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168 772 4159

0.33 0.0269

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Supplementary Figure 1. Multimodal single cell data processing and quality control metrics. a) Overview flowchart of our single sample and merged sample processing pipeline for 10x Multiome data. b) Density plots representing the spread of QC metrics in all non-empty droplets, after AMULET doublet removal. The dotted red lines mark the metric cutoffs chosen to remove low quality data barcodes. For RNA unique genes, RNA % mito reads, ATAC fragments and ATAC mito reads these were upper cutoffs; for ATAC TSSe this was a minimum cutoff. c) Violin plots of per-donor distribution of QC metrics after final QC filters were applied. d) Donor level summary of doublets removed, number of barcodes included in the final map, proportion of beta cells and SoupX estimated contamination fraction.



Supplementary Figure 2. Single modality clustering and characterizations of cell type assignments. a-b) Single modality UMAPs of single nuclear RNA (a) and ATAC (b) based clustering of all final barcodes. c) Range of per-donor 'pseudo'-bulk beta cell TPM values for an extended list of canonical beta cell markers. d) SCT-normalized expression of cell type marker genes projected onto the combined modality UMAP. e) Per-cell type distribution of QC metrics after final QC filters were applied. f) Percentage of barcodes from each donor for all cell types.



Supplementary Figure 3. Evaluation of prediction methods for cRE-gene target links. a) Overview of Single-cell MultimOdal Regulatory Scoring Method (SMORES), for each cREs within a 2Mb window centered around the gene of interest the correlation between binarized cRE accessibility and the gene is calculated and then compared to the correlation generated by 100 permuted barcode sets to generate an empirical p-value. b) Summary of the number of cRE-gene links predicted by each method, or a combination of methods, for each cell type with more than 1,000 barcodes. c-d) Distribution of beta cell cRE-gene links predicted by each method based on number of links per gene (c) and the distance between the cRE and gene TSS (d). e) Acinar cell cRE-gene links between CXCL8 and all cREs predicted to regulate it, separated by prediction method. Right inlay shows the range of per-donor 'pseudo'-bulk acinar cell TPM values for CXCL8. f) Enrichment of eQTLs with the same target gene prediction in cREs of sets of links separated by method and distance between cRE and gene TSS. g-h) Enrichment of overlapping HiChIP genomic contacts in sets of links separated by method and distance (g) and separated by prediction methods (q). i) Enrichment of GWAS credible sets link sets of cRE-gene links separated by prediction methods, as calculated by FINRICH. Stars indicate enrichments passing FDR<.1. j) Overlap of all cell type cRE-gene links sets between cell types, for each cell type we are comparing all links generated by any method. The upset plot shows the 40 different cell type overlap combinations with the most links.







Supplementary Figure 4. Comparisons between cell type proportions and donor covariates. a) Distribution of the proportion of each cell type across donors. Proportion values were scaled by taking the square root of the raw proportion. b) Distribution of biological and technical covariates across all Alberta donors, outlier donors that were not included in proportion associations are indicated with a red arrow. c) Heatmap of the correlation between all continuous covariates. d) Summary of all cell type proportion versus biological and technical covariates associations. For associations with continuous covariates, the coefficient of effect from the linear model is plotted, and for associations with discrete covariates the F value from the ANOVA test is plotted. Significant associates (FDR<.05) are marked with *. e-f) The proportion of beta (e) and acinar (f) cells compared to islet isolation purity. Donor points are colored based on sex: female (dark blue), male (light blue) and a basic linear equation was fit to the relationship, with the equation displayed on top of the graph. g) Distribution of the proportion of ductal cells amongst samples treated with two different collagenase types.

a

b

PCA using RNA TPM values



Supplementary Figure 5. Principal component analysis of donor gene expression and chromatin accessibility. a) Donors plotted based on the first and second principal components after performing PCA on per-donor beta, alpha and acinar cell gene expression TPM values. The plots in each column are colored by a different phenotype. b) Donors plotted based on the first and second principal components after performing PCA on per-donor beta, alpha and acinar cell chromatin accessibility CPM values. The plots in each column are colored by a different phenotype.



200

Cell type

pathways

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Cell type pathways

b

Distribution of traits across datasets

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Cell type

pathways

34 ND Donors

Cell type

pathways

Supplementary Figure 6. Summary of phenotypes in the HPAP dataset and gene expression associations. a) Distribution of cell type proportions and phenotype information across all 34 non-diabetic HPAP donors, where each column represents a donor. The dots indicate donors with missing measurements, where 17 of the donors had both RNA and ATAC measurements. b) Distribution of phenotypes in donors compared between the two datasets, Alberta (light colors) and HPAP (dark colors). c-d) 'Pseudo'-bulk per-donor TPM values for PHLDA3 (c) and EGLN2 (d) for donors from the HPAP dataset, plotted against age (c) and BMI (d). e) Summary of the overlap in all pathways associated with a trait or a cell type. The numbers of pathways refer to the total number of unique pathways associated with a trait across cell types, or a cell type across traits. Points are labeled based on whether the comparison is of all pathways per a trait (purple), or per a cell type (pink). f-i) Upset plots illustrating the overlap of different pathways associated between cell types and age (f), BMI (g), HbA1c (h) and sex (i).



Enrichment of all linked genes in RNA results



Linked genes pathway



Supplementary Figure 7. Changes in chromatin accessibility associated with donor phenotypes. a-b) Summary of the number of significantly differentially accessible (a; FDR <.1) and nominally differentially accessible (b; p<.01) cREs in associations between cell types and traits. Groups of cREs were divided based on the direction of differential accessibility and then the total number of differential cREs per association was scaled with log10 and signed based on the direction of change. c) Enrichment of all target genes of cREs nominally associated with a phenotype for a cell type in differentially expressed genes associated with the corresponding phenotype. Enrichments were performed by using fGSEA with a database of pathways comprised of all genes linked to a phenotype-associated cRE, split by direction of association. The color of each block is based on the product of the -log10 p-value and the normalized enrichment score (NES) from fGSEA. Nominal (p<.05, °) and FDR significant (FDR<.1,*) enrichments are marked. d-f) HOMER motif enrichment results for cREs increasing (orange) or decreasing (purple) with HbA1c in beta (d), alpha (e) or acinar (f) cells. The solid lines denote the foldchange value associated with the top 20% of motifs tested. Nominal (p<.05, °) and FDR significant (FDR<.1,*) enrichments are marked.



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Summary of caQTL results

Cell type	caQTL FDR 10%	caQTL FDR 5%	caQTL FDR 1%	Tested features
Bulk	16034	12217	7455	252057
Beta	7789	5932	3657	106506
Alpha	5629	4218	2546	107935
Delta	1262	877	478	79636
Gamma	758	524	274	60138
Acinar	3050	2144	1011	96373
Ductal	419	267	106	49135
Endothelial	0	0	0	1399
Stellate	2	2	2	11915
Immune	9	4	4	8173

d



Supplementary Figure 8. Donor ancestries and summary of caQTL results. a-b) Genotype PCA plots for PCs 1 and 2 (a) and PCs 3 and 4 (b). Reference genotypes from the 1000 Genomes project¹⁰² are included and colored according to ancestry group. All donors from our study are colored grey and all non-European donors are label with donor ID. c) Summary of caQTLs passing different FDR thresholds, and how many features were initially tested per cell type. d) Comparison between the number of cells in the cell type and the number of significant caQTL SNPs (FDR<.05) found in the cell type.



Supplementary Figure 9. caQTL quality control metrics and comparison of cell type caQTLs to bulk. a) Per cell type qq-plots for all caQTL p-values compared to a theoretical uniform distribution. The inflation factor, lambda-GC, and the median p-value for each cell type are listed above each plot. b) Density plots of the distribution of reference allele bias in the caQTLs for all cell types. c) Comparison of caQTL effect size (x-axis) and 'pseudo'-bulk islet caQTL effect sizes (y-axis). All SNPs that are significant cell type caQTLs are included and are colored based on whether they pass FDR significance in the 'pseudo'-bulk. The percentage of variants with concordant directional effects is listed at the top of each plot.



Supplementary Figure 10. Overlap of GWAS credible sets and cREs associated with phenotypes and genotypes. a) Summary of the number of cREs associated with traits that overlap the T1D, T2D, and glycemic trait credible sets. b-f) Enrichment of SNPs in the T1D (b), HbA1c (c), fasting glucose (d), fasting insulin (e), and 2-h glucose after an oral glucose challenge (f) credible sets that overlap cREs associated with age, BMI, HbA1c and sex, in the six largest cell types. Nominally significant enrichments (pval<.05) are indicated with °. g) Summary of the number of cREs with one or more significant caQTLs that overlap GWAS credible sets. h) Enrichment of SNPs in the glycemic trait, T1D and T2D credible set that overlap cREs that have a cell type-specific, lineage-specific, or shared significant caQTL in each cell type. FDR significant enrichments (FDR<.1) are indicated with * and nominally significant enrichments (pval<.05) are indicated with °.



Overlap of all fasting glucose colocalized cREs by cell type



chr3:100492002-100493009 - ZBTB20.rs1459513 chr7:76225862-76226537 - AUTS2.rs2533457 chr11:8242482-8242730 - TRIM66.rs10769936 chr6:43832998-43834158 - VEGFA.rs6458354 chr10:63200501-63202010 - JMJD1C.rs41274074 chr7:50687959-50688854 - GRB10.rs13236710 chr5:77138823-77139516 - ZBED3.rs7732130 chr7:50718275-50719371 - GRB10.rs13236710





Beta population Ductal propagation

chr5:157045749-157046695 - NSD1.rs244708 chr10:12265261-12266330 - CDC123-CAMK1D.rs11257655 chr17:17669013-17670100 - RAI1.rs1108646







f

Colocalization with caQTLs for chr3:168517203-168518176

Overlap of all HbA1c colocalized cREs by cell type



Supplementary Figure 11. Statistical colocalization between caQTLs and GWAS credible sets. a) Summary of all statistical colocalization results between beta cell caQTLs and all credible sets. For each beta cell cRE, the colocalization prediction with the highest PIP was assigned as the prediction, and what the colored bars represent. Right: zoomed in plot for just colocalizations of different causal variants, only the caQTL has a causal variant, or shared causal variants. b) Summary of the number of statistically significant (PIP>0.8) loci with evidence for different causal variants between cell type caQTLs and summary statistics for glycemic traits, T1D, and T2D. c-d) The PIP for each fasting glucose (c) and HbA1c (d) colocalizations are colored in green. Row names indicate the nearest credible set to the cRE that overlaps GWAS SNPs. e-f) Examples of loci where one or two cell-type caQTLs (e:chr3-123,351,479-123,353,273; f:chr3:168,517,203-168,518,176) colocalized with T2D risk. The lead SNP for each cell type caQTL is indicated by the colored line.

Supplementary Tables and Data

Supplementary Table 1. Characteristics of donors profiled in this study Supplementary Table 2. Expression level of genes in pancreatic cell types Supplementary Table 3. Cis-regulatory elements in pancreatic cell types Supplementary Table 4. Genes with cell type-specific specific expression levels Supplementary Table 5. Cis-regulatory elements with cell type-specific activity Supplementary Table 6. Sequence motifs enriched in cell type-specific cREs Supplementary Table 7. Significant correlations of sample variables with principal components Supplementary Table 8. Donors from HPAP consortium used in study Supplementary Table 9. Associations between cell type proportions and donor covariates Supplementary Table 10. Genes associated with phenotypes in pancreatic cell types Supplementary Table 11. Gene set enrichment of phenotype-associated genes Supplementary Table 12. Cis-regulatory elements associated with phenotypes in pancreatic cell types Supplementary Table 13. Sequence motif accessibility associated with phenotypes in pancreatic cell types Supplementary Table 14. Sequence motifs enriched in cREs associated with phenotypes Supplementary Table 15. Sequence motifs enriched in caQTLs for pancreatic cell types Supplementary Table 16. Enrichment of GWAS signals in sets of phenotype-associated cREs Supplementary Table 17. Enrichment of GWAS signals in sets of genotype-associated cREs Supplementary Table 18. Diabetes and glycemic trait loci with pancreatic cell type caQTLs Supplementary Table 19. Diabetes and glycemic trait loci colocalized with pancreatic cell type caQTLs

Supplementary Data 1. Links between cis-regulatory elements and target genes Supplementary Data 2. Summary statistics of chromatin QTLs in pancreatic cell types Supplementary Data 3. Re-estimated chromatin QTL effects in pancreatic cell types