

## Supplementary Material

### ***ELF5* is a potential respiratory epithelial cell-specific risk gene for severe COVID-19**

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## TABLES

Phenotype	short	cases	controls	case definition
Severe COVID-19 vs. population	A2	8,779	1,001,875	Very severe COVID-19 cases were defined as hospitalized individuals with COVID-19 as the primary reason for hospital admission with laboratory-confirmed SARS-CoV-2 infection (nucleic acid amplification tests or serology based) and death or respiratory support (invasive ventilation, continuous positive airway pressure, bilevel positive airway pressure or continuous external negative pressure, high-flow nasal or face mask oxygen). Simple supplementary oxygen (for example, 2 L min <sup>-1</sup> via nasal cannula) did not qualify for case status. Controls were all individuals in the participating cohorts who did not meet this case definition.
hospitalized COVID-19 vs. not hospitalized COVID-19	B1	14,480	73,191	Hospitalized COVID-19 cases were defined as individuals hospitalized with laboratory-confirmed SARS-CoV-2 infection (using the same microbiology methods as for the very severe phenotype), where hospitalization was due to COVID-19-related symptoms. Controls were all individuals with laboratory confirmed COVID-19, but did not require hospitalisation.
hospitalized COVID-19 vs. population	B2	24,274	2,061,529	Hospitalized COVID-19 cases were defined as individuals hospitalized with laboratory-confirmed SARS-CoV-2 infection (using the same microbiology methods as for the very severe phenotype), where hospitalization was due to COVID-19-related symptoms. Controls were all individuals in the participating cohorts who did not meet this case definition.
confirmed SARS-CoV-2 infection vs. population	C2	112,612	2,474,079	Susceptibility to COVID-19 cases was defined as individuals with laboratory-confirmed SARS-CoV-2 infection, health record evidence of COVID-19 (ICD coding or physician confirmation) or with self-reported infections (for example, by questionnaire). Controls were all individuals who did not meet this case definition.

**Supplementary Table 1** Summary of COVID-19 endpoints from the COVID-19 Host genetics initiative - release 6

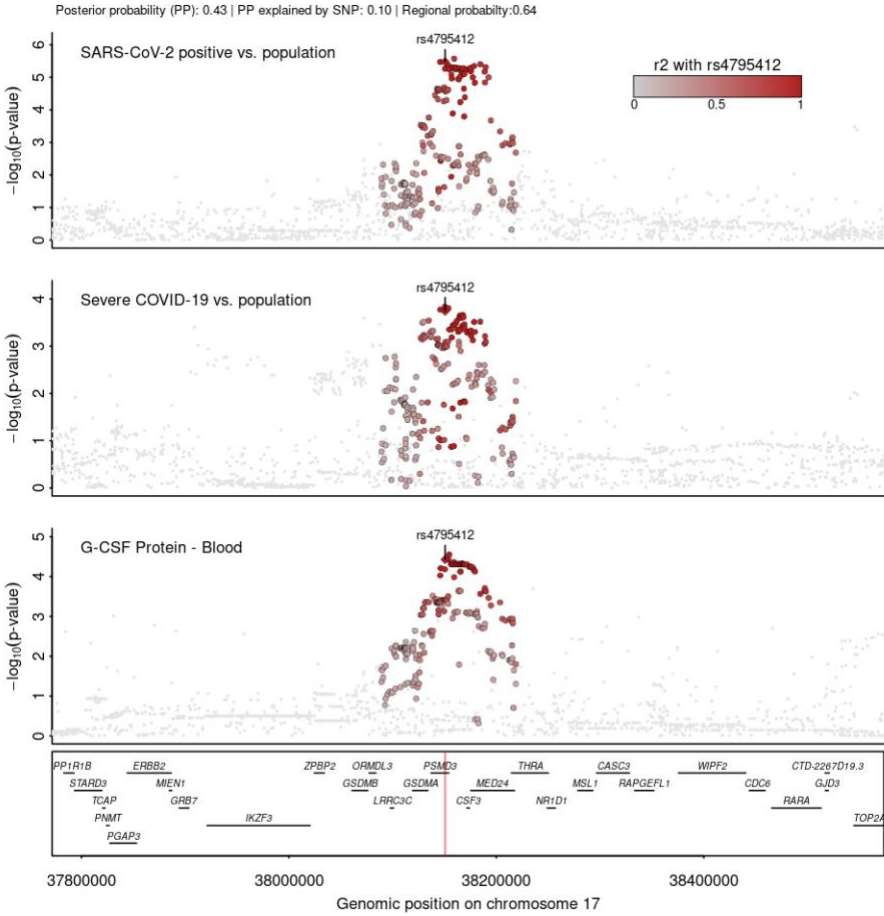
Patient ID	Disease	Sex	Age	COVID-19 main cause of death	Tissue	SARS-CoV-2 PCR mucosa	SARS-CoV-2 PCR lung
C19-1	COVID-19	Male	71-80	yes	Lung	-	pos
C19-2	COVID-19	Male	71-80	yes	Lung	-	pos
C19-3	COVID-19	Male	51-60	yes	Olf. Mucosa	pos	-
C19-4	COVID-19	Male	81-90	yes	Olf. Mucosa	neg	-
Control 1	Control	Male	31-40	no	Lung	-	-
Control 2	Control	Female	61-70	no	Lung	-	-
Control 3	Control	Female	71-80	no	Olf. Mucosa	neg	-
Control 4	Control	Female	71-80	no	Olf. Mucosa	neg	-

**Supplementary Table 2** Patient characteristics

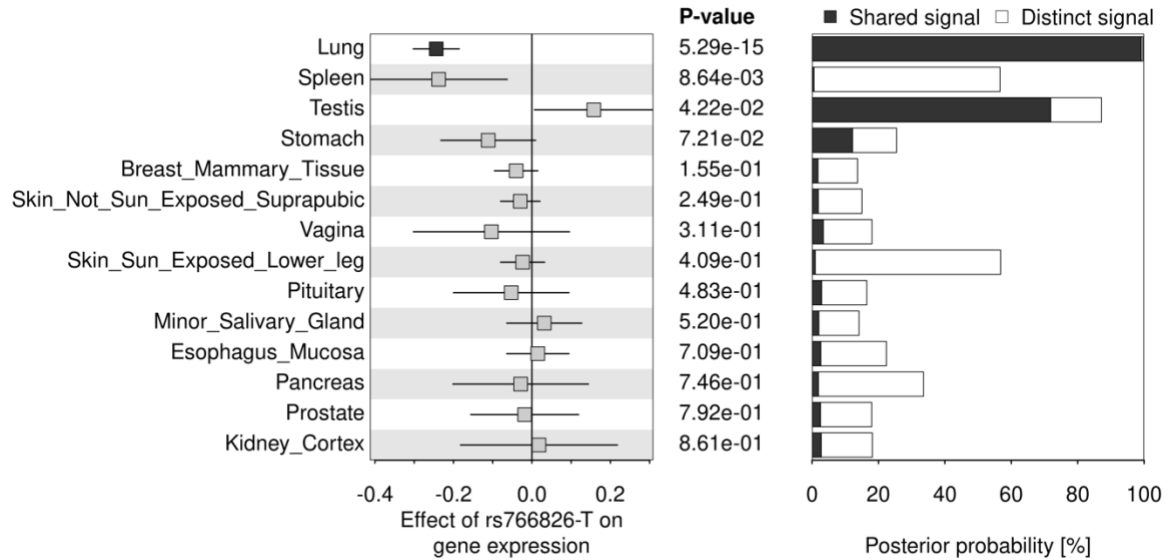
<b>Antigen/Target</b>	<b>Host</b>	<b>Dilution</b>	<b>Catalog Number</b>
KRT18	Mouse	1:100	Abcam, ab668
SFTPC	Mouse	1:100	ThermoFisher, PA5-71680
EPCAM	Mouse	1:100	ThermoFischer, MA5-12436
SCGB1A1	Mouse	1:100	Santa Cruz Biotechnology, sc-365992
ELF5	Rabbit	1:100	ThermoFisher, 720380
TMPRSS2	Mouse	1:100	Sigma, HPA035787-100UL
ACE2	Rabbit	1:100	Abcam, ab15348
AlexaFluor 488 Goat anti-Rabbit IgG (H+L)	Goat	1:500	Life Technologies, A11034
AlexaFluor 568 Goat anti-Mouse IgG (H+L)	Goat	1:500	Life Technologies, A11004

**Supplementary Table 3** List of antibodies used for staining experiments

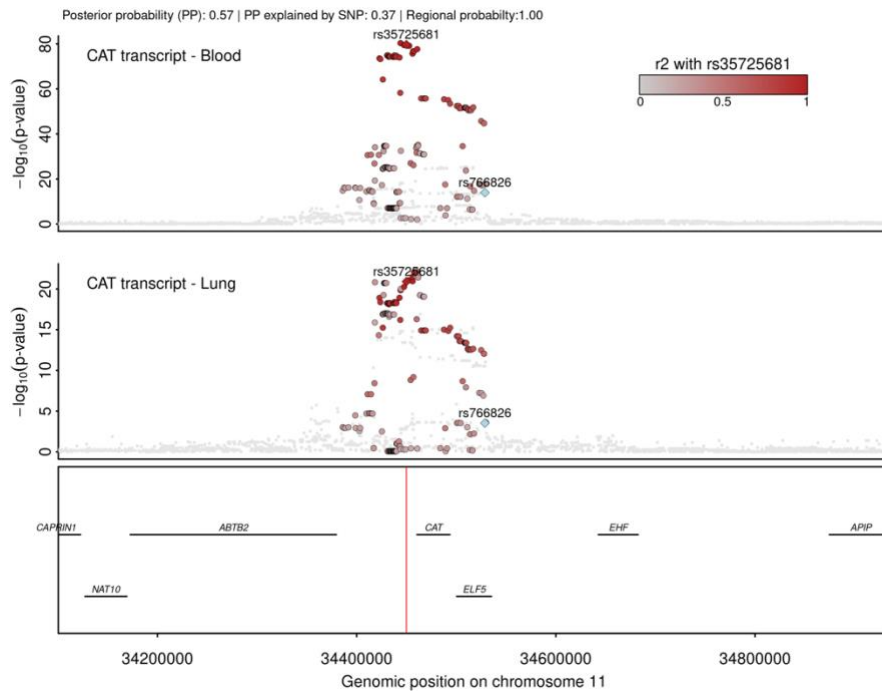
**FIGURES**



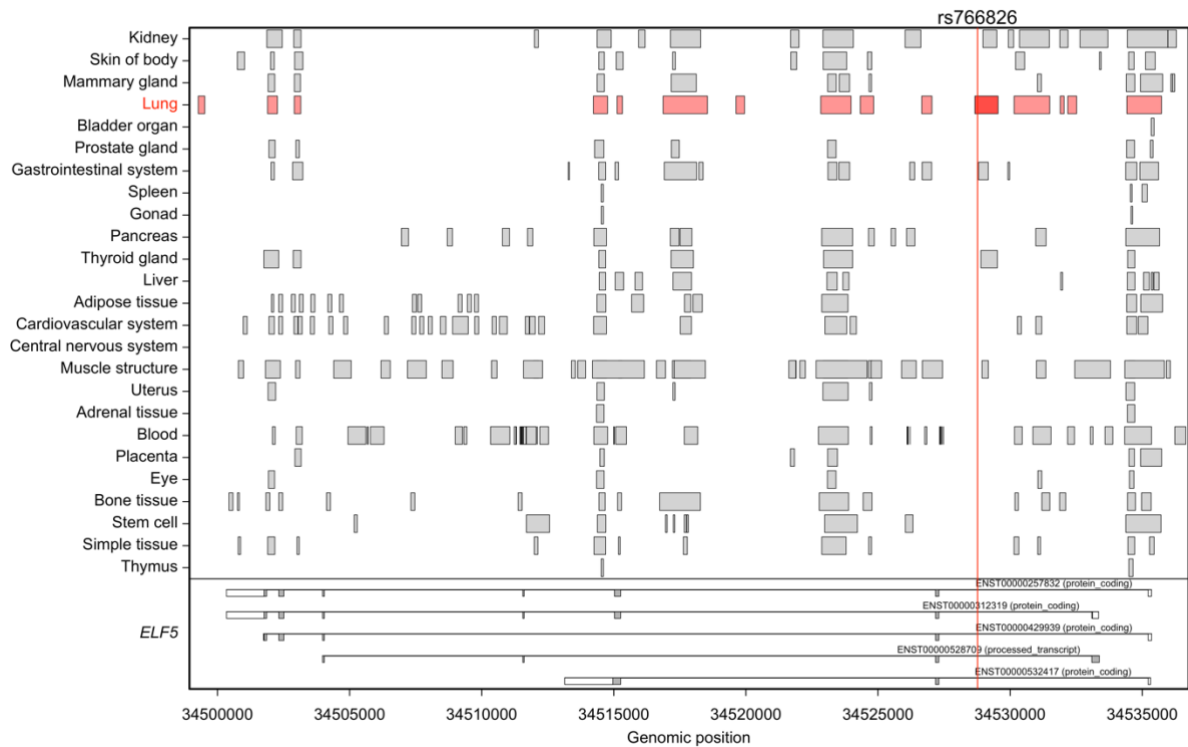
**Supplementary Figure 1 Stacked regional association plots at *CSF3*.** Each panel contains regional association statistics from linear regression analysis (p-values) for the trait listed in the upper left corner along genomic coordinates. Each dot represents a single nucleotide polymorphisms and colours indicate linkage disequilibrium (LD;  $r^2$ ) with the most likely causative variant (rs4795412) at this locus (darker colours stronger LD). LD was calculated based on 8,350 unrelated white-British participants of the Fenland cohort.



**Supplementary Figure 2** Summary of cross-tissue colocalisation for ELF5. The left panel shows effect estimates (rectangles) and 95%-CIs (lines) from linear regression models for rs766826 on *ELF5* expression in all tissues with detectable levels in the GTEx v8 resource. Significant effects ( $p < 0.001$ ) are highlighted in black. The left-hand side shows posterior probabilities for testing for a shared genetic signal between ELF5 abundance in plasma and *ELF5* expression in each tissue using statistical colocalisation. Sample sizes from GTEx v8 were as follows: Lung (n=515), Spleen (n=227), Testis (n=322), Stomach (n=324), Breast\_Mammary\_Tissue (n=396), Skin\_Not\_Sun\_Exposed\_Suprapubic (n=517), Vagina (n=141), Skin\_Sun\_Exposed\_Lower\_leg (n=605), Pituitary (n=237), Minor\_Salivary\_Gland (n=144), Esophagus\_Mucosa (n=497), Pancreas (n=305), Prostate (n=221), Kidney\_Cortex (n=73)

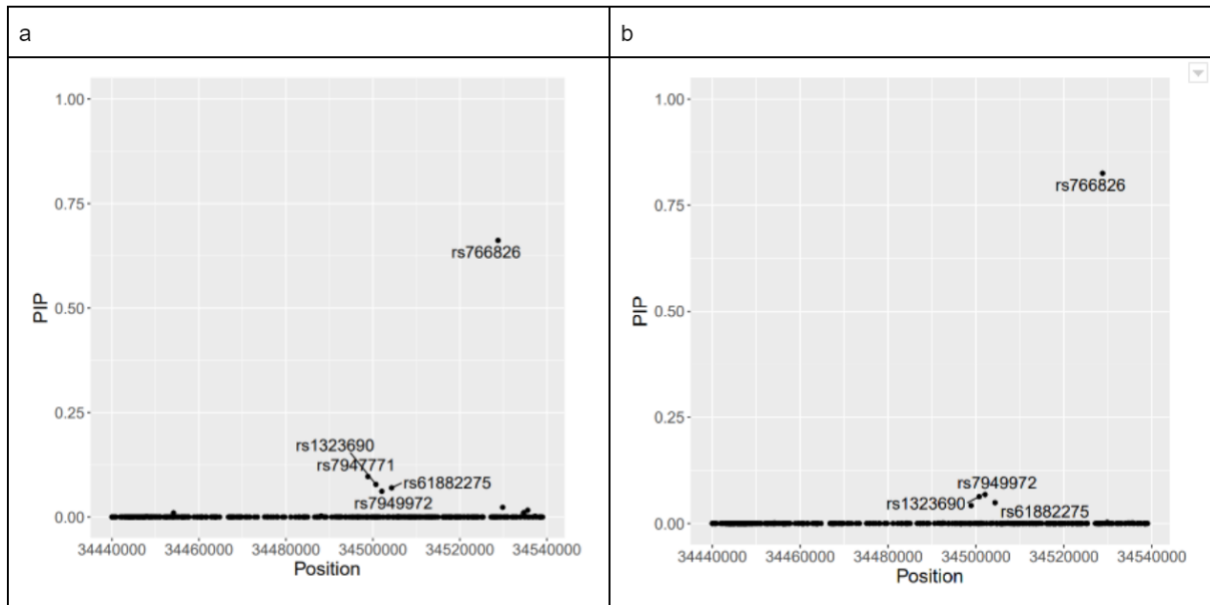


**Supplementary Figure 3 Stacked regional association plots at *CAT*.** Each panel contains regional association statistics from linear regression analysis (p-values) for the trait listed in the upper left corner along genomic coordinates. Each dot represents a single nucleotide polymorphisms and colours indicate linkage disequilibrium (LD;  $r^2$ ) with the most likely causative variant (rs35725681) at this locus (darker colours stronger LD). Summary statistics have been obtained from the GTEx v8 consortium<sup>1</sup>. The most likely causal variant for COVID-19-related outcomes, rs766826, is highlighted in blue. LD was calculated based on 8,350 unrelated white-British participants of the Fenland cohort.

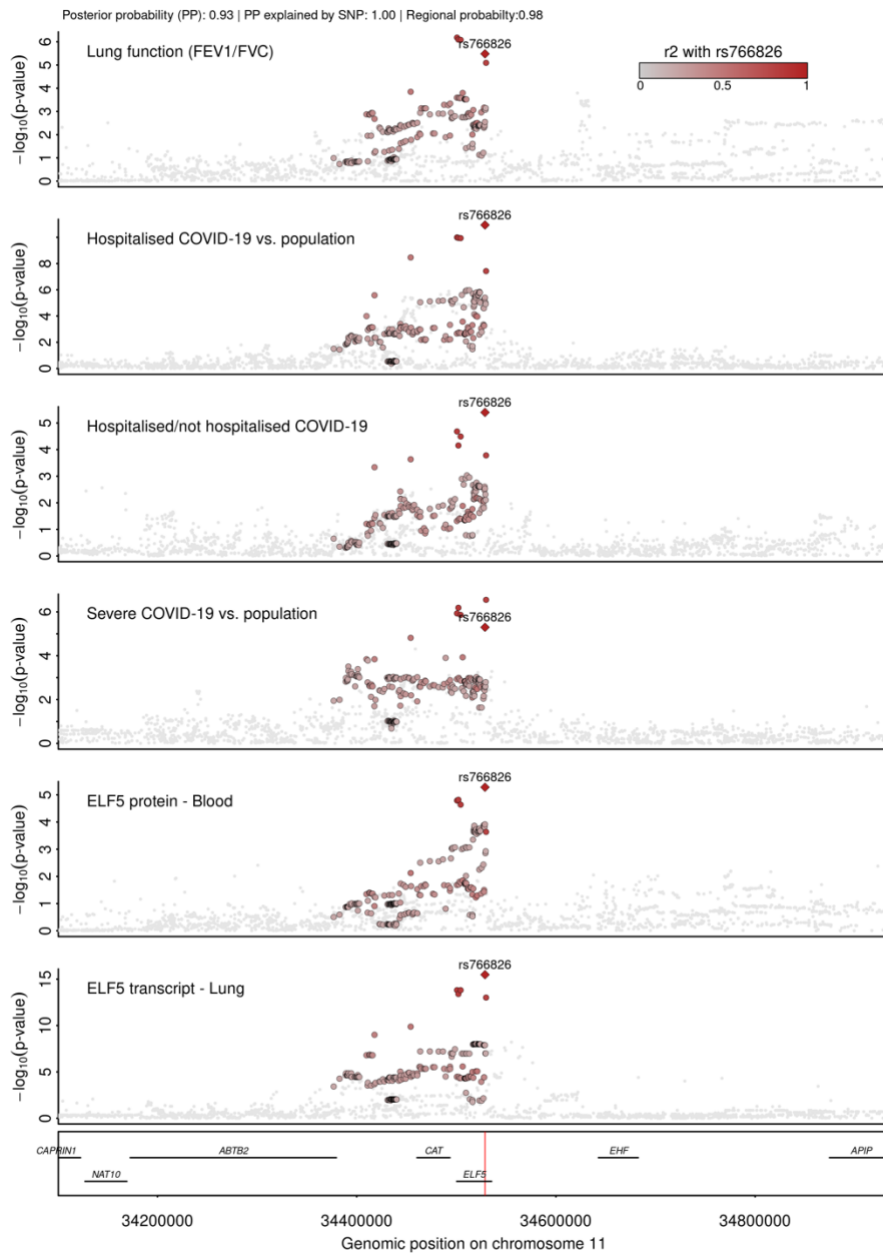


**Supplementary Figure 4 Open chromatin regions at *ELF5* across various tissues.** Each colour bar indicates open chromatin regions identified using ATAC-seq experiments and tissues are ordered by *ELF5* expression according to GTEx v8. The relevant lung-specific region is highlighted in red. Data was obtained from <https://t2d.hugeamp.org/variant.html?variant=rs766826> and open chromatin regions in lung are based on experiments in alveolar type 2 cells (<https://cmdga.org/annotations/DSR063NOE/>). Position of all available *ELF5* transcripts from ENSEMBL are depicted underneath. The position of rs766826 is highlighted by a red bar.

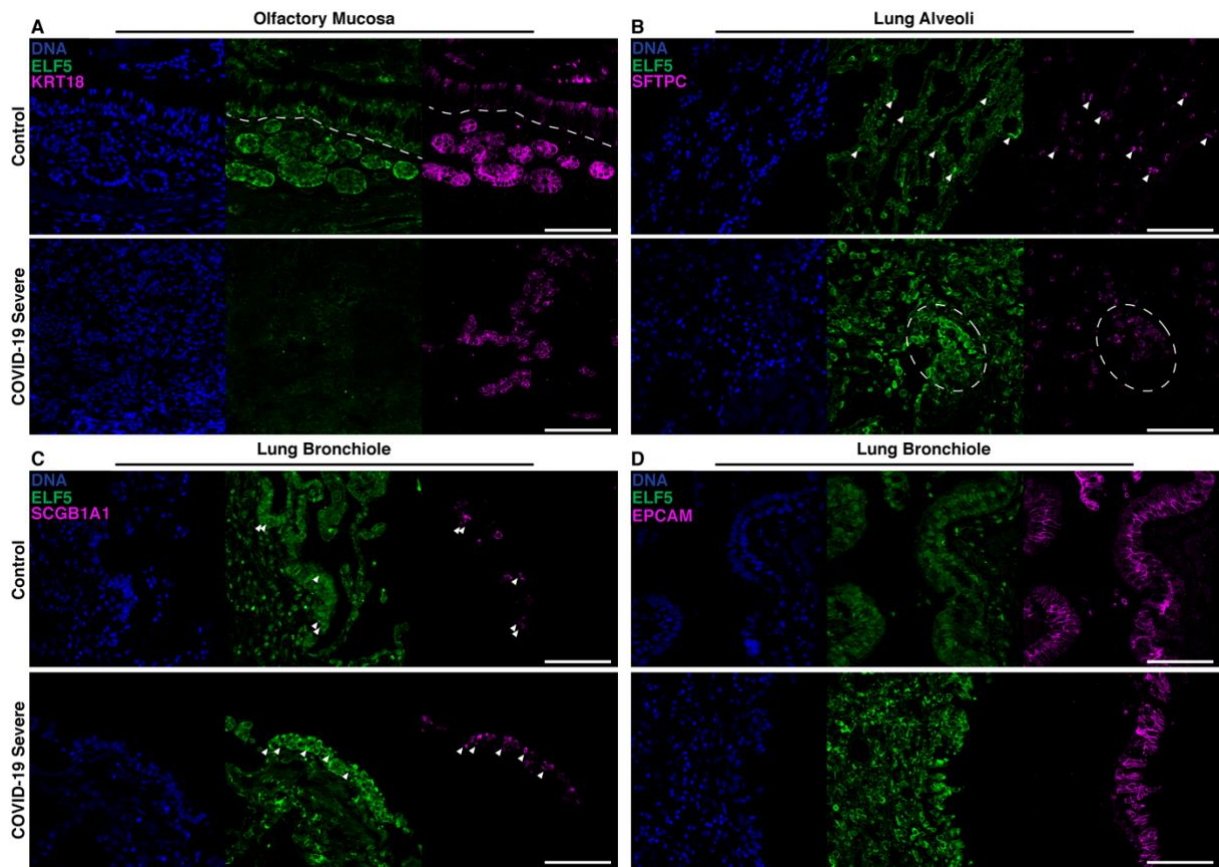




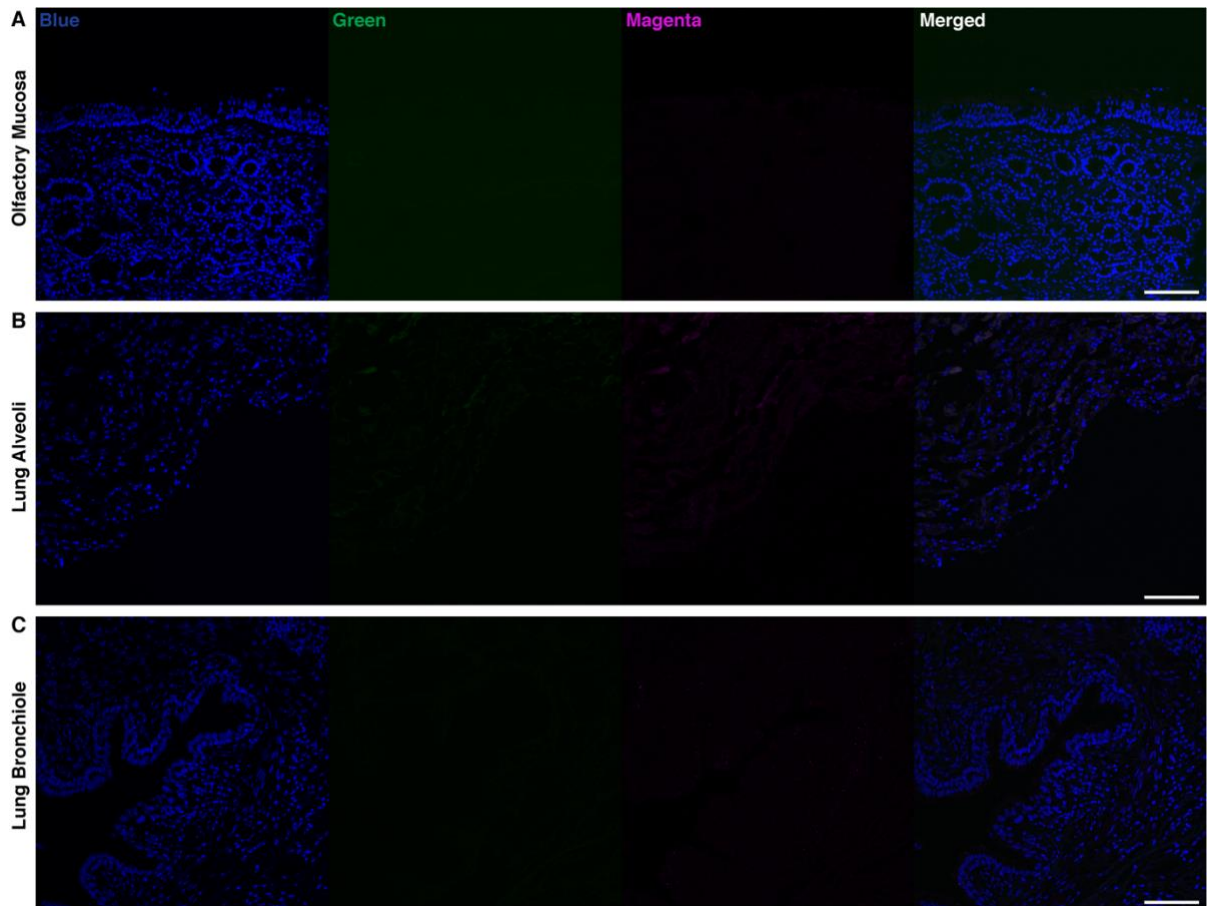
**Supplemental Figure 5 Results of multi-ethnic fine-mapping at the *ELF5* locus.** Posterior inclusion probabilities from fine-mapping based on European (a) and African (b) ancestry results are shown for each biallelic variants at the *ELF5* locus (chr11:34440000-34540000). Variants included in the 95%-credible set are annotated.



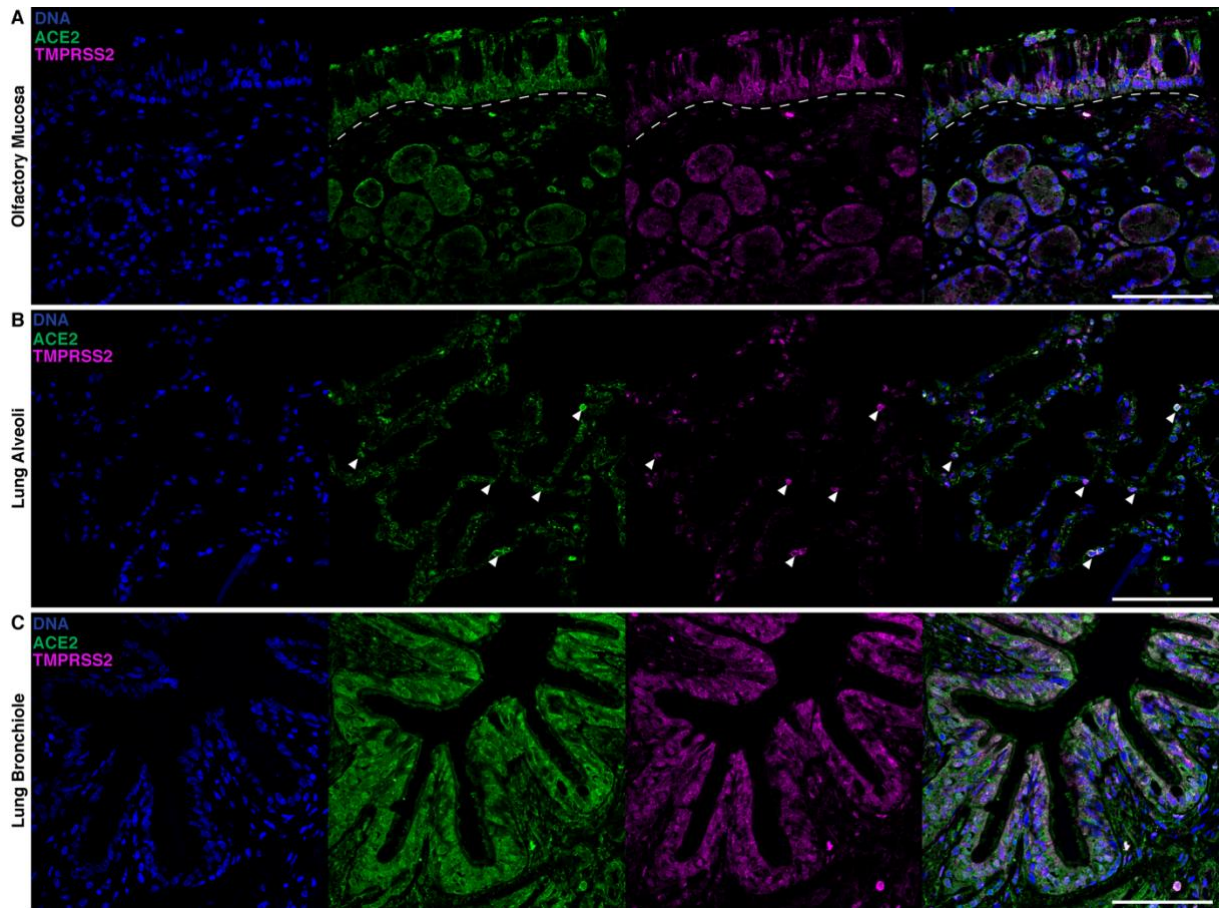
**Supplementary Figure 6 Stacked regional association plots at *ELF5*.** Each panel contains regional association statistics (p-values) for the trait listed in the upper left corner along genomic coordinates. Each dot represents a single nucleotide polymorphisms and colours indicate linkage disequilibrium (LD;  $r^2$ ) with the most likely causative variant (rs766826) at this locus (darker colours stronger LD). This figure is similar to Figure 2 in the main text, but now also including summary statistics for the FEV1/FCV ratio as a measure of lung function taken from Shrine *et al.*<sup>2</sup>. LD was calculated based on 8,350 unrelated white-British participants of the Fenland cohort.



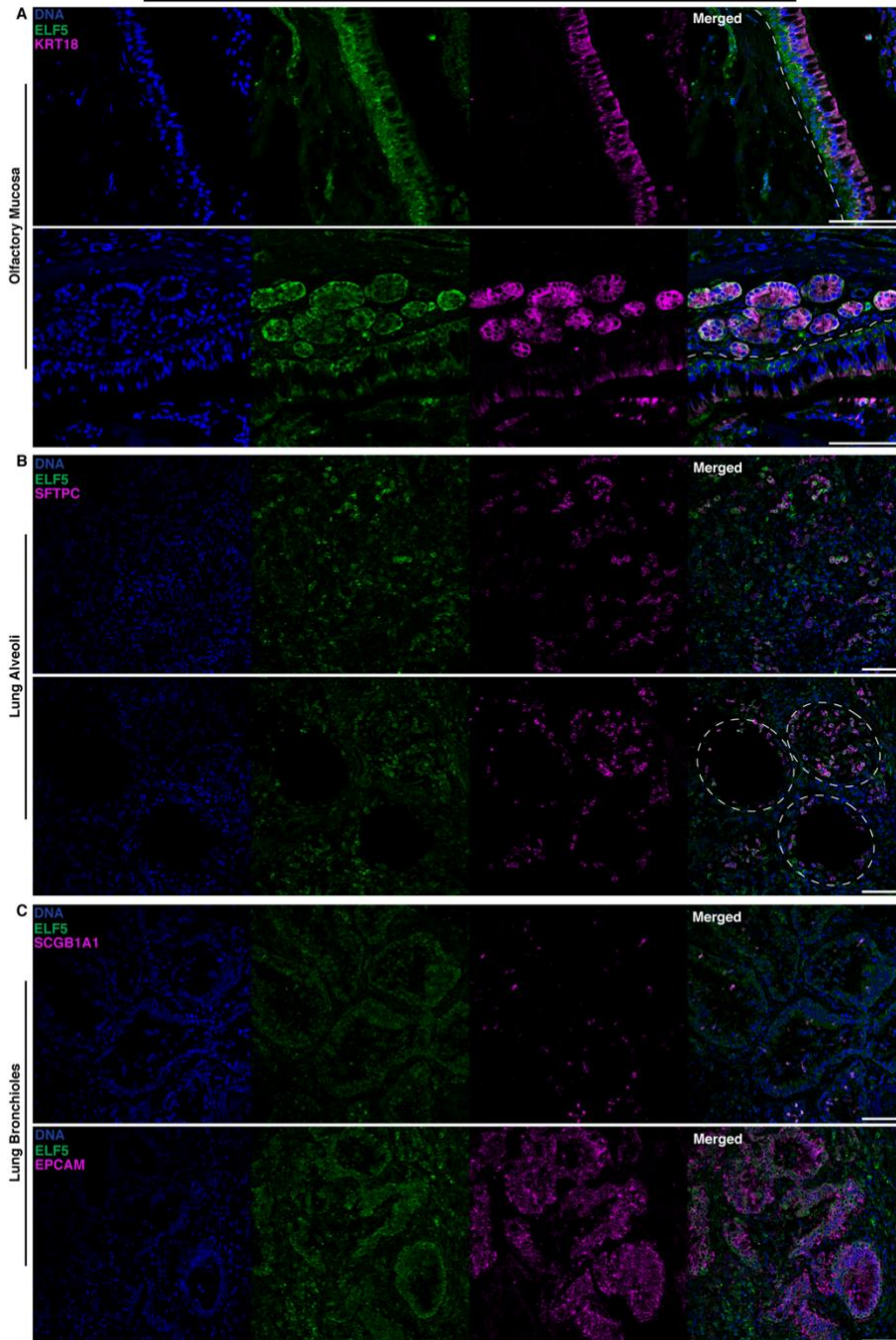
**Supplementary Figure 7 ELF5 expression by epithelial cells of the olfactory mucosa and lung.** Immunofluorescent staining of ELF5 in separate channels in control and COVID-19 patients in the **A** olfactory mucosa, **B** lung alveoli, and **C-D** lung bronchiole. **A** Dashed lines separate the olfactory epithelium and the lamina propria. **B** Arrowheads highlight AT2 cells expressing ELF5; dashed outline highlights clusters of AT2 cells expressing ELF5. **C** left: Arrowheads highlight secretory cells expressing ELF5; right: arrowheads highlight airway epithelial cells expressing ELF5. Marker genes for sustentacular and Bowman gland cells (**A**, KRT18), alveolar type II cells (**B**, SFTPC), secretory cells (**C**, SCGB1A1), and epithelial cells (**D**, EPCAM) are shown in purple. Validation staining for each tissue: control (n = 2); COVID-19 (n = 2). Scale bar = 100 $\mu$ m.



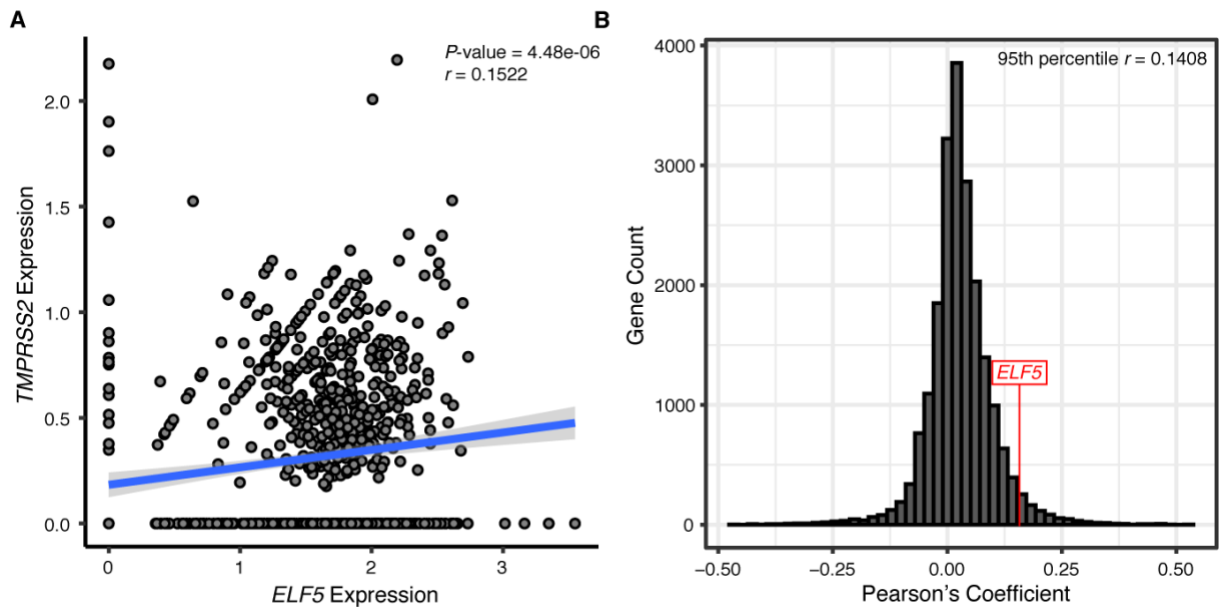
**Supplementary Figure 8. No primary antibody controls of the olfactory mucosa and lung.** Representative images of negative controls for the **A** olfactory mucosa, **B** lung alveoli, and **C** lung bronchiole under high laser power. Validation staining for each tissue: control (n = 2). Scale bar = 100 $\mu$ m.



**Supplementary Figure 9. ACE2 and TMPRSS2 are expressed by different epithelial cells of the olfactory mucosa and the lung. A** Sustentacular cells, horizontal basal cells, and Bowman gland cells of the olfactory mucosa co-express ACE2 and TMPRSS2. **B** Arrows highlight punctuated expression of TMPRSS2 reflecting the distribution of AT2 cells together with ACE2. **C** Airway epithelial cells of the bronchioles expressing ACE2 and TMPRSS2. Validation staining for each tissue: control (n = 2). Scale bar = 100 $\mu$ m.



**Supplementary Figure 10. ELF5 expression by epithelial cells of the olfactory mucosa and lung in COVID-19 cases with longer disease duration.** Immunofluorescent staining of ELF5 in separate channels of COVID-19 patients that died after hospitalization after 14 days. ELF5 expression in the **A** olfactory mucosa, **B** lung alveoli, and **C** lung bronchiole. **A** Dashed lines separate the olfactory epithelium and the lamina propria. **B** dashed outline highlights clusters of AT2 cells expressing ELF5. Marker genes for sustentacular and Bowman gland cells (**A**, KRT18), alveolar type II cells (**B**, SFTPC), secretory cells (**C**, SCGB1A1), and epithelial cells (**C**, EPCAM) are shown in purple. Validation staining for each tissue: control (n = 2); COVID-19 (n = 2). Scale bar = 100 $\mu$ m.

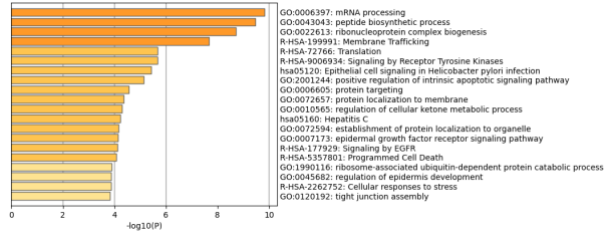


**Supplementary Figure 11. Co-expression of ELF5 and TMPRSS2.** A Scatterplot opposing normalised expression levels of ELF5 and TMPRSS2 in sustentacular cells of the olfactory mucosa. The blue line indicates a linear regression fit (error band indicating a 95% confidence level interval) and correlation coefficient and p-value are given in the legend. B Distribution of correlation coefficients of pairwise gene expression across all genes detected in sustentacular cells. The red line indicates where the ELF5 – TMPRSS2 correlations is placed.

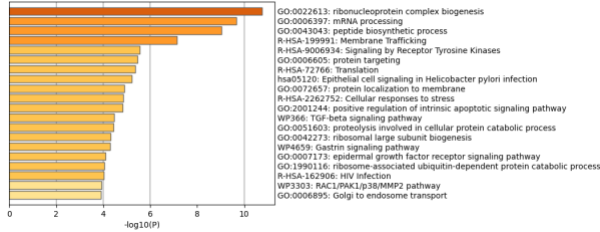
### Olfactory mucosa – Secretory cells



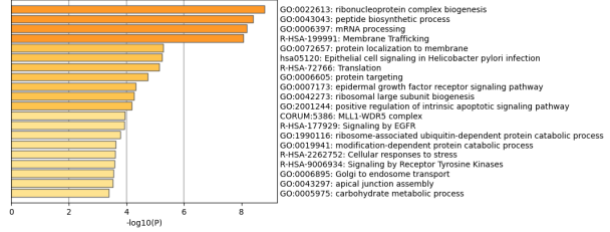
### Olfactory mucosa – Sustentacular cells



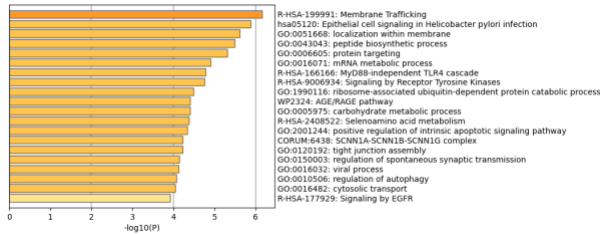
### Olfactory mucosa – Bowman cells



### Nasopharynx – Secretory cells

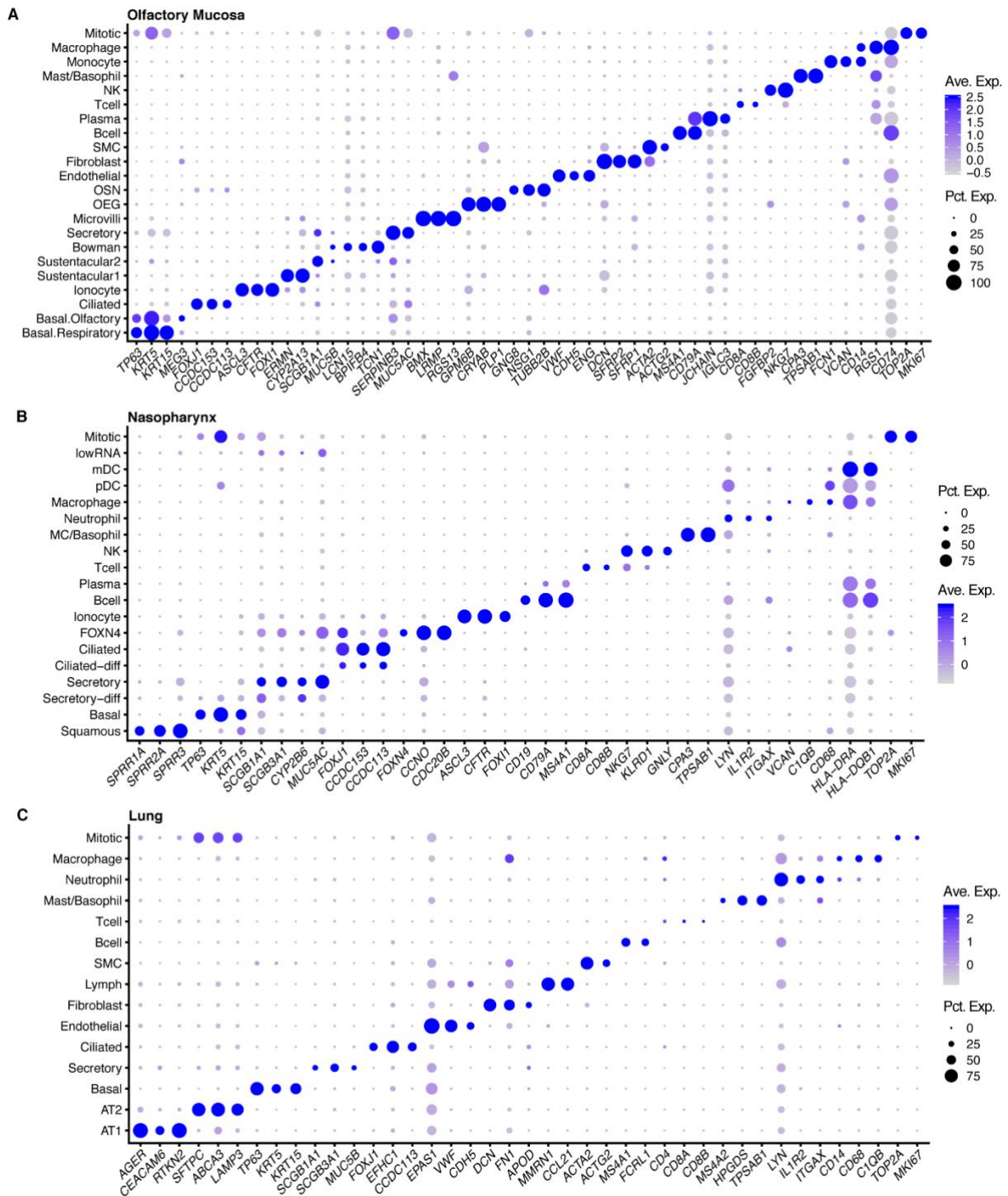


### Lung – Secretory cells



**Supplementary Figure 12.** Results from cell-type specific pathway enrichment analysis for predicted ELF5 targets.





**Supplemental Figure 13.** Cell-specific expression of marker genes used for single cell annotation across the three tissue data sets used: **A** olfactory mucosa, **B** nasopharynx, and **C** lung. Higher expression levels are indicated by darker shades and the size of the circle reflects the percentage of cells expressing the corresponding marker gene.