Single-cell transcriptomics identifies a dampened neutrophil function and

accentuated T-cell cytotoxicity in tobacco flavored e-cigarette exposed mouse

lungs

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Short running title: scRNA transcriptomics profiles of flavored e-cig aerosol

Abstract

E-cigarettes (e-cigs) are a public health concern for young adults due to their popularity and evidence for increased oxidative stress and immunotoxicity. Yet an extensive study defining the cell-specific immune changes upon exposure to flavored e-cigs remains elusive. To understand the immunological lung landscape upon acute nose-only exposure of C57BL/6J to flavored e-cig aerosols we performed single-cell RNA sequencing (scRNA seq). scRNA profiles of 71,725 cells were generated from control and treatment groups (n=2/sex/group). A distinct phenotype of Ly6G- neutrophils was identified in lungs exposed to tobacco flavored e-cig aerosol which demonstrated dampened IL-1 mediated and pattern recognition signaling as compared to air controls. Differential gene expression analyses identified dysregulation of T-cell mediated pro-inflammation (*Cct7*, *Cct8*) and stress-response signals (*Neurl3*, *Stap1*, *Cirbp* and *Htr2c)* in the lungs of mice exposed to e-cig aerosols, with pronounced effects for tobacco flavor. Flow cytometry analyses and cytokine/chemokine assessments within the lungs corroborated the scRNA seq data, demonstrating a significant increase in T-cell percentages and levels of T-cell associated cytokine/chemokines in the lungs of tobacco-flavored aerosol exposed mice. Increased levels of *Klra4* and *Klra8* expression also suggest an enhanced natural killer (NK) cell activity in this mouse group. Overall, this is a pilot study identifying increase in the percentages of Ly6G- neutrophils that may be responsible for dampened innate immune responses and heightened T-cell cytotoxicity in lungs of tobacco-flavored e-cig aerosol exposed mice. In addition, we provide preliminary evidence for sex-specific changes in the transcriptional landscape of mouse lungs upon exposure to e-cig aerosol, an area that warrants further study.

Keywords: E-cigarettes, Tobacco, scRNA seq, Immune cells, Innate immunity, Neutrophils, T-cells.

Introduction

Electronic cigarettes (e-cigs) or electronic nicotine delivery systems are a relatively novel set of tobacco and flavored products that have gained immense popularity amongst adolescents and young adults in the many countries including United States (US), United Kingdom (UK) and China. Flavors are one of the key features that make these products alluring to the younger diaspora (1). Reports indicate that in 2020 about 22.5% of high school students and 9.2% of middle school students in the US were daily vapers or e-cig users with fruit (66%), mint (57.5%), and menthol (44.5%) being the most preferred flavors (2). However, not much is known about the flavor-specific effects of e-cig vaping on the health and immunity of an individual.

E-cig products and aerosols are known to contain harmful constituents including formaldehyde, benzaldehyde, acrolein, n-nitrosamines, volatile organic compounds (VOCs), ketenes, and metal ions (3-5). Studies have indicated that exposure to e-cigs may enhance inflammatory responses, oxidative stress, and genomic instability in exposed cells or animal systems (6-8). Risk assessment of the non-carcinogenic (systemic) risks of inhaled diacetyl, a potential component of e-liquids, has estimated the hazard quotient to be greater than 1 amongst teens (9). Furthermore, clinical and *in vivo* studies have suggested that exposure to e-cig aerosols could impair innate immune responses in the host thus making them more susceptible to bacterial/viral

infections. The bacterial clearance, mucous production, and phagocytic responses in

these individuals are shown to be affected upon use of e-cigs (10-14).

However, cell-specific changes within the lung upon vaping is not fully understood

making it hard to determine the long-term health impacts of the use of these novel

products. In this pilot study, we aim to determine effects of e-cig exposure on mouse

lungs at single cell level. To do so, we exposed C57BL/6J mice to 5-day nose-only

exposure to air, propylene glycol: vegetable glycerin (PG:VG), fruit-, menthol- and

tobacco-flavored e-cig aerosols. We performed single-cell RNA sequencing (scRNA

seq) on the lung digests from exposed and control animals and identified neutrophils

and macrophages, among others, as the major cell populations in the lung that were

affected upon acute exposure. We were able to identify 29 gene targets that were

commonly dysregulated amongst all our treatment groups upon aggregating results

from the major lung cell types identified in this study. These gene targets are the

markers of early immune dysfunction upon e-cig aerosol exposure *in vivo* and could be

studied in detail to understand temporal changes in their expression that may govern

allergic responses and adverse pulmonary health outcomes upon acute and sub-acute

exposures to e-cigarette aerosols.

Results

Fruit- flavored e-cig aerosol results in lung injurious responses upon acute

exposure in vivo.

This study was designed to characterize the effects of exposure to flavored e-cig

aerosol at single-cell level to understand the immunological changes in the lung

microenvironment upon e-cig use. To do so, we generated a first ever single-cell profile

of e-cig aerosol exposed mouse lungs (n= 2/sex/group). The thus obtained results were

then validated with the help of our validation cohort of n= 3/sex/group as shown in Fig

1A. Since all the commercially available e-liquids used in this study contained tobacco

derived nicotine, we first determined the level of serum cotinine (a metabolite of

nicotine) to prove successful exposure to the mice in each treatment group. As

expected, we did not see any traces of cotinine in the serum of air and PG:VG exposed

mice. Significant levels of cotinine were detected in the serum of mice exposed to fruit-,

menthol-, and tobacco-flavored e-cig aerosols (Fig 1C).

Since metals released upon heating of the coils of e-cig devices are a source of toxicity

upon vaping (15, 16), we further monitored the levels of metals in the e-cig aerosols

generated during each day of mouse exposures. This acted as an indirect measure of

characterizing the chemical properties of the aerosols used for exposure in this study.

To monitor the release of metals into the lungs of the animals, the condensate from

each day of exposure was collected and the levels of select elements were detected

using ICP-MS. A detailed account of the concentrations of identified elements/metals is

provided in Table 1. Interestingly, we identified flavor-dependent changes in the levels

of metals like Ni, Zn, Na, K and Cu. Of note, despite the use of same wattage and

temperature (max of 230ºC) for generation of e-cig aerosols, the leaching of each metal

varied per day of exposure (Fig 1D). This is a crucial result as it highlights the

importance of studying the impacts of coil composition and device design on the

chemical composition of generated e-cig aerosols. These variations might affect the risk

and toxicity associated with each of these products, an area that warrants further study.

Next, we performed H&E staining of the lung tissue sections to study the morphometric

changes in the mouse lungs upon exposure to differently flavored e-cig aerosols. We

did not find much evidence of tissue damage or airspace enlargement upon acute

exposures in our model as expected. However, we found evidence of increased alveolar

septa thickening in the lungs of both male and female mice exposed to fruit-flavored e-

cig aerosols (Figure 1E). However, this could be a result of lower agarose inflation

observed for the mouse lungs in this group of mice. We had challenges/difficulties with

inflating the mouse lungs for all the mice in this group, however male mice showed

more restriction than the female. Owing to the lack of proper inflation, the lungs were in

a collapsed state than the other groups where the lungs were fully inflated. We have

also performed mean linear intercept (Lm) measurements for all the lung tissue sections

to show lowered Lm values for mouse lungs exposed to fruit-flavored e-cig aerosols as

compared to air controls (Figure 1F). Airway obstruction could be indicative of

"atelectasis", a condition that may result from lack of surfactant or alveolar damage thus

affecting the lung expansion in these mice. Since this was not the prime focus of this

study, we did not conduct further experiments to confirm out speculations, but

nevertheless, we report these changes to inform and encourage further research in this

area.

Detailed map of cellular composition during acute exposure to e-cig aerosols

reveals distinct changes in immune cell phenotypes.

As the principle focus of this study was to identify the flavor-dependent and independent

toxicities upon exposure to commercially available e-cig aerosols at the single-cell level,

we performed the scRNA seq on the mouse lungs from exposed and control mice. After

quality control filtering (Figure S1), normalization and scaling, we generated scRNA seq

profiles of 71,725 cells in total. Except for the PGVG group, all the rest of the treatments

had approximately similar cell viabilities, cell capture, and other quality assessments in

this study. However, for uniform analyses, equal features/ genes were used across all

the groups for subsequent analyses. A detailed account of the cell viability, number of

samples (single-cell capture)), and gene features identified before and after filtering

upon QC check of sequenced data is provided in Table S1.

Uniform Manifold Approximation and Projection (UMAP) was used for dimensionality

reduction and visualization of cell clusters. Cell annotations were performed based on

the established cell markers in Tabula Muris database and available published

literature. The general clustering of individual cell types based upon the commonly

known cell markers was used to identify -**Endothelial** (identified by expression of

Cldn5), **Epithelial** (identified by expression of *Sftpa1*), **Stromal** (identified by expression

of *Col3a1*), and **Immune** (identified by expression of *Ptprc*) cells. The Immune cell

population was further subclustered into lymphoid and myeloid populations in the UMAP

analyses (Figure 2A&B). The relative cell percentages were plotted in a sex-dependent

manner. Of note, upon assessing the sex- and treatment-specific changes in observed

cell frequencies for individual cell types using two-way ANOVA, we did not find any

significant variation in the relative frequencies of the general cell types in our treatment

groups across both sexes (Figure 2C). A detailed account of the two-way ANOVA

statistics for individual cell types is provided in Table S2.

DESeq2 was then used to identify the differentially regulated genes in each broad cell

category. A list of significant ($p_{adj} < 0.05$) differentially expressed genes (DEGs) was

generated using aggregate analysis for both sexes for each treatment group and

number of up- and down-regulated genes were plotted in a flavor-dependent manner to

get a snapshot of the cell-types and flavor-categories that show most dysregulation

upon exposure (Figure 2D). Our data showed dysregulation of genes in endothelial,

epithelial, and stromal cell populations, but maximum effect was observed on the cells

from immune cell clusters. This is not surprising, as the immune system especially the

myeloid cells form the frontline of the host's defenses against external stressors (17,

18). Compared to air, we observed a dysregulation of 553 genes (338 upregulated; 215

downregulated) in the myeloid cell cluster of mouse lungs exposed to tobacco-flavored

e-cig aerosol. We identified 324 and 24 DEGs in the myeloid lung cluster from mouse

lungs exposed to menthol- and fruit-flavored e-cig aerosols respectively as compared to

air control. For the lymphoid cluster, we observed maximum dysregulation in the lungs

exposed to fruit-flavored e-cig aerosols with a total of 112 DEGs. In contrast, 41 and 9

significant DEGs were identified for lymphoid cluster from lungs exposed to tobacco and

menthol-flavored aerosols respectively.

It is important to mention here that most of the commercially available e-liquids /e-cig

products use PG:VG as the base liquid to generate the aerosol and act as a carrier for

flavoring chemicals. Thus, we compared the effect of PG:VG alone in our study to make

further comparisons between individual flavoring products with that of PG:VG only.

DESeq2 analyses showed dysregulation of 276 genes in mouse lungs exposed to

PG:VG alone in the myeloid cell cluster as compared to air controls. Contrary to this,

exposure to PG:VG aerosols affected 24 genes in the lymphoid cluster as compared to

air control. Furthermore, when compared to PG:VG, exposure to fruit-flavored e-cig

aerosol dysregulated 262 genes in the myeloid cluster and 37 genes in the lymphoid

cluster (Table 2).

Exposure to tobacco-flavored e-cig aerosols dampens IL-1 mediated signaling in

Ly6G- neutrophil cluster.

We found maximum dysregulation in immune cell population, more specifically the

myeloid cells, upon exposure to e-cig aerosols through our previous analyses. We thus

subclustered the myeloid and lymphoid cell populations to further sub-divide their cell

types and identify the flavor-dependent changes in immune cell responses. Upon sub

clustering the myeloid cell population, we identified 14 unique clusters comprising all the

major cell phenotypes including neutrophils, alveolar macrophages (AM), interstitial

macrophages (IM), monocytes, dendritic cells (DC), and mast cells (Figure 3A). A

detailed account of all the cell types identified with their respective marker genes is

provided in Table 3. Cell cycle scoring revealed the neutrophil cluster to be in G2M

phase (Figure 3B), indicating that these cell types are either at a checkpoint for

uncontrolled proliferation or advancing toward a state of exhaustion (19, 20). In either

case, we believed that studying these cells might be of interest to understand the

mechanisms governing the immune dysregulation upon exposure of C57BL/6J mice to

differently flavored e-cig aerosols. On deeper evaluation, we identified two unique

phenotypes of neutrophils (identified by *S100a8*, *Cxcl2*, *Sell* and *Lcn2)* in the mouse

lungs. These clusters were named as Ly6G$^+$ Neutrophils and Ly6G$^-$ Neutrophils based

on the presence or absence of Ly6G marker, respectively (Figure 3C). Ly6G is

important for neutrophil migration and is crucial to regulate neutrophil function within the

lung (21). Interestingly we found a consistent flavor-dependent increase (though not

significant) in the Ly6G⁻ neutrophil percentage in the lungs of exposed mice as

compared to air controls. To validate the changes in cell percentages upon flavor

exposure from scRNA seq, we performed flow cytometry. Our data from flow cytometry

corroborated with the scRNA analyses results showing an increase in the levels of

Ly6G+ neutrophils in lung digests from mouse lungs exposed to tobacco-flavored e-cig

aerosols. The observed increase was more pronounced in males as compared to

females thus highlighting the sex-dependent nature of changes in immune cell

frequencies within the exposed lungs (Figure 3E).

AM form the bulk of the myeloid cell population in the lung and are characterized by top

markers like *Chil3*, *Plet1*, *Lpl* and *Marco* (Figure 3C) (22). A flavor-dependent decrease

in the resident AM (RAM) population was observed for both menthol and tobacco

flavored e-cig aerosol exposed lungs (Figure 3D). These changes were again

corroborated through the significant decrease in the BALF macrophage cell

percentages in menthol-flavored e-cig aerosol exposed mice lungs as compared to air

controls for both male and female mice (Figure 3F). Of note, though not significant, we

saw a decrease in the levels of resident macrophages in the lung digests from mouse

lungs exposed to menthol flavored e-cig aerosols with a more pronounced decrease

observed amongst female mice (Figure S2A). Interestingly we found a distinct

population of RAM expressing markers including *Mki67, Pclaf* and *Top2a*. These genes

are responsible for cell proliferation. Importantly, the cell scoring for the G2M phase of

the cell cycle was high for this cell cluster and thus these were labeled as 'proliferating'

RAMs (pRAM) (23, 24). The pRAMs showed significant (p=0.0156) changes in the cell

percentages with respect to varying exposures in our study (Figures 3D, Table S2).

Taken together, we show a significant shift towards the neutrophil-mediated immune

response in the lungs of animals exposed to tobacco-flavored e-cig aerosols in our

study. It is important to mention that due to the presence of nicotine in all the e-liquids

used as treatment groups for this study, we added an extra control group- PGVG+Nic-

for select experiments. Flow cytometric analyses revealed slight variations in the lung

neutrophils and macrophage percentages observed in PGVG+Nic group as compared

to PGVG only. However, none of these changes were significant. Furthermore, the

patterns of change observed for the lungs exposed to aerosols from flavored e-liquids

were quite distinct from those observed for PGVG+Nic thus proving that the observed

changes are not solely due to the presence of nicotine in these treatment groups

(Figures 3E-F, S1A).

Differential gene expression analyses on the myeloid cell cluster identified maximum

gene dysregulation in myeloid cell cluster from mouse lungs exposed to tobacco-

flavored e-cig aerosols. Interestingly, we did not observe major dysregulation in the

gene expression for myeloid cell cluster in fruit-flavored e-cig exposed mouse lungs as

compared to air controls. A total of 24 genes (17 upregulated; 7 downregulated) were

differentially expressed in the myeloid clusters of lungs of animals exposed to fruit-

flavored e-cig aerosols (Figure 4A). GO analyses identified terms like 'myeloid cell

differentiation', 'gas transport' and 'H_2O_2 catabolic process' as the top hits for this cluster

(Figures 4B). Importantly, few gene clusters (*Hbb-bs*, *Hbb-bt*, *Hba-a2* and *Hbb-a1*)

showed sex-specific changes in the gene expressions in exposed lungs as compared to

control. These genes clusters enrich for 'erythrocyte development' upon GO analyses

and warrant further study.

We demonstrated an upregulation of 220 genes and a downregulation of 104 genes in

the lungs of mice exposed to menthol-flavored e-cig aerosol as compared to ambient

air. We observed increased expression of inflammatory genes including *Cxcl3, Il1r2,*

Stat4, pointing towards the activation of chemokine-mediated signaling due to exposure

to menthol-flavored e-cig aerosol. We also found a significant decrease in the

expression of *Edn1* (endothelin1) in the myeloid cells of flavored e-cig aerosols as

compared to air controls (Figure 4C). These genes play a role in positive regulation of

neutrophil recruitment and inflammatory responses into the lungs (25-29). GO analyses

of the DEGs (p<0.01), thus, showed 'cytokine-mediated signaling', 'cell chemotaxes',

and 'negative regulation of MAPK cascade' as the top hits as shown in the Figure 4D.

Like menthol-, tobacco-flavored e-cig aerosol also elicited a significant increase in the

expression of 338 genes and a decrease in 215 genes as compared to air controls in

the myeloid cell cluster. We observed an increase in the expression of chemokines like

Stat4, Il1b, and *Il1bos* in the myeloid cells resulting in terms like 'cytokine-mediated

signaling pathway' enriched upon gene enrichment analyses. Like menthol-exposed

mouse lungs, we found significant downregulation of Edn1 gene in the lungs of mice

exposed to tobacco-flavored e-cig aerosol (Figure 4E). We provide the list of all DEGs

as obtained from DESeq2 analyses and GO analyses results in Supplementary Excel

Files 1-2.

Based on previous literature (30, 31) and enrichment of genes responsible for neutrophil

chemotaxes in the current work, we reckoned this cell type to be of importance to be

looked at separately *in vivo*. As mentioned earlier, we identified two distinct phenotypes

of neutrophils- (a) Ly6G$^+$ neutrophils and (b) Ly6G$^-$ neutrophils. Interestingly, the

percentage increase in the Ly6G⁻ neutrophil population of aerosol exposure was higher

as compared to that for Ly6G⁺ neutrophils per scRNA cell frequency analyses.

Upon performing DESeq2, we did not find any changes in the gene expressions for any

of the two neutrophil populations for mouse lungs exposed to menthol-flavored e-cig

aerosols despite an increase in the cell percentages of Ly6G- neutrophil phenotype.

Interestingly, exposure to fruit-flavored e-cig aerosol caused most changes in the gene

expressions in neutrophil population, with Ly6G⁻ neutrophils being affected more than

the Ly6G⁺ population. We observed a dysregulation of 33 and 25 genes in Ly6G⁻

neutrophil cluster from fruit- and PG:VG-aerosol exposed mouse lungs respectively.

The Egl-9 Family Hypoxia Inducible Factor 3 (*Egln3*) gene was found to be

downregulated upon exposure to e-cig aerosols in a flavor-independent manner. Egln3

has been known to play a crucial role in lung cancer and its inactivation exhibits lower

tumor burden by induction of cancer senescence (32). We further identified

dysregulation in the expressions of genes including *Irak2*, *Egr1, Il1r2*, *Pik3ap1*, and

Hspa8 in Ly6G⁻ neutrophils for both fruit- and tobacco-aerosol exposed mouse lungs as

compared to air controls. Furthermore, upregulation of genes like *Irak2* and *Egr1* in the

Ly6G⁻ neutrophils from mouse lungs exposed to PG:VG and fruit-flavored e-cig aerosol

points towards the involvement of NF-κB mediated signaling in our study (Figure 4G).

On performing gene enrichment analysis on the dysregulated gene sets from Ly6G-

neutrophil cluster we obtained hits including 'interleukin-1 mediated signaling pathway',

'hydrogen peroxide catabolic process', and 'pattern recognition signaling pathway'

(Supplementary Excel File 3). Of note, most of the associated genes were upregulated

in lungs exposed to fruit-flavored e-cig aerosols. However, the expression pattern of

these gene sets points towards dampening of neutrophil-mediated immune responses

for lungs exposed to tobacco-flavored e-cig aerosols as compared to air controls (Figure

4H). Compared to Ly6G$^-$ neutrophils, we did not observe any change in the gene

expression profile of Ly6G$^+$ neutrophils for mouse lungs exposed to tobacco- flavored e-

cig aerosol. For both, PG:VG and fruit-flavor e-cig aerosol exposed mouse lungs,

Treml4 (Triggering Receptor expressed on Myeloid Cells-Like Protein 4) gene was

found to be downregulated in the Ly6G$^+$ neutrophils (Figure S2B). This gene functions

as a positive regulator of TLR7 signaling (33, 34).

304 Activation of T-cell cytotoxic responses in lymphoid cells upon exposure to

305 tobacco-flavored e-cig aerosols.

We identified 10 clusters upon sub clustering the lymphoid cell population. These

comprised of: Pro-B cell, Pre-B cell, Mature B-cell, CD4+ T-cell, CD8+T-cell, Treg cell,

AB T-cell, GD T-cell and Natural killer (NK) cells (35-37). Based on the expression of,

Ifit3, *Oasl2* and *Rsad2* a unique cluster of IFN-stimulated B-cells was identified. The cell

frequency of these cells was markedly lowered (19%) in mouse lungs exposed to

tobacco-flavored e-cig aerosols as compared to air controls. Two-way ANOVA analysis

of scRNA seq data showed significant changes (p = 0.0237) in the cell frequencies of

CD4 T cells in a flavor-dependent manner in our treatment groups (Table S2). We also

identified sex-dependent changes in the cell frequencies of B-cells (p= 0.0148), pro-B

cells (p= 0.0078) and CD8 T cells (p= 0.0265) of the lymphoid cluster in our study

(Figures 5A-C, Table S2). Flow cytometric analyses showed a significant increase in the

CD4+ T-cell percentages in the lung digest from female mice exposed to tobacco-

flavored e-cig aerosol. We also observed a significant increase in the CD8+ T cell

percentages in the lungs of tobacco-flavored e-cig aerosol exposed mice lungs as

compared to air control in both male and female mice (Figure 5D). Of note, however, we

found significant sex-dependent associations between the CD4+ T cell percentages (p=

0.0339) upon two-way ANOVA analyses of the flow cytometry data.

We found dysregulation of 112 genes (40 up- and 72-down-regulated) in mouse lungs

exposed to fruit-flavored e-cig aerosols in the lymphoid cluster. We observe

dysregulation of genes (*Incenp*, *Wnt4*, *Ccnb2*, *Trat1*, *Themis*) enriched for 'T-cell

receptor signaling' and 'nuclear division', in exposed group as compared to air control

(Figure 6A-B). Upregulation of genes like *Malt1* (Mucosa-associated lymphoid tissue

lymphoma translocation protein 1), *Ppp1r2* (Protein phosphatase inhibitor 2), and *Spib*

(Transcription factor Spi-B) indicates activation of T-cell mediated immune response

upon exposure to fruit-flavored aerosol (38-40).

Contrary to the responses observed for exposure to fruit-flavored e-cig aerosols, we

found significant upregulation in the expression of *Cdk8* and *Camk1d* genes in the

lymphoid cell populations for menthol-flavored aerosol exposed mouse lungs (Figure

6C-D). *Cdk8* (cyclin-dependent kinase 8) is a transcriptional regulator that has a role in

the cell cycle progression (41). Whereas *Camk1d* (calcium/calmodulin dependent

protein kinase ID) functions to regulate calcium-mediated granulocyte function and

respiratory burst within the cells(42). Taken together, our results point towards an

increase in cell proliferation and gene transcription in the lymphoid cluster of mouse

lungs exposed to menthol-flavored e-cig aerosols as indicated by enrichment of terms

like 'cyclin-dependent protein serine/threonine kinase activity', 'RNA polymerase II CTD

modifying activity' and 'calmodulin-dependent protein kinase activity' associated with

this cell cluster.

We observed the downregulation of genes responsible for chaperone-mediated protein

folding (*Cct5*, *Cct7*, *Cct8*) in the lymphoid cells from tobacco-flavored e-cig aerosol

exposed mouse lungs. Downregulation of these genes could be indicative of the

accumulation of misfolded proteins in these lungs which may lead to enhanced cell

death (43, 44). In fact, we found increased expression of killer cell lectin-like receptor

(*Klra*)-4 and 8 in exposed mice lungs as compared to air controls, thus indicating that

upon exposure to tobacco-flavored e-cig aerosols, the lymphoid cells undergo protein

misfolding thereby resulting in increased cell death (Figure 6E-F). A detailed account of

the DESeq2 results and GO analyses for all the groups is provided in Supplementary

Excel files 4-5.

Dysregulation of chemokine signaling and T-cell activation on exposure to

flavored e-cig aerosols.

Since we showed increased production of cytokines/chemokines, driving the immune

responses in mouse lungs exposed to flavored e-cigs, we performed multianalyte assay

to determine the levels of these inflammatory cytokines in the lung digests from the

exposed animals as shown in Figure 7A. Exposure to tobacco-flavored e-cig aerosol

resulted in a marked increase in the levels of chemotactic chemokines including

CXCL16, CXCL12, CXC3R and proinflammatory cytokines including CCl12, CCL17,

CCL24, and Eotaxin in the mouse lung digests as compared to air control. Supporting

our transcriptional data, the levels of IL1b were dampened in the exposed mouse lungs

thus showing negative regulation of IL-1 mediated signaling. We identified sex-

dependent changes in the cytokine levels in lung digests from fruit-flavored e-cig

aerosols with male mice showing more dampening of cytokine/chemokine protein levels

as compared to their female counterparts. Interestingly, the fold changes in the

PGVG+Nic group were contrasting to those observed by PGVG alone and flavored e-

cig aerosol exposed mouse lungs, again supporting our previous deduction that the

observed changes are observed as a concerted effect of chemical present in the e-

liquid used for flavored e-cig aerosol exposure.

To identify genes that were commonly dysregulated upon exposure, we generated a list

of common genes that were significantly dysregulated in exposure categories (fruit,

menthol and tobacco). We identified 9 such target genes-Ne*url3*, *Egfem1*, *Stap1*, *Tfec*,

Mitf, *Cirbp*, *Hist1h1c*, *Gmds,* and *Htr2c* that were dysregulated in the myeloid cluster

from lungs exposed to differently flavored e-cig aerosol, but not PGVG. We observed

significant upregulation of *Neurl3*, *Stap1*, *Cirbp,* and *Hist1h1c* and downregulation of

Tfec, *Mitf*, *Gmds,* and *Htr2c* in the myeloid cluster of mice exposed to differently

flavored e-cig aerosol as compared to air control (Figure 7B). On analyzing the

lymphoid cluster for commonly dysregulated genes, we identified - *Klra8* (Killer cell

lectin-like receptor 8) and *Nfia* (nuclear factor I)- that were significantly upregulated in

the exposure groups as compared to air-controls (Figure 7E). Klra8 is a natural killer cell

associated gene, and its upregulation is generally associated with viral infection

associated host immune responses within the mouse lungs (45-47). *Nfia* is a

transcriptional activator responsible for regulating Oxphos-mediated mitochondrial

responses and proinflammatory pathways (48, 49).

Overall, we identified a total of 29 commonly dysregulated gene targets were identified

from five major cell clusters and performed gene enrichment analyses on the identified

targets to identify the top hits (Tables 4-5). Terms like 'negative regulation of immune

system' (*Hmgb3*/*Gpam*/*Scgb1a1*/*Stap1*/*Ldlr*), 'positive regulation of lipid biosynthetic

pathway' (*Htr2c*/*Gpam*/*Ldlr*), and 'receptor recycling' (*Ldlr*/*Ramp3*) were amongst the

top hits in our observations (Figure 7C).

Of note, the data presented in this study is a sub-part of a larger study. In addition to the

groups mentioned in this manuscript, we also had two additional groups of Tobacco-

Derived (TDN) and Tobacco-Free Nicotine (TFN). Though further objectives and

experimentations performed in both these studies were varied, common air and PG:VG

samples were used for analyses of cytokine/chemokine and cell count data as

described in our recent publication(50).

Discussion

E-cigs and associated products have constantly been under scrutiny by the US Food

and Drug Administration (FDA) due to public health concerns. In February 2020, FDA

placed a regulation on all cartridge-based flavored e-cigs except for menthol and

tobacco to reduce the use of e-cigs amongst adolescents and young adults. But it left a

loophole for the sale of flavored (including menthol) disposable and open system e-cigs

(1, 51). Importantly, most e-cig related bans in the US have happen at the state level,

thus allowing differential levels of restrictions imposed on the premarket tobacco

applications (PMTAs) and sales which defeats the purpose of limiting their accessibility

to the general public (52, 53). Each year new products are introduced in the market with

newer device designs and properties, to lure the users (adults between the ages of 18-

24 years) which makes it crucial to continue with the assessments of toxicity and health

effects of e-cigs in an unbiased manner (54).

Numerous studies indicate increased oxidative stress, DNA damage, and loss of

neutrophil function due to exposure to e-cig aerosols *in vitro* and *in vivo* (7, 30, 31, 50,

55, 56). However, we do not have much knowledge about the cell populations and

biological signaling mechanisms that are most affected upon exposure to differently

flavored e-cig aerosols. To bridge this gap in knowledge, we studied the transcriptional

changes in the inflammatory responses due to acute (1-hr nose-only exposure including

120 puffs for 5-consecutive days) exposure to fruit-, menthol- and tobacco-flavored e-

cig aerosols using single-cell technology.

Reports indicate that the release of metal ions due to the burning of metal coil is a major

source of variation during e-cig exposures (57-59). A 2021 study reported the presence

of 21 elements in the pod atomizers from different manufacturers identifying a high

abundance of 11 elements including nickel, iron, zinc, and sodium amongst others (60).

Previous studies have also shown the presence of similar elements in the e-cig aerosols

which could have a possible adverse health effect on the vapers (15, 61). But more

importantly, our study points towards a much graver issue, which pertains to the product

design of the e-cig vapes. We believe that the aerosol composition varies based on the

type of atomizer, coil resistance, coil composition, and chemical reactivity of the e-liquid

being used. While much work is done on the chemical composition of the flavors and e-

liquids, the other aspects of device design remain understudied and must be an area of

research in the future. Another factor that may limit the interpretation of our results

pertains to the correlation between the leached metal and the observed transcriptional changes. Since our study provides proof of day-to-day variation in the leaching of metal ions from the same liquid using the same atomizer, it could be possible to develop a statistical model correlating the differential metal exposure to the gene expression changes. We do not conduct such analyses as this was not the focus of this work, but it is a possibility that could be explored in the future.

E-cig vaping has been known to affect the innate and adaptive immune responses among vapers (30, 62-64), but flavor-specific effects on immune function are not fully explored. While we expected to see flavor-dependent changes in our experiment, we did not anticipate observing interesting sex-dependent variation in the lung tissues at single-cell level. In this respect, recent studies show concurring evidence suggesting sex-specific changes in lung inflammation, mitochondrial damage, gene expression, and even DNA methylation in mice exposed to e-cig aerosols (65, 66).

One of the most interesting discoveries from our single-cell analyses was the identification of a new cluster of neutrophils that was called Ly6G- neutrophils in this study. While we observed an increase in the cell percentages of these cells in our treatment groups, little to no change in the gene expression was noted in this study which could be indicative of impaired function of these neutrophil population, a fate being reported by various previous studies pertaining to e-cig exposures (13, 62). In fact, our study identified this unique population and showed that IL-1 mediated responses were dampened in tobacco and menthol-exposed lung neutrophils which was corroborated by mild to no change in the levels of IL-1β in the lung tissue digests from exposed mice as compared to air. Ly6G is an important marker of neutrophil

maturation in mammalian cells and has been reported in relation to various bacterial

and parasitic infections in previous studies (67, 68).Exposure to e-cig aerosols may

result in a loss of function of mature neutrophils in the mouse lungs which gets actively

replaced by inactive/immature neutrophils that are deficient in Ly6G expression. In fact,

this could explain our inability to identify significant changes in mature neutrophil

population through flow cytometry (where Ly6G was used as a marker) when comparing

treated and control groups.   Interestingly, our i*n vivo* findings were corroborated by a

recently published work where neutrophils from healthy volunteers demonstrated a

reduction in neutrophil chemotaxis, phagocytic function, and neutrophil extracellular trap

formation on exposure to e-cig aerosols, thus suggesting loss of function by mature

neutrophils (30). However, this study did not investigate the effects on the immature

neutrophil population, an area that needs further study in future research.

Of note, myeloid and lymphoid limbs of immunity are interconnected (69, 70). A decline

in the neutrophil-mediated immunity might activate other cell types to offer protection. In

our study, we find a decline in the neutrophilic immune responses in menthol and

tobacco flavored e-cig exposed mouse lungs. Contrarily, we report an increase in the T-

cell responses in the form of increased CD4+ and CD8+ T cells from both scRNA seq

and flow cytometric analyses. In fact, increased expression of genes including *Malt1*,

Serpinb9b, and *Sema4c* are indicative of enhanced T-cell mediated immune response

in the lungs of mice exposed to fruit(mango) flavored e-cig aerosols (71-73).   Contrary

to this, exposure to menthol-flavored e-cig aerosols had a much milder effect on the

lymphoid population within the lungs of C57Bl/6J mice. We found evidence for

increased cell proliferation due to activation of cyclin-dependent protein kinase signaling

mediated via expression of genes including *Cdk8* and *Camk1d* in these cells (42, 74).

Exposure to tobacco-flavored e-cig aerosol provided evidence for decreased

chaperone-mediated protein folding, due to the downregulation of Chaperonin

Containing TCP-1 (CCT) family of proteins. Chaperonin Containing TCP-1 proteins are

important to regulate the production of native active, tubulin, and other proteins crucial

for cell cycle progression and cytoskeletal organization (75). This is in conjunction with

the upregulation of *Klra4* and *Klra8* that is indicative of increased protein misfolding and

cytotoxic responses in the lymphoid cells of tobacco-exposed e-cig aerosols (76, 77).

Overall, we provide evidence of subdued innate immune responses due to loss of

function of neutrophils and increased T-cell proliferation and cytotoxicity in a flavor-

dependent manner upon exposure to e-cig aerosols in this study. An increase in the

levels of CCL17, CCL20, CCL22, IL2 and Eotaxin in the lung digests from tobacco-

exposed mouse lungs further support this deduction as these cytokines/chemokines are

associated with T-cell mediated immune responses (78-85). Importantly CXCL16

attracts T-cells and natural killer cells to activate cell death. It has been reported to be

involved in LPS-mediated acute lung injury (ALI), an outcome which has also been

linked with e-cig exposures in human (86, 87).

In the end, we compiled a list of commonly dysregulated genes in a flavor independent

manner and identified 29 gene targets. Signal-transducing adaptor protein-2 (*Stap1*)

which is commonly upregulated upon exposure to e-cig aerosols is known to regulate T-

cell activation and airway inflammation which falls in line with the overall crux of our

findings (88). Another gene that was found to be consistently dysregulated in many cell

types was Cold-inducible RNA binding protein (*Cirbp*). *Cirbp* is a stress response

proteins linked with stressors like hypoxia. Its upregulation upon e-cig exposure

supports that vaping induces oxidative stress and can have adverse implications on the

exposed cell types (89). 5-hydroxytryptamine receptor 2C (*Htr2c*) and *Klra8* are other

genes in this category of commonly dysregulated genes that are associated with

enhancing inflammation and cell death (76, 77, 90). Overall, we provide a cell-specific

atlas of immune responses upon exposure to differently flavored e-cig aerosols.

Considering that scRNA technology has not been commonly used for e-cig research,

ours is one of the first studies employing this technique to identify possible changes in

the cellular composition and gene expressions. Importantly we use the nose-only

exposure system for our experiment to avoid exposure through other routes. However,

despite the novel approach and state-of-the-art exposure system, we had a few

limitations. First, we used a small sample size to identify the changes in the mouse

lungs upon exposure to e-cig aerosols at a single-cell level. Due to the expensive nature

of single-cell sequencing technology and limited information in the literature reporting

changes at single-cell level, we chose to design this experiment with small sizes of

experimental and validation cohort. But, based on the encouraging findings from this

pilot study, future studies could be designed with a larger sample size and longer

durations of exposure to identify the acute and chronic effects of vaping. Second, we

could not delineate the sex-dependent changes upon exposure from our data. While we

found evidence of sex-dependent differences in immune responses on exposure to

differently flavored e-cig aerosols we pooled the samples from 2 mice/sex/group to

perform scRNA seq analyses. This limits us from analyzing and drawing conclusions

with regards to the sex-dependent variations at the level of differential gene expression

in our data with confidence. Thus, we chose to use aggregate analyses to make

comparisons. However, future experimental designs must study sex as a confounder for

studying the effects of e-cig exposure in humans. Third, the inclusion of PGVG+Nic

group was streamlined in this study, but future work including this group for scRNA seq

analyses might be crucial to delineate the effects of nicotine alone on gene

transcription. Fourth, we did not anticipate changes in the metal release on consecutive

days of exposure in our study. Our data pointed towards the importance of device

design in e-cig exposures. Future studies need to identify the factors that may affect the

daily composition of e-cig aerosols and devise a method of better monitoring these

possible confounders. However, in this regard our experiment does mimic the real-life

well, as such variations due to prolonged storage of e-liquid and differences arising due

to vape design must be common amongst human vapers.

In conclusion, we identified cell-specific changes in the gene expressions upon

exposure to e-cig aerosols using single cell technology. We identified a set of top 29

dysregulated genes that could be studied as markers of toxicity/immune dysfunction in

e-cig research. Future work with larger sample sizes and sex-distribution is warranted to

understand the health impacts of long-term use of these novel products in humans.

Methods

Animals Ethics Statement

All experiments were conducted per the guidelines set by the University Committee on

Animal Resources at the University of Rochester Medical Center (URMC). Care was

taken to implement an unbiased and robust approach during the experimental design

and conduction of each experiment to ensure data reproducibility per the National

Institutes of Health standards.

Animals

We ordered 5-week-old pups of male and female C57BL/6J mice from Jackson

Laboratory to conduct this experiment. Prior to the start of the experiment, mice were

housed at the URMC Vivarium for acclimatization. Thereafter the animals were moved

to the mouse Inhalation Facility at URMC for training and exposures.

One week prior to the start of the exposures, mice underwent a five-day nose-only

training to adapt themselves to the mesh restraints of the exposure tower. The mouse

restraint durations were increased gradually to minimize the animal stress and

discomfort. Of note, the mouse sacrifice was performed within 8-12 weeks' age for each

mouse group to ensure that the mouse age corresponds to the age of adolescents (12-

17 years) in humans (91, 92).

E-cigarette Device and E-liquid

We utilized an eVic-VTC mini and CUBIS pro atomizer (SCIREQ, Montreal, Canada)

with a BF SS316 1.0-ohm coil from Joyetech (Joyetech, Shenzhen, China) for vaping

and the inExpose nose-only inhalation system from SCIREQ (SCIREQ, Montreal,

Canada) for mouse exposures. Both air and PG:VG exposed mice groups were

considered as controls for this experiment. We used commercially available propylene

glycol (PG; EC Blend) and vegetable glycerin (VG; EC Blend) in equal volume to

prepare a 50:50 solution of PG:VG. For flavored product exposures, mice were exposed

to three different e-liquids – a menthol flavor "Menthol-Mint", a fruit flavor "Mango" and a

tobacco flavor "Cuban Blend". Of note, all the e-liquids were commercially manufactured

with 50mg/mL of tobacco derived nicotine (TDN). So, all treatments have nicotine in

addition to the flavoring mentioned respectively. Additionally, we used a mixture of

PG:VG with 50mg/mL of TDN as a control for limited experiments to study the effect of

nicotine alone in our treatment. This group is labeled as PGVG+Nic for the rest of the

manuscript.

E-cigarette Exposure

Scireq Flexiware software with the InExpose Inhalation system was used for controlling

the Joyetech eVic-VTC mini device to perform nose-only mouse exposures. For this

exposure, we utilized a puffing profile that mimicked the puffing topography of e-cig

users in two puffs per minute with a puff volume of 51 mL, puff duration of 3 seconds,

and an inter puff interval of 27 seconds with a 2 L/min bias flow between puffs (93).

Figures 1A and 1B depict the experimental design and exposure system employed for

this study.

Age-matched male and female (n=5 per sex) mice were used for each group, namely,

air, PG:VG, Fruit, Menthol, and Tobacco. To ensure rigor and reproducibility in our work,

we have used age- and sex-matched control and treated mice in this study.

Confounders like environment and stress were minimized by housing all the cages in

environmentally controlled conditions and training all the mice (both control and treated)

in nose-only chambers. Each group of mice was exposed to the above-mentioned

puffing profile for one hour each day (120 puffs) for a total of five consecutive days.

Additionally, a group of mice (n=3/sex) was exposed to PGVG+Nic for the same

duration using similar exposure profile to serve as control to assess the effect of

nicotine on the observed changes using selected experiments. Air-exposed mice were

exposed to the same puffing profile for a total of five consecutive days to ambient air.

We recorded the temperature, humidity, and CO levels of the aerosols generated at the

start, mid, and end of the exposure on each day using the Q-Trak Indoor Air Quality

Monitor 7575 (TSI, Shoreview, MN). Total Particulate Matter (TPM) sampling was done

from the exhaust tubing of the set-up at the 30 min mark of the exposure and at the inlet

connected to the nose-only tower (shown in Figure 1B) immediately after the

culmination of the exposure. Gravimetric measurements for TPM were also conducted

to confirm relative dosage to each mouse group daily.

Preparation of single-cell suspension

The animals were sacrificed (at 8-10 weeks' age) immediately after the final exposure.

Vascular lung perfusion was performed using 3mL of saline before harvesting the lung

lobes for preparation of single-cell suspension. It is important to mention here that of the

5 lung samples/sex/group; 2 sex/group were used for histological assessments and

scRNA analyses. Here, the left lung lobe was inflated using low-melting agarose and

used for histology, while the rest of the uninflated lung lobes were used for preparing

the single-cell suspension. We pooled the lung lobes for each sex per group for

preparation of the single-cell suspension as depicted in Figure 1A. The lung lobes were

weighed digested using Liberase method as described earlier(94).

Library Preparation and Single-Cell Sequencing

The prepared single-cell suspension was sent to the Genomics Research Center (GRC)

at URMC for library preparation and single-cell sequencing. Library preparation was

performed from control and treatment groups using the 10X single-cell sequencing

pipeline by 10X Genomics and 10000 cells were captured per sample using the

Chromium platform. The prepared library was sequenced on NovaSeq 6000 (Illumina,

San Diego, CA) at a mean sequence depth of 30,000 reads per cell. Read alignment

was performed to GRCm38 Sequence.

Data Analyses

We used the standard Seurat v4.2 analyses pipeline to analyze our data (95). In brief

the low-quality cells and potential doublets were excluded from the dataset to create the

analyses dataset. The residual features due to the presence of RBCs were corrected

before integration. "scTransform" function was used for integration of all the datasets

after which the standard Seurat pipeline was used for data normalization of integrated

data. "FindVariableGenes" gene function was used to identify the variable genes for

dimensionality reduction using PCA function. UMAP was used for dimensionality

reduction and clustering of the cells.

To identify the unique features and cell clusters within each cell subtypes, we used the

sub-setting feature within Seurat. After identifying the 5 major cell populations

(epithelial, endothelial, stromal, myeloid and lymphoid) in our data sets, each of these

cell types were sub-clustered using "subset ()" function, normalized and re-clustered.

Cell annotation for each of the subsets was performed with the help of Tabula Muris

database (35, 96). However, some clusters were annotated manually with the help of a

literature search as discussed in the results section.

DESeq2 (97) was used to perform pseudobulk analyses to identify differentially

expressed genes within each group. The ClusterProfiler (98) was employed to perform

gene enrichment analyses of the differentially expressed genes.

Cytokine/chemokine assessment

We used multiplex assay to determine the levels of cytokine/chemokine in the lung

homogenates from control and e-cig aerosol exposed mouse lungs using commercially

available Bio-Plex Pro Mouse Chemokine Assay (Cat#12009159, Bio-RAD, Hercules,

CA) per the manufacturer's instructions. Approximately 40 mg of mouse lung lobes

were homogenized in 300uL of 1X RIPA buffer with 0.1% protease and phosphatase

inhibitor. The lung homogenate was stored on ice for 30 min. Following incubation, the

homogenate was centrifuged at 15000 rpm for 15 min at 4 degrees Celsius. The

supernatant was collected and used for performing the multianalyte assay for

determination of cytokine/chemokine levels using Luminex FlexMap3D system

Lung Histology

The left lung lobe of mice used for scRNA seq were inflated with 1% low melting

agarose and fixed with 4% neutral buffered PFA. Fixed lungs were dehydrated, before

being paraffin-embedded and sectioned (5μm). Hematoxylin and eosin (H&E) staining

was performed by the Histology, Biochemistry, and Molecular Imaging Core at URMC.

We employed MetaMorph software (Molecular Devices) to determine the "Mean linear

intercept" (Lm) of airspace. In brief, 6-10 randomly selected ×100 fields per slide were

photographed in a blinded manner, and Lm values were quantitated for each captured

image using the MetaMorph software. Care was taken to avoid pictures with bronchiolar

regions and knife marks in the tissue for quantitation. An average of all quantified

images was then plotted for each sample in a sex-dependent manner.

Flow cytometry

Flow cytometry was performed on the cells collected from BALF and lung homogenates

from air and flavored e-cig aerosol exposed mouse lungs. For analyses of cells

collected from BALF, the fluid was centrifuged at 2000g for 10 min at 4^0C. Supernatant

was collected for ELISA, while the cell pellet was re-suspended in 1mL of PBS. For

analyses of immune cell population in the lung, the lung lobes were digested as

described earlier (94) . The single-cell suspension thus prepared was used to run flow

cytometry using the BD LSRFortessa cell analyzer. Cells were blocked with CD16/32

(Tonbo biosciences 70-0161-u500, 1:10) to prevent nonspecific binding and stained

with a master mix of Siglec F (BD OptiBuild Cat#740280, 1:200), CD11b (Biolegend Cat

#101243, 1:200), Ly6G (BD Horizon Cat# 562700, 1:200), CD45 (Biolegend

Cat#103126, 1:200), CD11c (Biolegend Cat #117318, 1:200), CD4 (Biolegend

Cat#116012, 1:200), and CD8 (eBiosciences Cat#17-0081-82, 1:200). 7AAD

(eBiosciences Cat#00-6993-50, 1:10) was used as the nucleic acid dye to detect live

and dead cells.

Metal analyses

To understand the levels of metals released during subsequent days of exposure, we

performed Inductively coupled plasma mass spectrometry (ICP-MS) on the e-cig

aerosol condensates collected from each day of exposure using a Perkin Elmer ICP-MS

model 2000C. The samples were run using a Total Quant KED protocol with 4mL/min

Helium flow and externally calibrated using a blank and a 100ppb standard for the 51

elements. The samples were submitted to the Element Analyses facility at URMC, and

levels of metals thus detected were plotted.

Statistical significance

We used GraphPad Prism 10.0 for all statistical calculations. All the data plotted in this

paper are expressed as mean ± SEM. Pairwise comparisons were done using

unpaired *t* test while one-way analysis of variance (ANOVA) with ad-hoc Tukey's test

was employed for multi-group comparisons. To identify sex-based variations in our

treatment groups, Tukey post hoc two-way ANOVA was employed.

Data Availability: The datasets generated during and/or analyzed during the current

study are deposited on NCBI Gene Expression Omnibus. Specifically, mouse

scRNAseq is available under accession code "GSE263903"

(https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE263903). The data will be

publicly available upon publication or on April 11, 2025, whichever is earlier. Reviewer's

token for access is 'wtofqmayjdeltcn'. All other relevant data supporting the key findings

of this study are available within the article and its Supplementary Information files or

from the corresponding author upon reasonable request. Source data are provided with

this paper.

Code Availability: Data collection was performed with mkfastq pipeline in Cell

Ranger's (v7.0.1). Cell Ranger (v7.0.1) was used for cell and gene counting using the

default settings. Single-cell analysis was performed using the Seurat R package (v4.3.0)

using the recommended workflow.

Author's contributions: GK, TL and AT planned and conducted the experiments; TL

analyzed the lab-based assays; GK and AT analyzed the scRNA data; GK wrote and

edited the manuscript; TL, AT and IR reviewed the data and manuscript; IR conceived

and procured funding for the project.

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References

1.   Ma S, Qiu Z, Yang Q, Bridges JFP, Chen J, Shang C. Expanding the E-Liquid Flavor Wheel:
Classification of Emerging E-Liquid Flavors in Online Vape Shops. Int J Environ Res Public Health.
2022;19(21).
2.   Wang TW, Neff LJ, Park-Lee E, Ren C, Cullen KA, King BA. E-cigarette Use Among Middle and
High School Students - United States, 2020. MMWR Morb Mortal Wkly Rep. 2020;69(37):1310-2.
3.   Wu D, O'Shea DF. Potential for release of pulmonary toxic ketene from vaping pyrolysis of
vitamin E acetate. Proc Natl Acad Sci U S A. 2020;117(12):6349-55.
4.   Goniewicz ML, Kuma T, Gawron M, Knysak J, Kosmider L. Nicotine levels in electronic cigarettes.
Nicotine Tob Res. 2013;15(1):158-66.
5.   Lee YJ, Na CJ, Botao L, Kim KH, Son YS. Quantitative insights into major constituents contained in
or released by electronic cigarettes: Propylene glycol, vegetable glycerin, and nicotine. Sci Total Environ.
2020;703:134567.
6.   Wang Q, Sundar IK, Blum JL, Ratner JR, Lucas JH, Chuang TD, et al. Prenatal Exposure to
Electronic-Cigarette Aerosols Leads to Sex-Dependent Pulmonary Extracellular-Matrix Remodeling and
Myogenesis in Offspring Mice. Am J Respir Cell Mol Biol. 2020;63(6):794-805.

7. Muthumalage T, Lamb T, Friedman MR, Rahman I. E-cigarette flavored pods induce
inflammation, epithelial barrier dysfunction, and DNA damage in lung epithelial cells and monocytes. Sci
Rep. 2019;9(1):19035.
8. Lee HW, Park SH, Weng MW, Wang HT, Huang WC, Lepor H, et al. E-cigarette smoke damages
DNA and reduces repair activity in mouse lung, heart, and bladder as well as in human lung and bladder
cells. Proc Natl Acad Sci U S A. 2018;115(7):E1560-e9.
9. White AV, Wambui DW, Pokhrel LR. Risk assessment of inhaled diacetyl from electronic
cigarette use among teens and adults. Sci Total Environ. 2021;772:145486.
10. Martin EM, Clapp PW, Rebuli ME, Pawlak EA, Glista-Baker E, Benowitz NL, et al. E-cigarette use
results in suppression of immune and inflammatory-response genes in nasal epithelial cells similar to
cigarette smoke. Am J Physiol Lung Cell Mol Physiol. 2016;311(1):L135-44.
11. Sussan TE, Gajghate S, Thimmulappa RK, Ma J, Kim JH, Sudini K, et al. Exposure to electronic
cigarettes impairs pulmonary anti-bacterial and anti-viral defenses in a mouse model. PLoS One.
2015;10(2):e0116861.
12. Masso-Silva JA, Moshensky A, Shin J, Olay J, Nilaad S, Advani I, et al. Chronic E-Cigarette Aerosol
Inhalation Alters the Immune State of the Lungs and Increases ACE2 Expression, Raising Concern for
Altered Response and Susceptibility to SARS-CoV-2. Front Physiol. 2021;12:649604.
13. Madison MC, Landers CT, Gu BH, Chang CY, Tung HY, You R, et al. Electronic cigarettes disrupt
lung lipid homeostasis and innate immunity independent of nicotine. J Clin Invest. 2019;129(10):4290-
304.
14. Cao Y, Wu D, Ma Y, Ma X, Wang S, Li F, et al. Toxicity of electronic cigarettes: A general review of
the origins, health hazards, and toxicity mechanisms. Sci Total Environ. 2021;772:145475.
15. Olmedo P, Goessler W, Tanda S, Grau-Perez M, Jarmul S, Aherrera A, et al. Metal Concentrations
in e-Cigarette Liquid and Aerosol Samples: The Contribution of Metallic Coils. Environ Health Perspect.
2018;126(2):027010.
16. Aherrera A, Lin JJ, Chen R, Tehrani M, Schultze A, Borole A, et al. Metal Concentrations in E-
Cigarette Aerosol Samples: A Comparison by Device Type and Flavor. Environ Health Perspect.
2023;131(12):127004.
17. Del Fresno C, Sancho D. Myeloid cells in sensing of tissue damage. Curr Opin Immunol.
2021;68:34-40.
18. Marshall JS, Warrington R, Watson W, Kim HL. An introduction to immunology and
immunopathology. Allergy Asthma Clin Immunol. 2018;14(Suppl 2):49.
19. Gire V, Dulic V. Senescence from G2 arrest, revisited. Cell Cycle. 2015;14(3):297-304.
20. Oshi M, Takahashi H, Tokumaru Y, Yan L, Rashid OM, Matsuyama R, et al. G2M Cell Cycle
Pathway Score as a Prognostic Biomarker of Metastasis in Estrogen Receptor (ER)-Positive Breast
Cancer. Int J Mol Sci. 2020;21(8).
21. Lee PY, Wang JX, Parisini E, Dascher CC, Nigrovic PA. Ly6 family proteins in neutrophil biology. J
Leukoc Biol. 2013;94(4):585-94.
22. Mould KJ, Jackson ND, Henson PM, Seibold M, Janssen WJ. Single cell RNA sequencing identifies
unique inflammatory airspace macrophage subsets. JCI Insight. 2019;4(5).
23. Liégeois M, Bai Q, Fievez L, Pirottin D, Legrand C, Guiot J, et al. Airway Macrophages Encompass
Transcriptionally and Functionally Distinct Subsets Altered by Smoking. Am J Respir Cell Mol Biol.
2022;67(2):241-52.
24. Woldemeskel M, Hawkins I, Whittington L. Ki-67 protein expression and tumor associated
inflammatory cells (macrophages and mast cells) in canine colorectal carcinoma. BMC Vet Res.
2017;13(1):111.

25.   Sokulsky LA, Garcia-Netto K, Nguyen TH, Girkin JLN, Collison A, Mattes J, et al. A Critical Role for
the CXCL3/CXCL5/CXCR2 Neutrophilic Chemotactic Axis in the Regulation of Type 2 Responses in a
Model of Rhinoviral-Induced Asthma Exacerbation. J Immunol. 2020;205(9):2468-78.

26.   Metzemaekers M, Gouwy M, Proost P. Neutrophil chemoattractant receptors in health and
disease: double-edged swords. Cell Mol Immunol. 2020;17(5):433-50.

27.   Tolomeo M, Cascio A. STAT4 and STAT6, their role in cellular and humoral immunity and in
diverse human diseases. Int Rev Immunol. 2024:1-25.

28.   Boraschi D, Italiani P, Weil S, Martin MU. The family of the interleukin-1 receptors. Immunol
Rev. 2018;281(1):197-232.

29.   Orsini EM, Perelas A, Southern BD, Grove LM, Olman MA, Scheraga RG. Stretching the Function
of Innate Immune Cells. Front Immunol. 2021;12:767319.

30.   Jasper AE, Faniyi AA, Davis LC, Grudzinska FS, Halston R, Hazeldine J, et al. E-cigarette vapor
renders neutrophils dysfunctional due to filamentous actin accumulation. J Allergy Clin Immunol.
2024;153(1):320-9.e8.

31.   Corriden R, Moshensky A, Bojanowski CM, Meier A, Chien J, Nelson RK, Crotty Alexander LE. E-
cigarette use increases susceptibility to bacterial infection by impairment of human neutrophil
chemotaxis, phagocytosis, and NET formation. Am J Physiol Cell Physiol. 2020;318(1):C205-c14.

32.   Jin Y, Pan Y, Zheng S, Liu Y, Xu J, Peng Y, et al. Inactivation of EGLN3 hydroxylase facilitates Erk3
degradation via autophagy and impedes lung cancer growth. Oncogene. 2022;41(12):1752-66.

33.   Gonzalez-Cotto M, Guo L, Karwan M, Sen SK, Barb J, Collado CJ, et al. TREML4 Promotes
Inflammatory Programs in Human and Murine Macrophages and Alters Atherosclerosis Lesion
Composition in the Apolipoprotein E Deficient Mouse. Front Immunol. 2020;11:397.

34.   Nedeva C, Menassa J, Duan M, Liu C, Doerflinger M, Kueh AJ, et al. TREML4 receptor regulates
inflammation and innate immune cell death during polymicrobial sepsis. Nat Immunol.
2020;21(12):1585-96.

35.   Hurskainen M, Mižíková I, Cook DP, Andersson N, Cyr-Depauw C, Lesage F, et al. Single cell
transcriptomic analysis of murine lung development on hyperoxia-induced damage. Nat Commun.
2021;12(1):1565.

36.   Le Berre L, Chesneau M, Danger R, Dubois F, Chaussabel D, Garand M, Brouard S. Connection of
BANK1, Tolerance, Regulatory B cells, and Apoptosis: Perspectives of a Reductionist Investigation. Front
Immunol. 2021;12:589786.

37.   Yang J, Ren J, Yang Y, Sun J, Zhou X, Zheng S, et al. BANK1 alters B cell responses and influences
the interactions between B cells and induced T regulatory cells in mice with collagen-induced arthritis.
Arthritis Res Ther. 2018;20(1):9.

38.   O'Neill TJ, Tofaute MJ, Krappmann D. Function and targeting of MALT1 paracaspase in cancer.
Cancer Treat Rev. 2023;117:102568.

39.   Horsnell HL, Cao WH, Belz GT, Mueller SN, Alexandre YO. The transcription factor SpiB regulates
the fibroblastic reticular cell network and CD8(+) T-cell responses in lymph nodes. Immunol Cell Biol.
2024;102(4):269-79.

40.   Luo W, Xu C, Phillips S, Gardenswartz A, Rosenblum JM, Ayello J, et al. Protein phosphatase 1
regulatory subunit 1A regulates cell cycle progression in Ewing sarcoma. Oncotarget. 2020;11(19):1691-
704.

41.   Dannappel MV, Sooraj D, Loh JJ, Firestein R. Molecular and in vivo Functions of the CDK8 and
CDK19 Kinase Modules. Front Cell Dev Biol. 2018;6:171.

42.   Jin Q, Zhao J, Zhao Z, Zhang S, Sun Z, Shi Y, et al. CAMK1D Inhibits Glioma Through the
PI3K/AKT/mTOR Signaling Pathway. Front Oncol. 2022;12:845036.

43.   Vallin J, Grantham J. The role of the molecular chaperone CCT in protein folding and mediation
of cytoskeleton-associated processes: implications for cancer cell biology. Cell Stress Chaperones.
2019;24(1):17-27.
44.   Haeri M, Knox BE. Endoplasmic Reticulum Stress and Unfolded Protein Response Pathways:
Potential for Treating Age-related Retinal Degeneration. J Ophthalmic Vis Res. 2012;7(1):45-59.
45.   Lopes N, Galluso J, Escalière B, Carpentier S, Kerdiles YM, Vivier E. Tissue-specific transcriptional
profiles and heterogeneity of natural killer cells and group 1 innate lymphoid cells. Cell Rep Med.
2022;3(11):100812.
46.   Pommerenke C, Wilk E, Srivastava B, Schulze A, Novoselova N, Geffers R, Schughart K. Global
transcriptome analysis in influenza-infected mouse lungs reveals the kinetics of innate and adaptive host
immune responses. PLoS One. 2012;7(7):e41169.
47.   Akter S, Chauhan KS, Dunlap MD, Choreño-Parra JA, Lu L, Esaulova E, et al. Mycobacterium
tuberculosis infection drives a type I IFN signature in lung lymphocytes. Cell Rep. 2022;39(12):110983.
48.   Kong S, Chen TX, Jia XL, Cheng XL, Zeng ML, Liang JY, et al. Cell-specific NFIA upregulation
promotes epileptogenesis by TRPV4-mediated astrocyte reactivity. J Neuroinflammation.
2023;20(1):247.
49.   Hiraike Y, Saito K, Oguchi M, Wada T, Toda G, Tsutsumi S, et al. NFIA in adipocytes reciprocally
regulates mitochondrial and inflammatory gene program to improve glucose homeostasis. Proc Natl
Acad Sci U S A. 2023;120(31):e2308750120.
50.   Lamb T, Kaur G, Rahman I. Tobacco-Derived and Tobacco-Free Nicotine cause differential
inflammatory cell influx and MMP9 in mouse lung. Res Sq. 2023.
51.   Sindelar JL. Regulating Vaping - Policies, Possibilities, and Perils. N Engl J Med. 2020;382(20):e54.
52.   Bhalerao A, Sivandzade F, Archie SR, Cucullo L. Public Health Policies on E-Cigarettes. Curr
Cardiol Rep. 2019;21(10):111.
53.   Azagba S, Ebling T, Adekeye OT, Hall M, Jensen JK. Loopholes for Underage Access in E-Cigarette
Delivery Sales Laws, United States, 2022. Am J Public Health. 2023;113(5):568-76.
54.   N KEaE. Current Electronic Cigarette Use Among

Adults Aged 18 and Over: United States, 2021 2023.
55.   Lamb T, Muthumalage T, Rahman I. Pod-based menthol and tobacco flavored e-cigarettes cause
mitochondrial dysfunction in lung epithelial cells. Toxicol Lett. 2020;333:303-11.
56.   Ren X, Lin L, Sun Q, Li T, Sun M, Sun Z, Duan J. Metabolomics-based safety evaluation of acute
exposure to electronic cigarettes in mice. Sci Total Environ. 2022;839:156392.
57.   Zhao D, Aravindakshan A, Hilpert M, Olmedo P, Rule AM, Navas-Acien A, Aherrera A.
Metal/Metalloid Levels in Electronic Cigarette Liquids, Aerosols, and Human Biosamples: A Systematic
Review. Environ Health Perspect. 2020;128(3):36001.
58.   Zhao D, Navas-Acien A, Ilievski V, Slavkovich V, Olmedo P, Adria-Mora B, et al. Metal
concentrations in electronic cigarette aerosol: Effect of open-system and closed-system devices and
power settings. Environ Res. 2019;174:125-34.
59.   Alcantara C, Chaparro L, Zagury GJ. Occurrence of metals in e-cigarette liquids: Influence of coils
on metal leaching and exposure assessment. Heliyon. 2023;9(3):e14495.
60.   Omaiye EE, Williams M, Bozhilov KN, Talbot P. Design features and elemental/metal analysis of
the atomizers in pod-style electronic cigarettes. PLoS One. 2021;16(3):e0248127.
61.   Rastian B, Wilbur C, Curtis DB. Transfer of Metals to the Aerosol Generated by an Electronic
Cigarette: Influence of Number of Puffs and Power. Int J Environ Res Public Health. 2022;19(15).
62.   Kalininskiy A, Kittel J, Nacca NE, Misra RS, Croft DP, McGraw MD. E-cigarette exposures,
respiratory tract infections, and impaired innate immunity: a narrative review. Pediatr Med. 2021;4.

63.   Rebuli ME, Glista-Baker E, Hoffman JR, Duffney PF, Robinette C, Speen AM, et al. Electronic-
Cigarette Use Alters Nasal Mucosal Immune Response to Live-attenuated Influenza Virus. A Clinical Trial.
Am J Respir Cell Mol Biol. 2021;64(1):126-37.
64.   Reidel B, Radicioni G, Clapp PW, Ford AA, Abdelwahab S, Rebuli ME, et al. E-Cigarette Use
Causes a Unique Innate Immune Response in the Lung, Involving Increased Neutrophilic Activation and
Altered Mucin Secretion. Am J Respir Crit Care Med. 2018;197(4):492-501.
65.   Song MA, Kim JY, Gorr MW, Miller RA, Karpurapu M, Nguyen J, et al. Sex-specific lung
inflammation and mitochondrial damage in a model of electronic cigarette exposure in asthma. Am J
Physiol Lung Cell Mol Physiol. 2023;325(5):L568-l79.
66.   Chirumamilla P, Rousselle, D, Sharma, S, Commodore, S and Silveyra, P. Evaluation of Sex
Differences in DNA Methylation and Lung Tissue Gene Expression in a Mouse Model of E-cigarette
Exposure. Respiratory Physiology. 2024;39(S1).
67.   Deniset JF, Surewaard BG, Lee WY, Kubes P. Splenic Ly6G(high) mature and Ly6G(int) immature
neutrophils contribute to eradication of S. pneumoniae. J Exp Med. 2017;214(5):1333-50.
68.   Kleinholz CL, Riek-Burchardt M, Seiß EA, Amore J, Gintschel P, Philipsen L, et al. Ly6G deficiency
alters the dynamics of neutrophil recruitment and pathogen capture during Leishmania major skin
infection. Scientific Reports. 2021;11(1):15071.
69.   Shanker A, Marincola FM. Cooperativity of adaptive and innate immunity: implications for
cancer therapy. Cancer Immunol Immunother. 2011;60(8):1061-74.
70.   Carroll MC, Prodeus AP. Linkages of innate and adaptive immunity. Curr Opin Immunol.
1998;10(1):36-40.
71.   Wang R, Zhang H, Xu J, Zhang N, Pan T, Zhong X, et al. MALT1 Inhibition as a Therapeutic
Strategy in T-Cell Acute Lymphoblastic Leukemia by Blocking Notch1-Induced NF-κB Activation. Front
Oncol. 2020;10:558339.
72.   Bird CH, Christensen ME, Mangan MS, Prakash MD, Sedelies KA, Smyth MJ, et al. The granzyme
B-Serpinb9 axis controls the fate of lymphocytes after lysosomal stress. Cell Death Differ.
2014;21(6):876-87.
73.   Beland M, Desjardins M, Xue D, Mazer BD. Semaphorin 4C Is An Intrinsic Regulator Of Cell-Cell
Interaction In Th2 Stimulated Memory-B-Cells. Journal of Allergy and Clinical Immunology.
2014;133(2):AB249.
74.   Szilagyi Z, Gustafsson CM. Emerging roles of Cdk8 in cell cycle control. Biochimica et Biophysica
Acta (BBA) - Gene Regulatory Mechanisms. 2013;1829(9):916-20.
75.   Brackley KI, Grantham J. Activities of the chaperonin containing TCP-1 (CCT): implications for cell
cycle progression and cytoskeletal organisation. Cell Stress Chaperones. 2009;14(1):23-31.
76.   Berry R, Ng N, Saunders PM, Vivian JP, Lin J, Deuss FA, et al. Targeting of a natural killer cell
receptor family by a viral immunoevasin. Nat Immunol. 2013;14(7):699-705.
77.   Bolanos FD, Tripathy SK. Activation receptor-induced tolerance of mature NK cells in vivo
requires signaling through the receptor and is reversible. J Immunol. 2011;186(5):2765-71.
78.   Israr M, DeVoti JA, Papayannakos CJ, Bonagura VR. Role of chemokines in HPV-induced cancers.
Seminars in Cancer Biology. 2022;87:170-83.
79.   Li BH, Garstka MA, Li ZF. Chemokines and their receptors promoting the recruitment of myeloid-
derived suppressor cells into the tumor. Mol Immunol. 2020;117:201-15.
80.   Wang S, Sun Y, Li C, Chong Y, Ai M, Wang Y, et al. TH1L involvement in colorectal cancer
pathogenesis by regulation of CCL20 through the NF-κB signalling pathway. J Cell Mol Med.
2024;28(10):e18391.
81.   Ross SH, Cantrell DA. Signaling and Function of Interleukin-2 in T Lymphocytes. Annu Rev
Immunol. 2018;36:411-33.

82.   Rapp M, Wintergerst MWM, Kunz WG, Vetter VK, Knott MML, Lisowski D, et al. CCL22 controls
immunity by promoting regulatory T cell communication with dendritic cells in lymph nodes. J Exp Med.
2019;216(5):1170-81.

83.   Jinquan T, Quan S, Feili G, Larsen CG, Thestrup-Pedersen K. Eotaxin activates T cells to
chemotaxis and adhesion only if induced to express CCR3 by IL-2 together with IL-4. J Immunol.
1999;162(7):4285-92.

84.   Chia TY, Billingham LK, Boland L, Katz JL, Arrieta VA, Shireman J, et al. The CXCL16-CXCR6 axis in
glioblastoma modulates T-cell activity in a spatiotemporal context. Front Immunol. 2023;14:1331287.

85.   Böttcher JP, Beyer M, Meissner F, Abdullah Z, Sander J, Höchst B, et al. Functional classification
of memory CD8+ T cells by CX3CR1 expression. Nature Communications. 2015;6(1):8306.

86.   Tu GW, Ju MJ, Zheng YJ, Hao GW, Ma GG, Hou JY, et al. CXCL16/CXCR6 is involved in LPS-induced
acute lung injury via P38 signalling. J Cell Mol Med. 2019;23(8):5380-9.

87.   Christiani DC. Vaping-Induced Acute Lung Injury. N Engl J Med. 2020;382(10):960-2.

88.   Kagohashi K, Sasaki Y, Ozawa K, Tsuchiya T, Kawahara S, Saitoh K, et al. Role of Signal-
Transducing Adaptor Protein-1 for T Cell Activation and Pathogenesis of Autoimmune Demyelination
and Airway Inflammation. The Journal of Immunology. 2024;212(6):951-61.

89.   Zhu X, Guan R, Zou Y, Li M, Chen J, Zhang J, Luo W. Cold-inducible RNA binding protein alleviates
iron overload-induced neural ferroptosis under perinatal hypoxia insult. Cell Death & Differentiation.
2024;31(4):524-39.

90.   Mikulski Z, Zaslona Z, Cakarova L, Hartmann P, Wilhelm J, Tecott LH, et al. Serotonin activates
murine alveolar macrophages through 5-HT2C receptors. Am J Physiol Lung Cell Mol Physiol.
2010;299(2):L272-80.

91.   Dutta S, Sengupta P. Men and mice: Relating their ages. Life Sci. 2016;152:244-8.

92.   Jackson SJ, Andrews N, Ball D, Bellantuono I, Gray J, Hachoumi L, et al. Does age matter? The
impact of rodent age on study outcomes. Lab Anim. 2017;51(2):160-9.

93.   Lee YO, Nonnemaker JM, Bradfield B, Hensel EC, Robinson RJ. Examining Daily Electronic
Cigarette Puff Topography Among Established and Nonestablished Cigarette Smokers in their Natural
Environment. Nicotine Tob Res. 2018;20(10):1283-8.

94.   Kaur GR, I. URMC TriState SenNet Mouse Lung Digestion. protocols.io2024.

95.   Hao Y, Hao S, Andersen-Nissen E, Mauck WM, 3rd, Zheng S, Butler A, et al. Integrated analysis of
multimodal single-cell data. Cell. 2021;184(13):3573-87.e29.

96.   Schaum N, Karkanias J, Neff NF, May AP, Quake SR, Wyss-Coray T, et al. Single-cell
transcriptomics of 20 mouse organs creates a Tabula Muris. Nature. 2018;562(7727):367-72.

97.   Love MI, Huber W, Anders S. Moderated estimation of fold change and dispersion for RNA-seq
data with DESeq2. Genome Biology. 2014;15(12):550.

98.   Yu G, Wang LG, Han Y, He QY. clusterProfiler: an R package for comparing biological themes
among gene clusters. Omics. 2012;16(5):284-7.

Figures:

Figure 1: E-cig aerosols show flavor-dependent changes in the levels of

quantified metals

Schematics showing the exposure profile and experimental design to understand the

effect of exposure to differently flavored e-cig aerosols in the lungs from C57BL/6J mice

using scRNA seq (A) and the nose only exposure system used for performing the

mouse experiment (B). The exposure characteristics were assessed by measuring the

serum cotinine levels in the blood of exposed and control mice. Data are shown as

mean ± SEM (n = 4/group); ns: not significant. **$p<0.01$, and ***$p<0.001$ vs air, per one-

way ANOVA for multiple comparison (C) and analyzing the levels of metals in the

aerosols captured from each day of exposure using ICP-MS (D). Lung morphometric

changes as observed using H&E staining of lung slices from air, PGVG and differently

flavored e-cig exposed mice. Representative images of n = 2/sex/group at 10X

magnification is provided (E) and quantified values for mean linear intercept (Lm)

plotted in a sex-specific manner (F)

Figure 2: scRNA seq analyses reveals maximum changes in the cell states of

immune cell population upon exposure to differently flavored e-cig aerosols.

Male and female C57BL/6J mice were exposed to 5-day nose-only exposure to

differently flavored e-cig aerosols. The mice were sacrificed after the final exposure and

lungs from air (control) and differently flavored e-cig aerosol (fruit, menthol, and

tobacco)-exposed mice were used to perform scRNA seq. UMAP plot of 71,725 cells

captured during scRNA seq showing the four major cell populations identified from

control and experimental mouse lungs (A) and the expression of canonical markers

used for identifying stromal (*Col3a1*), epithelial (*Sftpa1*), endothelial (*Cldn5*) and

immune (*Ptprc*) cell populations. The intensity of expression is indicated by the red-

yellow coloring (B). The cell frequencies (plotted as percentage) of different cell clusters

in each sample type showing the sex-dependent variations in the cell composition on

exposure to differently flavored e-cig aerosols (C). Bar graphs showing the number of

significant DEGs (p <0.01) found to be up (blue) and down (orange)- regulated in each

cell cluster in differently flavored e-cig aerosol exposed mouse lungs as compared to air

controls as determined by aggregate analyses for both sexes in each group using

DESeq2 (D).

Figure 3: Cellular composition of myeloid cells in air and e-cig aerosol exposed

mouse lung reveal a unique population of neutrophils.

A total of 14 unique cell clusters were identified from the myeloid cell subset of air and

e-cig aerosol exposed mouse lung (A). UMAP plot showing the cell cycle state of

different cell types in the myeloid cluster as determined using the Cell cycle scoring in

Seurat (B). The heatmap showing the most DEGs in each cluster across the myeloid

subset. These differential expressions were used to determine and name the cell types

in this cluster. The intensity of expression is indicated by the purple coloring (C). The

cell percentages of different cell types in the myeloid cluster showing the sex-dependent

variations in the cell composition on exposure to differently flavored e-cig aerosols (D).

Flow cytometry results showing sex-dependent changes in the percentages of lung

neutrophils (CD45+ CD11b+ Ly6G+) in lung tissue digest (E) and alveolar macrophages

(CD45+ CD11b- SiglecF+) in BALF (F) from mice exposed to differently flavored e-cig

aerosols. Data are shown as mean ± SEM (n = 3/sex/group). *p<0.05, and

****p<0.0001, per Tukey post hoc two-way ANOVA comparison.

Figure 4: Exposure to flavored e-cig aerosols result in dampening of neutrophil-

mediated innate immune responses in C57BL/6J mouse lungs.

Heatmap and bar plot showing the DESeq2 and GO analyses results respectively from

the DEGs in the myeloid cell cluster from Fruit (A & B), menthol (C&D) and tobacco

(E&F)-flavored e-cig aerosol exposed mouse lungs as compared to air controls.

Heatmap (G) and bar plot (H) showing the DESeq2 and GO analyses results

respectively from the DEGs in the Ly6G- neutrophil cluster from air and flavored e-cig

(fruit, menthol and tobacco) aerosol exposed mouse lungs.

Figure 5: Exposure to tobacco-flavored e-cig aerosols results in significant

increase in lung T-cell percentages in C57Bl/6J mice.

A total of 10 unique cell clusters were identified from the lymphoid cell subset of air and

e-cig aerosol exposed mouse lung (A). The heatmap showing the most DEGs in each

cluster across the myeloid subset. These differential expressions were used to

determine and name the cell types in this cluster. The intensity of expression is

indicated by the purple coloring (B). The cell percentages of different cell types in the

lymphoid cluster showing the sex-dependent variations in the cell composition on

exposure to differently flavored e-cig aerosols (C). Flow cytometry results showing

changes in the percentages of lung CD4+ and CD8+ T-cells in the lung tissue digest (D)

from mice exposed to differently flavored e-cig aerosols as depicted in a sex-specific

manner. Data are shown as mean ± SEM (n = 3/sex/group). *p<0.05, **p<0.01, and

****p<0.0001, per Tukey post hoc two-way ANOVA comparison.

Figure 6: Exposure to tobacco flavored e-cig aerosols result in activation of T-

cytotoxic responses in C57BL/6J mouse lungs.

Heatmap and bar plot showing the DESeq2 and GO analyses results respectively from the DEGs in the lymphoid cell cluster from Fruit (A & B), menthol (C&D) and tobacco (E&F)-flavored e-cig aerosol exposed mouse lungs as compared to air controls.

Figure 7: GO analyses of the commonly dysregulated genes show enrichment of dampened innate immune response upon exposure to flavored e-cig aerosols in C57BL/6J mice.

Heat map showing the sex-dependent average fold changes in the levels of cytokines/chemokines in the lung of differently flavored e-cig aerosol exposed C57Bl/6J mouse lungs as compared to air controls. Data are shown as mean ± SEM (n = 3/sex/group) (A). Heatmap showing the fold changes in the expression of commonly dysregulated genes in the myeloid cluster and lymphoid clusters in mouse lungs exposed to flavored e-cig aerosols as compared to ambient air as determined after DESeq2 analyses (B).

 CNET plot results showing the pathways regulated by the common DEGs on acute (5-day) exposure to differently flavored fruit, menthol, and tobacco) e-cig aerosols in C57Bl/6J mouse lungs (B).

Tables

Table 1: Table showing the levels of common elements found in the flavored e-liquids and e-cig aerosols in as measured using ICP-MS.

Element	Eliquid; ppb/ mg of eliquid				E-cig Aerosol (Mean ± SD); ppb/ mg of eliquid			
	PGVG	Fruit	Menthol	Tobacco	PGVG	Fruit	Menthol	Tobacco
S	75.63	68.36	95.34	79.79	70.67 ± 16.94	74.05 ± 39.63	81.31 ± 27.24	91.81 ± 11.67
Ni	2.09	1.63	4.73	2.84	1.04 ± 1.00	30.47 ± 14.28	83.52 ± 20.53	41.73 ± 12.25
Cu	2.16	0.87	2.72	2.00	0.37 ± 0.22	1.04 ± 0.48	1.85 ± 0.70	1.32 ± 0.39
Si	1.05	1.13	1.55	1.26	1.10 ± 0.14	1.09 ± 0.35	1.32 ± 0.28	1.33 ± 0.12
K	0.80	0.84	1.21	0.67	0.94 ± 0.13	0.99 ± 0.45	1.32 ± 0.28	0.51 ± 0.10
Na	0.39	0.40	1.10	0.63	0.65 ± 0.11	0.91 ± 0.17	1.70 ± 0.37	0.79 ± 0.11
W	0.48	0.23	0.24	0.14	0.46 ± 0.20	0.30 ± 0.18	0.28 ± 0.14	0.22 ± 0.05
Zn	0.32	0.36	0.68	1.94	0.18 ± 0.01	1.45 ± 0.48	2.06 ± 0.48	1.71 ± 0.42

Ir	0.28	0.47	0.27	0.11	1.19 ± 0.76	0.35 ± 0.29	0.19 ± 0.12	0.14 ± 0.05
B	0.14	0.02	0.02	0.02	0.07 ± 0.02	0.02 ± 0.01	0.02 ± 0.01	0.02 ± 0.01
Ta	0.14	0.34	0.24	0.13	0.73 ± 0.30	0.24 ± 0.09	0.18 ± 0.06	0.13 ± 0.02
Hf	0.13	0.18	0.13	0.07	0.43 ± 0.19	0.14 ± 0.05	0.09 ± 0.03	0.07 ± 0.01
Mo	0.08	0.01	0.01	0.01	0.02 ± 0.01	0.07 ± 0.01	0.15 ± 0.04	0.06 ± 0.02
Pd	0.07	0.14	0.11	0.06	0.30 ± 0.14	0.11 ± 0.06	0.07 ± 0.02	0.06 ± 0.01
Pt	0.05	0.06	0.05	0.07	0.16 ± 0.07	0.09 ± 0.05	0.08 ± 0.04	0.08 ± 0.03
Zr	0.04	0.01	0.02	0.02	0.02 ± 0.01	0.02±0.01	0.01 ± 0.00	0.01 ± 0.00
Sn	0.02	0.06	0.05	0.04	0.06 ± 0.02	0.07 ± 0.02	0.03 ± 0.01	0.03 ± 0.01
Mg	0.01	0.01	0.04	0.03	0.02 ± 0.00	0.12 ± 0.03	0.12 ± 0.03	0.10 ± 0.02
Al	0.01	0.01	0.01	0.01	0.01 ± 0.00	0.01 ± 0.00	0.01 ± 0.00	0.01 ± 0.00
Co	0.01	0.01	0.01	0.01	0.01 ±	0.02 ±	0.03 ±	0.02 ±

					0.00	0.00	0.01	0.00
Nb	0.01	0.00	0.00	0.00	0.01 ± 0.00	0.00 ± 0.00	0.00 ± 0.00	0.00 ± 0.00
Ba	0.01	0.01	0.01	0.01	0.01 ± 0.01	0.01 ± 0.00	0.01 ± 0.00	0.01 ± 0.00
Re	0.01	0.01	0.01	0.02	0.06 ± 0.04	0.03 ± 0.03	0.02 ± 0.01	0.02 ± 0.01

1043

1044 Table 2: DESeq 2 results showing the number of significantly ($p_{adj} < 0.05$) up- or

1045 downregulated genes in different cell clusters

Comparisons	Myeloid Cells		Lymphoid Cells		Endothelial cells		Stromal Cells		Epithelial Cells	
	Up	Down	Up	Down	Up	Down	Up	Down	Up	Down
PGVG vs Air	57	219	9	15	31	20	106	48	17	2
Menthol vs Air	220	104	8	1	59	80	37	14	6	4
Fruit Vs Air	17	7	40	72	3	12	8	2	8	2
Tobacco vs Air	338	215	25	16	87	110	29	13	5	5
Menthol vs PGVG	673	200	55	9	38	87	8	22	4	40
Fruit vs PGVG	135	127	25	12	25	20	29	9	12	12
Tobacco vs PGVG	852	408	90	12	52	87	44	48	5	15

1046

1047 Table 3: Table showing the cell types identified from myeloid and lymphoid clusters and

1048 their abbreviations

Cell Types	Abbreviations	Cell Types	Abbreviations
Resident alveolar macrophages	RAM	Rpl+ dendritic cell	Rpl+ DC
Proliferating Alveolar macrophages	pRAM	Plasmacytoid dendritic cell	pDC
Resolving alveolar macrophages	Resolving AM	B-cell progenitors	Pro B cell
Pde3a+ alveolar macrophages	Pde3a+ AM	B-cell precursor	Pre B cell
Interstitial macrophages	IM	Mature B cell	Mature B cell
Classical monocytes	CM	Interferon stimulated B-cell	IFN stim. B cell
Non-classical monocytes	NCM	CD8+ T cell	CD8+ T cell
Dendritic cell 1	cDC1	αβ T cell	αβ T cell
Dendritic cell 2	cDC2	Regulatory T cells	Treg cell
γδ T cell	γδ T cell	Natural Killer cells	NK cell

1049

1050 Table 4: List of top dysregulated genes on exposure to differently flavored (fruit, menthol

1051 and tobacco) e-cig aerosol in C57Bl/6J mouse lungs

Genes	Gene Names	Gene Function

Neurl3	Neuralized E3 Ubiquitin Protein Ligase 3	ubiquitin protein ligase activity
Egfem1	EGF-like and EMI domain containing 1	calcium ion binding activity
Stap1	Signal Transducing Adaptor Family Member 1	protein kinase binding and SH3/SH2 adaptor activity
Tfec	Transcription Factor EC	multiple cellular processes including survival, growth and differentiation
Mitf	Melanocyte Inducing Transcription Factor	critical role in cell differentiation
Cirbp	Cold Inducible RNA Binding Protein	role in cold-induced suppression of cell proliferation
Hist1h1c	H1.2 linker histone	functions in the compaction of chromatin
Gmds	GDP-Mannose 4,6-Dehydratase	coenzyme binding and NADP$^+$ binding
Htr2c	5-Hydroxytryptamine Receptor 2C	G protein-coupled receptor activity
Nfia	Nuclear Factor I A	DNA-binding transcription factor activity
Klra8	killer cell lectin-like receptor	carbohydrate binding activity. Acts upstream of or within response to virus
Trp53i11	Tumor Protein P53 Inducible Protein 11	negative regulation of cell population proliferation
Ehd2	EH Domain Containing 2	Angiopoietin-like protein 8 regulatory pathway and response to elevated platelet cytosolic Ca2+.
Ackr2	Atypical Chemokine Receptor 2	recruitment of effector immune cells to the inflammation site.
Marcks	Myristoylated Alanine Rich Protein Kinase C Substrate	involved in cell motility, phagocytosis, membrane trafficking and mitogenesis
Pfkl	Phosphofructokinase,	protein binding and monosaccharide binding

	Receptor Activity Modifying	
Ramp3	Protein 3	signaling receptor activity and coreceptor activity
Chrm3	Cholinergic Receptor Muscarinic 3	cellular responses such as adenylate cyclase inhibition, phosphoinositide degeneration, and potassium channel mediation
Sftpa1	Surfactant Protein A1	carbohydrate binding and lipid transporter activity
Add3	Adducin 3	actin binding and calmodulin binding
Hmgb3	High Mobility Group Box 3	important role in maintaining stem cell populations and may be aberrantly expressed in tumor cells.
Acot1	Acyl-CoA Thioesterase 1	involved in acyl-CoA metabolic process; long-chain fatty acid metabolic process; and very long-chain fatty acid metabolic process
H1f0	H1.0 Linker Histone	Cellular responses to stimuli and Programmed Cell Death.
Scgb3a2	Secretoglobin Family 3A Member 2	secreted lung surfactant protein
Scgb1a1	Secretoglobin Family 1A Member 1	implicated in numerous functions including anti-inflammation, inhibition of phospholipase A2 and the sequestering of hydrophobic ligands
Gpam	Glycerol-3-Phosphate Acyltransferase, Mitochondrial	acyltransferase activity and glycerol-3-phosphate O-acyltransferase activity
Cdh11	Cadherin 11	integral membrane proteins that mediate calcium-dependent cell-cell adhesion.
Ldlr	Low Density Lipoprotein Receptor	cell surface proteins involved in receptor-mediated endocytosis of specific ligands.
Myocd	Myocardin	transcriptional co-activator of serum response factor (SRF)

1052

1053 Table 5: Gene Ontology results showing the top hits from the commonly dysregulated

1054 genes in all clusters on exposure to e-cig aerosols

GO ID	ONTOLOGY	Description	Gene ID	BgRatio	p.adjust
GO:0045907	BP	positive regulation of vasoconstriction	Htr2c/Chrm3/Add3	53/23062	0.033815
GO:00192	BP	regulation of	Htr2c/Chrm3/Add3	86/2306	0.04249

29		vasoconstriction		2	1
GO:19039 78	BP	regulation of microglial cell activation	Stap1/Ldlr	16/2306 2	0.04249 1
GO:00026 83	BP	negative regulation of immune system process	Hmgb3/Gpam/Scg b1a1/Stap1/Ldlr	464/230 62	0.04249 1
GO:00108 67	BP	positive regulation of triglyceride biosynthetic process	Gpam/Ldlr	19/2306 2	0.04249 1
GO:00423 10	BP	vasoconstriction	Htr2c/Chrm3/Add3	109/230 62	0.04249 1
GO:00468 89	BP	positive regulation of lipid biosynthetic process	Htr2c/Gpam/Ldlr	110/230 62	0.04249 1
GO:00108 66	BP	regulation of triglyceride biosynthetic process	Gpam/Ldlr	25/2306 2	0.04704 6
GO:00019 19	BP	regulation of receptor recycling	Ldlr/Ramp3	29/2306 2	0.04704 6
GO:00072 71	BP	synaptic transmission, cholinergic	Htr2c/Chrm3	29/2306 2	0.04704 6
GO:01500 77	BP	regulation of neuroinflammatory response	Stap1/Ldlr	29/2306 2	0.04704 6
GO:00902 08	BP	positive regulation of triglyceride metabolic process	Gpam/Ldlr	31/2306 2	0.04704 6
GO:00459 87	BP	positive regulation of smooth muscle contraction	Chrm3/Myocd	35/2306 2	0.04704 6
GO:00972 42	BP	amyloid-beta clearance	Ldlr/Myocd	36/2306 2	0.04704 6
GO:00400 13	BP	negative regulation of locomotion	Htr2c/Mitf/Stap1/M yocd	360/230 62	0.04704 6
GO:00106 67	BP	negative regulation of cardiac muscle cell apoptotic process	Acot1/Myocd	37/2306 2	0.04704 6
GO:00018 81	BP	receptor recycling	Ldlr/Ramp3	40/2306 2	0.04704 6
GO:00106 64	BP	negative regulation of striated muscle cell apoptotic process	Acot1/Myocd	40/2306 2	0.04704 6
GO:00194 32	BP	triglyceride biosynthetic process	Gpam/Ldlr	40/2306 2	0.04704 6
GO:00352 96	BP	regulation of tube diameter	Htr2c/Chrm3/Add3	173/230 62	0.04704 6
GO:00977 46	BP	blood vessel diameter maintenance	Htr2c/Chrm3/Add3	173/230 62	0.04704 6
GO:00017	BP	microglial cell activation	Stap1/Ldlr	42/2306	0.04704

74				2	6
GO:1903725	BP	regulation of phospholipid metabolic process	Htr2c/Ldlr	42/23062	0.047046
GO:0035150	BP	regulation of tube size	Htr2c/Chrm3/Add3	174/23062	0.047046

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