Aging murine peritoneal macrophages undergo female-specific remodeling driven by hormone-dependent and independent mechanisms

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Abstract

Aging is a complex process characterized by a progressive decline in physiological functions driven by both biological and environmental factors, with notable differences between sexes. Immune function is strongly influenced by biological sex, affecting both innate and adaptive immune responses, including macrophage behavior. In this study, we investigated the effects of age and sex on the immune cell composition within the peritoneal cavity niche and identified macrophages as the most affected cell type. Macrophages, as central components of the innate immune system, play critical roles in maintaining tissue homeostasis and responding to infections. Here, we find that aging induces sex-specific remodeling of murine peritoneal macrophage transcriptomic and epigenomic landscapes. Consistently, peritoneal macrophages undergo sex-specific functional remodeling with aging (*i.e.* female-specific phagocytic decline and metabolic rewiring). Modulation of gonadal hormone signaling showed that changes in circulating estrogen levels likely contribute to aspects of female-specific macrophage age-related changes. Importantly, multi-omic analysis identified candidate transcription factors whose sex-specific age-regulated expression may drive aspects of sex-specific 'omic' remodeling with aging. Specifically, Irf2 downregulation in female macrophages recapitulates distinct transcriptomic and metabolic aspects of macrophage female aging phenotypes. These findings suggest that female-specific age-related functional remodeling arises through hormone-dependent and -independent mechanisms in peritoneal macrophages.

Introduction

Aging is a complex process characterized by a progressive decline in physiological functions, with notable differences between sexes[1]. This decline is driven by a combination of biological factors, and extrinsic factors[2]. Life expectancy of females are on average longer than males[3]. However, despite increased longevity, females tend to experience higher levels of comorbidities and disability than males (*i.e.* the mortality-morbidity paradox)[4-6]. Additionally, females face an elevated risk of developing age-related chronic conditions (*e.g.* coronary heart disease, osteoarthritis, Type 2 diabetes, neurodegenerative disorders)[7]. Chronic sterile inflammation, a mechanism dubbed "inflamm-aging", is a hallmark of aging and is associated to more general immune dysfunction or "immunosenescence"[8,9]. Despite well-documented sex-differences in aging and disease susceptibility, mechanisms driving sex-based aging disparities are poorly understood.

Immune function is heavily shaped by biological sex, influencing both innate and adaptive immune cells[10,11], including macrophages[12]. Females generally exhibit a more robust immune response compared to males (*e.g.* quicker pathogen clearance, higher antibody response, higher cytokine secretion, and less infection-related mortality)[10,11,13-15]. However, females are also more susceptible to autoimmune diseases[16]. During aging, hematopoietic stem cells (HSC) skew production toward myeloid cells (*e.g.* monocytes, neutrophils) at the expense of lymphoid cells (*e.g.* B- and T-cells), a shift more pronounced in males than females, thereby impacting leukemogenesis and hematopoiesis[17,18]. Importantly, lifelong sex differences in immune function can be shaped by differential 'omic' regulation in immune cell types[19-24]. Despite the potential significance of such sex-differences in immune aging, how biological sex shapes the impact of age on 'omic' and functional landscapes of innate immune cells is largely unexplored.

Macrophages are key components of the innate immune system, functioning as both regulatory and effector cells in maintaining tissue homeostasis and responding to infections. Tissue-resident macrophages (*e.g.* large peritoneal macrophages), which originate primarily from embryonic precursors, exhibit specialized, organ-specific functions shaped by the local microenvironment. In contrast, bone marrow-derived macrophages differentiate from circulating monocytes and typically adopt more pro-inflammatory phenotypes during immune responses[25,26]. Macrophages have a repertoire of functions: phagocytosis of pathogens and other foreign materials, clearance of dead/dying and senescent cells, chemotaxis and migration, and cytokine

production[27]. During aging, macrophages have been reported exhibit altered phagocytosis,

metabolic changes, and cytokine secretion, leading to poor inflammation control[28-36]. In addition

to age-related differences, sex-differences in young macrophages have also been reported[10],

where young females exhibited greater phagocytic activity and more efficient antigen

presentation[37,38]. Interestingly, microglia, the brain's resident macrophages, undergo a female-

specific shift in glycolytic output with age dependent on C3a signaling[39]. While pioneering

studies have started to unearth sex-differences in immune aging[40], systematic characterization of

such sex-dimorphic phenotypes in aging macrophages and the molecular mechanisms driving

them are still missing.

In this study, we employed an unbiased multi-omics approach to profile the transcriptome

and epigenome of primary peritoneal macrophages in female *vs*. male mice with aging. Our

analyses revealed that macrophages are regulated in a sex-dimorphic manner with aging,

potentially influencing numerous macrophage functions. Indeed, single cell transcriptomic

profiling of the peritoneal cavity revealed that aging and sex impact macrophages the most in

this niche. Consistently, we identified divergent regulation of macrophage 'omic' landscapes

using RNA-seq, ATAC-seq, and H3K4me3 CUT&RUN. These analyses revealed that aging

significantly alters macrophage function, with distinct patterns observed across multiple

parameters. Specifically, our analyses showed that aging macrophages follow sex-dimorphic

trajectories, with key phenotypes related to 'omic' pathway changes—namely phagocytosis and

metabolic wiring—exhibiting female-specific age-related remodeling. Our experiments suggest

that female-specific age-related remodeling of peritoneal macrophages likely occurs through

both gonadal hormone-dependent and independent mechanisms.

Results

Macrophages are the immune cell type most impacted by aging in the peritoneal cavity niche

The peritoneal cavity hosts a rich and accessible immune niche, housing B-cells, T-cells
macrophages, neutrophils, and monocytes[41]. This immune niche is easily accessible through
post-mortem peritoneal lavage[42,43], making it tractable for studies without the need for
mechanical tissue dissociation (which compromises both cell viability and phenotypes[44]). We
used this niche to better understand how biological sex may impact the mice aging immune
system. Specifically, we obtained peritoneal lavage cells from young adult (4-5 months) and old
(20-21 months) female and male C57BL/6JNia and C57BL/6J mice (**Figure 1A**). Isolated cells
were used for unbiased profiling by single-cell RNA sequencing (scRNA-seq) using the
10xGenomics v2 and v3.1 3' platforms in 3 independent sets of aging mice (see **Methods**;
Figure 1A).

We robustly identified expected cell types within this niche in our rich dataset: B-cells,
macrophages, monocytes, natural killer (NK) cells, and T-cells (**Figure 1B**; 18,805 cells, 10,758
cells, and 14,595 cells for the NIA 10x v2, NIA 10x v3 and JAX datasets, respectively). To
determine whether any of these cell types were especially impacted by age and/or sex, we
leveraged Augur[45], an algorithm that helps prioritize cell types based on their transcriptional
response to biological conditions using machine-learning (**Figure 1C**; **Supplementary Figure**
S1A-D). Using Augur area under the curve (AUC) scores, we observed that the transcriptome of
macrophages was the most impacted among peritoneal cell types in the combined dataset (0.632;
Supplementary Figure S1E), as well as each individual dataset ($\geq$ 0.567; **Supplementary**
Figure S1F-H).

Another important aspect that can be inferred from scRNA-seq corresponds to relative
cell type abundances, especially in the absence of potential dissociation artifacts. Thus, we asked
if there were any age- or sex-related changes in the relative abundances of peritoneal cell types,
using both sample-specific determination and scProportionTest[46] (**Figure 1D; Supplementary**
Figure S1I-L). Interestingly, both methods revealed a significant increase in the relative
proportion of B-cells and a significant decrease in the relative proportion of macrophages in the
peritoneal cavity with aging, regardless of sex (**Figure 1D; Supplementary Figure S1I-L**),
consistent with previous studies[47,48]. In addition, we also observed a male-specific increase in the

relative proportion of T-cells in the peritoneal niche with aging (**Figure 1D; Supplementary**

Figure S1I-L). To independently validate these results *in vivo*, we used flow cytometry staining

of peritoneal cells using cell surface markers CD19$^+$ (B-cells), F4/80$^+$ (macrophages), and CD3$^+$

(T-cells) (**Figure 1A, E**; **Supplementary Figure S1M**). We confirmed a relative increase in the

proportion of B-cells and a relative decrease in the proportion of macrophages in the peritoneal

cavity with aging, regardless of sex (**Figure 1E**). However, changes in relative T-cell abundance

were not validated, potentially due to high animal-to-animal variability and/or a smaller effect

size (**Figure 1E**). We then investigated whether changes in relative abundances of immune cells

were accompanied by changes in absolute quantities. Interestingly, we observed that regardless

of sex, there were increases of the total number of all 3 immune cell types within the peritoneal

cavity with aging, with B-cell increases being most steep, especially in aging females (**Figure**

1F).

Tissue-resident peritoneal macrophages self-renew after acute inflammation[49,50]. Thus,

we posited that compromised self-renewal properties may contribute to decreased macrophage

proportions with age. For this purpose, we leveraged scRNA-seq data to predict macrophage cell

cycle stage across samples, using Seurat 'CellCycleScoring'[51]. Intriguingly, the proportion of

macrophages predicted to be in a resting non-cycling state (*i.e.* in G1 phase) was significantly

reduced with aging (irrespective of sex), whereas that of macrophages predicted to be actively

proliferating (*i.e.* in S, G2 or M phases) tended to increase (**Supplementary Figure S1N**). Our

data suggests that despite reduced relative abundance, aged peritoneal macrophages may be in a

more proliferative state. Thus, differences in macrophage proportions with aging are unlikely to

stem from self-renewal defects. However, age-related changes in peritoneal cavity niche cellular

makeup are likely to lead to functional remodeling of these cells.

Together, our analyses suggest that macrophages are most significantly impacted by

aging and sex in the peritoneal cavity. Thus, we decided to focus on the peritoneal macrophage

compartment to understand potential sex-dimorphic molecular and functional effects with aging.

Peritoneal macrophages show sex-dimorphic 'omic' phenotypes with aging

To better understand the impact of aging and sex on aging peritoneal macrophages, we

leveraged a bulk multi-omic profiling approach using MACS-purified macrophages from young

adults (4-5 months) and old (20-21 months) female and male C57BL/6JNia mice. We opted to

use a bulk approach due to its increased sensitivity and robustness, especially in the context of

purified cells, compared to single cell level profiling. We profiled both transcriptional and

epigenomic features, specifically (i) transcriptome profiling by bulk sequencing of ribosomal-

RNA depleted RNA (RNA-seq), (ii) chromatin accessibility landscape through the Assay for

Transposon-Accessible Chromatin followed by sequencing (ATAC-seq)[52,53], and (iii) promoter

activity/priming using CUT&RUN profiling for the H3K4me3 histone post-translational

modification[54] (**Figure 2A**). These 'omic' assays were each performed on an independent cohort

of C57BL/6JNia animals (n = 5 animals per group; **Supplementary Table S1A**). After

accounting for premature death before the experimental day (**Supplementary Table S1A**) and

retaining only samples with > 90% macrophage purity (**Supplementary Figure S2A, B**), final

sample numbers range from 3-5 per group and 'omic' layer.

We first leveraged Multi-Dimensional Scaling [MDS] to evaluate the main axes of

separation of our samples across the 3 'omic' layers (**Figure 2B-D**). Interestingly, MDS revealed

clear separation of samples by sex, regardless of age (**Figure 2B-D**). Thus, MDS analysis

supports the existence of strong sex-dimorphism in the molecular aging landscape of primary

peritoneal macrophages. Interestingly, we also observed a secondary separation of samples by

age of the mice, albeit weaker than that by sex (**Figure 2B-D**). Thus, we investigated whether, in

addition to baseline differences, aging may impact the 'omic' landscapes of peritoneal

macrophage in a sex-dimorphic manner. For this purpose, we compared DESeq2 $\log_2$ fold

changes in gene expression (**Figure 2E, Supplementary Figure S2C**), chromatin accessibility

(**Figure 2F, Supplementary Figure S2D**) and H3K4me3 signal (**Figure 2G, Supplementary**

Figure S2E) for every detected gene/peak in aging female *vs*. male peritoneal macrophages. We

reasoned that high rank correlation values would correspond to largely colinear effects of aging

on 'omic' landscapes regardless of sex, and that divergent aging trajectories would result in

weaker rank correlation values. Using this method, we observed only relatively weak rank

correlations between 'omic' aging trajectories of female and male peritoneal macrophages

(Genome-wide Spearman Rho = 0.232-0.329; **Figure 2E-G, Supplementary Figure S2C-E**).

To further investigate these divergent patterns, we next performed analyzed 'omic' changes with

aging separately in females vs. males for each of the 'omic' layers. Specifically, we labelled

genes with FDR < 5% in one sex but FDR > 10% in the other sex as significant in one sex only

(sex-divergent regulation) and genes with FDR < 5% in both sexes as consistently regulated

(sex-independent regulation; **Supplementary Table S2A-C**). Importantly, although a core set of genes and peaks significantly changed similarly in both sexes with aging (respectively 61, 420 and 244; **Supplementary Figure S2C-E**), we identified many more genes and/or peaks with significant age-related changes in only one sex (respectively 284/234, 1044/2825 and 131/1699 [male-specific/female-specific]; **Figure 2E-M**). Together, these analyses are consistent with the notion of broadly divergent aging 'omic' trajectories in peritoneal macrophages as a function of biological sex.

Sex differences in aging may result from (i) downstream effects of sex hormone signaling (*e.g.* lifelong exposure to an estrogen- or androgen-rich milieu, or (ii) differential impact of sex chromosome karyotypes (*e.g.* XX vs. XY), including through X chromosome inactivation [XCI] escape[40]. Genes and/or peaks with sex-dimorphic aging regulation were distributed across the genome, indicating that autosomal gene dysregulation is a major feature of sex-dimorphism in the aging 'omic' landscapes of macrophages (**Supplementary Figure S2F-H**). To note, gene set enrichment analysis [GSEA] revealed a slight, but significant, trend for downregulation of X-linked genes in females (FDR = 1.4 $\times 10^{-2}$; **Supplementary Figure S2I**), consistent with a potential role of X chromosome dysregulation in aging female macrophages[55]. Consistently, we observed that one of the top female-specific regulated genes with aging in our bulk RNA-seq dataset was *Xist* (FDR = 5.4$\times 10^{-5}$; **Supplementary Figure S2J**), which encodes a non-coding RNA critical to XCI initiation and maintenance[56,57]. A trend for increased *Xist* expression in peritoneal macrophages was also observed in our 10xGenomics v3.1 single cell RNA-seq datasets (**Supplementary Figure S2K**). Interestingly, upregulation of *Xist*[58] and increased XCI escape[58,59] have been observed across cell types with female brain aging. In contrast, we observed that known XCI escapees were significantly downregulated in aged female macrophages (FDR = 3.6$\times 10^{-3}$; **Supplementary Figure S2I**), consistent with *Xist* upregulation but inconsistent with observations in the aging brain[58,59].

Together, our data reveals strong sex differences in the 'omic' landscapes of primary peritoneal macrophages throughout life and suggest that aging may differentially impact the function of these cells in female *vs.* male mice.

Functional enrichment analysis reveals sex-dimorphic regulation of key immune pathways with aging

We next asked whether sex-specific age-related changes in peritoneal macrophage gene
expression regulation, at the transcriptomic and epigenomic levels, were expected to impact
downstream functions using protein-protein interaction network construction and functional
enrichment analyses (**Figure 3, Supplementary Figure S3; Supplementary Table S3**).

First, we generated predicted networks for female and male age-related changes using
NetworkAnalyst 3.0[60] and protein-protein interaction [PPI] information from IMEx/InnateDB
data[61], a knowledgebase geared towards innate immunity (**Figure 3A-B**). Our analysis revealed
that genes regulated with aging in female vs. male macrophages are part of clear, interconnected
PPI networks (**Figure 3A, B**). Interestingly, although some predicted nodes were identified in
both sexes (Irf7, Il1r1), there was a majority of sex-specific nodes (*e.g.* Irf2 and Mef2c in
females; Irf1 and Rela in males; **Figure 3A, B**). The tight gene interconnectivity within the
female and male predicted PPI networks supports the notion that macrophage transcriptional
changes with aging are coordinated within each sex, likely leading to differential aging related
functional remodeling.

Next, we performed GSEA analysis using high quality gene sets from Gene Ontology
(GO; all domains; ENSEMBL v108) and Reactome (MSigDB v2022.1) to evaluate differentially
regulated processes in aging peritoneal macrophages at the levels of transcription, chromatin
accessibility and H3K4me3 signal, both in a sex-independent (**Supplementary Figure S3A-F;**
Supplementary Table S3A-F) and sex-dimorphic manner (**Figure 3C-E, Supplementary**
Figure S3G-I; Supplementary Table S3A-F). Importantly, top gene sets that were regulated in
a sex-independent manner were consistent with expected immune activation with aging (*e.g.*
Gene ontology terms "innate immune response" or "immune system process", Reactome gene
sets "complement pathway" and "neutrophil degranulation"; **Supplementary Figure S3A-C;**
Supplementary Table S3A-F). These observations are consistent with widespread observations
of age-related immune remodeling or "inflamm-aging"[62], regardless of sex. In addition, we also
observed strong sex-dimorphic regulation of GO and Reactome gene sets in aging peritoneal
macrophages (**Figure 3C-E, Supplementary Figure S3G-I; Supplementary Table S3A-F**).
Most notably, top significant sex-dimorphic aging gene sets revealed several phagocytosis-
related gene sets (*e.g.* GO "phagocytosis, recognition", "endosomes", Reactome "cross-
presentation of soluble exogenous antigens endosomes"), metabolism-related gene sets (*e.g.* GO
"proton transmembrane transport", "mitochondrial respiratory chain complex IV", Reactome

"respiratory electron transport ATP synthesis by chemiosmotic coupling and heat production by
uncoupling proteins") and inflammation-related gene sets (*e.g.* GO "positive regulation of
cytokine production involved in inflammatory response", "arachidonic acid epoxygenase
activity", Reactome "interleukin 2 family signaling", "defensins"; **Figure 3C-E, Supplementary**
Figure S3G-I; Supplementary Table S3A-F).

Since these types of terms reflect potential changes in key pathways relating to
macrophage function[63], we decided to complement our analysis using curated gene sets related to
these functions to independently validate their sex-specific regulation in the transcriptome of
aging peritoneal macrophages via GSEA (**Figure 3F-H, Supplementary Table S4**).
Specifically, we (i) curated a list of phagocytosis regulator genes from two phagocytosis
CRISPR/Cas9 screens[64,65], (ii) utilized curated lists of genes involved in oxidative
phosphorylation and glycolysis from the MSigDB Hallmark gene sets[66], and (iii) identified genes
involved in M1-like and M2-like polarization based on a publicly available macrophage RNA-
seq dataset[67]. Consistent with our unbiased GO and Reactome GSEA analyses, we observed
female-specific downregulation of phagocytosis regulators from CRISPR/Cas9 screens (**Figure**
3F; Supplementary Table S2G) and a male-specific upregulation of curated Hallmarks
metabolism related pathways (**Figure 3G; Supplementary Table S2H**). In contrast, both female
and male macrophages showed significant upregulation of M1-enriched genes, whereas only
male macrophages showed significant upregulation of M2-enriched genes as well (**Figure 3H;**
Supplementary Table S2I).

Together, our functional enrichment analyses suggest that several processes key to
macrophage function may be regulated in a sex-specific manner: (i) phagocytosis capacity,
which is required for pathogen and/or dead cell clearance[68,69], (ii) metabolic preference, which
reflects macrophage inflammatory status — with greater reliance on glycolysis being associated
to more pro-inflammatory macrophages[63] and (iii) macrophage polarization trends, whereby
distinct pro- and anti-inflammatory programs are activated[70].

Peritoneal macrophages undergo female-specific age-related functional decline
Based on our 'omic' analyses (**Figure 3**), we hypothesized that peritoneal macrophages
undergo sex-specific functional remodeling in phagocytosis capacity, metabolic preferences and

polarization state with age. Thus, we selected *ex-vivo* assays to evaluate these phenotypes using primary peritoneal macrophages from young and old, female and male mice (**Figure 4A**).

To evaluate potential sex-differences in macrophages phagocytic abilities, we used Alexa Fluor 488-Zymosan bioparticles as cargo to evaluate phagocytosis capacity as a function of age and sex. Specifically, we evaluated the "phagocytosis index", defined as the proportion of macrophages internalizing the labelled cargo in a set amount of time, using 2 complementary approaches based on (i) microscopy, after a day of *ex vivo* culture[71] and (ii) flow cytometry, on freshly isolated macrophages (**Supplementary Figure S4A**; see **Methods**). In line with computational predictions, we observed a significant reduction in phagocytosis capacity specifically in aged female peritoneal macrophages, as demonstrated by both microscopy (p-value = 2.0×10^{-2}; **Figure 4B, C**) and flow cytometry (p-value = 4.7×10^{-2}; **Figure 4D**). Importantly, we observed a consistent trend of decreased phagocytosis in aging female bone marrow-derived macrophages (BMDMs), a distinct primary macrophage population (p-value = 0.07; **Supplementary Figure S4B**), suggesting that female-specific phagocytic remodeling with aging is not niche-specific.

Within the peritoneal cavity, the peritoneal macrophage population can be comprised of both large peritoneal macrophages (LPM; expressing high levels of F4/80) and small peritoneal macrophages (SPM; expressing lower levels of F4/80)[72]. LPMs are the tissue-resident macrophages of the peritoneal cavity derived from the fetal yolk sac, and constitute the overwhelming majority of peritoneal macrophages in naïve mice[73-75]. In contrast, SPMs are constantly derived throughout life from blood monocytes, which are recruited to the peritoneal cavity in response to inflammatory signals, and represent a minority of peritoneal macrophages in naïve mice[50,75]. To rule out the possibility that female-specific changes in phagocytosis with aging could be trivial byproducts of LPM/SPM proportion shifts with aging, we analyzed F4/80 surface protein levels in MACS-purified peritoneal macrophages (**Supplementary Figure S4C-E**). Intriguingly, although there were no aging differences in LPM/SPM abundance for macrophages purified from C57BL/6JNia mice, shifts were observed in aged female C57BL/6J mice (**Supplementary Figure S4D, E**). Despite provider/substrain differences in LPM/SPM proportion with aging, female-specific phagocytosis decreases were observed consistently, ruling out the fact that shifts in macrophage subtypes is enough explain female-specific age-related remodeling (**Supplementary Figure S4D, E**). We also examined whether differential expression

of pattern recognition receptors involved in Zymosan recognition may explain decreased
phagocytosis in aging females specifically. Zymosan is recognized by both Tlr2 and Dectin-1
(encoded by *Clec7a*)[76]. There was no evidence of differential regulation of Zymosan receptors
Tlr2 and *Clec7a* in our RNA-seq datasets (**Supplementary Figure S4F**). Using flow cytometry
quantification, we observed no change in Tlr2 protein expression with aging or sex
(**Supplementary Figure S4G, H**). Dectin-1 abundance showed a significant reduction during
aging in female macrophages, although Dectin-1 levels in aged females matched those of males
regardless of age (**Supplementary Figure S4G**), despite comparable phagocytosis in young
animals (**Figure 4C**).

To identify potential mechanistic mediators of the specific phagocytosis phenotype in
aged female macrophages, we compared female-specific aging downregulated genes (RNA-seq)
with phagocytosis regulators from CRISPR/Cas9 phagocytosis screens[64,65] (**Figure 4E,**
Supplementary Table S4A-B). This revealed 9 candidate genes mediating female-specific
changes in phagocytosis with aging (6 at FDR < 5%: *B4galt1*, *Dpy19l3*, *Man1a2*, *Rps6ka3*,
Tbl1xr1, and *Tm9sf3;* 3 at FDR < 10%: *Gna13*, *Hmgcs1*, *Magt1*; **Figure 4E**). To validate
whether candidate regulators could indeed impact Zymosan phagocytosis in murine
macrophages, we performed a mini lentiviral short hairpin RNA (shRNA)-mediated knockdown
screen in RAW264.7 cells (**Figure 4F**; **Supplementary Figure S4I**). Interestingly, knockdown
of *Rps6ka3* and *Magt1* resulted in significantly decreased Zymosan phagocytosis capability
(**Figure 4G**), consistent with a potential mechanistic role in female-specific age-related
decreased phagocytosis.

Next, we evaluated the metabolic preference of primary macrophages with aging and sex.
Macrophage function in both homeostasis and disease conditions relies on metabolic
reprogramming[77], whereby increased reliance on glycolysis is characteristic of pro-inflammatory
states and increased preference of mitochondrial respiration is associated to tissue remodeling[63].
We took advantage of the Agilent Seahorse platform to metabolically phenotype primary
macrophages[78]. Due to required yields for this method, we leveraged BMDMs to measure
oxygen consumption rate [OCR] and extracellular acidification rate [ECAR], using a protocol
designed to evaluate glycolytic and mitochondrial activity[78] (**Figure 4H-J, Supplementary**
Figure S4J, K). Contrary to expectations from 'omic' analysis, no metabolic differences were
observed in aging male BMDMs (**Figure 4I, J, Supplementary Figure S4J, K**). However, we

observed a significant increase in glycolytic activity specifically in aging female BMDMs (**Figure 4I, J**). We independently validated this phenotype in peritoneal macrophages using a luminescence-based assay with much lower cell number requirements. Consistent with our BMDM findings, we also observed a female-specific glycolytic shift in aging peritoneal macrophages (**Figure 4K**).

Finally, we set out to validate our 'omic' findings of sex-dimorphic activation of polarization pathways (**Figure 3H**) using flow cytometry quantification of cell surface markers known to be associated to M1-like (CD80, CD86) and M2-like (CD163, CD206) macrophage phenotypes[79-81]. We found that cell surface markers CD80 and CD86 increased with age in both sexes (**Supplementary Figure S4L**), indicating a general shift toward a more inflammatory phenotype with aging regardless of sex, consistent with previous studies in the field. In contrast, markers CD163 and CD206 showed inconsistent age-related changes; notably, CD206—but not CD163—significantly increased with age specifically in female macrophages (**Supplementary Figure S4M**).

Our functional validation analyses revealed robust female-specific age-related remodeling related to primary macrophage phagocytosis and metabolic preference.

Impact of ovarian hormone signaling on macrophage phenotypes with female-specific age-related remodeling

Our functional analyses revealed two phenotypes with strong female-specific age-related remodeling: (i) phagocytosis and (ii) glycolytic capacity. Notably, female mammals undergo drastic age-related decreases in ovarian hormones (*e.g.* estradiol, progesterone)[82]. In addition, previous work suggested that ovarian hormones may impact macrophage function, including phagocytosis[83,84] and metabolic reprogramming[85]. Hence, we asked whether the known age-related decrease in circulating ovarian hormones in female mice[82] may drive female-specific age-related peritoneal macrophages remodeling. Consistent with the ability to respond to variations in circulating sex hormones, our RNA-seq dataset showed that peritoneal macrophages express sex hormone receptors, with *Esr1* (encoding estrogen receptor a) being most robustly expressed (**Supplementary Figure S5A**). Therefore, we reasoned that decreased circulating levels of 17β-estradiol [E2] (the major form of estrogen in females) with age could drive female-specific macrophage remodeling.

We combined analyses of macrophages (i) from young females across the estrus cycle
(experiencing endogenous changes in E2) and (ii) from young female ovariectomized [OVX] vs.
sham control mice. First, we characterized cohorts of 4 month old C57BL/6NTac mice and
identified animals actively cycling using vaginal cytology[86] to obtain peritoneal macrophages
exposed to different endogenous levels of E2[87] (proestrus/estrus: high E2, metestrus/diestrus: low
E2; **Supplementary Figure S5C; Supplementary Table S1B, C**). Interestingly, peritoneal
macrophages isolated from females in low E2 phases of the estrus cycle showed significantly
lower phagocytosis rates compared to those from females in high E2 phases (p-value = 1.3×10^{-2};
Supplementary Figure S5D). However, metabolic profiling of BMDMs from naturally cycling
mice did not reveal E2-dependent differences in metabolic preference (**Supplementary Figure**
S5E, F). We next used an OVX vs. sham surgery approach on young C57BL/6J females at 3
months of age and allowed the mice to recover for one month before euthanasia (**Figure 5A;**
Supplementary Table S1D). We then evaluated 4 phenotypes: (i) peritoneal lavage
composition, (ii) peritoneal macrophage transcriptomes, (iii) peritoneal macrophage
phagocytosis, and (iv) peritoneal macrophage glycolytic activity (**Figure 5A**). Relative
abundances and total quantities of peritoneal immune cell types were unaffected in OVX animals
(**Supplementary Figure S5G,H**). However, the transcriptional landscape of peritoneal
macrophages was strongly remodeled in OVX vs. sham animals (**Figure 5B;** samples with >
90% purity; **Supplementary Figure S5I; Supplementary Table S5A**). To evaluate whether
OVX impacts macrophage transcriptomes similarly to aging, we next performed GSEA of genes
differentially regulated upon OVX in macrophages (FDR < 5%) in the aging female peritoneal
macrophage transcriptome (**Figure 5C**). Importantly, genes upregulated/downregulated upon
OVX were significantly upregulated/downregulated in aging female macrophages (**Figure 5C**),
showing that OVX mimics transcriptional effects of aging in female macrophages. We next
evaluated the functional impact of OVX on peritoneal macrophages. Peritoneal macrophages
from OVX mice had significantly decreased phagocytosis capacity when compared to sham mice
(p-value = 2.2×10^{-3}; **Figure 5D**), similar to aging. However, lactate secretion (and by proxy
glycolysis) was unaffected by OVX (**Figure 5E**). Together, our findings support the notion that
lower levels of E2 are sufficient to recapitulate aspects of female macrophage aging (*i.e.*
transcriptome, phagocytosis), but not others (*i.e.* metabolic preference).

Next, we reasoned that because decreased E2 conditions phenocopied aspects of female
macrophage aging, supplementation of E2 in post-estropausal female mice may rescue aspects of
aging. For this purpose, we treated 3 months and 19 months old female C57BL/6J mice with E2
(440ng/mL) or vehicle (*i.e.* ethanol 0.1%) in their drinking water[88,89] for one month before
euthanasia (**Figure 5F; Supplementary Table S1E**). This method provides a minimally invasive
framework for hormone supplementation, which still leads to robustly increased systemic E2
levels (with significant increase in uterine dry weight in aged E2-treated animals; p-value =
1.1×10^{-2} in Wilcoxon rank-sum test; **Supplementary Table S1E**). We then phenotyped the
peritoneal cavity and purified peritoneal macrophages as above. While we observed expected
age-related changes in B-cells and macrophages relative abundances, E2 supplementation did not
significantly impact relative cell abundances nor overall cell numbers in the peritoneal cavity
(**Supplementary Figure S5J,K**). Interestingly, the transcriptional landscape of peritoneal
macrophages was strongly remodeled in response to aging and E2 supplementation (**Figure 5G**;
samples with > 90% purity; **Supplementary Figure S5L; Supplementary Table S5B-C**).
Interestingly, the transcriptomes of macrophages from E2-supplemented aged mice clustered in
between those of young vehicle-treated mice and old vehicle-treated mice (**Figure 5G**),
consistent with a "younger" transcriptomic signature. Indeed, GSEA using genes significantly
regulated in response to E2 supplementation in old mice (FDR < 5%) on female macrophage
aging transcriptomes revealed that genes upregulated in response to E2 were downregulated
during aging, whereas genes downregulated in response to E2 were significantly during aging
(**Figure 5H**), consistent with partial transcriptional rejuvenation. Next, we evaluated whether E2
supplementation would also functionally reprogram female macrophage toward a more youthful
state. While we observed an expected age-related decrease in phagocytosis with vehicle treated
animals (p-value = 1.9×10^{-2}), there was no significant rescue upon E2 supplementation (p-value
= 0.56; **Figure 5I**). Glycolytic output, as measured by lactate production, was increased with
aging as expected (p-value = 1.9×10^{-2}), but did not show significant changes upon E2 treatment
(**Figure 5J**). Therefore, short-term post-estropausal *in vivo* E2 supplementation, while showing
significant rescue of macrophage transcriptional aging markers, did not significantly rescue
functional phenotypes. Since post-menopausal hormonal therapy has a limited window for
efficacy in humans[90] and C57BL/6 mice undergo estropause between 12-15 months of age[91], it is

likely that short-term post-estropausal exposure cannot fully rescue the effects of age-related E2 loss.

Our results suggest that age-related decline in circulating E2 in females may explain aspects of female-specific macrophage aging. Since *Esr1* was the highest expressed receptor for E2 in our peritoneal macrophage bulk RNA-seq data (**Supplementary Figure S5A**), we next evaluated potential changes in expression or activity aging peritoneal macrophages. To note, there was a non-significant trend for increased *Esr1* expression in aging female (but not male) macrophages by bulk RNA-seq (p-value = 7.1×10^{-2}; **Supplementary Figure S5B**), consistent with the known negative feedback loop of Esr1 regulation[92]. *Esr1* expression levels were too low for robust detection in scRNA-seq (as expected for genes encoding transcription factors[93]). To determine whether Esr1 may mediate the impact of reduced E2 levels with aging in peritoneal macrophages, we leveraged existing *Esr1* full body knockout mice[94] (**Figure 5K**). We isolated and characterized cells from 3-4 months old *Esr1* knockout and wild-type littermate female mice, similarly as above (**Figure 5K; Supplementary Table S1F**). Interestingly, we found that *Esr1* knockout mice showed a significantly increased B-cell proportion (p-value = 4.1×10^{-2}) and a trend for decreased proportion of macrophages within the peritoneal cavity (p-value = 0.056; **Supplementary Figure S5M**), consistent with a prematurely aged immune phenotype. There was a change in the numbers of peritoneal macrophages, but not other cell types (p-value = 4.9×10^{-3}; **Supplementary Figure S5N**), which could stem from the impact of E2 on cell cycle in young macrophages[95]. Next, we evaluated the transcriptomic impact of constitutive *Esr1* knockout. Although *Esr1* knockout led to substantial transcriptional remodeling (**Figure 5L**; samples with > 90% purity; **Supplementary Figure S5O; Supplementary Table S5D**), GSEA analysis of *Esr1* knockout-regulated genes surprisingly showed a pattern consistent with transcriptional rejuvenation (**Figure 5M**). However, consistent with cycling and OVX functional results, *Esr1* knockout peritoneal macrophages exhibited significantly decreased ability to perform phagocytosis, as determined by flow-cytometry (p-value = 3.7×10^{-3}; **Figure 5N**), but showed no difference in glycolytic output (p-value = 0.23; **Figure 5O**).

Together, our results support the notion that sustained E2 exposure, at least in part through Esr1 signaling, is required to maintain youthful transcriptomic signatures and phagocytosis levels, but not low glycolytic dependence, in female peritoneal macrophages throughout life.

Identifying non hormonal mechanisms driving aspects of female-specific macrophage aging

Since decreased E2 signaling could only account for limited aspects of female-specific age-related remodeling in peritoneal macrophages (*i.e*. phagocytosis, transcriptome), we next sought to identify potential molecular mediators contributing to female-specific age-related macrophage remodeling. To do so, we leveraged our comprehensive 'omic' datasets (**Figure 1, 2**) as *in silico* screening tools to pinpoint candidate regulators (**Figure 6A; Supplementary Table S6B**). We prioritized genes encoding transcription factors [TFs], given their broad regulatory influence over the expression of hundreds to thousands of other genes[96].

First, we leveraged our bulk RNA-seq dataset to identify candidate TF-encoding genes that significantly changed in expression with aging in female, but not male, peritoneal macrophages (**Figure 6A; Supplementary Table S6B**). We then examined evidence for disrupted TF signaling specifically in aging female macrophages using: (i) TF binding motif analysis in ATAC-seq regions remodeled specifically in aging female macrophages and (ii) TF binding motif analysis in H3K4me3 CUT&RUN regions remodeled specifically in aging female macrophages (**Figure 6A; Supplementary Table S6B**). Mouse TF-encoding genes were obtained from the AnimalTFDB3.0 database[97] and overlapped to genes with significant age-regulation in females only, revealing 20 candidate TF-encoding genes (**Figure 6A, B; Supplementary Table S6B**). To note, 14 of these TFs were upregulated with age, and 6 of them were downregulated with age (**Figure 6A, B, Supplementary Figure S6A; Supplementary Table S6B**). We then performed TF motif analysis in the genomic regions with ATAC-seq and H3K4me3 CUT&RUN signal remodeled specifically in female macrophages with aging using HOMER[98]. Significantly enriched motifs in peaks with female-specific increased or reduced signals were then filtered based on correspondence with our 20 candidate TFs (**Figure 6C,D**), which led to the identification of 4 TF candidates with age-related <u>decreased</u> expression (*i.e. Irf2, Mef2C, Meis1, Tal1*), and 3 TF candidates with age-related <u>increased</u> expression (*i.e. Nr2f2, Sox7, Tead1*). For experimental simplicity, we focused on TFs specifically downregulated with aging in female macrophages (*i.e. Irf2, Mef2C, Meis1, Tal1*). Interestingly, all of these candidate TFs had also been identified as nodes of the predicted PPI network of aging female macrophages (**Figure 3A**), consistent with potentially central regulatory roles. In parallel, we leveraged our scRNA-seq datasets to predict differential TF activity across sex and ages in macrophage single

cell transcriptomes using SCENIC[99], which revealed significant predicted decrease in Irf2
activity and significant predicted increase in Mef2c activity in aging female macrophages
(**Supplementary Figure S6B-C; Supplementary Table S6A**), providing another layer of
evidence that age-related disruption of these TFs may impact female macrophages. Additionally,
Tbl1xr1, a candidate phagocytosis regulator (**Figure 4F-G**) that functions as a transcriptional co-
regulator[100], was also identified by SCENIC as showing significant age-related predicted activity
decrease (**Supplementary Figure S6B, C; Supplementary Table S6A**). In analyses thereafter,
we considered a set of 4 TFs and 1 TF co-regulator (*i.e. Irf2, Mef2c, Meis1, Tal1, Tbl1xr1*;
hereafter referred to as "TFs") as candidate regulators of female macrophage aging (**Figure 6A;**
Supplementary Table S6B). The impact of candidate TFs on macrophage phenotypes (*i.e.*
transcriptome, phagocytic capacity, metabolic preference) was evaluated using RAW264.7
macrophages using a mini lentiviral shRNA knockdown screen (**Figure 6F**; **Supplementary**
Figure S6D; see **Methods**).

We first analyzed the impact of decreased TF expression on macrophage transcriptomes
by mRNA-seq (**Supplementary Figure S6E-G**), which revealed that TF knockdown led to clear
remodeling of macrophage transcriptomes (**Supplementary Figure S6F**,**G; Supplementary**
Table S6C-G). Robust/consistent transcriptional targets of candidate TFs were then used as gene
sets for GSEA to evaluate whether transcriptional changes elicited by decreased TF expression
were consistent with female macrophage aging (**Figure 6G**). Interestingly, knockdown of *Irf2*
and *Tal1* showed patterns colinear with female macrophage aging, with upregulated genes being
significantly upregulated (and downregulated genes being downregulated) in aging female
macrophages. Importantly, *Irf2* targets showed substantially stronger colinearity than those of
Tal1 (**Figure 6G**). In the case of *Mef2c* and *Meis1* knockdown, downregulated genes showed
strong downregulation in aging female macrophages, whereas upregulated genes showed weak
downregulation opposite of aging (**Figure 6G**). *Tbl1xr1* knockdown led to transcriptional
changes in macrophages inconsistent with aging (**Figure 6G**). Intriguingly, when investigating
whether candidate TFs may belong to a regulatory network of their own, we observed that *Mef2c*
knockdown led to significantly reduced *Irf2* expression (**Supplementary Figure S6H, I**),
suggesting that concomitant downregulation of *Irf2* and *Mef2c* may act synergistically to shape
the female aging peritoneal macrophage transcriptome.

We next evaluated whether decreased expression of candidate TFs may recapitulate female-specific age-related macrophage functional remodeling in phagocytosis and metabolic preferences (**Figure 6H-J**). We observed no significant recapitulation of age-related phagocytosis decreases in response to TF knockdown, with the notable exception of *Meis1* (**Figure 6H**). Interestingly, *Rps6ka3*, the top hit from our mini-shRNA knockdown screen for candidate regulators of phagocytosis is significantly downregulated after *Meis1* knockdown (FDR = 0.004; **Supplementary Figure S6J; Supplementary Table S6E**), supporting the notion that *Meis1* downregulation in aged female macrophages occurs upstream of *Rps6ka3* downregulation to promote reduced phagocytosis. In contrast to phagocytosis, using both the Agilent Seahorse and Promega Lactate-Glo assays, there was a widespread impact of TF candidate knockdown on glycolytic output (**Figure 6I, J**). Specifically, knockdown of *Irf2*, *Tal1*, and *Tb11xr1* led to significantly increased macrophage glycolytic activity in both assays, consistent with the female aging macrophage phenotype (**Figure 6I, J**).

Thus, our mini-shRNA screen showed that downregulation of *Irf2* led to the strongest (i) transcriptional and (ii) metabolic remodeling consistent with female macrophage aging. Consequently, its age-related downregulation represents the best candidate mechanism to explain observations of female-specific glycolytic shift in aging macrophages, which could not be explained by age-related estrogen deprivation (**Figure 5, Supplementary Figure S5**).

Age-related downregulation of Irf2 expression may promote female macrophage metabolic reprogramming by lifting *Hk3* transcriptional repression

To note, *Irf2* transcriptional levels, as assessed by RNA-seq, was unaffected by ovarian hormone signaling, with no significant change in expression in response to OVX (DESeq2 FDR = 0.69; **Figure S7A upper panel**), late-life E2 supplementation (DESeq2 FDR = 1; **Figure S7A middle panel**) or *Esr1* knock-out (DESeq2 FDR = 0.91; **Figure S7A lower panel**), consistent with *Irf2* downregulation occurring independently of estrogen signaling and/or ovarian aging.

We next set out to independently validate Irf2 regulation at the RNA and protein levels in aging primary peritoneal macrophages (**Figure 7A-D**, **Supplementary Figure S7A-C**). RT-qPCR analysis of *Irf2* RNA expression in peritoneal macrophages from independent aging mouse cohorts confirmed significant transcriptional downregulation of *Irf2* with aging, albeit in both sexes (**Figure 7B**). Next, we asked whether protein levels of Irf2 were impacted in aging

peritoneal macrophages using intracellular immunolabeling and quantification by flow cytometry
(**Figure 7C-D**; **Supplementary Figure S7B-C**). Consistent with our predictions, we observed a
significant decrease in Irf2 protein levels in peritoneal macrophages with aging in female (but
not male) maice (**Figure 7D**). Importantly, Irf2 labeling was specific, as RAW264.7 and J774.1
macrophages expressing *Irf2* shRNAs showed decreased labeling (**Supplementary Figure S7D,**
E). Thus, Irf2 is downregulated in aging female peritoneal macrophages at the transcriptional
and protein levels.

To better understand the impact of Irf2 in young female macrophages (and thus the
impact of decreased expression with aging), we evaluated the Irf2 chromatin binding landscape
in primary female macrophages from young female C57BL/6JNia mice (**Figure 7E**). To note,
since TF ChIP-seq profiling requires 10 million cells, we leveraged abundant BMDMs to map
the Irf2 macrophage regulome. We identified 339 robust ChIP-seq peaks across 2 biological
replicates, which showed expected significant enrichment for DNA binding motifs recognized by
interferon regulatory factors (IRFs; **Supplementary Figure S7F; Supplementary Table**
S7A,B). Irf2-bound regions were mostly found near promoters ($\leq$ 3kb from annotated
transcription start sites [TSSs]) and distal intergenic regions (likely enhancers; **Supplementary**
Figure S7G). To gain insights about the regulatory network of Irf2 in primary macrophages, we
leveraged the Genomic Regions Enrichment of Annotations Tool (GREAT)[101], which revealed
enrichments of GO terms related to immune response and metabolism (*e.g*, GO:0006955
"immune response", GO:0003950 "NAD+ ADP-ribosyltransferase activity"; **Figure 7F**;
Supplementary Table S7C, D). Similar enrichments were observed when using the gene-centric
ChIPseeker tool[102] (*e.g*, GO:0045088 "regulation of innate immune response", GO:0046320
"regulation of fatty acid oxidation"; **Supplementary Table S7E, F**).

We next investigated how Irf2 *bona fide* target genes were regulated with aging at the
transcriptional and epigenomic levels. Importantly, GSEA revealed that Irf2 <u>direct</u> targets
(regardless of distance to TSSs) were significantly upregulated in aging female macrophages
(**Supplementary Figure S7H**), consistent with its primary role as a transcriptional
repressor[103,104]. Notably, even with a less sensitive overlap-based approach, the majority of direct
Irf2 targets overlapping with genes significantly regulated in aging female macrophages (FDR <
5%) were upregulated (**Supplementary Figure S7H**). Interestingly, 3 of the upregulated genes
in this overlap, *Tm6sf1*, *Usp18*, and *Ifit3*, have been previously reported to be linked to cell

metabolism[105-107]. Consistent with increased activation of Irf2 targets in aging female peritoneal

macrophages, Irf2-bound chromatin regions showed slightly increased chromatin accessibility by

ATAC-seq (**Supplementary Figure S7I-J,** left panel) and H3K4me3 CUT&RUN signal

(**Supplementary Figure S7I-J**, right panel). Together, these results support the notion that

decreased Irf2 expression with aging leads to reactivation of its target gene network.

Next, we manually inspected the list of Irf2 *bona fide* direct targets to gain further

insights into how Irf2 downregulation impacts aging female macrophages (**Supplementary**

Table S7A). Intriguingly, there was robust Irf2 binding in the promoter of the *Hk3* gene, which

encodes an isoform of hexokinase – the enzyme that catalyzes the initial rate-limiting step of

glycolysis (**Figure 7H**). There was a trend for increased *Hk3* expression with aging in our

peritoneal macrophage RNA-seq dataset, likely non-significant due to an outlier value in the

young female group (**Supplementary Figure S7K**). However, RT-qPCR analysis of peritoneal

macrophages from 3 independent cohorts of animals revealed a significant increase in *Hk3* RNA

levels (p-value = 1.6×10^{-2}; **Figure 7I**). Thus, age-related downregulation of Irf2 in female

peritoneal macrophages likely leads to *Hk3* upregulation and increased glycolytic activity.

To complement mechanistic insights downstream of Irf2 downregulation from our screen

in RAW264.7 macrophages (**Figure 6**), we performed shRNA knockdown in J774A.1

macrophages (**Figure 7J, Supplementary Figure S7L-N**). There was good agreement in the

transcriptional remodeling following *Irf2* knockdown across both macrophage cell lines as

measured by mRNAseq (**Supplementary Figure S7L, M; Supplementary Table S6G**).

Consistent our RAW264.7 screen results, *Irf2* knockdown did not impact phagocytic capacity in

J774A.1 macrophages (p-value = 0.51; **Supplementary Figure S7N**). In contrast, as expected

from the status of *Hk3* as a strong direct target of Irf2 and observations in female aging

macrophages, *Irf2* knockdown led to robust *Hk3* transcriptional upregulation in both macrophage

lines according to RNA-seq (RAW264.7 p-value = 2.6×10^{-37}; J774A.1 p-value = 3.9×10^{-9};

Figure 7K). Consistent with *Hk3* expression acting as a limiting factor for glycolytic potential of

macrophages, *Hk3* upregulation was accompanied by significantly increased glycolytic activity

both RAW264.7 (p-value = 1.2×10^{-3}, 7.3×10^{-3} respectively) and J774A.1 macrophages (p-value

= 1.7×10^{-3}, 2.6×10^{-2} respectively; **Figure 6I-J, 7L-M**).

Together, our data suggests that decreased *Irf2* expression with aging in female peritoneal
macrophages leads to an upregulation of *Hk3*, which then leads to an aberrant age-related
increase in glycolytic output (**Figure 7N**).
630
631

Discussion

A multi-omic resource to study murine tissue-resident macrophages as a function of age and biological sex.

To understand how sex may influence aging of the immune system, specifically macrophages, we generated a multi-omic resource focusing on primary resident peritoneal macrophages from young and old, female and male C57BL/6J[Nia] mice, with high quality transcriptomic (single-cell and bulk RNA-seq) and epigenomic (chromatin accessibility by ATAC-seq and H3K4me3 genomic distribution by CUT&RUN) maps. To our knowledge, our dataset is the largest multi-omic dataset for the study of primary macrophages during aging, and we believe it will be a rich resource to the scientific community in understanding the influence of biological sex on age-related immune remodeling. Analysis of these datasets revealed that, not only is there a baseline difference in genomic regulation of primary macrophages at young age, but also that aging differentially impacts 'omic' profiles in female *vs*. male animals. Specifically, although there were shared features of molecular aging in female and male macrophages, we observed much larger sex-dimorphic age-related changes in gene expression and chromatin organization (**Figure 2; Supplementary Figure S2**).

Importantly, genes and genomic regions showing age-related sex-dimorphic regulation were enriched for processes key to macrophage function, including phagocytosis regulation, metabolic wiring and inflammatory phenotypes (**Figure 3; Supplementary Figure S3**). Although aging phenotypes of macrophages across various niches have been reported (*e.g.* visceral adipose macrophages, alveolar macrophages, Kupffer cells, *etc*.), previous studies largely focused on using animals of one sex, or mostly reported results combining sexes (reviewed in[36]). A notable exception includes a series of recent studies on aging murine microglia, the brain resident macrophage, which also reported large sex-differences in molecular landscapes with aging[39,108].

Peritoneal macrophages show female-specific age-related remodeling in phagocytosis and metabolic wiring.

To determine whether sex-differential regulation of molecular landscapes with aging yielded functional consequences, we assessed phagocytic capacity, metabolic preference, and polarization surface markers in isolated peritoneal macrophages (**Figure 4; Supplementary**

Figure S4). Intriguingly, this revealed two significant female-specific age-related remodeling in primary peritoneal macrophages: (i) a decrease in phagocytic capacity, and (ii) a metabolic shift to increased glycolytic output. Different populations of tissue-resident macrophages have previously been observed to show age-related decreases in phagocytosis across a range of cargo types, but with no insights on the potential influence of sex on these phenotypes[36]. Our data suggests that age-related remodeling in macrophage functions is sex-dimorphic.

To understand the molecular mechanism driving female-specific regulation of phagocytosis, we tested candidate regulator genes of phagocytosis from CRISPR/Cas9 screens that were specifically downregulated in aged female macrophages through a mini shRNA knockdown screen (**Figure 4G**). Our results identified two phagocytosis regulators (*Magt1* and *Rps6ka3*) whose knockdown mimicked the age-related decrease in phagocytosis of female macrophages, consistent with the notion that their downregulation with aging may explain mechanistically our observed female-specific age-related decrease in macrophage phagocytic capacity. Although its impact during aging has not been evaluated before, *Magt1* is a Magnesium transporter located to the endoplasmic reticulum involved in protein glycosylation with critical function in immune cells[109,110], which was identified as required for proper phagocytosis of Zymosan in a whole genome CRISPR/Cas9 screen of human phagocytes[64]. Interestingly, *Rps6ka3* encodes a member of the S6 kinase family, whose activity is regulated by mTOR[111], which is a key regulator of aging[112], autophagy[113], phagosome maturation[114], and macrophage polarization[115]. *Rps6ka3* was also shown to play a direct role in innate immune responses[116] and was found to be required for phagocytosis of Zymosan in human phagocytes[64]. Thus, downregulation of *Magt1* and *Rps6ka3* in aging female peritoneal macrophages is likely to mechanistically underlie the female-specific age-related phagocytosis defect that we observed.

Interestingly, despite 'omic'-based predictions of male specific metabolic rewiring, we identified a metabolic shift specifically in aging female macrophages (both peritoneal macrophages and BMDMs), leading to increased glycolytic output. Increased glycolytic output is known to support inflammatory phenotypes and ROS-production in macrophages and is a characteristic of disease-associated macrophages[117]. Furthermore, a recent study of aging murine microglia also identified a female-specific increase in glycolytic output, which was driven by increased C3a – C3aR signaling[39]. Thus, our observations are consistent with a potential shift to a more dysfunctional state in female macrophages with aging.

Sustained estrogen signaling is necessary for youthful macrophage phagocytosis.

Since the age-related functional remodeling we uncovered were female specific, we reasoned age-related decreases in circulating ovarian hormones may explain these phenotypes (**Figure 5; Supplementary Figure S5**). Indeed, previous work found that E2 signaling can shape macrophage phenotypes[83,84]. Importantly, decreased exposure to youthful E2 levels by ovariectomy recapitulated aspects of female-specific macrophage aging, including transcriptional remodeling and decreased phagocytosis, but had no impact on glycolytic output of female macrophages (**Figure 5C-F**). Similar functional outcomes were observed in macrophages from mice lacking estrogen receptor gene *Esr1*, the most abundantly expressed estrogen receptor in peritoneal macrophages, suggesting the functional impact of youthful E2 may be mediated through ERa (**Figure 5Q-R**). In contrast, late-life short-term E2 *in vivo* supplementation partially rejuvenated the transcriptional landscape of peritoneal macrophages (**Figure 5I-J**), although there was no significant rescue of the phagocytic or metabolic remodeling (**Figure 5K-L**). Accumulating data has shown that delayed onset of hormone therapy in post-menopausal women leads to decreased efficacy (or even increased risk of adverse side effects)[118-120], suggesting that late-life supplementation, months after the onset of estropause (9-12 months of age in C57BL/6 mice)[121], is likely too late to observe substantial rescue of female-specific age-related macrophage functional remodeling. Thus, our results suggest that youthful E2 levels are necessary (although not sufficient) to maintain (i) aspects of the youthful female macrophage transcriptome, and (ii) youthful phagocytosis capacity in peritoneal macrophages. However, youthful E2 exposures had no influence on glycolytic output, suggesting that the female-specific metabolic shift of peritoneal macrophages occurs independent of circulating levels of sex hormones. Future work should determine whether hormone treatment initiated earlier in life, closer to estropause onset, will lead to at least partial functional rescue of aging female macrophage phenotypes.

TF-encoding genes are involved in female-specific age-related macrophage phenotypes.

We also identified a set of putative TF encoding genes that were specifically downregulated in aging female macrophages and may shape female-specific aging phenotypic remodeling: *Irf2*, *Mef2c*, *Meis1*, *Tal1*, and *Tbl1xr1* (**Figure 6**; **Supplementary Figure S6**).

Interestingly, with the exception of *Tbl1xr1*, knockdown of candidate TF genes recapitulated phenotypic aspects of aging female macrophages, with *Irf2* and *Tal1* knockdown most closely resembling the effect of aging on macrophage transcriptomes (**Figure 6G**). Among candidates, only knockdown of *Meis1* led to aged-like decreased phagocytic capacity, likely due to downregulation of phagocytosis regulator *Rps6ka3*. To note, *Meis1* expression is unaffected in macrophages from OVX mice or in response to late-life short term E2 supplementation (**Supplementary Table S5A, C**), suggesting that its impacy on phagocytosis occurs independently of E2 signaling. In contrast, knockdown of *Irf2*, *Tal1*, and *Tbl1xr1* promoted increased glycolytic output, suggesting that their age-related expression downregulation may underlie the female-specific glycolytic shift we observed in female peritoneal macrophages. How age-related decreased expression of these TFs in female macrophages may synergize together (and with decreased E2 signaling) to shape female-specific aging phenotypes is an interesting avenue for future studies.

Female-specific age-related downregulation of Irf2 leads to increased *Hk3* expression and glycolytic output.

Since *Irf2* knockdown best mimicked the aging female macrophage transcriptome and led to the strongest increase in glycolytic output, we focused on elucidating how it may drive aspects of female-specific peritoneal macrophage phenotypes (**Figure 7**; **Supplementary Figure S7**). Interestingly, Irf2 shares a similar DNA binding domain as Irf1, but works as a competitive antagonist of Irf1-mediated gene expression[122]. Consistent with decreased Irf2 activity driving aspects of aging female macrophage molecular landscapes, ChIP-seq analysis revealed that *bona fide* Irf2 target genes in primary macrophages were significantly upregulated and overlapped with remodeled chromatin regions in aging female macrophages. Most notably, ChIP-seq identified a strong region of Irf2 binding in the promoter of *Hk3* (the gene encoding Hexokinase 3). Both female macrophage aging and *Irf2* knockdown led to significant upregulation of *Hk3*, suggesting that decreased *Irf2* expression with aging is responsible for increased *Hk3* expression. Importantly, hexokinases catalyze the rate-limiting first step of glycolysis (the phosphorylation of glucose on C6)[123], thus gatekeeping cellular glycolytic potential. Thus, our data suggests that the female-specific increase in glycolytic output during peritoneal macrophage aging is driven by downregulation of *Irf2* and derepression of downstream target *Hk3*. Interestingly, this

mechanism that we identified in peritoneal macrophages is distinct from the one previously reported in microglia[39], suggesting that metabolic rewiring of female macrophages is driven by niche-specific mechanisms.

Together, our study provides the first systematic characterization of sex-differences in immune aging in the context of macrophages and provides mechanistic insights into how sex-specific aging phenotypes can be achieved. Intriguingly, our data suggests that both mechanisms involving age-related changes in gonadal hormone levels and mechanisms independent of gonadal hormones can drive sex-dimorphism in the aging trajectories of immune cells. Ultimately, such mechanisms could be leveraged as potential targets to rejuvenate immune responses in a sex-specific manner, the first and easy step towards personalized geroscience.

Material and Methods

Mouse husbandry

All animals were treated and housed in accordance with the Guide for Care and Use of Laboratory Animals. All experimental procedures were approved by the University of Southern California's Institutional Animal Care and Use Committee (IACUC) in accordance with institutional and national guidelines. Experiments described in this manuscript were performed on approved IACUC protocols 20770, 20804, 21004 and 21454. All animals were euthanized between 8-11 am using a "snaking order" to minimize batch-processing confounding factors related to circadian effects and post-mortem interval, by using by CO_2 asphyxiation followed by cervical dislocation.

For intact aging analyses, male and female C57BL/6JNia mice were obtained from the National Institute on Aging (NIA) colony at Charles Rivers, or male and female C57BL/6J mice were obtained from the Jackson Laboratories (3 and 19 months, acclimated at USC for 4-6 weeks) (**Supplementary Table S1A).**

For estrus cycle tracking experiments male and female C57BL/6NTac were obtained from Taconic Biosciences (3 months, acclimated at USC for 2 weeks; **Supplementary Table S1B**). The cycle stage of adult female mice was characterized by vaginal lavage daily for 3 weeks until euthanasia on 3-4 months old mice. Mice that seen at least a full cycle or seen of the different phases during the three weeks of vaginal smear were taken for euthanasia (**Supplementary Table S1C**). To reduce animal waste, non-cycling mice were housed with a mixture of clean and used male bedding to elicit additional cycle to stimulate cycling. Mice were cycled for another two weeks and mice that were cycling were taken for euthanasia.

For ovariectomy (OVX) *vs*. sham surgery experiments, female C57BL/6J mice were obtained from Jackson Laboratories (8 weeks old animals, acclimated at USC for 4 weeks) (**Supplementary Table S1D**). C57BL6/J female mice gone through sham or OVX surgery at 12 weeks of age. All surgery procedures and post-operative care were conducted by University of Southern California Department of Animal Resources veterinarians and veterinarian technicians. Surgery entry point was from the back to preserve the peritoneal cavity as much as possible for post-mortem peritoneal cell collection. Mice went through a recovery period of 4 to 5 weeks before euthanasia.

For late-life short-term E2 supplementation experiments, female C57BL/6J mice were

obtained from Jackson Laboratories at age 10 and 80 weeks and acclimated at USC for 2 weeks

before treatment initiation (**Supplementary Table S1E**). For supplementation, 17β-estradiol

(E2) was used in the purest chemical grade that could be obtained (≥98% purity; Sigma-Aldrich

#E8875). We generated our E2 stock solution of 5 ng/mL in pure 100% ethanol (Sigma-Aldrich

#E7023). E2 stock solution and 100% ethanol were filtered sterilized on 0.22μm PES filters

(VWR #76479-024) and stored at -20°C for no longer than 1 month. Drinking water of

C57BL6/J mice was supplemented with either vehicle (0.1% EtOH) or 440 ng/mL of E2 for 4

weeks, corresponding to ~94μg/kg of body weight/day[88,89]. Treatment water was changed every

2-3 days (3 times a week) to maximize treatment potency and limit potential E2 degradation.

Water levels and mice were monitored daily. Water supplementation of E2 in this manner was

found to be a safe and effective alternative to daily injections[88,89,124]. Mice were euthanized ~4

weeks after treatment initiation for experimental phenotyping.

For B6N(Cg)-*Esr1*[tm4.2Ksk]/J [*Esr1* KO][94] (JAX #026176) experiments, matched female

knockout [KO] and wild-type [WT] littermates were obtained from Jackson Laboratories

(**Supplementary Table S1F**). After receiving mice at USC, *Esr1* KO/WT mice were acclimated

and aged at USC until they reached 12-16 weeks before euthanasia.

Charles Rivers, Jackson Laboratories, and Taconic Biosciences have specific-pathogen-

free (SPF) facilities. All animals were acclimated at the SPF animal facility at USC for >2 weeks

before any processing or intervention to minimize the impact of travel stress. Some animals had

to be euthanized prior to experimental endpoints upon recommendation of USC veterinarians due

to welfare concerns and could thus not be included in the study.

Cell hashing, single-cell RNA-seq library preparation & sequencing of peritoneal cells

Single-cell libraries were prepared either using Chromium Single Cell 3' Library & Gel

Bead Kit v2 (10X Genomics #PN-120237) [NIA pooled cohorts 1 & 2], or the Chromium Next

GEM Single Cell 3□ GEM, Library & Gel Bead Kit v3.1 (10X Genomics #PN-1000121) [JAX

and NIA single animal cohorts with HTO labeling] according to manufacturer's instructions (10x

Genomics User Guide Chromium Next GEM Single-cell 3′ Reagent Kits v3.1 (CG000204, Rev

D)). For the two experiments using the v2 system, isolated peritoneal cells were pooled from

each biological group with equal cell number to ensure equal representation of all animals, based

on cell concentration estimates from a COUNTESS cell counter (Thermo Fisher Scientific #

AMQAF1000). This resulted in 4 libraries each (*i.e.* young female, young male, old female, old

male) for each of 2 independent cohorts. In this case, cell suspensions were loaded for a targeted

cell recovery of 3,000 cells per sample. For the two experiments using the v3.1 system, cell

hashing was performed on isolated peritoneal cells from each individual using Biolegend

TotalSeq^{TM}-A Antibodies according to the manufacturer's instructions (Biolegend #155801,

#155803, #155805, #155807, #155809, #155811, #155813, #155815, #155817, #155819).

Specifically, 0.5 million peritoneal cells were first incubated with mouse FcR-blocking Reagent

(Miltenyi Biotec #130-092-575) at 4°C for 10 minutes. Then, each blocked sample was

incubated with 1μg of specific TotalSeq Cell Hashing antibody (HTOs 1-10) at 4°C for 30

minutes. After incubation, stained cells were washed 3 times, and assessed for viability and yield

using the COUNTESS cell counter (JAX) or the DeNovix CellDrop (Denovix #CellDrop FL-

UNLTD) (NIA). Making sure no overlapping HTOs were included in a pool, samples were

pooled in equicellular mixes for 3 reactions (JAX) or 2 reactions (NIA), with targeted cell

recoveries of 14,000 and 30,000 cells, respectively. Samples were run on Chromium Single Cell

A Chips (10X Genomics #PN-120236) [v2 reactions] or Chromium Next GEM Chip G (10X

Genomics #PN-2000177) [v3.1 reactions] according to the manufacturer's instructions. For the

v3.1 reactions, HTO Additive primer v2 (Integrated DNA Technologies) was added to the cDNA

amplification reaction to amplify the HTO molecules. The amplified HTOs were recovered in the

cleanup step for the cDNA amplification, and HTO libraries were built using the 2x NEBNext

PCR Master Mix and Truseq indexing oligos (Integrated DNA Technologies). Partially amplified

and final single-cell RNA-seq libraries were quantified by a dsDNA High Sensitivity assay

(Invitrogen #Q32854) on a Qubit 3.0 Fluorometer (Thermo Fisher Scientific #Q33216). Quality

and size distribution of single-cell libraries were assessed on the 4200 TapeStation system

(Agilent Technologies #G2991A) with High Sensitivity D1000 DNA ScreenTapes (Agilent

Technologies #5067-5582) and D1000 reagent (Agilent Technologies #5067-5583). Libraries

were sequenced on an Illumina Novaseq 6000 generating 150 bp paired-end reads at Novogene

USA. Raw FASTQ reads have been deposited to the sequence read archive under accession

PRJNA1094925.

Computational processing of 10xGenomics sequencing libraries

Mapping, cell filtering and demultiplexing

For all datasets, raw reads were aligned to the mm10 mouse genome and processed using

cellranger 6.0.2[125] to generate gene-barcode matrices. For our hashed v3.1 datasets, HTO

quantification was performed using CITE-seq-Count v.1.4.4[126] with parameters "-cbf 1 -cbl 16 -

umif 17 -umil 26" to parse UMI/HTO sequences. Gene-barcode matrices and HTO counts were

loaded in R 3.6.3[127] for downstream processing using Seurat 3.2.2[128,129]. We used SoupX

v1.6.1[130] to correct counts for any interference by ambient RNA in our libraries. Cells that were

detected in the cellranger data (NIA v2 library) or in both cellranger and HTO data (NIA v3 and

JAX v3 libraries) were filtered for downstream analysis. Dead and low-quality cells were filtered

out by selecting for cells that contained between 300-6000 genes and < 25% mitochondrial reads.

After removal of low-quality unwanted cells, UMI expression data was normalized for

downstream processing using SCTransform(), regressing out the impact of number of genes and

mitochondrial read load ("vars.to.regress = c("nFeature_RNA", "percent.mito")").

Cell cycle prediction

A list of mouse cell cycle genes was obtained from the Seurat Vignettes

(https://www.dropbox.com/s/3dby3bjsaf5arrw/cell_cycle_vignette_files.zip?dl=1), derived from

a mouse study of cell cycling[51]. Cell cycle phase was predicted by these reference cell cycle

genes using the function CellCycleSorting() to assign cell cycle scores and most likely phase to

each cell. This data was used to determine whether there were age-related changes in

proliferation patterns of peritoneal macrophages (**Supplementary Figure S1N**).

Singlet identification, doublet removal and cell demultiplexing

Dataset dimensionality was determined using (i) the dimension where the principal

components only contribute 5% of standard deviation, (ii) cumulative PCs contribute 90% of the

standard deviation, and (iii) the dimension where the percent change in variation between the

consecutive PCs is less than 0.1%, using the smallest value. This was determined to be 16 (NIA

v2), 21 (NIA v3) and 16 (JAX v3), respectively.

For all our datasets, potential doublets were annotated using Doubletfinder v2.0.3[131] in

each particular library, using the predicted doublet rate based on cell capture provided by 10x

Genomics. For the NIA v2 dataset, all cells annotated as singlets by Doubletfinder were retained
for downstream analyses.

In addition, for our NIA v3 and JAX v3 libraries, we took advantage of HTO libraries to
add a second layer of doublet identification and removal. Specifically, HTO counts were added
to the Seurat object as an independent assay and normalized using centered log-ratio (CLR)
transformation. Cells were demultiplexed according to their HTO barcode of origin using the
MULTIseqDemux() function into their component samples. For these datasets, cells were
considered to be singlets if and only if they were annotated as singlets by Doubletfinder and
MULTIseqDemux.

Dimensional reduction and cell clustering

Singlet UMI expression data was normalized and scaled for downstream analyses using
SCTransform(), regressing out the impact of number of genes, mitochondrial read load and
predicted cell cycle scores ("vars.to.regress = c("nFeature_RNA", "percent.mito", "S.Score",
"G2M.Score)"). The first N principal components (PCs), where N is the estimated
dimensionality of the dataset (see above) were used to compute the UMAP transformation with
RunUMAP() and cluster cells using FindNeighbors() and FindClusters().

Cell type annotation using SingleR

To identify the most likely cell type annotation for each cell, singlets were annotated
using SingleR v.1.0.1[132], together with the reference ImmGen[133] and the mouse RNAseq[134]
expression datasets. To guarantee annotation robustness, only cells annotated to the same cell
type using both references were kept and annotated with the consensus prediction for all
downstream analyses.

Seurat object merging

After independent pre-processing for each dataset, the 3 cohort datasets were also merged
into a single Seurat object for analysis. Reciprocal PCA was used to integrate data from the 3
datasets and mitigate batch effects, using the top 3000 most variable genes and k = 10 anchors.

Cell type prioritization using AUGUR and cell type proportion analysis

We used the R package AUGUR v1.0.3[135] to determine which peritoneal cell types were
most transcriptionally impacted by age and sex, in the combined and separated objects (**Figure**
1C, Supplementary Figure S1A-H).

We calculated a per library cell type proportion using annotations and analyzed changes
in proportions for the most abundant cell types (B-cells, Macrophages and T-cells) across
biological groups (**Figure 1D**). In addition, as an orthogonal approach, we computed changes in
cell type proportions from the combined and dataset-specific Seurat objects using
'scProportionTest' v0.0.0.9000[46], which runs a permutation test on two different single-cell
groups for each cell type and returns the relative change in cell type abundance between groups
with a confidence interval (**Supplementary Figure S1I-L**).

Peritoneal lavage immune cell proportion

Flow cytometry analysis was used to validate changes in proportions of immune cell
types within the peritoneal cavity from at least two independent cohorts of aged C57BL/6JNia
mice, aged C57BL/6J, OVX *vs*. sham C57BL/6J mice, E2-supplemented C57BL/6J mice, and
Esr1 KO mice. A panel of antibodies was used to evaluate differences in the proportion of B-
cells, macrophages, and T cells (see below). Specifically, among live cell singlets, B-cells were
defined as $CD19^+$, T-cells were defined as $CD3^+$, and macrophages were defined as $F4/80^+$.

Cells were isolated from the peritoneal cavity using a peritoneal lavage. Then, 200,000
peritoneal cells were washed once by adding 1mL of PBS and 2mM EDTA pH 7.2 (Miltenyi
Biotec #130-091-222) supplemented with 0.5% BSA (Miltenyi Biotec #130-091-376; MACS
resuspension buffer) in a 5mL polystyrene round bottom tube (Falcon #352054), then
centrifuged 300g for 10 minutes at 4°C. Cells were resuspended in MACS resuspension buffer in
the presence of FcR-blocking solution (concentration following manufacturer recommended
dilution) for 10 minutes at 4°C. Afterwards, cells were stained with antibodies for 10 minutes at
4°C protected from light, and excess antibody was washed away using MACS resuspension
buffer. Stained cells were then analyzed by flow cytometry on a MACSQuant Analyzer 10
(Miltenyi Biotec #130-096-343), and flow cytometry data was analyzed using FlowLogic V8.
Gating was determined using fluorescence-minus-one [FMO] controls for each color used in the
experiment to ensure that positive populations were solely associated with the antibody for that
specific marker. Raw cytometry data, including FMO controls, were deposited for naïve aging,

sham   vs.   OVX,   E2   supplementation,   and   *Esr1*   KO   to   Figshare   under

10.6084/m9.figshare.28934213, 10.6084/m9.figshare.29169674, 10.6084/m9.figshare.29169737,

and 10.6084/m9.figshare.29169707, respectively.

Peritoneal lavage immune cell yield

To assess the age-related impact to immune cell number within the peritoneal cavity, we

took total peritoneal lavage cell counts from the DeNovix CellDrop and the identified the

fraction of each immune cell types (B-cell, macrophage, T-cell; **Figure 1E**) to calculate original

immune cell numbers in the peritoneal cavity. To calculate the number of immune cell types (B-

cell, macrophage, and T-cell), the total peritoneal lavage cell counts were multiplied by the

fraction of immune cell obtained from flow cytometry (**Figure 1F**).

Isolation of primary peritoneal macrophages

Isolation of primary peritoneal macrophages was performed on aged C57BL/6JNia, aged

C57BL/6J, estrus cycle tracking C57BL/6NTac, OVX *vs*. sham C57BL/6J, E2-supplemented

C57BL/6J, and *Esr1* KO mice following a protocol from Lu et al. 2020[71] with modifications to

remove excess T-cells and B-cells in old animals. Briefly, peritoneal cells were obtained by

using a 25G needle (BD #305125) to inject 10mL of filtered sterilized 3% bovine serum albumin

(BSA) (VWR #0332-500G) in DPBS (Corning, 21-031-CV) into the peritoneal cavity of

euthanized mice. Using a 20-gauge needle (BD #305175), the BSA solution was then harvested

back from the peritoneum, now referred to as "peritoneal lavage". Peritoneal lavages were

centrifuged 300g for 10 minutes at 4°C, and cells were resuspended in 1mL of MACS

resuspension buffer. To remove any potential contaminating red blood cells, samples were

treated with 10mL of 1x Red Blood Cell [RBC] lysis solution (Biolegend #420301) inverted to

mix and incubated at 2 minutes at room temperature, then centrifuged 300g for 10minutes at

4°C. To obtain single cell suspension and removal of cell clumps from RBC lysis, macrophages

were filtered on 30μm MACS SmartStrainers (Miltenyi Biotec #130-110-915).

Peritoneal macrophages were then isolated using Miltenyi Biotec peritoneal isolation kit

(Miltenti Biotec #130-110-434), with modifications to the magnetic labeling step improve purity

of macrophage isolation regardless of age, treatment, and genotype. Indeed, while using the

unmodified manufacturer's protocol, we found that aged mice exhibited poor macrophage purity,

with large contamination of B-cells (likely due to B-cell population expansion with aging;

Figure 1D, E). To improve peritoneal macrophage purity, we routinely added additional biotin

labelled antibodies during the "macrophage (peritoneum) biotin-antibody cocktail" labeling step

to help deplete potential excess B-cells, T-cells and monocytes from peritoneal lavages.

Specifically, 5µL of biotinylated anti-CD19 (Miltenyi Biotec #130-119-757), anti-CD79b

(Miltenyi Biotec #130-105-832), anti-CD3e (Miltenyi Biotec #130-093-179) and anti-Ly6c

(Miltenyi Biotec #130-111-776) antibodies were added during incubation for 10 minutes at 4°C.

After primary antibody incubation, all other steps in isolating peritoneal macrophages were

performed according to the manufacturer's instructions. This allowed us to routinely achieve

high purity for isolated peritoneal macrophages. Magnetic Activated Cell Sorting (MACS)-

purified peritoneal macrophages were used for downstream experiments, including 'omic' and

functional profiling.

Purity and identify of MACS-purified peritoneal macrophages

Potential phenotypic differences in MACS-purified peritoneal macrophage purity were

assessed from independent cohorts of aged C57BL/6JNia, aged C57BL/6J, OVX vs. sham

C57BL/6J, E2-supplemented C57BL/6J, and *Esr1* KO mice. Briefly, 100,000 MACS-purified

peritoneal macrophages were used for flow cytometry labeling. After FcR-blocking,

macrophages were stained using F4/80-APC (1:50; Miltenyi Biotec #130-116-547) and CD11b-

Vioblue (1:50; Miltenyi Biotec #130-113-238) antibodies according to the manufacturer's

instructions. Stained cells were analyzed by flow cytometry on the Miltenyi Biotec MACSQuant

Analyzer 10. Flow cytometry results were processed using the FlowLogic V8 software. Pure

macrophages were designated as double positive F4/80$^+$ CD11b$^+$ cells. From these, large

peritoneal macrophages were defined as F4/80^{+high}, and small peritoneal macrophages were

defined as F4/80^{+low}. The raw flow cytometry data for naïve aging, sham vs. OVX, E2

supplementation, and *Esr1* KO analyses has been deposited to Figshare under

10.6084/m9.figshare.28934198, 10.6084/m9.figshare.29169578, 10.6084/m9.figshare.29169581,

and 10.6084/m9.figshare.29169587, respectively.

1010

RNA purification from primary macrophages and macrophage cell lines

For RNA isolation of primary peritoneal macrophages, frozen cell pellets were

resuspended in 500μL of TRIzol reagent (Thermo-Fisher #15596018), and total RNA was

purified following the manufacturer's instructions. RNA quality was assessed using the Agilent

Technologies 4200 TapeStation system using High Sensitivity RNA ScreenTapes (Agilent

Technologies #5067-5579) together with RNA ScreenTape Sample Buffer (Agilent

Technologies #5067-5577).

For RNA isolation of modified RAW264.7 and J774A.1 cells (see below), 60-80%

confluency in a 6-well plate were lysed using 1mL of TRIzol reagent, and RNA was extracted

using DirectZol columns (Zymo #R2052) following manufacturer's protocol.

1021

1022   RNA-seq library preparations for primary peritoneal macrophages and macrophage cell

1023   lines

For primary peritoneal macrophages, we constructed ribosomal RNA depleted strand-

specific bulk RNA-sequencing libraries in house as previously described Lu et al. 2021[24].

Briefly, 450ng of total RNA was subjected to ribosomal-RNA depletion using the NEBNext

rRNA Depletion Kit v2 (New England Biolabs #E705X), according to the manufacturer's

protocol. Strand specific RNA-seq libraries were then constructed using the SMARTer Stranded

RNA-seq Kit (Clontech #634841, #634863), according to the manufacturer's protocol. Libraries

were quality controlled on the Agilent Technologies 4200 TapeStation system with Agilent

Technologies D1000 ScreenTape and Agilent Technologies D1000 reagent, before multiplexing

the libraries for sequencing. Paired-end 150bp reads were generated on the Illumina Novaseq X

or Novaseq 6000 platforms at Novogene USA. Raw FASTQ sequencing reads were deposited to

SRA under Bioprojects accession PRJNA1095555 and PRJNA1101936.

For macrophage cell line derived samples, total RNA samples were sent to the Novogene

corporation for unstranded mRNA-sequencing. Briefly, the company performed mRNA selection

using poly (A) capture, RNA fragmentation, cDNA reverse transcription and then unstranded

RNA sequencing library preparation. RNA libraries were sequenced as paired-end 150bp reads

on the Illumina Novaseq X or Novaseq 6000 platforms. Raw FASTQ sequencing reads were

deposited to SRA under Bioprojects accession PRJNA1096052 and PRJNA1222371.

1041

1042   RNA-seq analysis pipeline

Paired end 150bp FASTQ reads were hard-trimmed to 100bp at their 3' end to improve

mapping rates and the first 9bp at the 5' end were trimmed to eliminate priming biases[136]. This

was done using Fastx Trimmer 0.0.13 (https://github.com/agordon/fastx_toolkit), or Trimgalore

0.6.6 (github.com/FelixKrueger/TrimGalore) after a system upgrade made it impossible to use

Fastx Trimmer. For Trimgalore, additional required stringency filters were added to eliminate

any bases with phred score < 15 (corresponding to < 1% of bases). Trimmed reads were mapped

to the mm10 genome reference using STAR 2.7.7a[137]. Read counts were assigned to genes from

the UCSC mm10 reference using featureCounts from subread 1.5.3[138], using either the stranded

or unstranded option based on library construction (see above). Read count tables were imported

into R 3.6.3[127] for downstream processing. Based on general RNA-seq processing guidelines,

only genes with mapped reads in at least half of the samples in each analysis were considered to

be expressed and retained for analysis.

The 'DESeq2' R package v1.26.0 was used for normalization and differential gene

expression analysis of the RNA-seq data in R[139] using appropriate analytical covariates (*e.g*. sex,

age, treatment, etc.). Genes with a false discovery rate < 5% in any analysis were considered

statistically significant. For analysis of sex-specific age-regulation of genes, we considered a

gene to be specifically regulated with age in females (males) if the DESeq2 FDR was < 5% in

females (males) and > 10% in males (females). DESeq2 results are reported in **Supplementary**

Table S2A.

1062

ATAC-seq library generation for primary peritoneal macrophages

A second independent cohort of C57BL/6JNia mice was used to assess the impact of age

and sex on peritoneal macrophage chromatin accessibility (**Supplementary Table S1A**). We

constructed ATAC-seq libraries in house as described Lu et al. 2021[24], using the omni-ATAC

protocol and starting from 50,000 MACS-purified peritoneal macrophages[53]. Libraries were

quality controlled using the Agilent Technologies 4200 TapeStation system with Agilent

Technologies High Sensitivity D1000 DNA ScreenTape and reagent before multiplexing the

libraries for sequencing. Paired-end 150bp reads were generated on the Illumina Novaseq 6000

platform at Novogene USA. Raw FASTQ sequencing reads were deposited to SRA under

Bioproject accession PRJNA1095555.

1073

ATAC-seq preprocessing pipeline

Paired-end ATAC-seq reads were adapter-trimmed using NGmerge 0.3[140], a tool recommended for use in ATAC-seq preprocessing which clips overhanging reads in a sequence-independent fashion. Trimmed paired-end were mapped to the mm10 genome reference using bowtie2 v2.5.1[141]. After alignment, PCR duplicates were removed using the 'rmdup' function of samtools 0.1.19[142]. Reads from all samples were pooled define "meta-peaks" for robust differential accessibility analysis using samtools 'merge'. We used MACS2 v2.2.7.1 to identify ATAC-seq accessible regions[143]. A normalized read count matrix was then obtained using our mapped read bam files over MACS2 meta-peaks using R package 'Diffbind' 2.14[144], which was used for downstream analyses. 'DESeq2' 1.26.0 was used for normalization and differential gene expression analysis of ATAC-seq data in R[139] using appropriate analytical covariates (*e.g*. sex, age). Peaks with a false discovery rate < 5% in any analysis were considered statistically significant. For analysis of sex-specific age-regulation of chromatin region accessibility, we considered a chromatin region to be specifically remodeled with age in females (males) if the DESeq2 FDR was < 5% in females (males) and > 10% in males (females). DESeq2 results are reported in **Supplementary Table S2B**.

H4K4me3 CUT&RUN library generation for primary peritoneal macrophages

A third independent cohort of C57BL/6JNia mice was used to assess the impact of age and sex on peritoneal macrophage H3K4me3 landscapes (**Supplementary Table S1A**). We used a CUT&RUN protocol adapted from the kit manual from EpiCypher, with modifications to account for the use of immune cells (*i.e*. to avoid unscheduled immune activation from ConA signaling on cells). All buffers were made in-house.

Nuclei isolation

250,000 MACS-purified peritoneal macrophages were harvested and resuspended in 100µL of 1X DPBS. Samples were centrifuged for 3 min at 600g at room temperature and supernatant was discarded. Cells were resuspended in 100µL of ice-cold Nuclear Extraction Buffer (20mM HEPES [Sigma-Aldrich #H3375], pH 7.9, 10mM KCl [Sigma-Aldrich # P9541], 0,1% Triton X-100 [VWR # M143], 20% Glycerol [VWR # BDH1172], 0.5mM Spermidine [EMD Millipore # 56766] and 1x Protease Inhibitor [Roche #11873580001]) and incubated on

1105 ice for 10 min. Samples were centrifuged for 3 min at 600g at 4 °C and supernatant was
1106 removed. Samples were resuspended in 100µL of ice-cold Nuclear Extraction Buffer and kept on
1107 ice until further processing.

1108

Concanavalin A bead activation

11µL per sample of gently resuspended Concanavalin A (ConA) beads were transferred
to fresh 1.5mL tubes. Tubes were placed on a magnetic separation rack until slurry cleared and
supernatant was removed. 100µL of ice-cold Bead Activation Buffer (20 mM HEPES, pH 7.9,
10 mM KCl, 1 mM $CaCl_2$ and 1 mM $ManCl_2$) was added to each tube and pipetted 10 times to
mix and wash the beads for a total of two washes. Washed beads were resuspended in 11µL of
ice-cold Bead Activation Buffer. 10µL of activated bead slurry was transferred into fresh 1.5mL
tubes. Beads were kept on ice until further processing.

1117

Immunolabeling of chromatin

Isolated nuclei were collected by centrifugation at for 3 min at 600g at 4 °C and
supernatant was discarded. Nuclei were resuspended in 100µL of Wash Buffer (20mM HEPES,
pH 7.5, 150mM NaCl, 0.5mM Spermidine and 1x Protease Inhibitor) and transferred to the tubes
containing the activated Concanavalin A beads. Samples were incubated at room temperature for
10 min. Tubes were placed on a magnetic separation rack until slurry cleared and supernatant
was removed. 50µL of ice-cold Antibody Buffer (20mM HEPES, pH 7.5, 150mM NaCl, 0.5mM
Spermidine, 1x Protease Inhibitor, 0.01% Digitonin and 2mM EDTA) was added to each sample.
0.5µL of anti-H3K4me3 antibody (Active Motif #39159) was added to each sample. Samples
were incubated on a nutator overnight at 4°C. Tubes were placed on a magnetic separator rack
until slurry cleared and supernatant was removed. While keeping the tubes on the magnetic
separator, 250µL of ice-cold Digitonin Buffer (20mM HEPES, pH 7.5, 150mM NaCl, 0.5mM
Spermidine and 1x Protease Inhibitor and 0.01% Digitonin) was added to the tubes and
supernatant was removed without disturbing the tubes. Digitonin Buffer wash step was repeated
once more for a total of two washes. 50µL of ice-cold Digitonin Buffer was added.

1133

pAG-MNase binding and DNA purification

2.5µL of CUTANA pAG-MNase (EpiCypher # 15-1016) was added to each sample and

gently mixed by vortexing. Samples were incubated at room temperature for 10 min and placed

on a magnetic separator. Supernatant was removed by pipetting. While the tubes were on the

magnet separator, 250µL of ice-cold Digitonin Buffer was added to each sample and removed.

Digitonin Buffer wash step was repeated once more for a total of two washes. 50µL of ice-cold

Digitonin Buffer was added to the tubes and gently mixed by vortexing. 1µL of 100mM CaCl$_2$

was added to each sample and gently mixed by vortexing. Samples were incubated on a nutator

for 2 hours at 4°C. 33µL of Stop Buffer (340mM NaCl, 20mM EDTA, 4mM EGTA, 50µg/mL

RNaseA, 50µg/mL GlycoBlue Coprecipitant) was added to each sample. Samples were

incubated at 37 °C for 10 min in a thermocycler. Samples were placed on a magnetic separator

until slurry cleared and the supernatant was collected to new 1.5 ml tubes. DNA purification was

performed using the DNA Clean & Concentration-5 kit (Zymo Research #D4013) according to

the manufacturer's instructions.

1148

Sequencing library preparation and sequencing

CUT&RUN sequencing libraries were prepared using the NEBNext Ultra II Library Prep

Kit for Illumina kit (NEBNext #E7645), according to the manufacturer's instructions. H4K4me3

CUT&RUN libraries were multiplexed and sent for sequencing on the Illumina NovaSeq 6000

platform to Novogene USA. De-multiplexed FASTQ files were provided by Novogene for data

analysis. Raw FASTQ sequencing reads were deposited to SRA under Bioproject accession

PRJNA1095555.

1156

1157

H4K4me3 CUT&RUN preprocessing pipeline

Paired-end H4K4me3 CUT&RUN reads were adapter-trimmed using NGmerge 0.3[140].

Trimmed paired-end were mapped to the mm10 genome reference using bowtie2 v2.5.1[141]. After

alignment, PCR duplicates were removed using the 'rmdup' function of samtools 0.1.19[142].

Reads from sequenced samples were pooled in order to define "meta-peaks" for robust

differential accessibility analysis using samtools 'merge'. We used MACS2 v2.2.7.1 to identify

H4K4me3 modified regions[143]. A normalized read count matrix was then obtained using our

mapped read bam files over MACS2 meta-peaks using R package 'Diffbind' 2.14[144], which was

used for downstream analyses. 'DESeq2' 1.26.0 was used for normalization and differential gene

expression analysis of H4K4me3 CUT&RUN data in R[139] using appropriate analytical covariates

(*e.g.* sex, age). Peaks with a FDR < 5% in any analysis were considered statistically significant.

For analysis of sex-specific age-regulation of H4K4me3 signal intensity, we considered a

chromatin region to be specifically remodeled with age in females (males) if the DESeq2 FDR

was < 5% in females (males) and > 10% in males (females). DESeq2 results are reported in

Supplementary Table S2C.

1173

1174 **Multidimensional Scaling analysis**

1175 To perform Multidimensional Scaling (MDS) analysis, we used a simple distance metric

1176 between samples based on the Spearman's rank correlation value (1-Rho), which was then

1177 provided to the core R command 'cmdscale'. Dimensionality reduction was applied to DESeq2-

1178 normalized data, obtained as described in relevant sections above.

1179

Putative Protein-Protein Interaction [PPI] network analysis with NetworkAnalyst

Genes with significant regulation with aging in female or male peritoneal macrophages

(DESeq2 FDR < 5%; **Supplementary Table S2A**) were used as input for network analysis with

NetworkAnalyst 3.0[60]. Significant age-regulated genes in each sex and their corresponding

DESeq2 computed $\log_2$(fold-change) were used as input. In both cases, we had NetworkAnalyst

use PPI information derived from IMEx/InnateDB data, a knowledgebase specifically geared for

analyses of innate immune networks[61], to construct putative PPI networks. In each case, the

largest subnetwork determined by NetworkAnalyst was used in our analyses (**Figure 3A, B**).

1188

1189 **Functional enrichment analysis by Gene Set Enrichment Analysis**

1190 We used the Gene Set Enrichment Analysis (GSEA) paradigm[145] through the 'phenotest'

1191 v1.34.0 package. Significance was calculated using 10,000 permutations.

1192

GSEA analysis using Gene Ontology and Reactome gene sets

Gene Ontology term annotation were obtained from ENSEMBL through Biomart

(Ensembl 108; downloaded on 2022-12-21), and gene-term association with only author

statement support (GO evidence codes 'TAS' and 'NAS') or unclear evidence (GO evidence

code 'ND') was filtered out. The Reactome annotations were obtained from the Molecular

Signature Database mouse v2022.1[66]. For RNA-seq GSEA analysis, differential gene regulation

information and gene-centric statistics were obtained directly from the DESeq2 result table

without further processing. For ATAC-seq and H3K4me3 CUT&RUN GSEA analyses, the

peak-centric DESeq2 result tables were first processed to generate gene-centric results

compatible with GSEA. Specifically, only peaks with 10kb of annotated TSSs according to

HOMER v5.1 'annotatePeaks.pl' script[98] were retained. For ATAC-seq, to capture the most

strongly remodeled regulatory elements, the gene-centric data was obtained by capturing the

DESeq2 statistics for the peak with the most significant DESeq2 FDR, and in the case of peaks

tied for FDR, with the largest absolute $\log_2$(fold change) with aging among tied peaks for each

annotated gene. For H3K4me3 CUT&RUN, to capture the peak most representative of gene

promoters (since H3K4me3 is a modification typical of promoters), the gene-centric data was

obtained by capturing the DESeq2 statistics for the peak closest to each annotated gene.

In all cases, from gene-centric result tables, the DESeq2 t-statistic was used to generate

the ranked list of genes for functional enrichment analysis with aging in female and male

macrophages separately. The 'gsea' function from phenotest' was run on gene sets with a size of

20 to 5000 genes, filtering too small or too large gene sets, so as to improve biological

robustness. For ease of reading, only the top 5 most significant sex-specific gene sets or top 10

most significant sex independent gene sets are shown in figures, with all shown gene sets passing

FDR < 5%. All significantly regulated gene sets are reported in **Supplementary Tables S3**.

1217

GSEA analysis of curated gene sets for top functional processes

For curated gene set analyses (**Figure 3F-H**), we used curated gene sets for validation of

important top curated processes. Specifically, we curated candidate regulators of phagocytosis

from CRISPR/Cas9 screens based on results reported by Haney et al. 2018 and Pluvinage et al.

2019[64,65]. We obtained mouse Hallmark curated gene sets "Glycolysis" and "Oxidative

Phosphorylation" from the Molecular Signature Database mouse v2022.1[66]. We obtained a set of

genes upregulated in M1 and M2 *in vitro* polarized BMDMs, by reanalyzing a publicly available

RNA-seq dataset (accession number GSE103958)[67]. Briefly, downloaded FASTQ reads were

mapped using STAR, a count table generated using featureCounts from subread, and differential

gene expression analysis was performed using DESeq2 comparing M0 (untreated) vs. M1 (IFNg

LPS treated) BMDMs, and M0 (untreated) vs. M1 (IL4 or IL13 treated) BMDMs. Genes with

FDR < 5% and upregulated upon M1/M2 treatments were used as signatures of polarization for

analysis (M1: 1392 genes; M2: 760 genes; **Supplementary Table S4C**).

1231

GSEA analysis of macrophage-regulated gene sets

To compare the impact of various interventions on macrophage transcriptomes to that of

aging in peritoneal macrophage from female mice, we also leveraged a GSEA approach.

Specifically, we used our various RNA-seq experiments to identify genes significantly regulated

in response to *in vivo* interventions (*i.e.* OVX vs. Sham, E2-supplementation vs. Vehicle, *Esr1*

KO) or *in vitro* modulation (*i.e.* TF gene shRNA knockdown; see below).

In all cases, we performed DESeq2 differential gene expression analysis of our datasets to

identify genes with significant regulation across our conditions (see above). For RNA-seq

datasets measuring the impact of *in vivo* interventions on primary peritoneal macrophage

transcriptomes, we obtained gene sets corresponding to genes significantly upregulated or

downregulation in response to the intervention at FDR < 5%. These lists were then used as gene

sets for GSEA analysis with phenotest (**Figure 5D, J, P**). For *in vitro* modulation of TF gene

expression datasets, we used a more stringent definition for target gene sets to limit the impact of

hairpin-specific off-target effects. Specifically, for each candidate TF, we performed differential

expression analysis comparing control (i.e. non mammalian and luciferase hairpins) to each

hairpin separately. To identify robust and consistent transcriptional targets, we then performed

Fisher combination of adjusted p-values across both hairpins (analytical tables provided in

Supplementary Table S6C-G). Genes were considered to be significant transcriptional targets

of a candidate TF if and only if (i) they showed consistent direction of transcriptional regulation

across both hairpins, and (ii) if their Fisher combined adjusted p-values were $< 10^{-4}$ as a stringent

filter. Heatmaps showing consistent regulation for the chosen gene sets to be used for GSEA

analysis are reported in **Supplementary Figure S6G**, showing that our approach identifies

consistent transcriptional targets. These lists were then used as gene sets for GSEA analysis with

phenotest (**Figure 6G**).

1256

Growth and maintenance of cell lines

All cell lines were cultured in a humidified incubator under 5% CO_2-95% air at 37°C.

L929 cell line (ATCC CCL-1) were cultured with Dulbecco's Modified Eagle's Medium/ Hams

F-12 50/50 mix (DMEM/F-12 50/50; Corning #10-090-CV) supplemented with 10% fetal bovine

serum (FBS) (Sigma-Aldrich #F0926), and 1x penicillin streptomycin L-glutamine (Corning #

30-009-Cl). L929 cells were seeded in vented T175 tissue culture flasks (VWR #10062-864) at

10% confluency. Once cells reached around 80% confluency, conditioned media was collected

and filtered through a 0.45μM filter (GenClone #25-246). Conditioned media was stored at -

20°C until use (see below). HEK293T (ATCC CRL-3216), RAW264.7 (ATCC TIB71), and

J774A.1 (ATCC TIB-67) were cultured with Dulbecco's Modified Eagle's Medium (DMEM)

(Corning #15-013-CV) supplemented with 10% FBS, and 1x penicillin streptomycin L-

glutamine. Media was changed every 2-3 days. To passage cell lines, L929, HEK293T, and

RAW264.7 cells were detached using 0.05% trypsin (Coring #25-052-Cl) for 5 minutes at 37°C.

After incubation, trypsin was neutralized by adding double the volume of complete media to the

trypsin used. Cells were pelleted by centrifugation at 300g for 5 minutes at room temperature.

For passaging of J774A.1 cells, cells were detached using a cell lifter (VWR #76036-006). Cells

were collected and pelleted at 300g for 5 minutes at room temperature. Supernatant was

discarded and cells were resuspended with 1mL of complete media. Cells were seeded at lower

densities in a new tissue culture plate as needed based on experimental needs. All cell lines were

re-authenticated after establishing culture in the laboratory using the ATCC cell line STR

profiling service to confirm their identity in presented experiments.

1278

Culture of primary peritoneal macrophages and BMDMs

All primary macrophages were cultured in a humidified incubator under 5% CO_2-95% air

at 37°C. MACS-purified peritoneal macrophages were cultured in macrophage media

(DMEM/F-12 50/50 supplemented with 10% FBS, 1x antibiotic antimycotic (Gibco #15240-

062), 10% L929 conditioned media and 2ng/mL M-CSF (Miltenyi Biotec #130-101-706)) in

non-treated tissue culture plates. Bone marrow cells were obtained from the hind legs of aged

C57BL/6JNia, aged C57BL/6J and estrus cycle tracked C57BL/6NTac mice following as

before[71]. Briefly, after bone marrow harvest following Amend et al. 2016 protocol[71,146], cells

were resuspended in 1mL of MACS resuspension buffer and treated with 1x RBC lysis solution

for 2 minutes at room temperature, then centrifuged at 300g for 10minutes at 4°C. Resuspended

RBC-lysed bone marrow cells were then filtered on a 70μM filter to remove debris and clumps

(Miltenyi Biotec #130-110-916). Cells were then transferred to macrophage media for culture in

T75 vented untreated tissue culture flasks (Greiner Bio-One #658195) for differentiation into

bone marrow derived macrophages. After 3 days, the media was replaced with fresh macrophage

media and differentiation continued for a total of seven days after euthanasia and bone marrow

harvest. Obtained BMDMs were then used for downstream experiments (*i.e.* phagocytosis assay

(**Supplementary Figure S4B**) and Agilent Seahorse metabolic profiling (**Figure 4I, J,**

Supplementary Figure S4J, K).

1297

Analysis of macrophage phagocytic capacity

We used our previously described microscopy-based phagocytosis assay protocol[71] and a

new streamlined flow cytometry-based phagocytosis assay protocol to quantify the phagocytic

capacity of primary macrophages and macrophage cell lines.

Briefly, for the microscopy protocol, 75,000 macrophages were seeded in a 24-well plate

with a 12mm glass coverslip (Electron Microscopy Sciences #72231-01), with technical

duplicates for each animal. Macrophages were allowed to attach overnight, before treatment for

1 hour with 1mg/mL Alexa Fluor 488-labelled Zymosan bioparticles (Invitrogen #Z23373)

diluted in macrophage media. After 1-hour, Zymosan particles were washed three times with ice-

cold DPBS, and cells were fixed with 4% formaldehyde (Macron #H121-05) for 10 minutes at

room temperature. After fixation, coverslips were washed three times with DPBS and mounted

on microscope slides (VWR #48311-703) with prolong diamond antifade mounting medium with

DAPI (Invitrogen #P36962). Images of phagocytosis were acquired using the Keyence

microscope (Keyence #BZ-X710) with the 10x objective. Stitched images of a 3 by 3 field were

then counted by blinded experimenters. To quantify Zymosan-internalized (green fluorescent)

cells and total cell number, images were analyzed using ImageJ software[147]. Total cell counts

were determined by identifying DAPI-stained nuclei using the "Analyze Particles" function

following appropriate thresholding. Due to the possibility of multiple phagosomes within a

single cell, Zymosan-positive cells were manually counted to ensure accurate identification of

individual phagocytic cells The phagocytosis index was determined by calculating the ratio of

Alexa Fluor 488–positive cells to the total number of cells. Phagocytosis images for aging and

estrus cycling has been deposited to Figshare under 10.6084/m9.figshare.29286194 and
10.6084/m9.figshare.29286206, respectively.

For our new flow cytometry-based protocol, 100,000 macrophages were first blocked
with FcR-blocking reagent for 10 minutes at 37°C. For primary MACS-purified peritoneal
macrophages, we also included an additional staining step with F4/80-APC (Miltenyi Biotec
#130-116-547) for downstream data filtering. For both primary and immortalized macrophages,
cells were then treated with Alexa Fluor 488-labelled Zymosan bioparticles as above, targeting
with a multiplicity of infection (MOI) of 2 per macrophage for 30 minutes at 37°C. After
treatment, macrophages were fixed with a final concentration of ice cold 2% formaldehyde
solution (Macron #H121-05) at 4°C protected from light. Macrophages were washed twice and
resuspended in 500uL of MACS resuspension buffer, then analyzed on the MACSQuant
Analyzer 10 to phagocytosis capacity. Gating was determined using fluorescence-minus-one
[FMO] controls for each color used in the experiment to ensure that positive populations were
solely associated with the antibody/particle Analysis was performed in Flowlogic V8 software.
Flow cytometry data for aging, sham vs. OVX, E2 supplementation, *Esr1* KO, RAW264.7
phagocytosis regulator knockdown, RAW264.7 transcription factor candidate knockdown, and
J774A.1 Irf2 knockdown phagocytosis has been deposited to Figshare under
10.6084/m9.figshare.29161955, 10.6084/m9.figshare.29169836, 10.6084/m9.figshare.29169821,
10.6084/m9.figshare.29169860, 10.6084/m9.figshare.29169821, 10.6084/m9.figshare.29169872,
10.6084/m9.figshare.29169899, and 10.6084/m9.figshare.29286278, respectively.

1339

Cell surface marker protein level quantification by flow cytometry
To estimate potential differences in peritoneal macrophage surface markers (*i.e.* Zymosan
pattern recognition receptors, M1/M2 markers) with respect to sex and age, 100,000 MACS-
purified peritoneal macrophages were subjected to Fc receptor blocking (Miltenyi Biotec #130-
092-575) and stained with corresponding antibodies according to the manufacturer's instructions.
For analysis of pattern recognition receptors, cells were stained with F4/80-Brilliant Violet 421
(1:20) (Biolegend #123131), Dectin-1-PE (1:10) (Miltenyi Biotec #130-102-284), and CD282
(Tlr2)-APC (1:50) (Miltenyi Biotec #130-120-052). For M1 marker detection, cells were stained
with CD80-FITC (1:20) (Biolegend #104705) and CD86-APC (1:20) (Biolegend #105011). For
M2 marker detection, cells were stained with CD163-PE (1:20) (Biolegend #111803) and

CD206-APC (1:20) (Biolegend #141707). After gating on F4/80 positive cells, we obtained median fluorescent intensity (MFI) of stained cells for surface proteins of interest using flow cytometry quantification on the Milteni Biotec MACSQuant Analyzer 10. Flow cytometry results were processed using the FlowLogic V8 software. Flow cytometry data has been deposited to Figshare under 10.6084/m9.figshare.29162144.

Metabolic profiling of macrophages using the Agilent Seahorse platform

50,000 BMDMs or transduced macrophage cell lines (RAW264.7, J774A.1) cells were seeded in a 96-well Seahorse assay plate with macrophage media (or appropriate culture media) and incubated overnight for cells to attach. To characterize the bioenergetics of cells, a XF–96 Flux Analyzer (Agilent Technologies) was used. Growth media was replaced with 175μL of XF assay medium (specially formulated, unbuffered Dulbecco's modified Eagle's medium for XF assay; Agilent Technologies #103575-100) supplemented with 1mM sodium pyruvate at pH 7.4 (Agilent Technologies #103578-100). The cells were kept in a non-CO_2 incubator for 60 minutes at 37°C before placing in the analyzer. Oxygen consumption rate [OCR] and extracellular acidification rate [ECAR] were measured using 3 cycles of 3 minutes wait and 4 minutes measure time. Each biological replicate had three technical replicates and the results obtained were averaged. Injection of compounds and calculating metabolic parameters were obtained by following an established protocols for macrophages[78].

To normalize OCR and ECAR values to actual live/seeded cell number, the cell media was removed from 96-well plates at the end of the assay and air died for around 10 minutes before storage at -80°C at least overnight to initiate cell lysis. To finalize cell lysis, 100μL of nuclease-free water was added to each well and incubated at 37°C for 1 hour, and plates were refrozen for > 1 hour at -80°C. Plates were thawed at room temperature, and 200μg/mL Hoechst (Thermo Scientific #H1399) in TNE buffer (10mM Tris [Thermo scientific #J22675-A1], 1mM EDTA [VWR #BDH7830-1], 2M NaCl [Sigma-Aldrich #S5150-1L], pH 7.4) was added to each well. Plates were read at excitation 346 and emission 460 on Molecular Devices SpectraMAX M3. Fluorescent values were then used to divide the OCR and ECAR values to obtain normalized, comparable values. Seahorse data for aging, estrus cycling, transcription factor candidate knockdown in RAW264.7, and *Irf2* knockdown in J774A.1 has been deposited under

1380   10.6084/m9.figshare.29169911, 10.6084/m9.figshare.29169920, 10.6084/m9.figshare.29169926

1381   , and 10.6084/m9.figshare.29169938, respectively.

1382

Measurement of macrophage glycolytic function using Lactate-Glo

30,000 MACS-purified peritoneal macrophages or RAW264.7/J774A.1 cells were seeded

into a 96-well plate tissue culture plate (GenClone #25-109) with 100μL of fresh media. Then,

48 hours after seeding (primary peritoneal macrophages) or 24 hours (macrophage cell lines), the

conditioned media was collected and stored at -20°C until further processing. To note, for this

experiment, transduced RAW264.7/J774A.1 cells were cultured without puromycin (see below)

to avoid metabolic abnormalities due to the impact of puromycin on mitochondrial function[148].

To measure the amount of lactate in the condition media, Lactate-Glo (Promega #J5021) was

used following to the manufacturer's protocol and luminescence values were collected using

Promega GLOMAX (Promega #GM3500) plate reader. Luminescence values were normalized

to actual live/seeded cell numbers using the same method as for the Seahorse assay (see above).

1394

Lentiviral particle production for shRNA-mediated gene knockdown

In all cases, plasmid DNA was isolated from overnight cultures using mini-preps from

the Macherey-Nagel NucleoSpin Plasmid kit (Macherey-Nagel #740588.250) according to the

manufacturer's protocol, and DNA was sent to GENEWIZ or Plasmidsaurus for sequence

validation before use in any experiment.

We used a lentiviral shRNA particle approach to mediate gene-specific RNA interference

and evaluate the impact of decreased gene expression of candidate phagocytosis regulators or

TF-mediators on macrophage phenotypes. We obtained 3rd generation of lentiviral vector

packaging backbones from Addgene: pMDLg/pRRE (Addgene #12251), pRSV-Rev (Addgene

#12253), VSV.G (Addgene #14888). To guarantee single clone origin of laboratory isolates,

bacteria were re-streaked on a 100μg/mL carbenicillin (Sigma-Aldrich #C3416) Luria broth (LB;

Thermo Scientific #J75852-A1) 1% agar (Invitrogen #30391-023) plates and incubated overnight

at 37°C. For plasmid preparation, single colonies were isolated and inoculated into culture tube

containing 100μg/mL carbenicillin in LB media for culture at 37 °C with shaking for 16-20

hours for each construct. Plasmid DNAs were obtained using the NucleoBond Xtra midi plus EF

kit (Macherey-Nagel #740422.50) following manufacturer's recommendation.

MISSION® shRNA control and target bacterial glycerol stocks were obtained from

Sigma-Aldrich (**Supplementary Table S1G-H**). To obtain single bacteria colonies, frozen

glycerol stocks were inoculated into sterile culture tubes (Genesee Scientific #21-129) containing

0.5mL terrific broth (TB) (Sigma-Aldrich #T0918-1KG) without antibiotics and incubated at 37

°C with shaking for 30 minutes. Next, 50μL of bacteria pre-cultures was spread on prewarmed

100μg/mL carbenicillin TB 1% agar plate, and incubated for 16 hours at 37 °C. For plasmid

preparation, a single colony was isolated from the plate and inoculated into a culture tube

containing 100μg/mL TB, incubated at 37 °C with shaking for 16-20 hours for each construct.

To produce a large quantity and endotoxin free plasmid DNA, 200mL of 100μg/mL TB bacteria

culture was inoculated and incubated at 37°C with shaking for 20 hours. Plasmid DNAs were

obtained using the NucleoBond Xtra midi plus EF kit (Macherey-Nagel #740422.50) following

manufacturer's recommendation.

Lentiviral particles were produced by transfection of HEK293T cells using the calcium

phosphate transfection method[149]. Transfection mixtures were prepared by combining plasmid

DNA (contained pMDLg/pRRE (1,000 ng), VSV.G (500 ng), pRSV-Rev (500 ng), and the

pLKO shRNA plasmid of interest (1000ng)), with 2.5 M calcium chloride (Sigma-Aldrich

#C1016-500G) and mixing with 0.22μM filter sterilized 2xHEPES-buffered saline ([HBS]

140mM NaCl, 1.5mM $Na_2HPO_4 \cdot 2H_2O$ (VWR #0348-500G), 50mM HEPES)) to form DNA-

calcium phosphate complexes. The DNA-calcium phosphate complexes were formed for 2

minutes at room temperature and then added dropwise on HEK293T cells at 60-80% confluency.

HEK293T were incubated with DNA-calcium phosphate complexes for 16 hours, then media

was changed to fresh complete media. After 24 hours, supernatants containing viral particles

were collected and filtered using a 0.45μM filter to remove cells.

To concentrate lentiviral particles before use, supernatant was carefully layered on top of

a layer of 20% sucrose (Sigma-Aldrich #S0389-1KG) in DPBS solution in a Beckman Coulter

polypropylene quick-seal centrifuge tube (Beckman Coulter #343414). Viral preps were

centrifuged at 70,000 x g for 2 hours at 4°C in an Optima XPN-100 Ultracentrifuge (Beckman

Coulter #B10053). After centrifugation, the layered supernatant was removed, and viral pellets

were resuspended and concentrated 100x in ice cold DPBS. Lentiviral particles were aliquoted

and stored at -80°C until experiments.

1441

Lentiviral transduction of macrophage cell lines

Macrophage cell lines were seeded at a density of 30,000 cells per well in a 96-well tissue culture plate (GenClone #25-109) and incubated for 48 hours. During this period, cells were treated with various concentrations of puromycin in complete media (10, 8, 6, 4, 2,1μg/mL) (Sigma-Aldrich #P8833), to assess cytotoxicity. On the second day, 100μL of the culture medium in each well was replaced with fresh medium containing the corresponding concentration of puromycin. Following the manufacturer's instructions, CyQUANT™ XTT Cell Viability (Invitrogen #X12223) assay reagents were added to each well to assess cell viability. The plates were then incubated for 4 hours at 37 □°C. Absorbance was measured at 450 □nm and 660 □nm using a microplate reader. Specific absorbance values were calculated by subtracting the 660 □nm reference readings from the 450 □nm readings.

For transduction, 200,000 cells from macrophage cell lines (RAW264.7, J774A.1) were seeded in a 12-well tissue culture plate (GenClone #25-109) one day before infection. The next day, cells were infected with viral particles at a MOI of 1 in the presence of 8μg/mL polybrene (Sigma-Aldrich #TR-1003-G). After 24 hours, the media was replaced with fresh complete media. 48 hours after infection, cells were selected using complete media with addition of 10μg/mL of puromycin (Sigma-Aldrich #P8833), as determined with our in house kill curve for these cells (see above). Molecular and/or functional profiling of modified cells was performed on puromycin-selected macrophage cells cultured in complete media supplemented with 10μg/mL puromycin, expect for metabolic assays where 24 hours prior, media was changed to complete media without puromycin.

Reverse transcription quantified PCR verification of shRNA gene knockdown

Total RNA was reverse transcribed into complementary DNA (cDNA) using the Thermo Scientific™ Maxima H Minus First Strand cDNA Synthesis Kit (Thermo scientific #K1682), according to the manufacturer's instructions. Quantitative PCR was performed using the SensiFAST SYBR No-ROX Kit (Bioline #BIO-98020) with gene-specific primers (For sequences see **Supplementary Table S1I**) to assess relative gene expression. cDNA, primers, and SYBR master mix were first combined in a PCR tube to ensure a homogeneous mixture, then transferred into Mic qPCR-specific tubes (QuantaBio #95910-20) for amplification using the Mic qPCR Cycler (Bio Molecular Systems #MIC-2). Gene expression levels were quantified

1473   using the ΔΔCt method and normalized to the geometric mean of three housekeeping genes (*18s*,

1474   *Hprt*, and *Ubc*).

1475

Vaginal cytology determination of estrus cycling

Vaginal lavages were obtained using a standard protocol[150]. Lavages were deposited to

glass slides (VWR #48311-703) and left to dry for at least 24 hours. Vaginal cytology slides

were stained for 30 seconds 1% Thionin (Alfa Aesar #A18192), in 20mM acetic acid (Sigma-

Aldrich #695092-2.5L-GL), 0.36mM Sodium Hydroxide (Sigma-Aldrich #221465-500G) at pH

4.0. Excess thionin staining was washed twice in MilliQ water. Slides were dehydrated for 30

seconds in 70%, 95%, and 100% ethanol, then air dried overnight before microscopic analysis.

Slides were viewed under a microscope at 20x magnification identify the estrus phase each

mouse was in at the time of sample collection (**Supplementary Table S1C**).

1485

Motif analysis in remodeled chromatin regions

To identify potential TFs regulating sex-specific aging phenotypes in macrophages,

ATAC-seq and H3K4me3 peaks with age-related remodeling in only one sex were obtained (see

above for criteria). Motif finding was performed using HOMER v5.1 'findMotifsGenome.pl'

script[98], using all robustly detected metapeaks as enrichment background and the mm10

reference genome. We focused on results for enrichment of known motifs reported in

"knownResults.txt". Top TF motifs corresponding to TF genes significantly regulated with

female aging are shown in **Figure 6C, D**. All enriched motifs from our analyses are reported in

Supplementary Table S7A. To confirm enrichment of Irf2-related binding motifs, Irf2 peaks

(see below) were used with the same pipeline, and selected motifs are reported in

Supplementary Figure S6F.

1497

SCENIC analysis of regulon activity in single cell RNA-seq analysis

As an orthogonal method to evaluate candidate TF activity in aging female and male

macrophages, we took advantage of macrophages identified in our scRNA-seq datasets (see

above) and applied the SCENIC algorithm to our data[99]. We applied the SCENIC pipeline using

R packages SCENIC v1.1.2-01, RcisTarget v1.6.0, GENIE3 v1.8.0 and AUCell v1.8.0 following

the package tutorial. Specifically, SCT normalized UMI counts from a combined Seurat object

with macrophages transcriptomes from our 3 datasets were used as the input expression matrix.

Mouse feather datasets for the mm10 assembly were downloaded from the SCENIC website (*i.e.*

mm10__refseq-r80__500bp_up_and_100bp_down_tss.mc9nr.feather   and   mm10__refseq-

r80__10kb_up_and_down_tss.mc9nr.feather). Computed TF regulon activities were obtained for

82 TFs in every cell, and we used a Wilcoxon rank-sum test approach to determine whether

regulon activity was significantly impacted by aging in female or male macrophages

(**Supplementary Table S6A**). Dot plots and violin plots were generated for TFs also identified

from our bulk 'omic' data (**Supplementary Figure S6B, C**).

1512

Irf2 protein level quantification using intracellular labeling and flow cytometry

quantification

Cells were resuspended in 90μL of staining buffer and incubated with 10μL of FcR

blocking reagent (Miltenyi Biotec #130-092-575) at 4°C for 20 minutes. For MACS-purified

peritoneal macrophage analysis, surface F4/80 staining was performed (to guarantee

quantification of Irf2 expression solely on macrophages) by adding 2μL of anti-F4/80 antibody

per sample, followed by a 10-minute incubation at 4°C. Then, 2mL of resuspension buffer was

added, and cells were centrifuged at 300g for 10 minutes to remove unbound antibodies.

Supernatant were then removed, and cells were resuspended in 1mL of Foxp3

Fixation/Permeabilization working solution (Invitrogen #00-5523-00), pulse-vortexed, and

incubated at 4°C for 1 hour protected from light. Following fixation, 2mL of 1x

Permeabilization Buffer (Invitrogen #00-5523-00) was added, and samples were centrifuged at

600g for 5 minutes at room temperature. Supernatants were carefully decanted, leaving

approximately 200μL, and cells were gently resuspended. To block nonspecific binding, 10μL

normal rat serum was added, and samples were incubated at room temperature for 15 minutes.

Each sample was split into 98μL aliquots for intracellular staining with 2μL of directly

conjugated PE-IgG isotype control (Abcam #ab209478) or PE-Irf2 (Abcam #ab318372)

antibodies, and incubated at 4°C for 1 hour, protected from light. After staining, cells were

washed twice with 2mL of 1x Permeabilization Buffer by centrifugation at 600g for 5 minutes at

room temperature. Finally, cells were resuspended in eBioscience Flow Cytometry Staining

Buffer (Invitrogen #00-4222-26). Stained cells median fluorescent intensity (MFI) was analyzed

by flow cytometry on the Miltenyi Biotec MACSQuant Analyzer 10, and flow cytometry results

were processed using the FlowLogic V8 software. To obtain the TF expression level, non-

specific background signal was removed by subtracting the MFI of IgG isotype control from the

MFI of Irf2 for each specific cell sample (i.e. isolate for a single animal, or transduced cell

aliquot)[151]. TF levels were then normalized dividing the median entire cohort per value to

mitigate the impact of cohort-specific variation in fluorescence intensity. Raw flow cytometry

data for aging, RAW264.7 *Irf2* KD, J774A.1 has been deposited to Figshare under

10.6084/m9.figshare.29285708,   10.6084/m9.figshare.29169947,   and

10.6084/m9.figshare.29169959 respectively.

1543

Active Motif FactorPath Irf2 ChIP-seq

Red-blood cell lysed bone marrow cells from 4 months old female C57BL/6JNia mice

were differentiated into BMDMs in two independent biological replicates (pool of 2 animals per

replicate) as above. For each replicate ChIP experiment, we plated 10 million BMDMs from an

independent primary culture, which were fixed by adding 1:20 (v/v) ratio of freshly prepared

formaldehyde   solution   (11%   formaldehyde   (Sigma-Aldrich   #F8775-25ML),   100 mM

NaCl,1 mM EDTA pH 8.0 (EMD Millipore #324506), and 50 mM HEPES pH = 8) to the cell

culture media, followed by incubation for 15 min at room temperature. Fixation was stopped by

adding 2.5 M glycine (Sigma-Aldrich #G7403-100G) solution at a 1:20 (v/v) ratio and

incubating for 5 min at room temperature. Cells were collected by scraping on ice and spun

down at 4°C 800g for 10 minutes. All subsequent steps were performed on ice. Cells were

collected and washed twice with chilled PBS (Sigma-Aldrich #P4474-500ML) with 0.5% Igepal

(Sigma-Aldrich #I8896-50ML). 1mM of phenylmethylsulfonyl fluoride (PMSF) (Sigma-Aldrich

#P7626-250MG) was added to the second wash before pelleting. Cell pellets were snap-frozen

on dry ice and sent to Active Motif for further processing.

Subsequent processing steps including chromatin extraction, fragmentation, antibody

precipitation, input, and library preparation were performed by Active Motif using a ChIP

validated antibody to IRF2 (Abcam #ab124744). Active motif generated ChIP-seq libraries from

the ChIP-DNA and a pooled Input control library using a custom Illumina library type protocol

on an automated system (Apollo 342, Wafergen Biosystems/Takara). ChIP-seq libraries were

sequenced on Illumina NovaSeq 6000 as 75 nucleotides single-end reads. Demultiplexed FASTQ

files were provided by Active Motif, and the ChIP-seq FASTQ reads were deposited to SRA
under Bioproject PRJNA1126274.

1567

BMDM Irf2 ChIP-seq analysis

Single-end Irf2 ChIP-seq reads were mapped to the mm10 genome reference using
bowtie1 v1.2.3[152]. After alignment, PCR duplicates were removed using the FIXSeq
algorithm[153], as previously described[134]. We used MACS2 v2.2.7.1 to identify Irf2-bound regions
in each of our 2 biological replicates[143]. Consensus peaks were then calculated using MSPC
v5.5.0[154], which identified 339 reproducibly bound regions (**Supplementary Table S7A**). Peaks
were annotated to the closest TSS using the HOMER 'annotatePeaks.pl' script[98]
(**Supplementary Table S7B**). To compute functional enrichment for Irf2 target genes, we
leveraged the 'GREAT' 4.0.4 tool[101], a tool specifically optimized to identify functional
enrichment starting from genomic regions. We used the mm10 genome as the background for
enrichment and all other options were left to default parameters. Results were exported as 'tsv',
processed in R to filter significant enrichments with FDR < 5% and are reported in
Supplementary Table S7C, D. We also used R packages ChIPSeeker v1.22.1[155] and
TxDb.Mmusculus.UCSC.mm10.knownGene v3.10.0 to perform genomic distribution annotation
of peaks (**Supplementary Figure S7G**), together with clusterProfiler v3.14.3 as an orthogonal
approach for functional enrichment analysis of Irf2-bound regions (see results in
Supplementary Table S7E, F).

To determine whether chromatin remodeling (*i.e.* changes in ATAC-seq or H3K4me3
CUT&RUN signal) may occur in female peritoneal macrophages with aging at Irf2 bound sites,
we used R packages ChIPpeakAnno v3.20.1[156] to perform overlap analyses (**Supplementary
Figure S7H**) and NGSplot v2.61[157] to generate signal plots (**Figure 7I**).

1589

Data availability

Sequencing data has been deposited to the Sequence Read Archive, under Bioprojects
PRJNA1094925, PRJNA1095555, PRJNA1096052, PRJNA1101936, PRJNA1126274,
PRJNA1222371.

Raw flow cytometry data (10.6084/m9.figshare.28934213,
10.6084/m9.figshare.29169674, 10.6084/m9.figshare.29169737, 10.6084/m9.figshare.29169707,

10.6084/m9.figshare.28934198, 10.6084/m9.figshare.29169578, 10.6084/m9.figshare.29169581,

10.6084/m9.figshare.29169587, 10.6084/m9.figshare.29161955, 10.6084/m9.figshare.29169836,

10.6084/m9.figshare.29169821, 10.6084/m9.figshare.29169860, 10.6084/m9.figshare.29169821,

10.6084/m9.figshare.29169872, 10.6084/m9.figshare.29169899, 10.6084/m9.figshare.29285708,

10.6084/m9.figshare.29169947,10.6084/m9.figshare.29169959,   and

10.6084/m9.figshare.29286278),   microscopy   images   (10.6084/m9.figshare.29286194,

10.6084/m9.figshare.29286206), and Agilent Seahorse data (10.6084/m9.figshare.29169911,

10.6084/m9.figshare.29169920,   10.6084/m9.figshare.29169926)   have   been   deposited   to

Figshare.

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1606   **Code Availability**

1607   All R code for this study was run using R version 3.6.3. Genomic data processing scripts

1608   have   been   made   available   on   the   Benayoun   lab   GitHub   repository   at

1609   https://github.com/BenayounLaboratory/ Macrophage_SexDim_Aging.

Acknowledgements

We are grateful to Dr. Caleb Finch, Dr. Raphael Williams, Clayton Baker, Dr. Marc Vermulst, Sarah Shemtov, Allison Chae, Courtney Shen, Wyatt Web, Evelyn Navar, Emily K. Wang, Prakroothi S. Danthi, Amy Huang, Rochelle W. Lai, Guan J. Lai and Claire Chung for scientific insights and assistance during the preparation of this manuscript. We thank USC DAR veterinarians Dr. Lynlee M. Stevey-Rindenow and Dr. Bradley Ahrens for performing the ovariectomy and sham surgeries. We thank Hemal Mehta at the USC Leonard Davis school of Gerontology Seahorse core facility for helping run Seahorse experiments. We thank Dr. Didier Trono for providing the pMDLg/pRRE (Addgene #12251) and pRSV-Rev (Addgene #12253) plasmids. We thank Dr. Tannishtha Reya for providing VSV.G (Addgene #14888) plasmid. We thank Dr. Kenneth S. Korach for providing the B6N(Cg)-Esr1*tm4.2Ksk*/J (*Esr1* KO) mice[94] (JAX #026176).

This work was supported by a Diana Jacobs Kalman/AFAR Scholarships for Research in the Biology of Aging, NIA T32 AG052374, and AthenaDAO student leader award to R.J.L.; USC Provost's Undergrad Research Fellowships to E.E.W., E.H.L., and C.R.; GCRLE-2020 post-doctoral fellowship from the Global Consortium for Reproductive Longevity and Equality at the Buck Institute, made possible by the Bia-Echo Foundation to M.K.; NIAID R01 AI134987 to H.S.G.; core vouchers from the USC Leonard Davis School of Gerontology, NIA R00 AG049934, Pew Biomedical Scholar award #00034120, an innovator grant from the Rose Hills foundation, the Kathleen Gilmore Biology of Aging research award, a generous gift from Dr. Eric Hennigan, and Hevolution grant HF-GRO-23-1199072-28 to B.A.B. The authors acknowledge the Center for Advanced Research Computing [CARC] at the University of Southern California for providing computing resources that contributed to the research results reported within this publication (URL: https://carc.usc.edu). The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript.

Author contributions

R.J.L., N.S.K., and B.A.B. designed the study. R.J.L., N.S.K, A.P., performed live animal experiments. A.P. read vaginal cytology slides. R.J.L., S.C., M.K., L.A., I.Y.L., K.M., N.S.K., and B.A.B. dissected mouse tissues. R.J.L. and M.K. generated omics libraries. B.A.B. performed computational analyses. R.J.L. performed flow cytometry experiments. R.J.L.,

E.E.W., I.Y.L., C.R., J.J., and S.B. imaged and analyzed microscopy phagocytosis data. R.J.L.,
S.C., and A.X. performed phagocytosis flow cytometry and quantification analysis. R.J.L., S.C.,
and E.H.L. performed metabolic profiling experiments. R.J.L., A.X., and B.A.B analyzed
Seahorse experiments. R.J.L., E.H.L, S.P., C.R., I.Y.L. performed RT-qPCR analyses. R.J.L.,
and S.C. perform intracellular Irf2 quantification. C.D.L. and H.S.G. contributed scientific
insights to the project. R.J.L., S.C., and B.A.B. wrote the manuscript with input from all authors.
All authors edited and commented on the final manuscript.
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Legends to figures

Figure 1. Peritoneal macrophages are the most impacted cell type in the peritoneal cavity

niche as a function of age and biological sex.

(**A**) Experimental scheme illustrating age-based cell profiling in mouse peritoneal lavage. (**B**)

Uniform Manifold Approximation and Projection (UMAP) visualization of unsupervised

clustering of peritoneal lavage cells. (**C**) UMAP representation of AUGUR area under the curve

(AUC) scores for peritoneal lavage immune cell populations. (**D**) Boxplots of peritoneal cell

composition quantified by scRNA-seq; n = 8 libraries per sex and age; 4 independent cohorts in

3 independent datasets. (**E**) Boxplots of peritoneal cell composition quantified by flow

cytometry; n ≥ 25 per sex and age (6 independent cohorts). (**F**) Boxplots of peritoneal immune

lavage cell number calculated by the proportion obtained from flow cytometry and total

peritoneal lavage cell count; n ≥ 25 per sex and age (6 independent cohorts). For boxplots in

panels (**D-F**), circles/squares represent NIA/JAX mice, respectively. Significance in non-

parametric two-sided Wilcoxon rank-sum tests are reported in **D-F**. The center line of the box

plots represents the sample median, the box limits consist of the 25th and 75th percentiles, the

whiskers span 1.5x the interquartile range.

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Figure 2. The peritoneal macrophage transcriptome and epigenome shows sex-dimorphic remodeling with aging.

(**A**) Experimental scheme of murine peritoneal macrophage 'omics' profiling. (**B**) Multidimensional scaling (MDS) plot of transcriptomic profiles, indicating distinct transcriptomic aging patterns between sexes. (**C**) MDS plot of chromatin accessibility profiles by ATAC-seq. (**D**) MDS plot of H3K4me3 profiles. (**E**) Scatterplot of age-related changes in peritoneal macrophage transcriptomes in female vs. males, reported as DESeq2 $\log_2$ fold changes per month. 284 Male-specific (blue) and 234 female-specific (pink) aging-regulated genes (Transcriptome-wide Spearman Rho = 0.288). (**F**) Scatterplot of age-related changes in peritoneal macrophage ATAC-seq accessible regions in female vs. males, reported as DESeq2 $\log_2$ fold changes per month. 1044 Male-specific (blue) and 2825 female-specific (pink) regions (Genome-wide Spearman Rho = 0.232). (**G**) Scatterplot of age-related changes in peritoneal macrophage H3K4me3 signal in female vs. males, reported as DESeq2 $\log_2$ fold changes per month. 131 male-specific (blue) and 1699 female-specific (pink) marks (Genome-wide Spearman Rho = 0.329). (**H**) Heatmap of male-specific aging gene expression changes by RNA-seq. (**I**) Heatmap of female-specific aging gene expression changes by RNA-seq. (**J**) Heatmap of male-specific aging chromatin accessibility changes by ATAC-seq. (**K**) Heatmap of female-specific aging chromatin accessibility changes by ATAC-seq. (**L**) Heatmap of male-specific aging H3K4me3 peak intensity by H3K4me3 CUT&RUN. (**M**) Heatmap of female-specific H3K4me3 peak intensity by H3K4me3 CUT&RUN.

Figure 3. Peritoneal macrophages show sex-dimorphic functional enrichments at the transcriptomic and epigenomic levels.

(**A**, **B**) NetworkAnalyst putative PPI network of genes changing with age in female (**A**) and male (**B**) peritoneal macrophages using IMEx network information. (**C**, **D**, **E**) Top 5 sex-dimorphic GSEA enrichments for aging in each sex for RNA-seq (**C**), ATAC-seq (**D**), and H3K4me3 CUT&RUN (**E**). (**F**) GSEA of CRISPR-Cas9 phagocytosis regulators from screens in aging female and male peritoneal macrophages. (**G**) GSEA of metabolic gene sets from MSigDB Hallmarks in aging female and male peritoneal macrophages. (**H**) GSEA of M1/M2 polarization genes in aging female and male peritoneal macrophages. NES: Normalized Enrichment Score. FDR: False Discovery Rate.

Figure 4. Peritoneal macrophages show female-specific remodeling of phagocytosis capacity and metabolic preferences with aging.

(**A**) Experimental scheme of murine peritoneal macrophage purification and functional analysis. (**B**) Representative microscopy image showing a phagocytosis event by young old male and female MACS-purified peritoneal macrophages engulfing Zymosan bioparticles. Blue = DAPI, Green = Zymosan bioparticles, Scale bar: 200μm. (**C**) Phagocytosis quantification of phagocytosis images from young old male and female peritoneal macrophages. The phagocytosis index is calculated by dividing phagocytosing cells by the total number of imaged cells. Due to cohort-to-cohort variation, values are normalized to the median value of each independent experiment. Animals from 5 independent cohorts (3 from NIA, 2 from JAX). Young females n = 21, old females n = 18, young males n = 22, and old males n = 20 (variation due to animal death prior to experimental day). (**D**) Flow cytometry phagocytosis quantification of peritoneal macrophage. Each point represents one animal. Animals from 6 independent cohorts (3 from NIA, 3 from JAX). Circles/squares represent NIA/JAX mice, respectively Samples with < 5000 $F4/80^+$ events or < 75% $F4/80^+$ purity were excluded from the analysis. (**E**) Venn diagram for CRISPR-Cas9 phagocytosis regulators and female-specific down-regulated genes according to DESeq2 at FDR < 5% and < 10%. (**F**) Lentiviral shRNA phagocytosis regulator screen experimental scheme. (**G**) Mini shRNA screen of RAW264.7 phagocytosis capacity using flow cytometry. The horizontal red line in the panel shows the median control value in the relative phagocytosis index of the macrophage. Dark green/light green for sh1/sh2 samples. Significance in non-parametric one-sided Wilcoxon rank-sum tests were reported (Hypothesis: same regulation direction as aging). (**H**) Experimental scheme of aging bone marrow-derived macrophage seahorse. (**I**) Representative normalized extracellular acidification rate (ECAR) mpH/min/DNA from 1 cohort of animals. (**J**) Glycolysis quantification using Seahorse (n = 15 for young old females and males; animals from 3 independent NIA cohorts). (**K**) Glycolysis quantification using Lactate-Glo (n = 18 for young males, n = 18 for young females, n = 17 for old males, and n = 17 for old females; animals from 5 independent cohorts (3 from NIA, 2 from JAX). For boxplots in panels (**C-D**, **J-H**), circles/squares represent NIA/JAX mice, respectively. Significance in non-parametric two-sided Wilcoxon rank-sum tests were reported. (**C-D**, **G**, **J-H**) The center line of the box plots represents the sample median, the box limits consist of the 25th and 75th percentiles, the whiskers span 1.5x the interquartile range.

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Figure 5. Sustained estrogen signaling is required to maintain youthful peritoneal macrophage transcriptomes and phagocytic capacity, but not metabolic preferences.

(**A**) Experimental scheme outlining the analysis of OVX mice. (**B**) Multi-dimensional scaling (MDS) analysis of gene expression profiles from Sham and OVX mice. (**C**) GSEA of OVX-regulated genes in the aging female peritoneal macrophage transcriptome. (**D**) Boxplot of phagocytosis quantification of peritoneal macrophages in Sham and OVX mice using flow cytometry (n = 11 for Sham, n = 12 for OVX; animals from 3 independent cohorts). (**E**) Boxplot of glycolysis quantification of peritoneal macrophages in Sham and OVX mice (n = 12 for Sham, n = 11 for OVX; 2 independent cohorts). (**F**) Experimental scheme describing late-life short-term 17β-estradiol (E2) supplementation in female mice. (**G**) MDS analysis of gene expression profiles in young females, old females, and E2-treated old females; n = 5 for young females, n = 5 for old females, n = 4 for E2-treated old females. (**H**) GSEA of E2-regulated genes in old female macrophages in the aging female peritoneal macrophage transcriptome. (**I**) Boxplot of phagocytosis of peritoneal macrophages in young females, old females, and E2-treated old females (n = 13 for young females, n = 13 for old females, n = 14 for E2-treated old females; animals from 3 independent cohorts). (**J**) Boxplot of glycolysis quantification of peritoneal macrophages in young females, old females, and E2-treated old females (n = 14 for young females, old females, and E2-treated old females; animals from 3 independent cohorts). (**K**) Experimental scheme for *Esr1* knockout (KO) mice. (**L**) MDS analysis of gene expression profiles in WT and *Esr1* KO mice (n = 5 for WT, n = 6 for *Esr1* KO). (**M**) GSEA of *Esr1* KO-regulated genes in the aging female peritoneal macrophage transcriptome. (**N**) Boxplot of phagocytosis of peritoneal macrophages in WT and *Esr1* KO mice (n = 15 for WT, n = 13 for *Esr1* KO; animals from 4 independent cohorts). (**O**) Boxplot of glycolysis quantification of peritoneal macrophages in WT and Esr1 KO mice (n = 15 for WT and *Esr1* KO; animals from 4 independent cohorts). For boxplots in panels (**D**, **E**, **I**, **J**, **N**, **O**), circles/squares represent NIA/JAX mice, respectively. Significance in non-parametric two-sided Wilcoxon rank-sum tests were reported. The center line represents the sample median, the box limits consist of the 25th and 75th percentiles, and the whiskers span 1.5x the interquartile range.

Figure 6. A mini screen for candidate transcription factors driving female-specific
macrophage 'omic' and functional remodeling with aging.
(**A**) Flow chart outlining the steps for the selection of candidate transcription factors (TFs) for
screening. (**B**) Heatmap displaying female-specific differential transcription factor gene
expression with aging (FDR < 5% in aging female macrophages, FDR > 10% in aging male
macrophages based on DESeq2 analysis). (**C**) Selected enriched motifs identified at female-
specific differentially accessible ATAC-seq peaks with aging (HOMER; FDR < 5%). (**D**)
Selected enriched motifs identified at female-specific differentially marked H3K4me3 peaks
with aging (HOMER; FDR < 5%). (**E**) Experimental scheme of shRNA-mediated TF
knockdown in RAW264.7 macrophages. (**F**) GSEA of TF shRNA knockdown regulated genes in
the aging female peritoneal macrophage transcriptome. (**G**, **H**, **I**) Boxplots showing phagocytosis
quantification using flow cytometry (**G**), glycolysis quantification using Agilent Seahorse assays
(**H**), and lactate levels measured with Lactate-Glo in RAW264.7 macrophages transduced with
lentiviral TF shRNA against (**I**) *Irf2*, *Mef2c*, *Meis1*, *Tal1*, and *Tbl1xr1* (n = 6 independent
infections for each hairpin). Dark green/light green for sh1/sh2 samples. Significance in non-
parametric one-sided Wilcoxon rank-sum tests were reported (Hypothesis: same direction as
aging). The horizontal red line in the panel shows the median control value in the relative
phagocytosis index (**G**), relative glycolysis (**H**), and relative lactate secretion (**I**) of macrophages.
The center line represents the sample median, the box limits show the 25th and 75th percentiles,
and the whiskers span 1.5 times the interquartile range.
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Figure 7. Age-related decrease in Irf2 expression impacts Hk3 expression, leading to increased glycolytic reliance.

(**A**) Analysis of Irf2 expression at the RNA and protein levels in aging peritoneal macrophages. (**B**) Boxplot of *Irf2* gene expression in mouse peritoneal macrophages using RT-qPCR (young female n = 12, old female n = 8, young male n = 12, and old male n = 9; animals from 4 independent cohorts). (**C**) Histogram of female and male Irf2 protein expression between young and old peritoneal macrophages based on intracellular immunolabelling and flow cytometry quantification. (**D**) Boxplot of Irf2 protein quantification in peritoneal macrophages between young and old female and male mice (young female n = 13, old female n = 14, young male n = 14, and old male n = 13; animals from 3 independent cohorts). (**E**) Experimental scheme for Irf2 ChIP-seq in young female BMDMs. (**F**) Top GREAT enriched terms of Irf2-bound genomic regions. (**G**) GSEA of direct Irf2 target genes in the aging female peritoneal macrophage transcriptome. Peaks were assigned to target genes based on their absolute distance to transcriptional start sites (500bp-5kb). (**H**) Integrated Genomics Viewer (IGV) snapshot of Irf2 ChIP-seq signal at the *Hk3* gene locus on chromosome 13. (**I**) Quantitative RT-qPCR analysis of *Hk3* mRNA levels in young and old female peritoneal macrophages samples (n = 12 young, n = 8 old female; animals from 4 independent cohorts). (**J**) Experimental design for lentiviral knockdown of *Irf2* in J774A.1 cells. (**K**) Boxplot of *Hk3* expression from RNA-seq after knockdown of *Irf2* in macrophage cells. Circles/squares for RAW264.7/J774A.1 samples; shLuciferase (goldenrod), non-targeting control (light goldenrod), sh1 (dark green), and sh2 (light green); n = 3 infections per hairpin. Significance as FDR from DESeq2. (**L**) Boxplot of glycolysis quantification using Seahorse assays on lentiviral knockdown of *Irf2* RAW264.7 and J774A.1 cell line (n = 6 infections per hairpin). Note that the RAW264.7 data is repeated from **Figure 6I** for comparison convenience. (**M**) Boxplot of glycolysis quantification using Lactate-Glo on lentiviral knockdown *Irf2* in RAW264.7 and J774A.1 cells (n = 6 infections per hairpin). Note that the RAW264.7 data is repeated from **Figure 6J** for comparison convenience. (**N**) Proposed mechanism for Irf2-driven age-related glycolytic shift in aging female peritoneal macrophages. For boxplots in panels (**B, D, I**), circles/squares represent NIA/JAX mice, respectively. Significance in non-parametric two-sided Wilcoxon rank-sum tests is reported. For boxplots in panels (**L, M**) circles/squares for RAW264.7/J774A.1 samples; dark green/light green for sh1/sh2 samples. Significance in non-parametric one-sided Wilcoxon rank-sum tests

2244   were reported (Hypothesis: same regulation direction as aging). The horizontal red line in the

2245   panel shows the median control value of the normalized glycolysis (**L**) and normalized lactate

2246   (**M**).

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Figure 1

A Experimental scheme

Young (4-5 months) ♀ ♂ → Peritoneal lavage → Peritoneal lavage cells → 10x Genomics → Sequencing and analysis

Old (20-21 months) ♀ ♂ → Flow cytometry

B Peritoneal lavage cell UMAP

- B-cells
- Macrophages
- Monocytes
- NK cells
- T-cells

C UMAP of Augur AUC scores

AUC 0.63 – 0.56

T-cells, Monocytes, Macrophages, B-cells

D Peritoneal cell composition (scRNA-seq)

B-cells — B-cell proportion (Fraction): 3.1E-4, 2.1E-2

Macrophages — Macrophage proportion (Fraction): 6.2E-4, 3.7E-3

T-cells — T-cell proportion (Fraction): 0.12, 1.2E-3

Young Old Female | Young Old Male

E Peritoneal cell composition (Flow cytometry)

B-cells — B-cell proportion (Fraction): 2.4E-6, 2.2E-3

Macrophages — Macrophage proportion (Fraction): 3.5E-4, 4.8E-3

T-cells — T-cell proportion (Fraction): 0.44, 0.38

Young Old Female | Young Old Male

F Peritoneal lavage immune cell yield (Flow cytometry)

B-cells — Total B cells (1E7): 1.6E-8, 8.5E-5

Macrophages — Total macrophages (1E6): 2.9E-5, 5.1E-3

T-cells — Total T cells (1E6): 6.6E-3, 6.5E-3

Young Old Female | Young Old Male

Figure 2

A Experimental scheme

B RNA-seq

MDS dimension 2 vs MDS dimension 1

C ATAC-seq

MDS dimension 2 vs MDS dimension 1

D H3K4me3

MDS dimension 2 vs MDS dimension 1

E Sex-dimorphic aging changes (RNA-seq)

• Male-specific aging (284)
• Female-specific aging (234)

Rho = 0.288

log₂(fold change per month) in males vs log₂(fold change per month) in females

F Sex-dimorphic aging changes (ATAC-seq)

• Male-specific aging (1044)
• Female-specific aging (2825)

Rho = 0.232

log₂(fold change per month) in males vs log₂(fold change per month) in females

G Sex-dimorphic aging changes (H3K4me3)

• Male-specific aging (131)
• Female-specific aging (1699)

Rho = 0.329

log₂(fold change per month) in males vs log₂(fold change per month) in females

H Male-specific aging genes (RNA-seq)

J Male-specific aging peaks (ATAC-seq)

L Male-specific aging peaks (H3K4me3)

I Female-specific aging genes (RNA-seq)

K Female-specific aging peaks (ATAC-seq)

M Female-specific aging peaks (H3K4me3)

● Young females (4-5 months)   ● Old females (20-21 months)   ● Young males (4-5 months)   ● Old males (20-21 months)

Figure 3

A Putative PPI network of genes changing with age in *females* (IMEx)

B Putative PPI network of genes changing with age in *males* (IMEx)

Up with age

Down with age

C Top GSEA enrichments for sex-dimorphic aging from RNA-seq (GO)

GO:0006910 phagocytosis, recognition

GO:0061077 chaperone-mediated protein folding

GO:0042470 melanosome

GO:0042310 vasoconstriction

GO:0019373 epoxygenase P450 pathway

GO:0015035 protein-disulfide reductase activity

GO:0015078 proton transmembrane transporter activity

GO:1902600 proton transmembrane transport

GO:0005751 mitochondrial respiratory chain complex IV

GO:1900017 pos. regulation of cytokine production involved in inflammatory response

Female   Male

D Top GSEA enrichments for sex-dimorphic aging from ATAC-seq (GO)

GO:0005540 hyaluronic acid binding

GO:0098656 anion transmembrane transport

GO:0031683 G-protein beta/gamma-subunit complex binding

GO:0060088 auditory receptor cell stereocilium organization

GO:0031641 regulation of myelination

GO:0045104 intermediate filament cytoskeleton organization

GO:0034364 high-density lipoprotein particle

GO:0050919 negative chemotaxis

GO:0007187 G protein-coupled receptor signaling pathway coupled to cyclic nucleotide second messenger

GO:0032809 neuronal cell body membrane

Female   Male

E Top GSEA enrichments for aging sex differences from H3K4me3 (GO)

GO:0005691 U6atac snRNP

GO:0006910 phagocytosis, recognition

GO:0080008 Cul4-RING E3 ubiquitin ligase complex

GO:0008401 retinoic acid 4-hydroxylase activity

GO:0036342 post-anal tail morphogenesis

GO:0050766 positive regulation of phagocytosis

GO:0033038 bitter taste receptor activity

GO:0038187 pattern recognition receptor activity

GO:0008392 arachidonic acid epoxygenase activity

Female   Male

NES
$-\log_{10}$(FDR)

F GSEA of CRISPR-Cas9 phagocytosis regulators

$-\log_{10}$(FDR)
1
3
5

Haney M.S., et al. screen

Pluvinage J.V., et al. screen

Combined screen

Female   Male

G GSEA of metabolic genes

$-\log_{10}$(FDR)
5
15
20

Hallmark Glycolysis

Hallmark Oxidative Phosphorylation

Female   Male

H GSEA of polarization genes

$-\log_{10}$(FDR)
5
15
20

NES

M1 enriched

M2 enriched

Female   Male

Figure 4

A Experimental scheme

Young (4-5 months) → Peritoneal lavage cells → MACS purification → Macrophages

Old (20-21 months)

Phagocytosis — Microscopy, Flow cytometry

Metabolism — Seahorse (BMDM), Lactate-Glo

Polarization — Flow cytometry

B Representative phagocytosis images

Female / Male / Young / Old

C Phagocytosis quantification (Microscopy)

2.0E-2   0.16

Relative phagocytosis index (A.U.)

Young Old — Female ; Young Old — Male

D Phagocytosis quantification (Flow cytometry)

4.7E-2   0.68

Relative phagocytosis index (A.U.)

Young Old — Female ; Young Old — Male

E Candidate phagocytosis regulators specifically regulated in female aging

Female-specific down-regulated genes (FDR < 5%, FDR < 10%)   Phagocytosis regulators

128   9   515

B4galt1   Gna13
Dpy19l3   Hmgcs1
Man1a2   Magt1
Rps6ka3
Tbl1xr1
Tm9sf3

F shRNA mini screen of phagocytosis regulators experimental scheme

Lentiviral shRNA (sh1, sh2) → RAW264.7 → 1-2 week puromycin selection → Selected RAW264.7 → 24-72hr functional assay → RT-qPCR, Phagocytosis

G Mini shRNA screen for phagocytosis capacity (Flow cytometry)

Inconsistent with aging

Relative phagocytosis index (A.U.)

Consistent with aging

0.88   0.69   0.23   1.6E-2   0.92   0.58   0.31   0.40   1.7E-2

B4galt1 Dpy19l3 Man1a2 Rps6ka3 Tbl1xr1 Tm9sf3 Gna13 Hmgcs1 Magt1

H BMDM Seahorse scheme

Young Old Male Female → Bone marrow cells

Plate cells → Differentiate 7 days +M-CSF → BMDM → Seahorse

I Representative normalized ECAR (Seahorse)

Glucose Oligomycin FCCP Rot/AA

Normalized ECAR (mpH/min/DNA)

Time (minutes)

● Young females (4-5 months)   ● Young males (4-5 months)
● Old females (20-21 months)   ● Old males (20-21 months)

J Glycolysis quantification (Seahorse)

4.5E-2   0.88

Normalized glycolysis (A.U.)

Young Old — Female ; Young Old — Male

K Glycolysis quantification (Lactate-Glo)

1.6E-2   0.46

Relative luminescence (A.U.)

Young Old — Female ; Young Old — Male

Figure 5

A OVX experimental scheme

B Multi-dimensional scaling

C GSEA of OVX-regulated genes (FDR < 5%)

D Phagocytosis quantification (Flow cytometry)

E Glycolysis quantification (Lactate-Glo)

F Short term E2 supplementation (1 month) scheme

G Multi-dimensional scaling

H GSEA of E2 supplemented regulated genes (FDR < 5%)

I Phagocytosis quantification (Flow cytometry)

J Glycolysis quantification (Lactate-Glo)

K *Esr1* KO scheme

L Multi-dimensional scaling

M GSEA of *Esr1* knockout regulated genes (FDR < 5%)

N Phagocytosis quantification (Flow cytometry)

O Glycolysis quantification (Lactate-Glo)

Figure 6

A Flowchart for identifying transcription factors (TFs) for screening

Differential expressed genes specifically in females

234 total genes

149 ↑

85 ↓

→ Animal TFDB 3.0 →

Transcription factors with female-specific age-regulation

TFs

↑ 14

↓ 6

TF motifs enriched at female-specific remodeled chromatin region

8 ATAC motifs
5 H3K4me3 motifs

→

Downregulated TFs and co-regulators

Irf2
Mef2c
Meis1
Tal1
↓

↓ Tbl1xr1

B Female-specific differential TFs gene expression with aging

Plag1
Mef2c
Meis1
Tal1
Irf2
Tfec
Nr1h3
Nr2f2
Hoxb3
Hoxb6
Hoxb5
Hoxc6
Hoxc4
Sp110
Zfp697
Tead1
Sox7
Rfx2
Hsf4

Row Z-score
3
2
1
0
-1
-2
-3

● Young females (4-5 months)   ● Young males (4-5 months)
● Old females (20-21 months)   ● Old males (20-21 months)

C Selected enriched motifs at female-specific differential ATAC peaks with aging (FDR < 5%)

Irf2
Tal1 (Scl)
Nr2f2 (COUP–TFII)
Tead1
Meis1
Sox7
Mef2c
Tal1 (Scl)

Enrichment
2
1
0
-1

-log₁₀(p-val)
20
40
60
80

D Selected enriched motifs at female-specific differential H3K4me3 peaks with aging (FDR < 5%)

Irf2
Tead1
Meis1
Tal1 (Scl)
Tal1 (Scl)

Enrichment
2
1
0
-1

-log₁₀(p-val)
10
30
50

E shRNA mini screen for candidate TF regulators

Lentiviral shRNA
● sh1
● sh2

RAW264.7

→ 1-2 week puromycin selection →

Selected RAW264.7

→ 24-72hr functional assay →

RT-qPCR

Omics
RNA-seq

Functional profiling
Phagocytosis
Metabolism

F GSEA of shRNA knockdown compared to female aging

shRNA up
shRNA down

shIrf2   shMef2c   shMeis1   shTal1   shTbl1xr1

NES
2
0
-2

-log₁₀(FDR)
5
10
15
20

G Phagocytosis quantification (Flow cytometry)

Normalized phagocytosis index to control median (A.U.)

Inconsistent with aging

Consistent with aging

0.99   0.74   4.6E-2   1   0.95

Irf2   Mef2c   Meis1   Tal1   Tbl1xr1

H Glycolysis quantification (Seahorse)

Normalized glycolysis to control median (A.U.)

Consistent with aging

1.2E-3   0.38   0.14   1.2E-3   2.7E-2

Inconsistent with aging

Irf2   Mef2c   Meis1   Tal1   Tbl1xr1

I Glycolysis quantification (Lactate-Glo)

Normalized lactate secretion (A.U.)

Consistent with aging

7.3E-3   7.7E-2   7.7E-2   2.3E-2   2.7E-2

Inconsistent with aging

Irf2   Mef2c   Meis1   Tal1   Tbl1xr1

A Irf2 expression validation scheme

B *Irf2* gene expression (RT-qPCR)

C Irf2 protein expression (Flow cytometry)

D Irf2 protein quantification

E ChIP-seq scheme

F Great enrichment ChIP-seq (Gene ontology)

G Irf2 ChIP-seq targets

H Genome browser snapshot at *Hk3* locus

I *Hk3* gene expression (RT-qPCR)

J Irf2 shRNA knockdown experimental scheme (J774A.1)

K *Hk3* gene expression (RNA-seq)

L Glycolysis quantification (Seahorse)

M Glycolysis quantification (Lactate-Glo)

N Proposed mechanism for female macrophage age-related glycolytic shift