Title: Unraveling the immunological roles of serum amyloid A3 in aortic immune

cell subsets during atherosclerosis progression

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Abstract

Atherosclerosis is a growing concern in developed nations, necessitating the identification of therapeutic targets for advancing personalized medicine. Serum amyloid A3 (*Saa3*) has been linked to accelerated plaque progression by affecting cholesterol metabolism and modulation of inflammation. We hypothesize that knocking out *Saa3* (*Saa3*$^{-/-}$) could mitigate plaque development by regulating aortic immune cell subsets during atherosclerosis progression. Using a murine model, we induced atherosclerosis via a gain-of-function mutant PCSK9-encoding adeno-associated viral vector (AAVmPCSK9) in wild-type (WT) and *Saa3*$^{-/-}$ mice. Single-cell RNA sequencing revealed that *Saa3*$^{-/-}$ mice developed smaller plaques than WT mice, with significant differences in aortic immune cell populations, particularly aortic macrophages. *Saa3*$^{-/-}$ macrophages, characterized by high *Gpnmb*, *Lpl*, and *Spp1* expressions, predominated over the typical resident foamy macrophages in WT mice. *Saa3*$^{-/-}$ mice also showed enhanced intercellular immune communication and increased signaling interactions, suggesting a shift towards an anti-inflammatory and tissue-repairing phenotype. Our study highlights the potential of *Saa3* as a therapeutic target for atherosclerosis.

Introduction

Atherosclerosis, a major cardiovascular concern in developed countries [1], is a chronic

arterial disease characterized by plaque formation within arterial walls. This process

involves complex interplays among various cellular components and inflammatory

mediators that drive inflammation and lipid accumulation. Atherosclerosis initiation

involves low-density lipoprotein (LDL) accumulation in the coronary artery intima,

which upon oxidation to ox-LDL by risk factors, activates nuclear factor kappa B (NF-

κB) [2,3]. This leads to the expression of adhesion molecules like vascular cell adhesion

molecule-1 (VCAM-1) and intercellular adhesion molecule-1 (ICAM-1) on the

endothelium, aiding monocyte recruitment into the vascular wall [4]. These recruited

monocytes then transform into macrophages under the influence of macrophage

colony-stimulating factor (M-CSF), and release inflammatory cytokines such as

interleukin (IL)-1β, IL-12, and tumor necrosis factor (TNF)-α, escalating the

inflammatory response [5]. Additionally, other immune cells like neutrophils, T cells, and

mast cells are recruited to the site. As the disease progresses, these macrophages

become foam cells by uptaking ox-LDL, which is crucial for plaque formation and

intimal thickening.

Macrophages are the predominant type of immune cell found in aortic plaques but

display a wide range of phenotypes and functions. At the onset of atherosclerosis,

macrophages ingest ox-LDL via receptors like CD36 and SR-A, forming cholesterol-

rich foam cells. Continued lipid intake without effective cholesterol removal leads to

foam cell death, creating a necrotic core in advanced plaques [6,7]. Single-cell RNA

sequencing (scRNA-seq) of monocyte-derived macrophages has revealed that

macrophage heterogeneity is beyond M1/M2 definitions and associated with different

states of atherosclerosis, where progression is linked to more complex states than

regression [8]. This technique has revealed various macrophage subsets within

atherosclerotic plaques, each characterized by unique markers and roles contributing to

aortic plaque progression or regression. Notably, three main groups are identified:

tissue-resident-like macrophages, marked by *Folr2* and *Lyve1*, which promote tissue

stability; inflammatory macrophages, with markers such as *Tnf* and *Il1b*, which activate

immune responses; and anti-inflammatory TREM2$^{\text{hi}}$ macrophages, associated with

cholesterol metabolism and identified by markers such as *Trem2* [9,10]. This diversity in

macrophage functions underscores the complexity of atherosclerosis and offers

multiple targets for therapy.

The Serum Amyloid A (SAA) protein family, encompassing SAA3 as one of its

members, represents a class of acute phase proteins pivotal in immune responses.

Previous studies suggest that *Saa3* has a modulatory role in local injury and

inflammatory responses, as the expression of *Saa3* at the mRNA or protein level in

mouse macrophages increases with the administered dosage of lipopolysaccharide

(LPS) [11]. It also indicates that increased SAA expression correlates with the aortic

plaque progression in *ApoE*$^{-/-}$ mice, accompanied by elevated levels of IL-6 and TNF-

α. This upregulation potentially facilitates the infiltration of M1 macrophages into

atherosclerotic regions, thereby promoting atherosclerosis progression [12]. *Saa3* is

actively expressed, predominantly in macrophages and adipose tissues [13], and the

activation of the *Saa3* promoter is regulated through C/EBPβ signaling, which in turn

activates macrophages, underscoring the complex interaction within adipose tissue [14].

Notably, SAA3 has been reported to promote atherosclerosis, and overexpressed SAA3

increases atherosclerotic plaque size [15]. Overall, these studies support the role of SAA3

in regulating macrophage function during atherosclerosis, though the specific type of

aortic macrophages that regulate aortic plaque progression and the underlying

mechanisms remain elusive.

To assess how *Saa3* deficiency impacts aortic immune cell composition and

functionalities in contributing to atherosclerosis progression, we applied scRNA-seq

using the BD Rhapsody platform on immune cells from aortic arches of *Saa3* knockout

(*Saa3*$^{-/-}$) mice and littermate wild-type (WT) control mice during atherosclerosis. Our

investigation seeks to delineate the impact of *Saa3* deficiency on the phenotypic and

functional landscape of aortic macrophages and other immune cell populations. By

comparing the immune cell profiles between $Saa3^{-/-}$ and WT mice, we aim to uncover

the molecular mechanisms by which SAA3 influences macrophage or other immune

cell types-mediated aortic plaque progression.

Results

***Saa3* deletion reduced aortic plaque progression but increased peripheral**

cholesterol levels

To determine the phenotype of atherogenesis after $Saa3$ deficiency, we utilized a

C57BL/6 wild-type (WT) mouse-based atherosclerosis model independent of $Ldlr^{-/-}$

mice breeding [8,16,17]. Plaque progression was initiated by injecting the mice with an

adeno-associated viral vector expressing a gain-of-function mutant of protein

convertase subtilisin/kexin type 9 (AAVmPCSK9), resulting in LDL receptor

deficiency and hypercholesterolemia. Both C57BL/6 WT and C57BL/6 $Saa3^{-/-}$ mice

were treated with AAVmPCSK9 and fed a Western diet (WD) for 18 weeks to induce

hypercholesterolemia and aortic plaque formation. We longitudinally collected plasma

from mice at 0, 2, 4, 8, 12, and 16 weeks on WD, and the immune profiling was

performed on sorted CD45+ cells from aortic arches by single-cell RNA-seq at 18

weeks on WD (Fig. 1a). We first determined total cholesterol levels in the plasma of

WT and $Saa3^{-/-}$ mice and a baseline comparison at weeks 0 revealed no significant

differences, with levels below 100 mg/dL (Fig. 1b). Over time, $Saa3^{-/-}$ mice developed

higher cholesterol levels than WT, with a slight increase at weeks 2 through 12, and a

significant rise by weeks 16 (Fig. 1b).

Research demonstrates that serum amyloid A (SAA) attenuates the anti-

inflammatory and antioxidative functions of high-density lipoprotein (HDL) by

facilitating its binding to adipocyte and macrophage-derived glycoproteins, thereby

compromising its efficacy[18]. We conducted high-density lipoprotein (HDL)/ low-

density lipoprotein LDL analyses that revealed an increase in peripheral HDL levels

during the initial phase of atherosclerosis progression (Fig. 1c). In *Saa3*[-/-] mice, not only

did HDL levels demonstrate a rising trend with statistically significant increases in the

Saa3[-/-] group compared to WT at weeks 2 and 4, but the absence of *Saa3* also correlated

with a marked increase in LDL levels in the bloodstream (Fig. 1c).

Overexpression or suppression of SAA3 can increase or decrease aortic lesion area

in *ApoE*[-/-] mice[15]. We also determined aortic plaque sizes between WT and *Saa3*[-/-] mice

by histologically evaluating aortic root sections stained with Oil Red O (Fig. 1d). It

demonstrated a significant decrease in plaque area in *Saa3*[-/-] compared to WT mice,

with mean values of 31.50% and 45.48%, respectively (Fig. 1e). These observations

may support *Saa3* deficiency enhances the circulation of SAA3-free HDL (unmodified

HDL), which exhibits pronounced anti-inflammatory properties, potentially mitigating

plaque development.

***Saa3* deficiency enhances overall intercellular immune communications in aortic**

arches during atherosclerosis progression

All immune cells express CD45, a major transmembrane glycoprotein expressed on

all hematopoietic cells[19] and some cardiac fibroblasts[20]. To elucidate the immunological

impact of *Saa3* deficiency within the aortic arch and its putative role in the pathogenesis

of atherosclerosis, we performed a single-cell RNA sequencing on FACS-purified

CD45+ cells (Supplementary Fig. 1). After data processing, anchor-based dataset

integration[21], and cell clusters visualized by Uniform Manifold Approximation and

Projection (UMAP), it revealed the cell compositional variances in aortic arches

between WT and *Saa3*[-/-] mice during atherosclerosis progression (Fig. 2). Utilizing the

cell annotation tool by *SingleR*[22], we classified the cell phenotypes, enabling initial

taxonomical segregation within the discerned clusters (Fig. 2a). Our analysis identified

11 discrete cell subpopulations, encompassing B cells, dendritic cells (DCs), fibroblasts,

innate lymphoid cells (ILCs), macrophages, monocytes, neutrophils, natural killer T

(NKT) cells, stromal cells, T cells, and γδ T cells (Tgd) (Fig. 2a). Despite similar UMAP

topologies between WT and *Saa3*[-/-] aortic cell populations (Fig. 2a), *Saa3*[-/-] mice

showed increased T cells, B cells, monocytes, and γδ T cell pro-

portions but decreased macrophages, stromal cell, and innate lymphoid cells (ILC)

compared to WT mice (Fig. 2b). Heatmaps of differential gene expression profiles

supported these *SingleR*-annotated cell type differences, highlighting the top 5 marker

genes per subset (Fig. 2c).

Cellchat has been used to infer, analyze, and visualize cell-cell communication

networks in scRNA-seq datasets[22]. To dissect the variances in signaling dynamics in

aortic cell types between WT and *Saa3*[-/-] mice, we employed *CellChat* to evaluate the

intercellular communication networks and assess the volume and intensity of cellular

interactions within the respective cohorts (Figs. 2d-2f). The resultant metrics

demonstrated 3343 and 3857 interactions across all cell types in aortic arches between

WT and *Saa3*[-/-] mice, with interaction strength for *Saa3*[-/-] cell types quantified at

133.288 compared to 97.333 for WT (Fig. 2d). The network graphs elucidate these

differential interactions, both in terms of quantity (left) and magnitude (right), among

the various cellular phenotypes within the murine aortic microenvironment (Fig. 2e).

Interactions augmented in $Saa3^{-/-}$ cells are represented by red lines, whilst blue lines

indicate more pronounced communication in WT cells, with an observed dominance of

red lines suggesting an intensified and potentially more reactive immune milieu in

$Saa3^{-/-}$ aortae (Fig. 2e). To rigorously dissect the discrete intercellular communication

patterns responsible for the observed differential signaling, we interrogate the heatmaps

that delineate both the frequency and magnitude of interaction strengths across aortic

cell types (Fig. 2f). Increased frequency and magnitude of intercellular interaction

strengths were observed in the aortic arches of $Saa3^{-/-}$ mice compared to their WT mice

(Fig. 2f). We identified a pronounced amplification in signaling pathways, particularly

those originating from fibroblasts, macrophages, and stromal cells directed toward

neutrophils. The neutrophil subset in the context of $Saa3^{-/-}$ mice exhibited a significant

enhancement in their interactive roles, acting effectively as both originators and targets

of signaling—a contrast to the interaction dynamics evident in the context of WT mice

(Fig. 2f). Reversely, there was a tangible suppression of signaling within the cells in

aortic arches of $Saa3^{-/-}$ mice, as evidenced by reduced communication frequencies from

fibroblasts to macrophages and in the macrophage-to-monocyte signaling axis,

irrespective of their directional roles in signal propagation (Fig. 2f). These patterns

suggest that the absence of the $Saa3$ gene exerts a profound regulatory influence on the

intercellular communication network among macrophages, monocytes, neutrophils,

stromal cells, and fibroblasts, potentially revealing critical insights into the regulatory

mechanisms of immune function within the aortic niche.

$Saa3$ depletion increases biological processes in aortic neutrophils and fibroblasts

that are highly associated with tissue remodeling during atherosclerosis

CellChat analysis revealed significant differences in cell-cell interaction signals between neutrophils within the *Saa3^-/-* group compared to the WT (Figs. 2e-2f). To delve deeper, we assessed the transcriptomic variances in neutrophils from WT versus *Saa3^-/-* mice. Our volcano plot delineated distinct gene expression profiles, with genes such as *Ncf2*, *Sf3b1*, and *Cd24a* notably upregulated in *Saa3^-/-* mice, exceeding the established $\log_2$ fold change threshold of >1 and p-values < 0.01 (Fig. 3a). These genes are critically linked to the production of reactive oxygen species, as well as neutrophil activation and bactericidal functions[23,24]. The observed disparities in gene expression suggest modulated immune responses in *Saa3^-/-* aortic neutrophils, potentially influencing their roles in inflammatory processes (Fig. 3a). Further dissection of the phenotypic divergence in neutrophils between WT and *Saa3^-/-* mice entailed quantitatively assessing differentially expressed genes (DEGs). Subsequent gene set enrichment analysis, executed via the *ClusterProfiler* package[25], elucidated the predominant gene ontology (GO) pathways impacted by the absence of *Saa3* (Fig. 3b). Compared to WT mice, aortic neutrophils in *Saa3^-/-* mice exhibit an upregulation in biological processes encompassing positive regulation of the immune effector process and immune response-activating signaling pathway (Fig. 3b, Supplementary Table 1).

The differential gene analysis in fibroblasts between WT and *Saa3^-/-* mice revealed significant transcriptional downregulation of *Il6* in the *Saa3^-/-* group (Fig. 3c). Consistent with previous reports, IL-6 has been characterized as a pro-inflammatory cytokine that facilitates the trans-differentiation of fibroblasts into myofibroblasts, enhancing chemokine release and immune cell recruitment at inflammation sites [26] [27]. Conversely, the expression of *Spp1* was upregulated in the *Saa3^-/-* fibroblasts, correlating with increased TGF-β expression, collagen production, and fibrosis [28,29].

Additionally, elevated expressions of *Col12a1* and *Col5a2* were observed in *Saa3*[-/-]

fibroblasts (Fig. 3c), suggesting a propensity towards enhanced tissue remodeling. GO

analysis of these enriched genes in aortic fibroblasts from *Saa3*[-/-] mice highlighted

advanced mechanisms of extracellular matrix structuring, organization, and lipid export

compared to WT fibroblasts (Fig. 3d, Supplementary Table 1). These alterations in gene

expression suggest a modified fibroblast phenotype that may reduce the usual

inflammatory response while concurrently enhancing fibrotic repair processes.

In comparing the total macrophages from WT and *Saa3*[-/-] mouse aortic arches, we

observed that the absence of *Saa3* markedly alters the gene expression profile within

macrophages (Fig. 3e). Notably, genes *Fabp5* and *Gpnmb* are upregulated in *Saa3*[-/-]

macrophages (Fig. 3e). *Fabp5*, which plays a central role in the intracellular transport

of lipids, is integral to the uptake, transport, and metabolism of fatty acids.[30] *Gpnmb*

has been shown to protect against obesity-related metabolic disorders by mitigating

macrophage inflammatory capacity[31]. Conversely, genes such as *Cxcl13*, *Lyz1*, *Cp*,

Tmem176a, *Clec4a1*, *C3*, and *Cfp* are downregulated in *Saa3*[-/-] macrophages (Fig. 3e).

Studies have demonstrated that a lack of *Cxcl13* correlates with a diminished presence

of atherosclerotic conditions, likely due to lower recruiting inflammatory granulocytes

within the lesions [32] [33]. *C3* expression in macrophages has been linked to exacerbating

atherosclerosis by limiting macrophage efferocytosis, contributing to plaque

development and inflammation.[34] *Cfp* has been linked to regulating complement

activation and orchestrating iron homeostasis[35]. Dysregulation or loss of *Cp* gene

function precipitates iron overload in these cells, a hallmark of atherogenic

macrophages, which consequently accelerates the progression of atherosclerotic

disease[36]. Subsequent GO analysis of these enriched genes in aortic macrophages

highlighted the increased recruitment and cell chemotaxis in WT mice while *Saa3*[-/-]

aortic macrophages increase the lipid localization and transport (Fig. 3f,

Supplementary Table 1).

Overall, these data suggest that *Saa3* deficiency precipitates states of elevated

functional activity within neutrophils and enhances the reparative activity of fibroblasts

within the organization, potentially influencing tissue architecture remodeling and

reparative capacities that impact aortic plaque progression. The phenotypes of aortic

macrophages were impacted by reduced recruitment of inflammatory granulocytes,

which helped mitigate inflammation potentially influencing lesion formation and

stability.

Altered macrophage compositions and enhanced Trem2^{hi} macrophage presence

linked to diminished aortic plaque progression in *Saa3$^{-/-}$* mice

Macrophage (Mφ) polarization, along with several distinct clusters, has been

identified as increasingly prevalent during the atherosclerosis progression and

regression[8,37]. To dissect the functional heterogeneity of aortic macrophage populations

in WT and *Saa3$^{-/-}$* mice during atherosclerosis, we classified macrophages into

subpopulations and compared the top differentially expressed genes from each cluster

against our previously published dataset, where we profiled single-cell sorted *Cx3cr1*-

derived aortic macrophages from lineage-tracing mice during atherosclerosis

progression and regression (hereinafter referred to as "*Lin regression study*")[8]. There

are five distinct macrophage clusters in the aortic arches of WT and *Saa3$^{-/-}$* mice during

atherosclerosis (Fig. 4a). CD74^{hi}MHCII^{hi} Mφ is the most abundant macrophage subset

in both genotypes, with CD74^{hi}MHCII^{hi}, Folr2^{hi}, and Retnla^{hi}Ear2^{hi} Mφ being more

prevalent in WT mice compared to *Saa3$^{-/-}$* mice (Fig. 4b). Conversely, Trem2^{hi} and

Apbb2[hi] Mφ are found in higher percentages within the aortic arches of *Saa3[-/-]* mice

than in WT mice (Fig. 4b).

The Cd74[hi]MHCII[hi] Mφ, a subset identified through the *Lin regression study*[8], is

characterized by high expression of genes such as *Tmem176b*, *Lilra5*, *H2-Eb1*, and *H2-*

Aa (Supplementary Fig. 2a). Folr2[hi] Mφ exhibit unique transcriptional profiles with

F13a1, Pf4, Folr2, and *Lyve1* (Supplementary Fig. 2a). These markers are indicative of

a tissue-resident-like macrophage phenotype[38-41] and align with the molecular signature

of the Folr2[hi] macrophage cluster previously delineated in the *Lin regression study* [8].

Retnla[hi]Ear2[hi] Mφ is distinguished by their elevated expression of genes such as *Retnla*

and *Ear2*, which suggest an early-stage transition of monocytes to macrophages within

tissues[42,43]. Additionally, these macrophages show enrichment in genes like *Gm2a* and

Fn1, confirming their specialized state as identified in the *Lin regression study*.[8]

Trem2[hi] Mφ is defined by a gene expression signature that mirrors the population

described by *Cochain et al.*[44] and *Lin regression*[8] studies and is exemplified by

heightened expression of *Ctsd, Lgals3, Spp1*, and *Lpl* (Supplementary Fig. 2a). Apbb2[hi]

Mφ is characterized by the predominant expression of *Cd9, Cd72*, and *Hexb* genes.

While sharing traits with the "Trem2[hi] Mφ," they are uniquely distinguished by their

expression of *Apbb2* (Supplementary Fig. 2a).

On the other hand, we identified differentially expressed genes (DEGs) across five

macrophage populations and conducted gene ontology (GO) enrichment analysis on

biological pathways to explore potential functions (Supplementary Fig. 2b and Table

3). Compared to other macrophage clusters, Cd74[hi]MHCII[hi] Mφ in the aortic arches

showed significant enrichment in pathways related to leukocyte-mediated immunity,

positive regulation of cell activation, activation of the immune response, and

immunoglobulin-mediated immune responses (Supplementary Fig. 2b and Table 3).

Folr2[hi] Mφ is distinguished by activation of immune response, ameboidal-type cell

migration, cell chemotaxis, regulation of angiogenesis, and regulation of viral processes

(Supplementary Fig. 2b and Table 3).   Retnla[hi]Ear2[hi] Mφ were noted for their

leukocyte proliferation, mononuclear cell proliferation, positive regulation of leukocyte

cell-cell adhesion, positive regulation of T cell activation, and response to type II

interferon (Supplementary Fig. 2b and Table 3). Trem2[hi] Mφ is characterized by a

purine ribonucleoside triphosphate biosynthetic process, ATP biosynthetic process,

oxidative phosphorylation, aerobic respiration, and the overall generation of precursor

metabolites and energy (Supplementary Fig. 2b and Table 3). These functions highlight

the metabolic specialization of Trem2[hi] Mφ in energy production and biosynthesis.

Apbb2[hi] Mφ demonstrated upregulation in myeloid cell differentiation, leukocyte

migration, actin filament organization, regulation of protein-containing complex

assembly, and mononuclear cell migration (Supplementary Fig. 2b and Table 3).

In *Lin regression study*[8], Cd74[hi]MHCII[hi] Mφ and Retnla[hi]Ear2[hi] Mφ are abundant in

aortic arches of progression group and we also observed these two subsets are higher

in aortic arches of WT mice compared to *Saa3[-/-]* mice (Fig. 4b). *Folr2* expression is

elevated in human atherosclerotic plaques compared to normal arterial tissue[45] and we

also observed aortic Folr2[hi] Mφ are higher in WT mice than *Saa3[-/-]* mice (Fig. 4b).

Trem2[hi] Mφ exhibits comparable prevalence between the progression and regression

cohorts in the *Lin regression study*[8], whereas both Trem2[hi] and Apbb2[hi] Mφ are more

abundant in the aortic arches of *Saa3[-/-]* mice compared to WT mice (Fig. 4b). Trem2[hi]

Mφ is previously identified as lipid-laden foam cells within atherosclerotic lesions,

underscoring their capacity for lipid processing and phagocytosis[9,10,37]. They are

associated with anti-inflammatory responses, which may help prevent the establishment

of a proinflammatory environment within the plaque[9,37,46]. Similar to previous findings,

Trem2[hi] Mφ expresses high *Spp1,* a gene associated with fibrotic responses indicative

of tissue repair mechanisms[47,48] (Fig. 4c, Supplementary Fig. 2a). Additionally, this

subset expresses *Gpnmb*, a gene implicated in anti-inflammatory processes[31,49], along

with *Fabp5*, which is involved in the uptake and transport of fatty acids[30] (Fig. 4c).

Notably, enzymes such as *Lpl*, central to lipid metabolism[50] , and *Mmp12*, a contributor

to extracellular matrix remodeling[51], further characterize this population. Hence, these

data indicate that *Saa3*[-/-] mice exhibit higher compositions of aortic macrophages with

tissue-repairing and anti-inflammatory properties, leading to reduced aortic plaque

progression.

***Saa3* modulates aortic macrophage functionalities during atherosclerosis**

Investigating the transition of macrophage phenotypes from M1-like to M2-like as a

therapeutic strategy recognizes the complexity of aortic macrophage phenotypes in

atherosclerosis, which extend beyond conventional M1 and M2 polarization states[8,37].

We use typical markers for Chemokine, IFN, Inflammatory, and Type II responses to

visualize the aortic macrophage subsets from WT and *Saa3*[-/-] mice (Fig. 4d). Among

the comparisons between WT and *Saa3*[-/-] aortic Mφ, pronounced differences were noted

in the increased expression levels of chemokines including *Cxcl1*, *Ccl2*, *Ccl3*, and *Ccl4*

in *Saa3*[-/-] than WT Folr2[hi] Mφ (Fig. 4d). Chemokines are signaling molecules that

attract various types of immune cells to sites of infection or injury. Increased expression

of chemokines by tissue-resident macrophages enhances the recruitment of neutrophils

and lymphocytes, which is crucial for initiating and sustaining an effective immune

response[52]. Additionally, there was a higher expression of type II response markers

including *Cd163, Mrc1*, and *Msr1*[53-56] in *Saa3*[-/-] than WT Folr2[hi] Mφ (Fig. 4d).

Moreover, Il10ra showed higher expression in *Saa3*[-/-] than WT Cd74[hi]MHCII[hi] Mφ, and

Il10ra is required for protection against atherosclerosis in low-density lipoprotein

receptor knockout mice[57]. Furthermore, we observed higher expression levels of

interferon regulatory and downstream markers such as *Irf5*, *Irf7*, *Isg15*, and *Stat1* in

WT than *Saa3*[-/-] Retnla[hi]Ear2[hi] Mφ (Figure 4d), which may indicate an enhanced

interferon response in these cells [58,59]. These expression patterns indicate a significant

alteration in gene expression profiles and macrophage subsets between the two

genotypes, suggesting that deletion of the *Saa3* may modulate macrophage recruitment,

type 2 immune responses, and inflammatory/anti-inflammatory phenotypes.

Saa3 modulates aortic macrophage communications that impact inflammatory

processes and aortic plaque compositions

To determine the role of *Saa3* in aortic macrophage communication during

atherosclerosis, we also performed a comparative analysis of cell interactions using

CellChat[22] in both WT and *Saa3*[-/-] macrophages. Our findings indicate a substantial

decline in intercellular communication in *Saa3*[-/-] macrophages, with interaction events

decreasing from 482 in WT to 290 in *Saa3*[-/-] cells (Fig. 4e). Correspondingly, we

observed a significant drop in the strength of these interactions, with the average

interaction strength in WT macrophages being 17.997 compared to a lower average of

14.348 in *Saa3*[-/-] macrophages, mirroring the decrease in the number of interaction

events (Fig. 4e).

The heatmap depicts the overall signaling patterns observed in various macrophage

subpopulations from WT and *Saa3*[-/-] mice (Fig. 4f), and the bar graph shows the relative

information flow of these signaling pathways between WT and *Saa3*[-/-] macrophages

(Fig. 4g). In the context of inflammatory-mediated atherosclerosis progression, WT

macrophages present higher signaling activity in THBS, ANGPTL, LAMININ, PVR, CD226, OSM, NOTCH, CADAM, and JAM pathways compared to $Saa3^{-/-}$ macrophages (Figs. 4f-g). In THBS signaling, *Thbs1* is a critical regulator of macrophage interleukin-1β (IL-1β) production and activation via CD47, highlighting the complex interplay between thrombospondins and immune modulation[60]. In ANGPTL signaling, *Angptl2* promotes vascular inflammation and accelerates atherosclerosis progression, with increased cardiac *Angptl2* production linked to heart failure and pathological cardiac remodeling by influencing inflammatory responses and affecting cardiomyocytes and macrophages[61,62]. In LAMININ and JAM signaling, LAMININ and junctional adhesion molecules (JAM) are involved in monocyte-to-macrophage differentiation and macrophage migration, playing roles in immune cell dynamics and atherosclerotic disease modulation[63,64]. PVR significantly contributes to atherosclerosis by facilitating leukocyte migration across the endothelium, thereby promoting inflammation [65]. CD226, a costimulatory molecule, when absent, has been observed to protect against atherosclerosis by preventing foam cell formation and reducing plaque buildup [66]. Oncostatin M (OSM) signaling promotes atherogenesis and plaque vulnerability by promoting the differentiation of vascular smooth muscle cells into osteoblastic phenotypes via M1 macrophages, potentially leading to plaque instability [37]. NOTCH signaling plays a significant role in atherosclerosis development, with *Notch-1* deletion inducing anti-inflammatory M2 effects through the PI3K-Akt pathway, contrasting with its increased presence in vulnerable human plaques [67].

In contrast to their WT counterparts, $Saa3^{-/-}$ macrophages exhibit elevated expression of signaling molecules such as COLLAGEN, GRN, SN, TGFb, and CLEC. Collagen plays a crucial role in modulating macrophage functions and improving plaque stability, with an increased presence in M2-polarizing macrophages within the plaque [68,69]. GRN

exerts anti-atherogenic effects by enhancing nitric oxide production in endothelial cells

through the Akt/eNOS signaling pathway, forming a complex with apolipoprotein A-I

to stabilize atherosclerotic plaques, and in atherosclerotic mice, its deficiency leads to

increased expression of adhesion molecules and inflammatory cytokines[70-72]. TGF-β

signaling contributes to the reduction and stabilization of atherosclerotic plaques by

altering macrophage behavior, and its overexpression is linked to smaller lesions,

increased collagen deposition, smooth muscle cell infiltration, and reduced macrophage

presence, ultimately fostering a more stable lesion phenotype[73]. CLEC signaling,

specifically through Clec4a2, a C-type lectin receptor, protects against atherosclerosis

by promoting homeostatic functions within the vessel wall, enhancing cholesterol

metabolism, and limiting immune responses to toll-like receptors [74]. In summary, this

analysis confirms that aortic macrophages in WT mice are more associated with

inflammatory and migration processes, whereas aortic macrophages in $Saa3^{-/-}$ mice are

more related to vascular protection and aortic plaque stabilization.

Differential effects of *Saa3* deficiency on macrophage subpopulations and ligand-

receptor interactions

We further investigated the differential effects of *Saa3* deficiency on five

macrophage subpopulations. Our observations revealed that, aside from Trem2[hi] Mφ,

the gene expression profiles of CD74[hi]MHCII[hi] Mφ, Folr2[hi] Mφ, Retnla[hi]Ear2[hi] Mφ, and

Apbb2[hi] Mφ in $Saa3^{-/-}$ mice exhibited substantial downregulation of numerous genes

when compared to their WT counterparts (Figs. 5a-d). We also performed GO term

enrichment pathway analysis on the downregulated DEGs in these four $Saa3^{-/-}$

macrophage subpopulations compared to WT (Figs. 5e-h). The analysis revealed

common downregulated genes in $Saa3^{-/-}$ mice, including *Lyz1*, *Lyz2*, other lysozyme-

related genes, *Cxcl13*, and *Ccl8*, which are associated with pathways involved in cell

killing and the destruction of other organisms, suggesting that the absence of *Saa3*

impairs macrophage functions in combating pathogens as previous studies[75,76] (Figs.

5e-h). Specifically, Folr2hi Mφ in *Saa3-/-* mice showed significant downregulation of

Cxcl13 (Fig. 5b). Previous study indicates patients with carotid atherosclerosis exhibit

elevated plasma levels of CXCL13, especially in symptomatic cases, and higher

CXCL13 expression within atherosclerotic carotid plaques compared to non-

atherosclerotic vessels[77]. CCL8 is a potent chemoattractant for monocytes and

macrophages, directing them to areas of inflammation and infection[78,79]. Retnlahi Ear2hi

Mφ in WT mice show higher enrichment in ERK1 and ERK2 cascade, positive

regulation of angiogenesis, and lipid storage (Figs. 5c, 5g). ERK1 and ERK2 signaling

pathways regulate macrophage function in atherosclerosis. Deletion of *Erk1* reduces

macrophage migration and plaque lipid content in LDL receptor-deficient mice on a

high-fat diet[80,81]. Macrophages regulate angiogenesis in atherosclerotic plaques, leading

to new blood vessel formation. This enhances lipid and immune cell accumulation,

contributing to plaque growth and instability[82]. Apbb2hi Mφ in WT mice enrich in

defense response to virus and interferon (Figs. 5d, 5h). This may indicate that WT

Apbb2hi Mφ have more inflammatory response features than Saa3-/-, contributing to

chronic inflammation, plaque instability, and progression [83]. To elucidate the specific

ligand-receptor interactions contributing to the observed differences in pathway

patterns between *Saa3-/-* and WT groups, we conducted a comparative analysis of

ligand-receptor signaling within five subpopulations of macrophages (Supplementary

Figs 3a-e). The analysis encompassed an assessment of the differential expression of

ligands and receptors and the computation of interaction probabilities, thereby enabling

the dissection of signaling discrepancies between the two genotypic conditions. Since

aortic Trem2[hi] Mφs are more abundant in *Saa3[-/-]* mice, we focus on ligand-receptor

interactions within Trem2[hi] Mφ under both WT and *Saa3[-/-]* conditions (Supplementary

Fig. 3d). Prominently, pairs such as Spp1-Cd44 and Spp1-integrins (Itgav+Itgb1,

Itga5+Itgb1, Itga4+Itgb1), exhibit a heightened probability of interaction in the signal

transduction pathways of Trem2[hi] Mφ within the *Saa3[-/-]* mice (Supplementary Fig. 3d).

Spp1 is established to bind integrins Itgav, Itgb1, Itgb5, and Itga4 (Col4a2-Sdc44,

Col4a2-Cd44,   Col4a2-(Itga9+Itgb1),   Col4a1-Sdc44,   Col4a1-Cd44,   Col4a1-

(Itga9+Itgb1)),   influencing   cellular   adhesion   and   migration   crucially[84,85]

(Supplementary Fig. 3d). Furthermore, interactions involving Col4a2 and Col4a1 with

their partners are exclusively observed in the *Saa3[-/-]* condition (Supplementary Fig. 3d).

As major constituents of the basement membrane, type IV collagen may have

implications for the stability of atherosclerotic plaques.[86] In contrast, the CCL-CCR

signaling axis, encompassing Ccl9-Ccr1, Ccl8-Ccr1, Ccl7-Ccr1, Ccl6-Ccr2, Ccl6-Ccr1,

Ccl3-Ccr5, and Ccl3-Ccr1, is exclusively active in the WT condition within Trem2[hi]

Mφ transitioning to Retnla[hi]Ear2[hi] Mφ (Supplementary Fig. 3d). These chemokine-

mediated communications facilitate the recruitment of macrophages or monocytes to

sites of inflammation, contributing to the formation and progression of atherosclerotic

lesions and plaque vulnerability[87,88]. Parallel observations were noted for the ligand-

receptor pairs Cd74[hi]MHCII[hi] Mφ, Folr2[hi] Mφ, Retnla[hi]Ear2[hi] Mφ, and Apbb2[hi] Mφ to

Retnla[hi]Ear2[hi] Mφ (Supplementary Figs. 3a-e). It is posited that these altered signaling

patterns may underlie the observed reductions in plaque burden and macrophage

recruitments in *Saa3[-/-]* mice.

Trem2[hi] Mφ potentially mitigates aortic plaque development by enhancing lipid absorption, promoting an anti-inflammatory environment, and increasing extracellular matrix and fibrosis.

In atherosclerosis, *Saa3* deletion precipitates substantial changes in macrophage gene expression profiles, within the Trem2[hi] Mφ, as evidenced by differential expression between WT and *Saa3[-/-]* groups (Fig. 6a). The upregulation of genes in *Saa3[-/-]* than WT Trem2[hi] Mφ such as *Fabp4, Fabp5,* and *Lpl*, which are central to lipid metabolism[89,90], as well as *Ctsk* and, has been implicated in promoting disturbed flow-induced endothelial inflammation.[91] Other genes including *Gpnmb, Atp6v0d2, Mrc1, Mmp12*, and *Spp1* also exhibit altered expression (Fig. 6a). Studies suggest that *Gpnmb* may be anti-inflammatory by promoting inflammation resolution, as it can attenuate pro-inflammatory responses and promote M2 polarization in macrophages[49,92,93]. The suppression of *Gpnmb* has been associated with enhanced atherosclerotic plaque formation, whereas its overexpression correlates with decreased plaque development[94]. Augmented *Atp6v0d2* expression activates autophagy as a compensatory response to hemodynamic pressure, which indicates its role in maintaining plaque stability and potentially curtailing the progression of atherosclerosis[95,96]. *Mrc1* appears to modulate macrophage polarization toward an anti-inflammatory phenotype[97], while *Mmp12* plays a pivotal role in attenuating inflammation and fostering resolution via targeted proteolysis of chemokines[98,99]. Spp1+ foamy macrophages have been linked to signaling pathways that might abate plaque progression and stabilize susceptible lesions[100]. These genes correspond to GO enrichment pathways such as lipid localization, fatty acid transport, and the positive regulation of macrophage-derived foam cell differentiation (Fig. 6b). These results suggest that *Saa3[-/-]* Trem2[hi] Mφ may possess enhanced lipid uptake and metabolism capabilities, which could contribute to

the significant reduction in plaque size. Additionally, genes like *Ctsk*, *Gpnmb*, *Igf1*, and

Spp1 are associated with tissue remodeling pathways, indicating a potential shift of

Saa3[-/-] Trem2[hi] Mφ towards an anti-inflammatory phenotype (Fig. 6b). Differential

gene expression analysis utilizing violin plots demonstrated that genes associated with

tissue repair and lipid metabolism—specifically *Gpnmb*, *Fabp5*, *Lpl, Lgals3*, *Cd36*, and

Spp1—are more prominently expressed in *Saa3*[-/-] Trem2[hi] Mφ compared to their WT

counterparts (Fig. 6c). CD36 is a scavenger receptor widely expressed on the surface

of various cell types, including macrophages. CD36 binds to oxLDL particles,

facilitating their uptake into the macrophage, particularly in the context of

atherosclerosis and inflammation[101]. Concomitantly, there is a downregulation of genes

in *Saa3*[-/-] than WT Trem2[hi] Mφ such as *Thbs1, Kdm7a, Vegfa, Slc7a11, Fn1*, and *Chil3*.

These genes correspond to GO enrichment pathways such as positive regulation of

chemotaxis, positive regulation of vasculature development, and angiogenesis (Fig. 6b).

Angiogenesis is associated with inflammatory cells and can contribute to plaque

instability[102,103]. This complex gene expression network underscores the multifaceted

influence of *Saa3* in atherosclerosis and pinpoints interconnected genes geared toward

modulating macrophage function to combat disease progression.

Analysis of aortic Trem2[hi] macrophages from WT and Saa3[-/-] mice also revealed a

consistent expression pattern for a cohort of genes associated with lipid metabolism and

cholesterol processing (Figs 6b-c). The violin plots compare the expression levels of

genes central to cholesterol efflux pathways, including *Abca1, Abcg1, Cd36, Nr1h2,*

Scarb1, Pparg, Nr1h3, and *Apoe* (Fig. 6c, Supplementary Fig. 4). There were no

statistically significant differences observed between the two genotypes for most genes;

however, an exception was noted in the expression of *Cd36* (Fig. 6c).

Analysis through *CellChat* has additionally revealed alterations in the growth

differentiation factor (GDF) signaling pathway in all subsets of the aortic macrophages

(Figs. 6d-e). In the *Saa3*[-/-] Trem2[hi] macrophage phenotype, there is a notable shift

towards the sender role in the GDF signaling network (Fig. 6d). In contrast, Folr2[hi]

macrophages predominantly assume the signaling initiative in the WT condition (Figs.

6d-e). This shift in signaling behavior suggests that the absence of *Saa3* leads to a

reprogramming of the Trem2[hi] macrophage population, endowing them with a more

prominent role in initiating signaling within the GDF pathway. GDF-15 has been

reported to reduce cardiac damage and rupture after myocardial infarction by mitigating

inflammation and apoptosis via the PI3K/Akt pathway. It also protects against

atherosclerosis by modulating apoptosis, inhibiting monocyte recruitment and

macrophage activation, and enhancing plaque stability[104-106]. Other studies suggest

GDF-15 may reduce macrophage accumulation in *Ldlr*[-/-] or *Apoe*[-/-] mice[107-109]. This

shift in the gene expression landscape highlights the critical role of *Saa3* in regulating

macrophage function and may provide insight into the molecular mechanisms

underpinning the immune responses in aortic plaque progression.

Discussion

Our study demonstrates that *Saa3* deficiency reduces aortic plaque progression while

increasing peripheral cholesterol levels (Figs. 1b-e). This finding aligns with previous

research indicating that SAA diminishes the anti-inflammatory and antioxidative

capabilities of high-density lipoprotein (HDL) by binding to glycoproteins from

adipocytes and macrophages, thereby impairing its anti-inflammatory properties[18,110]. It

suggests that serum amyloid A (SAA) compromises HDL functionality, which could

explain the elevated cholesterol levels observed in *Saa3*[-/-] mice. Despite this, *Saa3*[-/-]

mice decreased aortic plaque size, indicating that *Saa3* deficiency protects against

atherosclerosis (Figs 1d-e).

The single-cell RNA sequencing (scRNA-seq) analysis of CD45+ cells from aortic

arches revealed significant alterations in the aortic immune cell landscape of *Saa3*[-/-]

mice. Increased proportions of T cells, B cells, monocytes, and γδ T cells were noted,

while macrophages, stromal cells, and innate lymphoid cells (ILCs) were reduced

compared to WT mice (Fig. 2b). This shift in immune cell composition suggests that

Saa3 deficiency alters the inflammatory responses within the aortic arches, potentially

contributing to the observed reduction in plaque progression.

CellChat analysis further highlighted the impact of *Saa3* deficiency on intercellular

communication within the aortic microenvironment (Figs. 2, 4). *Saa3*[-/-] mice exhibited

enhanced intercellular interactions, particularly among neutrophils, fibroblasts, and

stromal cells, suggesting a more reactive immune milieu. Conversely, a reduced

macrophage-to-monocyte and fibroblast-to-macrophage signaling was observed,

indicating a dampened inflammatory response (Figure 2d-f). Neutrophils and

fibroblasts from *Saa3*[-/-] mice showed the upregulation of genes associated with immune

effector processes and tissue remodeling. Neutrophils exhibited increased expression

of genes linked to reactive oxygen species production and bactericidal functions (Fig.

3b), while fibroblasts showed enhanced expression of collagen and fibrosis-related

genes (Fig. 3d). These findings suggest that *Saa3* deficiency promotes a shift towards a

reparative and less inflammatory phenotype in these cell types, potentially influencing

atherosclerosis progression.

Compared to our previously published dataset, where we profiled single-cell sorted

Cx3cr1-derived aortic macrophages during atherosclerosis progression and regression[8],

we identified 11 aortic macrophage clusters, while we only identified five distinct

clusters with notable differences in gene expression between WT and $Saa3^{-/-}$ mice (Fig.

4a). This may be due to the difference in the platform used to capture single cells

between 10X Genomics and BD Rhapsody. Nonetheless, we still observed that Trem2hi

macrophages were more abundant in $Saa3^{-/-}$ mice (Fig. 4b) and exhibited gene

expression profiles indicative of enhanced lipid metabolism and tissue repair functions

(Fig. 6). These macrophages may be crucial in mitigating plaque progression by

promoting an anti-inflammatory environment and enhancing extracellular matrix

production.

Our findings also highlight the differential ligand-receptor interactions in WT and

$Saa3^{-/-}$ mice macrophages (Supplementary Fig. 3). $Saa3$ deficiency led to altered

signaling dynamics, particularly in Trem2hi macrophages, which showed increased

interactions involving $Spp1$ and integrins, as well as type IV collagen, suggesting

enhanced adhesion and migration capabilities. In contrast, chemokine-mediated

communications were more prominent in WT macrophages, facilitating the recruitment

of inflammatory cells to atherosclerotic lesions (Supplementary Fig. 3d). The observed

changes in gene expression and intercellular communication underscore the complex

role of $Saa3$ in modulating Trem2hi macrophage functions during atherosclerosis. $Saa3$

deficiency appears to shift Trem2hi macrophages towards a phenotype that promotes

tissue repair and plaque stability (Fig. 6), which may explain the reduced plaque

progression despite elevated cholesterol levels.

In conclusion, our study reveals that $Saa3$ deficiency has a dual impact on

atherosclerosis, reducing aortic plaque progression while increasing peripheral

cholesterol levels. The enhanced reparative and anti-inflammatory properties of

macrophages, neutrophils, and fibroblasts in $Saa3^{-/-}$ mice likely contribute to the

observed protective effects against atherosclerosis. These findings provide valuable

insights into the regulatory mechanisms of immune function within the aortic niche and

highlight the potential of targeting *Saa3* for therapeutic strategies in atherosclerosis.

Further research is warranted to elucidate the precise molecular pathways involved and

to explore the therapeutic potential of modulating *Saa3* expression in cardiovascular

diseases.

Author Contributions

TYC, YZY, and JDL designed experiments and interpreted the data. TYC and YZY wrote the manuscript draft, followed by JDL editing. TYC, YZY, IJL, CJL, CHY, YTC, and PAC performed experiments. TYC and YZY coordinated and performed the single-cell RNA-seq experiments and then analyzed single-cell RNA-seq data.

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Method

Animals

All animal procedures were approved by the National Taiwan University IACUC Committee. The Saa3-knockout mice ($Saa3^{-/-}$) were developed by the Mutant Mouse Resource & Research Centers (MMRRC). The cryopreserved sperm were acquired and recovered by the National Laboratory Animal Center in Taiwan. We generated heterozygous $Saa3^{+/-}$ mice and bred them to obtain 12-week-old Wild-type C57BL/6J mice wild-type (WT) and $Saa3^{-/-}$ littermates used for the experiments. Murine atherosclerosis was induced by injecting intraperitoneally once with AAVmPCSK9 (ssAAV8/hAAT-mPCSK9D377Y, AAV core, Institute of Biomedical Sciences, Academia Sinica, using a plasmid acquired from Addgene (Plasmid #58376) and kindly provided by Dr. Mi-Hua Tao) at 5×10^{11} viral particles/mouse and fed on Western diet (Research Diets, Cat# D12079Bi) for 18 weeks. All mice were housed in a specific pathogen-free (SPF) environment within individually ventilated cages (IVC) at a ventilation rate of 70-100 air changes per hour (ACH) under positive pressure. The facility maintained a constant temperature of $22 \pm 2°C$ and a relative humidity of $55 \pm 10\%$. A 12-hour light-dark cycle was regulated by timers (7:00 AM to 7:00 PM light, 7:00 PM to 7:00 AM dark).

Cholesterol level measurements

Blood samples were collected from mice and total cholesterol levels in plasma were assessed in WT and $Saa3^{-/-}$ mice subjected to AAVmPCSK9D377Y and fed on Western

Diet for 0, 4, 8, 12, and 16 weeks (n=5 mice per group). Cholesterol levels were

measured using a colorimetric assay (FUJIFILM/Wako, Cat# 639-50981), with

absorbance read at 600 nm following a 5-minute incubation at 37 °C. HDL and

LDL/VLDL cholesterol levels in plasma were quantified using the ab65390 Cholesterol

Assay Kit (Abcam, Version 13a, Updated 17 April 2023), following the manufacturer's

protocol with adaptations for our setup. Plasma (20-30 μL) was mixed with an equal

volume of 2X Precipitation Buffer to separate the HDL and LDL/VLDL cholesterol

fractions. After adding reaction mixes, samples were incubated at 37 °C for 60 minutes

away from light. Absorbance was measured at 570 nm using a microplate reader, and

cholesterol concentrations were determined by correlating absorbance readings with the

standard curve. Statistically significant differences between the two groups at

respective time points were determined using the unpaired Mann-Whitney U-test (*$p <$

0.05).

Histology

At harvesting, the aortic arch was meticulously excised from the experimental mice

for the subsequent single-cell isolation, and then aortic roots were embedded in OCT

(Catalog # NC0696746). Serial sections were performed at 6 μm on embedded aortic

roots and stained with Oil Red O solution (Sigma) for 10 minutes at 37°C. Intimal

lesions and stained areas were imaged by an inverted fluorescence microscope

(OLYMPUS CKX53) and quantified by ImageJ as previously described [17].

Flow cytometry sorting and single-cell RNA-seq library preparation

The protocol for isolating aortic cells from mice is as previously described[8]. Briefly, the

procedure began with aorta perfusion using phosphate-buffered saline (PBS). After

perfusion, the aortas were stored in FACS buffer. The enzymatic digestion processes

involved immersing the aorta in a digestion buffer containing 4U/ml liberase (Roche,

Cat. 54001127001), 60U/ml hyaluronidase (Sigma, Cat. H3506), and 40U/ml DNase I

(Sigma, Cat. DN25) at specified concentrations, followed by fine mincing. The mixture

was incubated at 37°C to facilitate effective digestion, with the process repeated

multiple times to ensure complete tissue breakdown. After digestion, the mixture was

filtered through a 35μm strainer to obtain a single-cell suspension. The collected cells

were then stained with CD45 (Alexa Fluor 488 anti-mouse CD45, Clone: 30-F11,

Biolegend, Cat. 103122) and Live/Dead (L/D) Blue markers (Thermo Fisher, Cat.

L34962), and the CD45-positive, L/D Blue-negative cells were sorted as

Supplementary Figure 1 to prepare single-cell libraries.

Single-cell samples were labeled using the BD™ Mouse Immune Single-Cell

Multiplexing Kit (Cat. 633793) for each cartridge run on the BD Rhapsody Express

Single Cell Analysis System for single-cell capture, followed by cDNA synthesis with

the BD Rhapsody cDNA Kit (Cat. 633773). The mRNA Whole Transcriptome Analysis

(WTA) and Sample Tag libraries were prepared using the BD Rhapsody™ WTA

Amplification Kit (Cat. 633801), according to the manufacturer's guidelines. The

quality and quantity of the libraries were assessed using the Agilent 4200 TapeStation

System with Agilent High Sensitivity D1000 ScreenTape (Agilent Technologies, Santa

Clara, CA) and a Qubit Fluorometer with the Qubit dsDNA HS Assay (Invitrogen, MA,

USA). Finally, the libraries were sequenced using the NovaSeq PE150 sequencer

(Illumina, San Diego, CA).

Reads alignment and single-cell data analysis

The fastq files generated from sequencing were processed using Seven Bridges

Genomics. The data were aligned to the mouse_GRCm38-PhiX-gencodevM19-

20181206 and demultiplexed using hashtags to separate samples. Subsequent steps

included filtering low-quality cells and identifying unique molecule identifiers (UMIs)

to produce filtered matrices, which were then utilized as inputs for further analysis. The

filtered matrices were analyzed using the Seurat package (v.4.3.0)[111] in R (v.4.3.1).

Initially, to exclude low-quality cells, we filtered out cells with nFeature_RNA < 200

and percent.mt > 15, tailoring filter parameters for each sample based on violin plots of

RNA feature numbers and the percentage of mitochondria in each cell. We used the

FindVariableFeatures() function in each sample to select the top 2000 genes with the

highest variance using the variance variance-stabilizing transformation (VST) method

for downstream analysis. Next, we applied a linear transformation to scale the data,

ensuring equal weight to each gene expression level in downstream analysis. A linear

dimensional reduction (PCA) was performed, and the Elbow plot was used to decide

which PCs to include in the following steps. We cluster cells using the Louvain

algorithm (resolution = 0.5). The non-linear dimensional reduction method was

employed for visualizing cell clustering, such as UMAP.

We followed the Seurat integration analysis pipeline to analyze two or more single-

cell datasets together. We used the FindIntegrationAnchors() function to identify

anchors, followed by the IntegrateData() function to use these anchors to integrate the

datasets. To identify differentially expressed features, we employed the

FindAllMarkers() or FindMarkers() functions to identify biomarkers for each cell

cluster (min.pct = 0.25, logfc.threshold = 0.25). We used visualization tools such as

VlnPlot, feature plot, dotplot, and heatmap to display intergroup gene expression

differences. Additionally, to comprehend the potential biological pathway connections

of gene sets expressed by each cell population and their differences between two

genotypes, we conducted a Gene Ontology (GO) analysis using the ClusterProfiler

package (v4.8.3)[112]. This was done after identifying differentially expressed genes

(DEGs) in each cell population compared to the cell population of another genotype.

The results were visualized using a Dotplot. Moreover, intercellular communications

was analyzed using the CellChat package (v1.6.1)[113]. This approach allowed us to

understand the roles played by each cell group in signal transduction pathways and

compare the differences in cellular signaling among cell groups under different

genotypes.

Data and code availability

Raw sequence data from single-cell RNA sequencing experiments are deposited in the

NCBI Sequence Read Archive under BioProject accession number PRJNA1129034 and

gene expression omnibus (GEO) accession number GSE270922. All processing was

performed in R and analysis scripts can be found on Github at

(https://github.com/JDLinLab/Saa3KO-Arch-scRNAseq-pepline-)

Figure legend

Fig. 1 Effects of *Saa3* deletion on peripheral lipid profiles and aortic plaque

progression during atherosclerosis.

(a) Schematic of an experimental model for the time points of plasma collections and

single-cell RNA sequencing (scRNA-seq) on aortic immune cells. C57BL/6 wild-type

(WT) and *Saa3*$^{-/-}$ mice were injected with AAVmPCSK9 and fed with the Western diet

for 18 weeks. Then aortic arches were digested to single-cell suspensions and FACS-

sorted aortic CD45+ cells were subjected to scRNA-seq on the BD Rhapsody platform

from WT and *Saa3*$^{-/-}$ mice.

(b) Plasma total cholesterol levels in WT and *Saa3*$^{-/-}$ mice subjected with

ssAAV8/hAAT-mPCSK9 and fed with the Western diet for 0, 4, 8, 12, and 16 weeks.

(c) Measurement of high-density lipoprotein (HDL) cholesterol levels and low-

density lipoprotein (LDL) cholesterol levels in plasma from WT and *Saa3*$^{-/-}$ mice over

a period of 0, 2, 4, 8, 12, and 16 weeks.

(d) Representative Oil Red O staining of aortic root sections in WT and *Saa3*$^{-/-}$ mice at

18 weeks post Western diet. Scale bar: 100 μm.

(e) As in (d), quantification of the lesion area of aortic root sections stained with Oil

Red O.

All data are presented as mean ± SEM; Statistically significant differences between the

two groups at respective time points were denoted by asterisks (*p < 0.05), determined

using an unpaired Mann-Whitney U-test. Each symbol represents an individual mouse;

WT mice (n=5), *Saa3*$^{-/-}$ mice (n=5).

Fig. 2 *Saa3* deficiency increases immune intercellular communication in aortic

arches during atherosclerosis progression.

(a) UMAP visualization compares the distribution of cell types in aortic arches between

WT and *Saa3*$^{-/-}$ mice. Unbiased cell annotations against the IMMGEN database are

colored and labeled accordingly on the plot.

(b) Cell type composition by percentages of WT and *Saa3*$^{-/-}$ mice (blue, WT; red, *Saa3*$^{-/-}$

) in total sorted CD45+ cells.

(c) Heatmap of top 5 marker genes of each cell type in aortic arches from WT and *Saa3*$^{-/-}$

mice. The selection of these top marker genes was based on the results of a Wilcoxon

test for differential expression.

(d) Bar plots show the number (left) and strength (right) of inferred interactions of

intercellular communication networks in aortic arches from WT and *Saa3*$^{-/-}$ mice.

(e) Circle plots show the numbers (left) and the strengths (right) of inferred interactions.

Node and edge sizes indicate the weights of the inferred networks across WT and $Saa3^-$

$^{/-}$ mice. Line color indicates variations between WT and $Saa3^{-/-}$ groups, with red

showing an increase and blue showing a decrease in interaction numbers within the

$Saa3^{-/-}$ compared to WT group.

(f) AS in (e), heatmap visualization of intercellular communication networks in aortic

arches from WT and $Saa3^{-/-}$ mice. The red and blue colors represent increased or

decreased signaling in the aortic arches of $Saa3^{-/-}$ mice compared to the WT mice. The

top-colored bar plot represents the sum of the columns of values (incoming signaling),

and the right-colored bar plot represents the sum of a row of values (outgoing signaling).

Fig. 3 Increased fatty acid degradation and oxidative phosphorylation in aortic

immune cells of $Saa3^{-/-}$ mice during atherosclerosis progression.

(a), **(c)**, **(e)** Volcano plot illustrating differential gene expression in neutrophils,

fibroblasts, and macrophages within aortic arches of WT versus $Saa3^{-/-}$ mice. The x-

axis displays the $\log_2$ fold change, while the y-axis shows the $-\text{Log}_{10}$ p-value. Grey dots

denote genes without significant differences, green dots indicate genes with significant

fold changes, and red dots mark genes significant in both fold change and p-value. The

dashed vertical lines represent the fold change boundaries, and the dashed horizontal

line demonstrates the p-value significance threshold. Analysis was performed on 26,189

genes using DESeq2.

(b), **(d)**, **(f)** Top 10 biological processes enriched in neutrophils, fibroblasts, and total

macrophages within the aortic arches of WT mice compared to *Saa3*[-/-] mice (upper

panel) or *Saa3*[-/-] mice compared to wild-type mice (lower panel). Enrichment analysis

utilized GO pathways to identify significant biological processes. The gene ratio is

plotted along the x-axis, and the enriched biological processes are listed on the y-axis.

A color gradient has been applied to indicate the $-\log_{10}$ adjusted *p*-value (p.adjust) of

each term, with the size of each point reflecting the number of genes associated with

the respective pathway.

Fig. 4 Delineation of macrophage sub-cluster in aortic arches between WT and

***Saa3*[-/-] mice during atherosclerosis progression.**

(a) UMAP plots show the sub-clusters of macrophages (Mφ) in aortic arches between

WT (left) and *Saa3*[-/-] (right) mice. Macrophages are delineated based on their gene

expression profiles: CD74[hi]MHCII[hi] Mφ in navy blue, Folr2[hi] Mφ in red, Retnla[hi]Ear2[hi]

Mφ in green, Trem2[hi] Mφ in sky blue, and Apbb2[hi] Mφ in pink.

(b) The bar graph displays the percentage composition of various macrophage

subpopulations within total macrophages from WT and *Saa3*$^{-/-}$ mice. Different colors

represent distinct macrophage subpopulations as indicated in **(a)**.

(c) Dot plot representing the expression profiles of five sub-macrophage populations.

The x-axis lists genes with differential expression, while the y-axis indicates the sub-

macrophage clusters.

(d) Dot plots show the expression profiles of macrophage markers involved in pathways

of chemokine, IFN (interferon), inflammatory, and type II responses across sub-

macrophage clusters. For **(c)** and **(d)**, the size of each dot corresponds to the percentage

of the indicated cell cluster expressing a particular gene marker, and the color intensity

signifies the mean expression level within that cell cluster.

(e) Bar plots show the number (left) and strength (right) of inferred intercellular

communication networks in total aortic macrophages from WT and *Saa3*$^{-/-}$ mice.

(f) Heatmap visualization of overall signaling patterns in aortic macrophages of WT

and *Saa3*$^{-/-}$ mice. The top-colored bar plot represents the sum of each column of values

(signaling the strength of overall pathways) across sub-clusters. The gradient blue

colored bar represents the relative strength of the indicated pathway.

(g) The bar graph displays the relative information flow of various signaling molecules

in aortic macrophages of WT and *Saa3*$^{-/-}$ mice. Blue bars indicate higher relative

information flow in WT macrophages, while red bars indicate higher information flow

in $Saa3^{-/-}$ macrophages.

Fig. 5 *Saa3* deficient impacts gene expression profiles of aortic macrophages

(a)-(d) Volcano plot illustrating differential gene expression in four sub-macrophage

populations (CD74^{hi} MHCII^{hi} , Folr2^{hi}, Retnla^{hi} Ear2^{hi}, and Apbb2^{hi} macrophage(Mφ))

within aortic arches of WT versus $Saa3^{-/}$ mice. The x-axis displays the log$_2$ fold change,

while the y-axis shows the -Log$_{10}$ p-value. Grey dots denote genes without significant

differences, green dots indicate genes with significant fold changes, and red dots mark

genes significant in both fold change and *p*-value. The dashed vertical lines represent

the fold change boundaries, and the dashed horizontal line demonstrates the *p*-value

significance threshold. Analysis was performed on 26,189 genes using DESeq2.

(e)-(h) The bubble plot presents the GO enrichment analysis for CD74^{hi} MHCII^{hi} ,

Folr2^{hi}, Retnla^{hi} Ear2^{hi}, and Apbb2^{hi} aortic macrophage (Mφ) from WT and $Saa3^{-/-}$ mice.

The x-axis represents the GeneRatio. The y-axis lists the enriched GO terms. Bubble

size corresponds to the count of DEGs associated with each GO term. The color

gradient from blue to red represents the -log$_{10}$ (adjusted *p*-value) of the enrichment.

Fig. 6 Aortic Trem2^{hi} macrophages in *Saa3$^{-/-}$* mice express more lipid metabolism

and tissue repair-associated genes.

(a) Volcano plot illustrating differential gene expression in aortic Trem2^{hi} macrophage

(Mφ) population of WT versus *Saa3$^{-/-}$* mice.

(b) The bubble plot presents the GO enrichment analysis for Trem2^{hi} Mφ from WT

versus *Saa3$^{-/-}$* (upper panel) or *Saa3$^{-/-}$* versus WT (lower panel) mice.

(c) Violin plots depicting the expression levels of tissue repair-associated genes in

Trem2^{hi} Mφ from WT and *Saa3$^{-/-}$* mice aortas. Each plot indicates the gene expression

level for *Gpnmb*, *Fabp5*, *Lpl*, *Lgals3*, *Cd36*, and *Spp1*, with blue representing WT and

red for *Saa3$^{-/-}$* group. The central white bar denotes the median expression level, while

the thick bar within the violins indicates the interquartile range. The width of the violins

reflects the density of data points at different expression levels.

(d) The circular diagram illustrates the GDF signaling pathway networks in aortic

macrophage subpopulations from WT (left) and *Saa3$^{-/-}$* (right) mice. Each segment of

the circle represents a different macrophage subpopulation. The connections between

segments indicate interactions and signaling pathways shared among these

subpopulations.

(e) Heatmap representation of the inferred GDF signaling pathway network across five

sub-populations of aortic macrophages. Each column represents a specific macrophage

sub-population, while each row corresponds to the role of the population in the

signaling pathway as a sender, receiver, mediator, or influencer.

Supplementary Figure Legends

Supplementary Fig. 1 Sorting strategy of aortic CD45+ cells.

Flow cytometry analysis was performed for cell sorting to isolate CD45+ immune cells from aortic arches stained for CD45 Alexa 488 and Live/Dead Blue. The top left plot shows forward scatter (FSC-A) versus side scatter (SSC-A), differentiating cells based on size and granularity, with a population gated as P1. The top right plot presents FSC-A versus FSC-H, with the discrimination gate P2 to exclude cell aggregates. The bottom left plot displays SSC-A against the Live/Dead Blue, with live cells gated as P7. The bottom right plot demonstrates SSC-A against the fluorescence intensity of CD45 Alexa-488, with the CD45+ population gated as P8. The CD45+ cells were sorted from P8 gated population.

Supplementary Fig. 2 Heatmap of top 10 gene markers and GO enrichment analysis of five aortic macrophage sub-cluster.

(a) Heatmap of top 10 marker genes of each sub-macrophage population in aortic arches from WT and *Saa3*[-/-] mice. The selection of these top marker genes was based on the results of a Wilcoxon test for differential expression.

(b) Gene Ontology (GO) enrichment analysis of biological pathways in 5 sub-populations of aortic macrophage (Mφ), using differentially expressed genes (DEGs) identified when comparing one of specific Mφ sub-population against the rest of all other Mφ sub-populations. It can represent the functional characteristics of each Mφ sub-population.

Supplementary Fig. 3 Comparison of ligand-receptor pair differences across five

sub-macrophage populations between WT and *Saa3⁻/⁻* mice.

The bubble plot illustrating the protein-protein interaction probabilities between

various ligand-receptor pairs across **(a)** CD74^{hi} MHCII^{hi} macrophage (Mφ), **(b)** Folr2^{hi}

Mφ, **(c)** Retnla^{hi} Ear2^{hi} Mφ, **(d)** Trem2^{hi} Mφ, and **(e)** Apbb2^{hi} Mφ between WT and

Saa3⁻/⁻ mice. The x-axis categorizes the conditions under which the interactions were

assessed. The y-axis lists the ligand-receptor pairs. Each bubble's color corresponds to

the communication probability, with a gradient from minimum (blue) to maximum (red).

The communication probability can be seen as a numerical value representing how

strong or likely this interaction is between specific cell types. The size of each bubble

represents the *p*-value of the interaction.

Supplementary Fig. 4 Comparison of differences in the expression level of

cholesterol efflux and lipid metabolism genes from Trem2^{hi} macrophages between

WT and *Saa3⁻/⁻* mice.

Differential gene expression in aortic Trem2^{hi} macrophages (Mφ) from WT and *Saa3⁻/⁻*

mice. Violin plots illustrate the distribution of expression levels for genes involved in

cholesterol efflux and lipid metabolism in Trem2^{hi} macrophages. Blue represents WT

macrophages, while red indicates *Saa3⁻/⁻* macrophages.

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1264

Figure 1

Figure 2

Figure 3

Figure 4

Figure 5

Figure 6

Supplementary Figure 1

Supplementary Figure 2

b

GO Cd74hiMHCIIhi Mφ enriched

GO Folr2hi Mφ enriched

GO RetnlahiEar2hi Mφ enriched

GO Trem2hi Mφ enriched

GO Apbb2hi Mφ enriched

Supplementary Figure 3

a

Supplementary Figure 3

Supplementary Figure 3

C

Retnla^{hi}Ear2^{hi} Mφ

Supplementary Figure 3

d

Supplementary Figure 3

e

Apbb2^hi Mφ

Supplementary Figure 4