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Single-nucleus ATAC-seq elucidates major modules of gene regulation in the development of non-alcoholic fatty liver disease

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Methods. ATAC-seq

ATAC-seq

- Detect open chromatin
- If there is nearby
 - Gene → the gene is expressed
 - Transcription factor binding motif → the transcription factor is binding (indirect evidence)
 - Measure both genome-wide

	ChIP-seq	Single-cell ATAC-seq
Transcription factor	1	All
Cell	Bulk aggregate	Distinguish each



Methods. High-fat diet model for non-alcoholic fatty liver disease

- Male Spontaneously Hypertensive Rats (SHR/Izm)
- High-fat atherogenic diet (HFD)
- ATAC-seq of livers
 - Single-nucleus ATAC-seq (10x Genomics)
 - Bulk ATAC-seq



Observed cell types

- By similarity of chromatin opening, nuclei were grouped into 16 clusters
- Cell type assigned by marker gene expression
 - Hepatocytes
 - 7 clusters
 - Endothelial cells
 - 3 clusters
 - Stellate cells
 - 2 clusters
 - White blood cells
 - 4 clusters



3000 nuclei per sample



Data-driven discovery of global gene regulation

(3)

Machine learning		Gene set enrichment analysis		Co-expression, protein-protein interaction		
Global T regulatio	F 🔶 n	► Modules (TFs therein)	-	Biological processes	-	Core genes
		Module 1 (STAT family))	Steroid metabolism		Abcg1, Sqle
Hepatocyte	uto	Module 2 (AP-1 family)	') { amily)	TNFα signaling via N	F-κB	FOS/JUN, The
	yle	Module 3 (TCF/LEF far		Lobular zonation		Glul, Cyp7a1
		Module 4		Undetected		
		Module 1 (AP-1 family))	$TNF \alpha$ signaling via N	F-кB	Socs3, Tlr2
Endothelial cell	lial (Module 2 (AHCTF1, ZN	√F740)	Angiogenesis		Pxn
		Module 3		Undetected		
		Module 1 (SOX9)		Semaphorin-plexin s	ignaling	Nrp1, Nrp2
Stellate cell	cell	Module 2 Module 3		Undetected		
				Undetected		
		Module 4		Undetected		
Macrophage		Module 1 (AP-1 family)	1	$TNF \alpha$ signaling via N	F-κB	JUN, Cd44
	age	Module 2 (Maf family)		Complement system		C1qc, Fcnb
	ugo .	Module 3 (IRF family)		Angiogenesis		Pak1, Kdr
		Module 4		Undetected		

(2)

(1)

Conclusion. Using novel statistical methods, we elucidated a global picture of *in vivo* transcription factor (TF) regulation in each cell type as a set of modules, and discovered core genes.

① Extract major modules of TF regulation



A) Quantify "TF binding" and "gene expression" in single nuclei

- Bindings are totaled genomewide for each TF
- B) Learn which TF regulates which gene

C) Extract modules

- A module is a subset of TFs and genes
- TFs in a module regulate the genes in the same module

② Search biological processes characteristic to a module



- Essentially, a module is a list of TFs and genes
- From the list of genes, find characteristic biological processes
 - Search Gene Ontology and pathway databases, using Gene Set Enrichment analysis

TF modules found in this study

Cell type	TF	Biological process	Previous reports
Hepatocyte	STAT family	steroid metabolism	
Hepatocyte, endothelial, macrophage	AP-1 family	TNF α signaling via NF- κ B	AP-1 TFs respond to cytokine stimuli (Hess et al., 2004)
Hepatocyte	TCF/LEF family	zonation in liver lobule	LEF1 TF binds to β -catenin protein and activates Wnt signaling pathway (Sun and Weis, 2011)
Endothelial	AHCTF1, ZNF740	angiogenesis	ZNF740 activates angiogenesis in pulmonary artery endothelial cells of rats (Yu et al., 2018)
Stellate	SOX9	semaphorin-plexin signaling	
Macrophage	Maf family	complement system	In <i>Mafb</i> -deficient macrophages of mice, C1q production decreased (Tran et al., 2017)
Macrophage	IRF family	angiogenesis	IRF1 contributes to the commitment of pro-inflammatory M1 macrophages, which produce angiogenic stimulators (Chistiakov et al., 2018).

 The linkage between TF and biological process has been reported in 5 out of 7

 Good indication!

③ Discover core genes of a biological process



- Focus on a biological process in a cell type
 - Here, a biological process is defined as a gene set (GS)
- Core genes of a GS
 - Central in co-expression imes
 - Central in protein-protein interaction (STRING database)
- "GS activity" of each nucleus
 - The "average" of TF binding and gene expression for genes in GS
 - X Strong positive or negative correlation with GS activity
- Overlapped well with genes know for the disease