

# Single-Cell RNA-Seq Reveals that CD9 Is a Negative Marker of Glucose-Responsive Pancreatic $\beta$ -like Cells Derived from Human Pluripotent Stem Cells

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## SUMMARY

To date, it remains unclear if there are specific cell-surface markers for purifying glucose-responsive pancreatic  $\beta$ -like cells derived from human pluripotent stem cells (hPSCs). In searching for this, we generated an efficient protocol for differentiating  $\beta$ -like cells from human embryonic stem cells. We performed single-cell RNA sequencing and found that CD9 is a negative cell-surface marker of  $\beta$ -like cells, as most  $\text{INS}^+$  cells are  $\text{CD9}^-$ . We purified  $\beta$ -like cells for spontaneous formation of islet-like organoids against CD9, and found significantly more  $\text{NKX6.1}^+\text{MAFA}^+\text{C-PEPTIDE}^+$   $\beta$ -like cells in the  $\text{CD9}^-$  than in the  $\text{CD9}^+$  population.  $\text{CD9}^-$  cells also demonstrate better glucose responsiveness than  $\text{CD9}^+$  cells. In humans, we observe more  $\text{CD9}^+\text{C-PEPTIDE}^+$   $\beta$  cells in the fetal than in the adult cadaveric islets and more  $\text{Ki67}^+$  proliferating cells among  $\text{CD9}^+$  fetal  $\beta$  cells. Taken together, our experiments show that CD9 is a cell-surface marker for negative enrichment of glucose-responsive  $\beta$ -like cells differentiated from hPSCs.

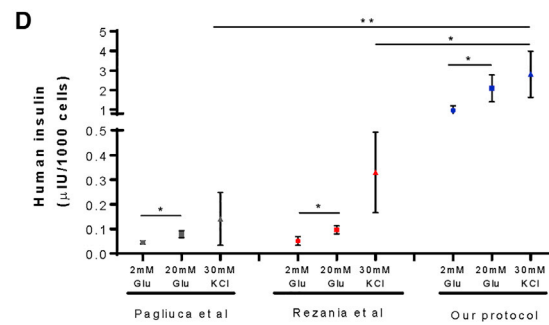
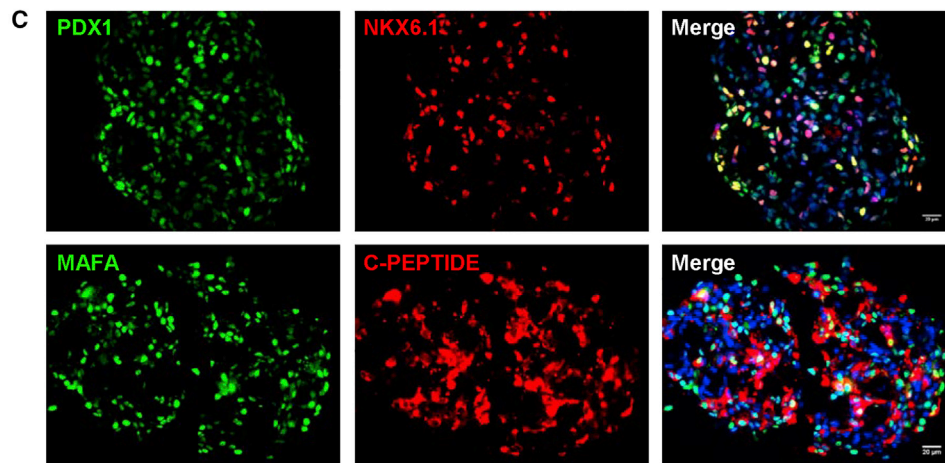
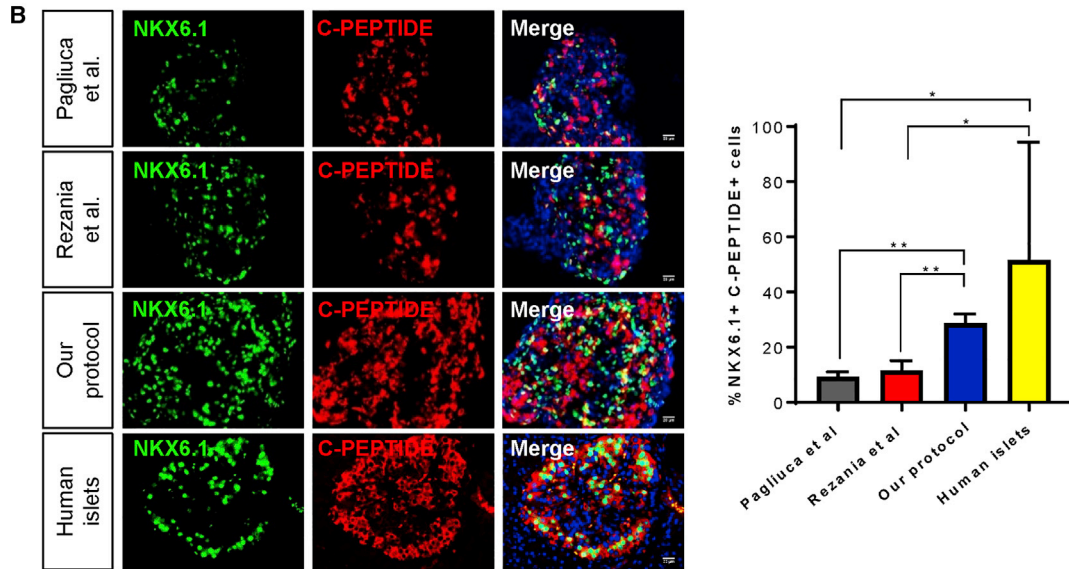
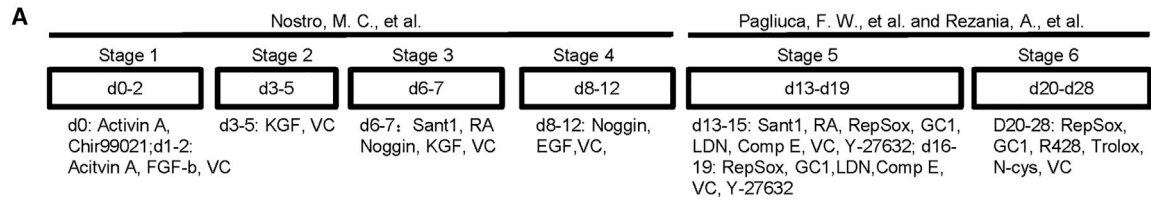
## INTRODUCTION

Insulin deficiency is detected in all type 1 (T1D) and some type 2 diabetic patients. However, conventional insulin therapy does not provide a real-time glycemic control, while transplantation of glucose-sensing insulin-secreting (GSIS) cadaveric islets requires at least two donors. To address the issue of donor shortage, much progress has been made in the past decades to generate literally an unlimited amount of pancreatic  $\beta$ -like cells from human pluripotent stem cells (hPSCs) by recapitulating signaling pathways essential in pancreatic development. For instance, the combination of epidermal growth factor and nicotinamide signaling pathways induces the generation of  $\text{NK6 homeobox 1 (NKX6.1}^+)$  pancreatic progenitor cells from hPSCs (Nostro et al., 2015). Moreover, inhibition of the bone morphogenetic protein signaling pathway at specific stages promotes the generation of insulin-expressing  $\beta$ -like cells (Nostro et al., 2011). Modifications of these stepwise pathways facilitate the generation of neurogenin 3 ( $\text{NGN3}^+$ ) and/or neurogenic differentiation factor 1 ( $\text{NEUROD1}^+$ ) endocrine progenitor cells (Rezania et al., 2014), as well as monohormonal endocrine cells, including insulin-expressing  $\beta$ -like cells that are glucose responsive

*in vitro* (Pagliuca et al., 2014; Rezania et al., 2014). More recently, Rho-associated coiled-coil containing protein kinase 2 (ROCKII) inhibition has also been found to promote the maturation of hPSC-derived  $\beta$ -like cells (Ghazizadeh et al., 2017).

Using these protocols, hPSC-derived pancreatic progenitor (Schulz, 2015) or  $\beta$ -like (Pagliuca et al., 2014; Rezania et al., 2014; Russ et al., 2015) cells reverse diabetes after transplantation; and therefore, implantation of encapsulated human embryonic stem cell (hESC)-derived pancreatic progenitor cells into T1D patients forms the basis of a clinical trial being conducted by ViaCyte, Inc. (ClinicalTrials.gov identifier: NCT02239354). Although these advances have increased our understanding of human  $\beta$  cell development with potential clinical applications, differentiation efficiency of the reported protocols has not been validated in a large number of hPSC lines, including those that showed poor efficiency in  $\beta$  cell lineage specification. This might attenuate the therapeutic potential of patient-specific induced PSCs (iPSCs), as we and others have demonstrated that their efficiency in lineage commitment varies greatly among different hiPSC lines (Chetty et al., 2015; Sahara et al., 2014; Xu et al., 2012). Moreover, the generated  $\beta$ -like cells express fewer





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maturation markers, such as musculoaponeurotic fibrosarcoma oncogene homolog A (MAFA) and insulin, compared with human islets (Ghazizadeh et al., 2017; Johnson, 2016; Millman and Pagliuca, 2017). Nevertheless, identification of specific cell-surface markers that enables the purification of mature and functional human  $\beta$ -like cells for transplantation awaits urgent investigations.

Here, we develop an efficient differentiation protocol to generate islet-like organoids from hESCs, particularly the H9 line that has been previously shown to have poor  $\beta$  cell specification. We then searched for cell-surface markers that marked  $\beta$ -like cells by using genome-wide single-cell RNA sequencing (scRNA-seq) at various developmental stages. We demonstrate that cluster of differentiation 9 (CD9) is a cell-surface marker that negatively marks NKX6.1<sup>+</sup>MAFA<sup>+</sup>C-PEPTIDE<sup>+</sup>  $\beta$ -like cells that are glucose responsive. We also validate our findings in human islets by immunostaining on both immature fetal and mature adult cadaveric islets. Furthermore, we show that CD9 might not be essential in human  $\beta$  cell specification and function. Our results reveal that CD9 could be used as a cell-surface marker for negative enrichment of glucose-responsive human  $\beta$ -like cells.

## RESULTS

### Generation of Pancreatic Islet-like Organoids from Human Pluripotent Stem Cells with High Efficiency

We attempted to differentiate human  $\beta$ -like cells from hESCs by generating an efficient protocol (Figure 1A). We used the H9 hESC line that has been previously found less efficient in its differentiation toward the  $\beta$  cell lineage compared with other hESC lines such as H1 (Nostro et al., 2015). We first followed two protocols previously published by Pagliuca et al. (Pagliuca et al., 2014) and Reznia et al. (Reznia et al., 2014) to generate  $\beta$ -like cells. The reported differentiation efficiency of insulin-expressing  $\beta$ -like cells in HUES8 hESCs was about 33% using the protocol derived by Pagliuca et al., while that in H1 hESCs was about 50% using the one derived by Reznia et al. However, the differentiation ef-

iciency using these protocols in H9 hESCs was only about 10% in our laboratory as demonstrated by immunostaining for NKX6.1 and C-PEPTIDE (Figure 1B). We observed that the amount of NKX6.1<sup>+</sup> cells was low, but NKX6.1 is a specific marker for the emerging  $\beta$  cell lineage (Schaffer et al., 2013); and NKX6.1<sup>-</sup> cells are found to be polyhormonal and non-glucose responsive after differentiation from hPSCs (Nostro et al., 2015). We sought to increase the amount of NKX6.1<sup>+</sup>C-PEPTIDE<sup>+</sup>  $\beta$ -like cells by following the protocol by Nostro et al. (Nostro et al., 2015) that focused on increasing the number of pancreatic and duodenal homeobox 1 (PDX1<sup>+</sup>) NKX6.1<sup>+</sup> pancreatic progenitor cells during the first four stages of differentiation. So our protocol was modified from those derived by Nostro et al., Pagliuca et al., and Reznia et al. with combined factors (Table S1).

To confirm if our protocol generated more pancreatic progenitors, we traced the marker gene expression at the first four stages of differentiation by qRT-PCR (Figure S1). We observed that there was no significant difference in the expression levels of stage (S) 1 markers of the definitive endoderm, such as C-X-C motif chemokine receptor 4 (CXCR4), forkhead box protein A2 (FOXA2), and SRY-box (SOX) 17 (SOX17), using S1 cells derived from protocols of Pagliuca et al., Reznia et al., and our team (Figure S1A). In S2, there was a significantly higher expression level of the primitive gut tube marker hepatocyte nuclear factor 1 homeobox A (HNF1A) in cells derived from the protocol by Reznia et al. compared with those by Pagliuca et al. and our team (Figure S1B). In S3, there were significantly greater expression levels of the posterior foregut markers PDX1 and SOX9 in cells derived from the protocol by Pagliuca et al. compared with those by Reznia et al. and our team (Figure S1C). In S4, there was significantly more expression of the pancreatic progenitor marker NKX6.1 in cells derived from our protocol compared with those of Pagliuca et al. and Reznia et al. (Figure S1D). Our findings showed that the major difference in the first four stages of differentiation using these protocols relied on the better differentiation of NKX6.1<sup>+</sup> cells, potentially leading to more efficient  $\beta$ -like cell differentiation.

To verify this assumption, we performed immunostaining for NKX6.1 and C-PEPTIDE at S6, and found

### Figure 1. Generation of Pancreatic Islet-like Organoids from hPSCs with High Efficiency

(A) Schematic diagram outlining the modified protocol used in this study. Uncommon abbreviations: RA, retinoic acid; VC, vitamin C; Nic, nicotinamide; N-cys, N-acetyl cysteine; and Comp E, compound E.

(B) Immunostaining on frozen sections for NKX6.1 (green) and C-PEPTIDE (red) in S6 cells after differentiation using the protocols reported by Pagliuca et al. (n = 3) and Reznia et al. (n = 3), our protocol (n = 10), or adult cadaveric islets (n = 6). Scale bars: 20  $\mu$ m. The percentage of NKX6.1<sup>+</sup>C-PEPTIDE<sup>+</sup> cells among total cells of the hESC-islet organoids was also quantified. We counted ~20 islet-like clusters per group and repeated three times with a total of ~60 islet-like clusters per group. Scale bars: 20  $\mu$ m.

(C) Immunostaining on frozen sections for PDX1, NKX6.1, MAFA, and C-PEPTIDE in S6 cells after differentiation using our protocol. Scale bars: 20  $\mu$ m.

(D) Quantification of human insulin secreted by human  $\beta$ -like cells derived from the three protocols by *in vitro* GSIS.

Data were obtained from three independent experiments. (B and D) Data are presented as the mean  $\pm$  SD, \*p < 0.05, \*\*p < 0.01.



significantly increased %NKX6.1<sup>+</sup>C-PEPTIDE<sup>+</sup> cells, from 10% to 35%, compared with those generated by Pagliuca et al. and Reznia et al., respectively ( $p < 0.01$ , Figure 1B). There was no significant difference in the %NKX6.1<sup>+</sup>C-PEPTIDE<sup>+</sup> cells of hESC-derived islet-like organoids (hESC-islets) compared with human cadaveric islets (Figure 1B). Following differentiation until S6, we observed that the generated human  $\beta$ -like cells were PDX1<sup>+</sup>NKX6.1<sup>+</sup> (Figure 1C). Moreover, almost all C-PEPTIDE<sup>+</sup> cells expressed the maturation marker MAFA (Figure 1C). Our protocol also allowed the generation of glucagon (GCG)-expressing  $\alpha$ - and somatostatin (SST)-expressing  $\delta$ -like cells, albeit at lower efficiency (Figure S2). Notably, we demonstrated a similar percentage, if not significantly reduced, of polyhormonal cells compared with previous reports: C-PEPTIDE<sup>+</sup>GCG<sup>+</sup> (5.5% versus 7.7% by Pagliuca et al. and 11% by Reznia et al.) and C-PEPTIDE<sup>+</sup>SST<sup>+</sup> (3.7% versus 4.7% by Pagliuca et al.). Therefore, we generated hESC-islets that, at least in part, recapitulated human cadaveric islets containing three types of endocrine cells, with  $\beta$ -like cells being the predominant ones. We also repeated with the H1 and H7 hESCs and confirmed that this protocol was efficient in generating NKX6.1<sup>+</sup>C-PEPTIDE<sup>+</sup>  $\beta$ -like cells, with the H1 line being the most efficient hESC line compared with H7 and H9 (Figure S3).

One key functional characteristic of a pancreatic  $\beta$  cell is its ability to respond to glucose challenge in GSIS assays *in vitro* (Pagliuca et al., 2014; Veres et al., 2019). Quantification of three independent experiments demonstrated that our protocol facilitated the generation of glucose-responsive human  $\beta$ -like cells, in line with those generated by Pagliuca et al. and Reznia et al. (Figure 1D). Importantly, we also showed that the human  $\beta$ -like cells derived from our protocol released a significantly greater amount of insulin after depolarization with KCl compared with the other two reported protocols, suggesting a better differentiation efficiency with greater insulin production.

### Single-Cell Transcriptomic Profiling Reveals Heterogeneity during Human Pancreas Development

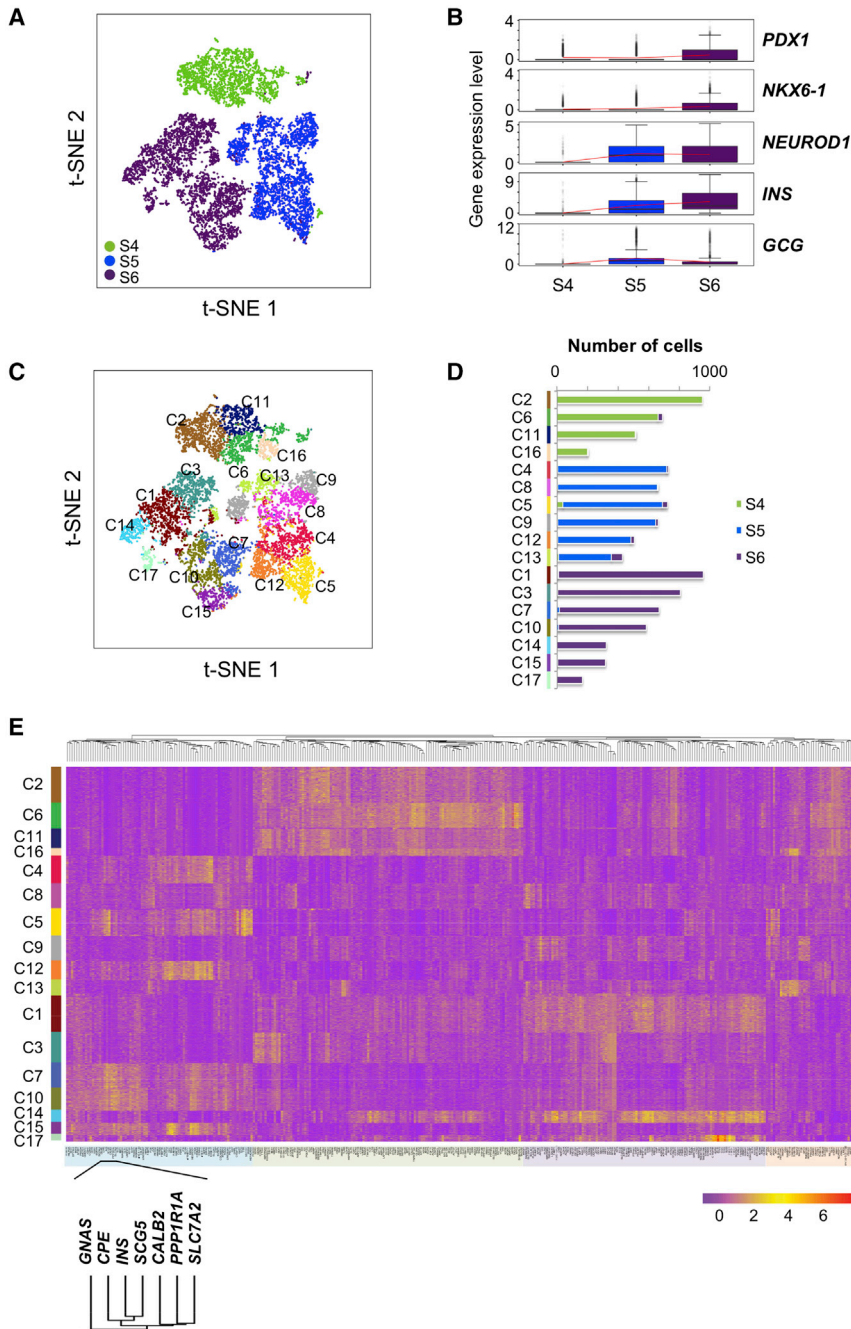
Genome-wide scRNA-seq has been used to characterize the heterogeneity of adult human pancreatic islets (Baron et al., 2016; Muraro et al., 2016; Segerstolpe et al., 2016; Xin et al., 2016). However, we cannot track individual cell-fate decision, as we are unable to obtain islet samples from the same human volunteer at multiple developmental stages. hESC derivatives could partly recapitulate human islet development *in vivo*; we, therefore, differentiated hESCs into the pancreatic lineage for large-scale, droplet-based scRNA-seq using a 10X Genomics system as recently reported by us (Leung et al., 2018; Li et al., 2019, 2020; Liang et al., 2020). In this system, individual cells were encapsulated with unique nucleotide barcodes and

molecule identifiers (UMI) for tagging RNAs inside the droplets. We established a transcriptomic map by analyzing a total of ~10,000 cells at progressive developmental stages, namely, S4, S5, and S6 cells (Figure 2A). After filtering, we had 2,388 S4, 3,525 S5, and 3,984 S6 cells for subsequent analysis (Table S2).

To identify distinct cell populations, we first performed unsupervised t-stochastic neighbor embedding (t-SNE) analysis with all 9,897 transcriptomes that revealed three major cell clusters with gene expression patterns specific for each of the three developmental stages (Figure 2A). We demonstrated an overexpression of *PDX1*, *NKX6.1*, *NEUROD1*, and insulin (*INS*) with the emergence of the  $\beta$  cell lineage in S5 and S6, respectively, and a downregulation of *GCG* from S5 to S6 upon  $\beta$  cell maturation (Figure 2B). Specifically, we observed expression of *PDX1* (Figure S4A) and *NKX6.1* (Figure S4B) by each cell cluster. *NGN3* (Figure S4C) and *NEUROD1* (Figure S4D) were expressed by the same cells within the S5 cluster; and *NEUROD1*, a direct target of *NGN3* required for  $\beta$  cell maturation (Gu et al., 2010), was expressed by some cells of the S5 and S6 clusters (Figure S4D). In addition to *INS*<sup>+</sup> cells (Figure S4E), we detected *GCG*<sup>+</sup>  $\alpha$ -like (Figure S4F), *SST*<sup>+</sup>  $\delta$ -like (Figure S4G), and pancreatic polypeptide (*PPY*<sup>+</sup>)-like (Figure S4H) cells, albeit at low frequency, consistent with the protein data (Figure 1B). Altogether, our transcriptomic analysis suggested that S4 could comprise *PDX1*<sup>+</sup>*NKX6.1*<sup>+</sup> pancreatic progenitor-like cells, S5 could contain both *NGN3*<sup>+</sup>*NEUROD1*<sup>+</sup> endocrine progenitor- and *INS*<sup>+</sup> immature  $\beta$ -like cells, and S6 could harbor *INS*<sup>+</sup> mature  $\beta$ -like cells.

After that, a graph-based clustering algorithm was used for further delineating different cell subsets of each developmental stage. We identified 17 clusters (Figure 2C) and the constitution of most clusters demonstrated a developmental stage-specific pattern (Figure 2D). To annotate these clusters, we examined gene expression for each cluster by comparing its expression level with the mean value of the remaining clusters. We revealed that 339 genes were overexpressed in at least one of the clusters (Table S3). In S4 (Figure 2C and Table S3), we observed that midkine (*MDK*), which has also been found in embryonic day 15.5 mouse pancreas (Krentz et al., 2018), was upregulated in C2, C6, and C11. Moreover, DNA-binding protein inhibitor 3 (*ID3*) was upregulated in clusters C2, C6, C11, and C16, and *ID1* was upregulated in C2 and C11. In fact, *ID1* and *ID3* regulate cell growth, suggesting that C2, C6, C11, and C16 cells might be more proliferative than clusters at later stages of lineage specification (O'Brien et al., 2012).

In S5 (Figure 2C and Table S3), *NGN3* and regulator of G-protein signaling 4 (*RGS4*) (Serafimidis et al., 2011) were upregulated; and *NEUROD1* also began to be expressed in



### Figure 2. scRNA-Seq Reveals Heterogeneity during Human Pancreas Development

(A) t-SNE analysis showing transcriptomic clustering of single cells derived from three differentiation stages. Cells were colored individually according to their stage: green, pancreatic progenitor-like cells (S4); blue, endocrine progenitor-like and *INS*<sup>+</sup> immature  $\beta$ -like cells (S5); and purple, *INS*<sup>+</sup> mature  $\beta$ -like cells (S6).

(B) Quantification of expression levels of the pancreatic lineage-specific genes. Expression levels were quantified as log<sub>2</sub>-scaled UMI.

(C) t-SNE analysis showing transcriptomic clustering of single cells by graph-based clustering analysis.

(D) Bar chart of the cells constituting the 17 clusters of (C).

(E) Heatmap analysis depicting the transcript levels of genes that were overexpressed in at least one of the clusters. The clusters are shown on the left border. Genes that co-expressed with *INS* are highlighted at the bottom.

C4, indicating that C4 could likely represent endocrine progenitor cells. Moreover,  $\beta$ -like (gastrin/*GAST* [Krentz et al., 2018], *NEUROD1*, and *INS*),  $\alpha$ -like (*GCG*), and  $\delta$ -like (*SST*) cell markers were upregulated in C5, suggesting that C5 could be immature polyhormonal endocrine cells. On the other hand,  $\beta$  cell markers such as tryptophan hydroxylase 1 (*TPH1*) (Almaca et al., 2016), stanniocalcin-1 (*STC1*) (Zaidi et al., 2012), and insulin-like growth factor-binding protein 3 (*IGFBP5*) (Gleason et al., 2010) were over-

expressed in C12 without *INS*. In addition to *TPH1*, DOPA decarboxylase (*DDC*), which is also involved in serotonin biosynthesis, was overexpressed in C12. C8, C9, and C13 were more heterogeneous. For instance, acinar cell markers c-FOS (*FOS*) and c-JUN (*JUN*) (Turner et al., 2001), as well as the developing islet marker *SOX11* (Lioubinski et al., 2003), were upregulated in C8.

In C1 and C14 of S6 cells (Figure 2C and Table S3), we detected upregulation of genes associated with fat



metabolism, such as apolipoprotein E (*APOE*) and fatty acid-binding protein 1 (*FABP1*), as well as claudin 7 (*CLDN7*), which has been previously found in acinar and ductal cells of the postnatal pancreas (Westmoreland et al., 2012). *CLDN3*, previously reported to be restricted to human endocrine cells (Borka et al., 2007), was overexpressed in C17, indicating that C17 could likely be endocrine cells, albeit with low *INS* expression. Furthermore, we detected upregulation of  $\beta$  cell markers, including *NEUROD1* in C7, C10, and C15; *INS* in C7, C10, and C15; *TPH1* in C10 and C15; and *DDC* in C10 and C15. *FOXA2*, which regulates insulin secretion (Lantz et al., 2004), was upregulated in C7, C10, and C15; and insulin-like growth factor 2 (*IGF2*), which regulates  $\beta$  cell mass (Modi et al., 2015), was overexpressed in C10. These results indicate that C7, C10, and C15 were  $\beta$ -like cells.

A heatmap of the hierarchical clustering analysis showed that most clusters displayed a distinct gene expression profile (Figure 2E). We highlighted genes co-localized with *INS* in C7, C10, and C15 of S6 cells, including carboxypeptidase E (*CPE*) and neuroendocrine protein 7B2 (encoded by *SCG5*), which have been found to be involved in the cleavage of proinsulin (Liew et al., 2014; Yoshida et al., 1995). We also found other unreported genes, such as calbindin 2 (*CALB2*), protein phosphatase 1 regulatory subunit 1A (*PPP1R1A*), and cationic amino acid transporter 2 (*SLC7A2*).

### CD9 Negatively Marks $INS^{hi}$ Human $\beta$ -like Cells

We asked if there were specific cell-surface markers facilitating the purification and enrichment of  $INS^{hi}$  mature  $\beta$  cells at S6. We focused on C7, C10, and C15, which overexpressed *INS* (Figure 3A), and performed differential expression analysis by comparing them with clusters that showed low *INS* expression (C1, C3, C14, and C17). We found a total of 448 differentially expressed genes and focused on genes that code for cell-surface molecules (CD molecules, HUGO Gene Nomenclature Committee). We further identified 12 differentially expressed cell-surface markers (Figure 3B) and demonstrated their expression at the single-cell level by cluster-based heatmap (Figure 3C). In line with a recent report, we also observed that integrin subunit  $\alpha 1$  (*ITGA1*) was a cell-surface marker co-localized with *INS* (Figure 3B) (Veres et al., 2019). However, our statistical analysis did not reveal that *ITGA1* was a differentially expressed gene for  $INS^{hi}$  cells, at least for those derived from H9 hESCs, even though *ITGA1* was clustered along with *INS* as demonstrated by heatmap analysis (Figure 3C). Despite being more specific for  $INS^+$  cells, *ITGA1* did not label all  $INS^+$  cells efficiently, especially in C7, C10, and C15 (Figures 3C and 3D). On the other hand, *CD9* was a more statistically significant marker, negatively correlating with *INS* expression (Figure 3B). *CD9* also negatively marked

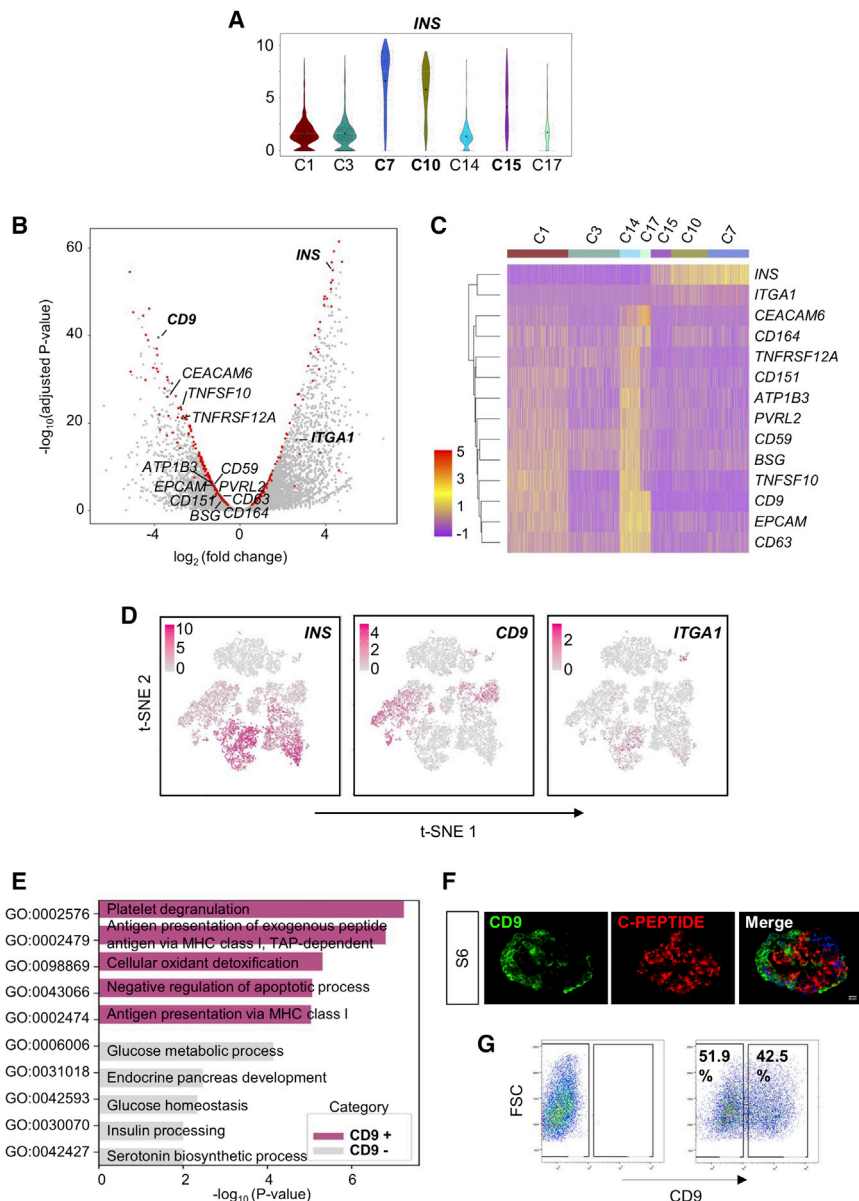
cells with high *INS* expression in C7, C10, and C15 and positively marked cells with low *INS* expression in C1, C14, and C17 cells (Figure 3C). Moreover, t-SNE analyses showed that expression of *CD9* was more restricted to  $INS^-$  or  $INS^{lo}$  cells at both S5 and S6 (Figure 3D).

We, therefore, hypothesized that *CD9* could be a better cell-surface marker for negative selection of pancreatic  $\beta$ -like cells. Indeed, gene ontology (GO) functional annotations showed that the most significantly upregulated pathways in  $CD9^+$  S6 cells were not related to pancreatic development nor  $\beta$  cell function, while those of  $CD9^-$  S6 cells were associated with glucose metabolism, endocrine pancreas development, glucose homeostasis, insulin processing, and serotonin biosynthesis (Figure 3E, Table S4). In addition, we validated protein expression by immunostaining for *CD9* and C-PEPTIDE on frozen sections of S6 cells. Our data revealed that most C-PEPTIDE<sup>+</sup>  $\beta$  cells did not express *CD9* (Figure 3F). Furthermore, we consistently observed that efficient  $\beta$  cell differentiation would result in *CD9* expression in less than half of the hESC-islet cell population by flow cytometry (Figure 3G). Altogether, our findings suggested that *CD9* could be used as a cell-surface marker for negative enrichment of  $\beta$ -like cells derived from hESCs.

### Negative Enrichment of Glucose-Responsive Human $\beta$ -like Cells through *CD9*

Next, we asked if negative selection against *CD9* could purify glucose-responsive pancreatic  $\beta$ -like cells. We sorted  $CD9^-$  and  $CD9^+$  cells by flow cytometry and dissociated hESC-islet cells containing both  $CD9^-$  and  $CD9^+$  cells (unsorted) at S6. We then cultured 500 cells of each group for overnight (~16 h) reaggregation in AggreWell plates. The sorted or dissociated cells spontaneously self-organized into spherical 3D organoids (Figure 4A). We further quantified %NKX6.1<sup>+</sup>C-PEPTIDE<sup>+</sup> (Figure S5A) and %MAFA<sup>+</sup>C-PEPTIDE<sup>+</sup> (Figure S5B) cells by immunostaining. Our results demonstrated significantly more NKX6.1<sup>+</sup>C-PEPTIDE<sup>+</sup> (Figure 4B) or MAFA<sup>+</sup>C-PEPTIDE<sup>+</sup> (Figure 4C) cells in the  $CD9^-$  compared with the  $CD9^+$  or unsorted population. Moreover, the percentage of these  $\beta$ -like cells was significantly reduced in the  $CD9^+$  compared with the unsorted population (Figures 4B and 4C).

To determine whether overnight reaggregation would reduce the purity of NKX6.1<sup>+</sup>C-PEPTIDE<sup>+</sup> cells among  $CD9^-$  (Figure S6A) and  $CD9^+$  (Figure S6B) sorted cells, and whether a part of the purified  $CD9^-$ C-PEPTIDE<sup>+</sup> cells would become C-PEPTIDE<sup>-</sup> after reaggregation, we compared the efficiency using sorted S6 cells derived from the H1 hESCs immediately after sorting and after reaggregation overnight. We showed that there was no significant difference in the %NKX6.1<sup>+</sup>C-PEPTIDE<sup>+</sup> cells before and after overnight reaggregation of either  $CD9^-$



**Figure 3. Identification of CD9 as a Negative Cell-Surface Marker for  $INS^+$   $\beta$ -like Cells**

(A) Violin plot showing expression levels of *INS* by S6 cell clusters. Expression levels were quantified as  $\log_2$ -scaled UMI.

(B) Volcano plot showing genes differentially expressed between  $INS^{hi}$  (C7, C10, and C15) and  $INS^{lo}$  (C1, C3, C14, and C17) clusters. Highlighted in red are 448 differentially expressed genes, and cell-surface markers are further named.

(C) Heatmap analysis of cell-surface markers differentially expressed by  $INS^+$  S6 cell clusters.

(D) Expression patterns of *INS*, *CD9*, and *ITGA1* in single cells of the three differentiation stages S4–S6 by t-SNE plot. Expression levels were quantified as  $\log_2$ -scaled UMI.

(E) Representation of the most significantly upregulated pathways in  $CD9^+$  and  $CD9^-$  cells determined by GO functional annotation (see also Table S4).

(F) Immunostaining of frozen sections for CD9 (green) and C-PEPTIDE (red) in S6 cells after differentiation. Scale bars: 20  $\mu$ m.

(G) Flow cytometric analysis showing the percentage of S6 cells expressing CD9 and the potential for enrichment of C-PEPTIDE $^+$  cells by sorting against CD9.

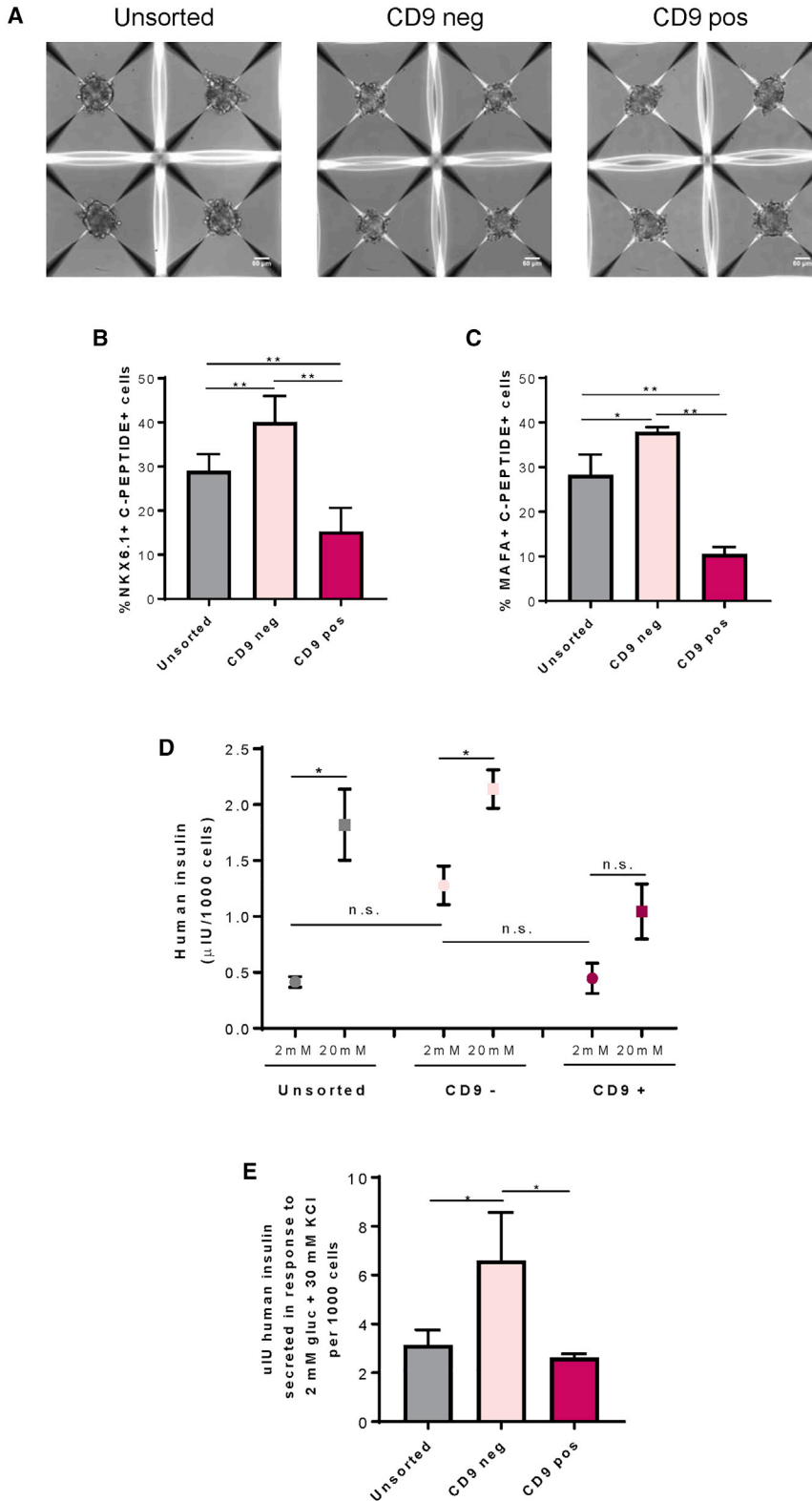
or  $CD9^+$  sorted cells. Similarly, we found the same results using sorted S6 cells derived from the H9 hESCs (Figures S6C and S6D). Therefore, our findings suggest that overnight reaggregation did not alter the purity of human  $\beta$ -like cells after negative selection against CD9 at S6.

We also performed GSIS assays *in vitro*, and quantification of four independent experiments demonstrated that  $CD9^-$  cells responded better to glucose challenge compared with the  $CD9^+$  cells (Figure 4D). In contrast,  $CD9^+$  cells secreted very low amounts of insulin and the amounts did not differ in 2 and 20 mM glucose, suggesting that they failed to respond to a change in glucose concentration (Figure 4D). Furthermore, quantification of four in-

dependent experiments showed that  $CD9^-$  cells had significantly increased levels of insulin after depolarization with KCl compared with  $CD9^+$  or unsorted controls (Figure 4E).

### CD9 Is Preferentially Expressed by Human Immature and Proliferating $\beta$ Cells

It is generally believed that fetal  $\beta$  cells are immature, as they acquire glucose responsiveness through functional maturation after birth. To ask if CD9 might be a marker for immature  $\beta$  cells, we compared CD9 expression in the immature fetal and the mature adult pancreata by collecting human pancreata from fetuses aborted at the second trimester and from adult patients. Immunostaining for



**Figure 4. Negative Enrichment of Glucose-Responsive Human  $\beta$ -like Cells through CD9**

(A) Representative images of four individual hESC-islet organoids reaggregated after overnight culture in AggreWell400. Each organoid contained 500 dissociated or sorted cells. Scale bars: 50  $\mu$ m.

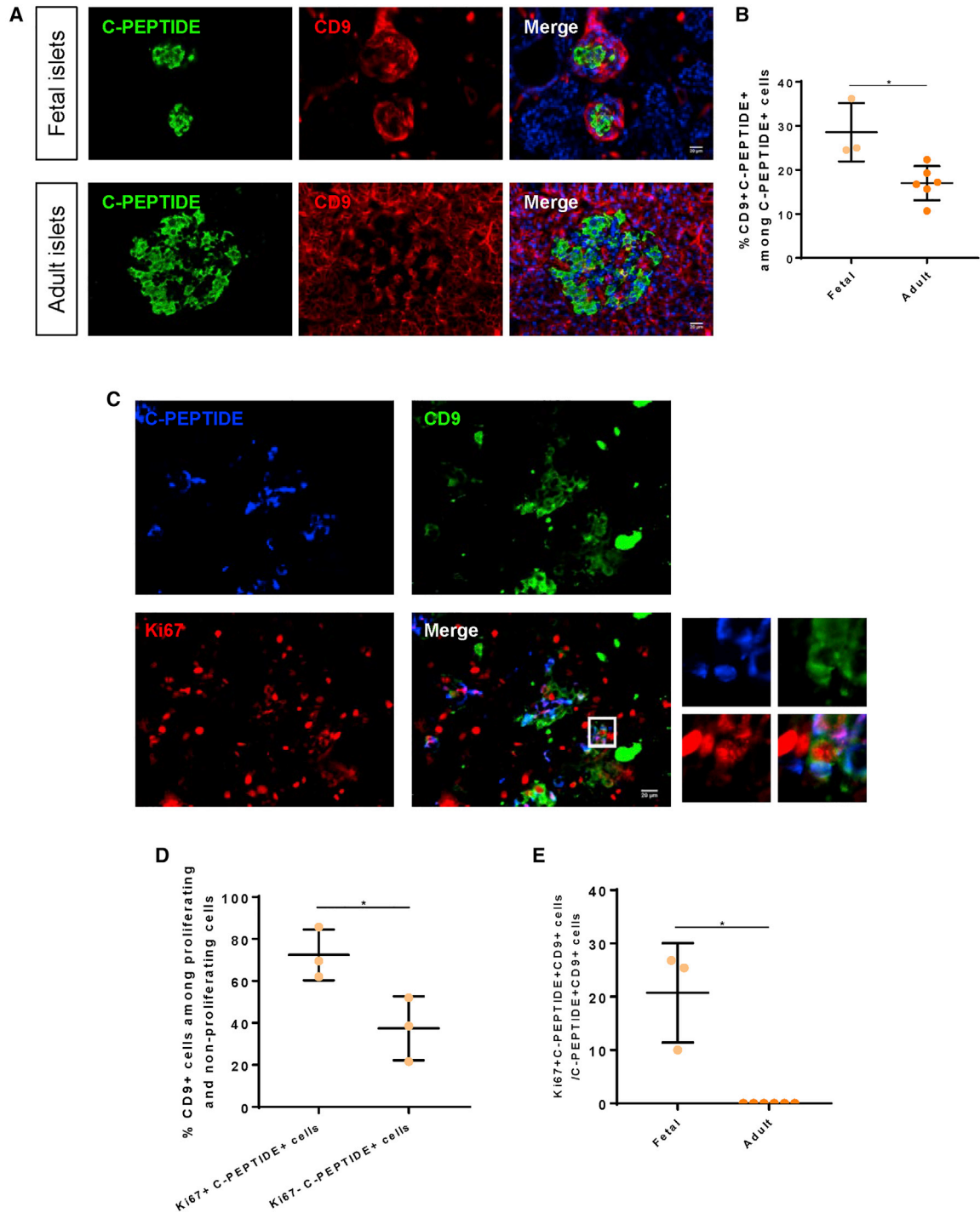
(B and C) Quantification of (B) %NKX6.1+C-PEPTIDE<sup>+</sup> cells (see also Figure S5A) and (C) %MAFA+C-PEPTIDE<sup>+</sup> cells (see also Figure S5B) among total cells of the hESC-islet organoids.

(D) Quantification of human insulin secreted by human  $\beta$ -like cells derived from dissociated unsorted, sorted CD9<sup>-</sup>, or sorted CD9<sup>+</sup> cells by *in vitro* GSIS.

(E) Quantification of human insulin secreted from dissociated unsorted, sorted CD9<sup>-</sup>, or sorted CD9<sup>+</sup> cells in response to 2 mM glucose and 30 mM KCl.

(B–E) Data were obtained from four independent experiments and presented as the mean  $\pm$  SD, \* $p$  < 0.05, \*\* $p$  < 0.01, and n.s. denotes no statistically significant difference.





### Figure 5. CD9 Is Preferentially Expressed by Human Immature $\beta$ Cells

(A) Immunostaining of frozen sections for C-PEPTIDE (green) and CD9 (red) in fetal ( $n = 3$ ,  $<100 \mu\text{m}$ ) or adult ( $n = 6$ ,  $100\text{--}250 \mu\text{m}$ ) cadaveric islets. Scale bars:  $20 \mu\text{m}$ .

(B) Quantification of (A) showing %CD9<sup>+</sup>C-PEPTIDE<sup>+</sup> among total C-PEPTIDE<sup>+</sup>  $\beta$ -like cells in fetal and adult cadaveric islets.

(C) Immunostaining of frozen sections for C-PEPTIDE (blue), CD9 (green), and Ki67 (red) in fetal ( $n = 3$ ) or adult ( $n = 6$ , data not shown) cadaveric islets. The white box indicates the amplified regions on the right. Scale bars:  $20 \mu\text{m}$ .

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CD9 and C-PEPTIDE showed significantly fewer %CD9<sup>+</sup>C-PEPTIDE<sup>+</sup> cells among total C-PEPTIDE<sup>+</sup>  $\beta$  cells of adult (~17%, n = 6) compared with fetal (~28.5%, n = 3) islets (Figures 5A and 5B). Moreover, we also performed immunostaining for the immature  $\beta$  cells that are capable of proliferation (Figure 5C) and showed that significantly more Ki67<sup>+</sup>C-PEPTIDE<sup>+</sup> proliferating  $\beta$  cells (~75%) expressed CD9 compared with the Ki67<sup>-</sup>C-PEPTIDE<sup>+</sup> non-proliferating  $\beta$  cells (~35%) of the fetal islets (Figure 5D, n = 3). Ki67<sup>+</sup>C-PEPTIDE<sup>+</sup>CD9<sup>+</sup> proliferating  $\beta$  cells could be found only in the fetal and not in the adult islets (Figure 5E). Furthermore, we also observed that reaggregated CD9<sup>+</sup> cells at S6 showed expression of SST (Figure S7A), and CD9 also co-localized with SST in the fetal (Figure S7B) and adult (Figure S7C) human islets, suggesting that CD9 could be a marker for SST<sup>+</sup>  $\delta$  cells. Altogether, our results showed that CD9 could be used as a negative marker to enrich human  $\beta$ -like cells, as CD9 marked immature  $\beta$  cells as well as other endocrine cells such as  $\delta$  cells in the human islets of the fetal pancreas in particular.

#### CD9 May Not Have a Functional Role in the Differentiation of Human $\beta$ -like Cells

Last, we asked if CD9 plays any functional role in human  $\beta$ -like cell development. We performed flow cytometry to score for the temporal expression pattern of CD9 during human  $\beta$ -like cell differentiation from hESCs (Figure 6A). Our results revealed that the expression levels of CD9 were very high in the pluripotent and endodermal stages. About 100% of cells at S0–S2 expressed CD9, with a gradual reduction to ~30% at S4 and a slight increase to ~50% at S5–S6 (Figure 6B). Our data might suggest that the expression levels of CD9 started to decline upon pancreatic/endocrine lineage specification. We then overexpressed or knocked out CD9 during  $\beta$  cell specification at the end of S4 through ectopic expression of hCD9-GFP or CRISPR/Cas9-GFP targeting CD9, respectively. Flow cytometric analysis demonstrated that there were ~99% and ~25% cells, respectively, expressing CD9 in the overexpression and knockout groups, compared with ~50% cells of the control group (Figure 7A). We then performed immunostaining for C-PEPTIDE, GFP, and CD9 and found that neither overexpression (Figure 7B) nor knockout (Figure 7C) of CD9 altered the %C-PEPTIDE<sup>+</sup>GFP<sup>+</sup> cells among total transduced GFP<sup>+</sup> cells at S6. Furthermore, we performed GSIS *in vitro* at S6 to determine if altering the expression level of CD9 would influence the function of human  $\beta$ -like cells. Our results showed that neither overexpression (Figure 7D) nor

knockout (Figure 7E) of CD9 at S5 influenced the ability of S6 human  $\beta$ -like cells to respond to a change in glucose concentration.

## DISCUSSION

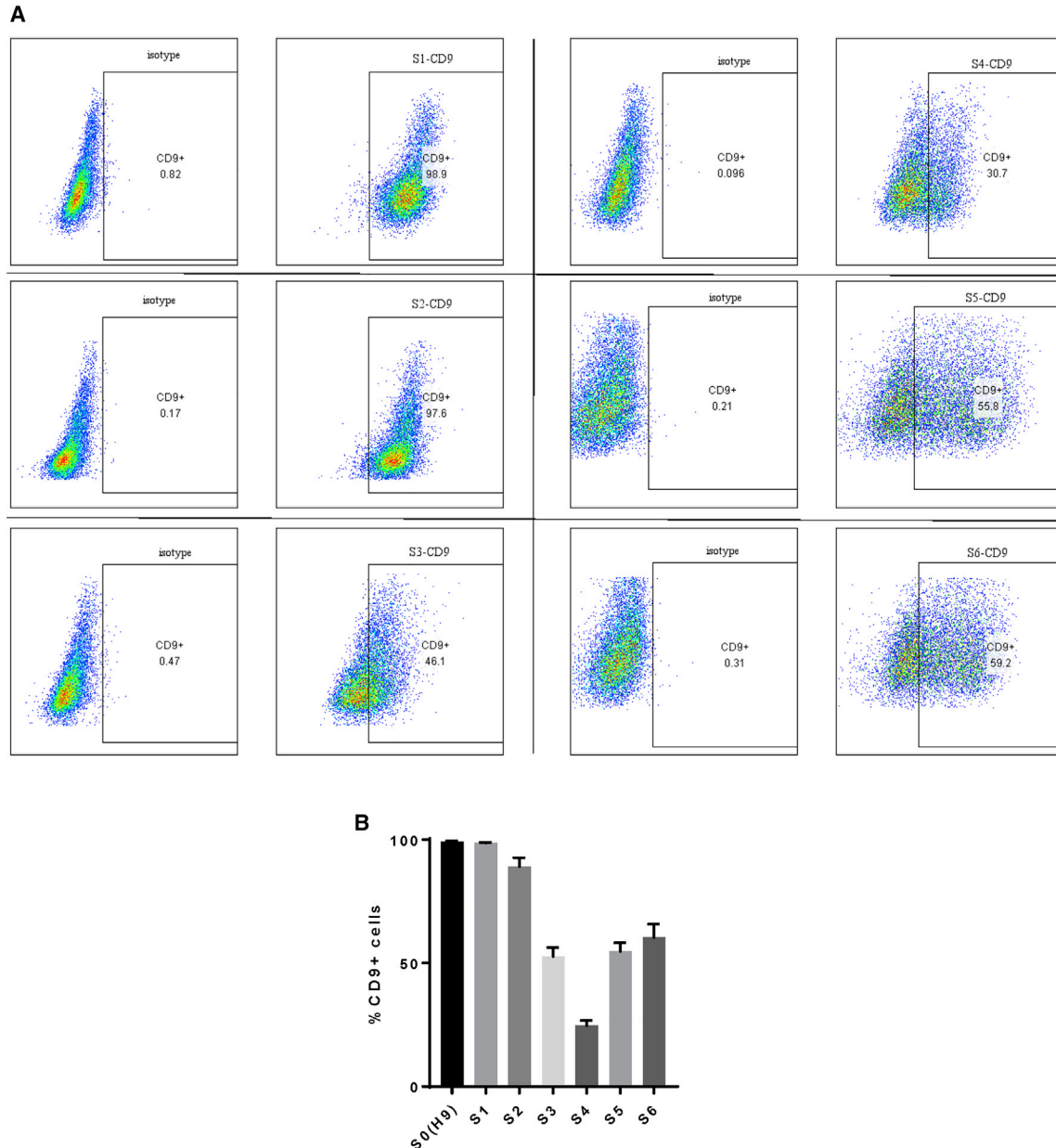
The use of hPSCs in the generation of  $\beta$ -like cells could provide an unlimited source of cells for potential treatment of diabetes through cell therapy, disease modeling, and drug discovery. Although current protocols produce human  $\beta$ -like cells with some functionality (Pagliuca et al., 2014; Rezaia et al., 2014; Russ et al., 2015), the differentiation efficiency varies greatly among different hPSC lines. For instance, most studies utilize HUES8 (Pagliuca et al., 2014; Veres et al., 2019) or H1 (Ghazizadeh et al., 2017; Rezaia et al., 2014) hESCs, which have been shown to be efficient in  $\beta$  cell lineage commitment. The same protocol, when applied to other cell lines, including patient-specific iPSCs, could result in poor  $\beta$  cell specification (Ghazizadeh et al., 2017). Moreover, the generated cells lack expression of maturation markers such as MAFA and show limited glucose responsiveness compared with human cadaveric islets (Ghazizadeh et al., 2017; Johnson, 2016).

In this study, we developed a protocol using reported differentiation factors (Nostro et al., 2015; Pagliuca et al., 2014; Rezaia et al., 2014) for efficient generation of monohormonal NKX6.1<sup>+</sup>MAFA<sup>+</sup>C-PEPTIDE<sup>+</sup>  $\beta$ -like cells from the H9 hESC line previously known to be less amenable to  $\beta$  cell differentiation. Unlike rodent islets, which are predominantly constituted of  $\beta$  cells (~80%), human islets have fewer (~50%) and more disperse  $\beta$  cells (Brissova et al., 2005). The H9 hESC-islets that we generated contained ~30%–40%  $\beta$ -like cells, ~5%  $\alpha$ -like cells, and ~2%  $\delta$ -like cells, recapitulating the cellular architecture of the endocrine cell populations of human islets. We performed high-resolution, genome-wide scRNA-seq to comprehensively characterize cellular heterogeneity during human islet development. During islet cell differentiation, S4 mainly harbored PDX1<sup>+</sup>NKX6.1<sup>+</sup> pancreatic progenitor-like cells, S5 encompassed both NGN3<sup>+</sup>NEUROD1<sup>+</sup> endocrine progenitor- and INS<sup>+</sup> immature  $\beta$ -like cells, and S6 contained INS<sup>+</sup> mature  $\beta$ -like cells. Moreover, we identified 17 cell clusters that could exhibit diverse roles in supporting endocrine cell function. It was also intriguing to observe that the expression level of INS differed among individual  $\beta$ -like cells. The heterogeneous  $\beta$ -like cell subsets might express genes not directly related to GSIS but associated with  $\beta$  cell maturation or maintaining the

(D) Quantification of (C) showing %CD9<sup>+</sup> cells among Ki67<sup>+</sup>C-PEPTIDE<sup>+</sup> or Ki67<sup>-</sup>C-PEPTIDE<sup>+</sup>  $\beta$ -like cells in fetal cadaveric islets.

(E) Quantification showing %Ki67<sup>+</sup>CD9<sup>+</sup>C-PEPTIDE<sup>+</sup> among total CD9<sup>+</sup>C-PEPTIDE<sup>+</sup>  $\beta$ -like cells in fetal and adult cadaveric islets.

(B, D, and E) Data are presented as the mean  $\pm$  SD, \*p < 0.05.



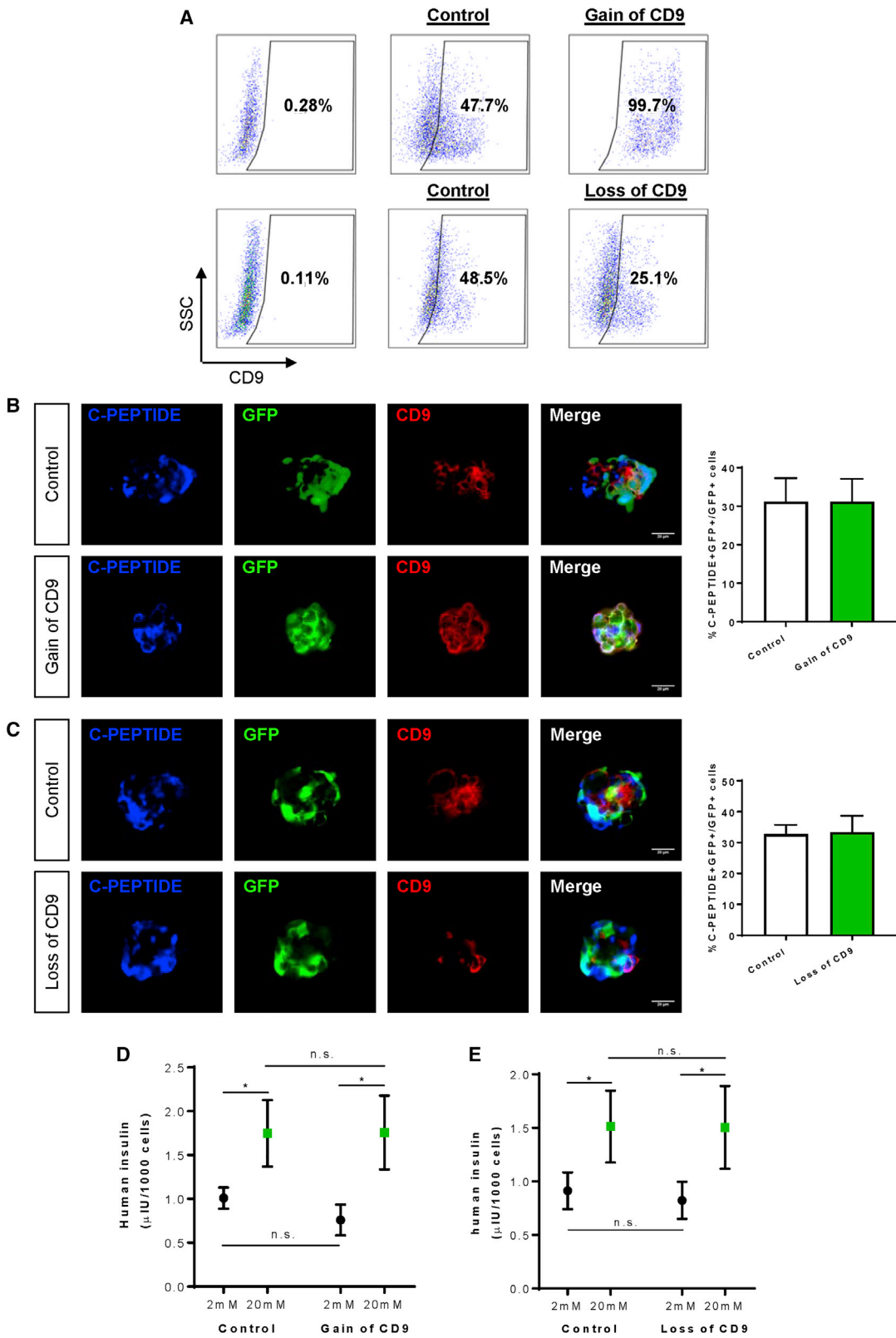
### Figure 6. Temporal Expression of CD9 during Human $\beta$ -like Cell Differentiation

(A) Flow cytometric analysis showing the FACS plots and (B) quantification data showing the percentages of S1–S6 cells derived from the H9 hESCs expressing CD9. Data are presented as the mean  $\pm$  SD.

non-secretory roles that are important for the overall islet function (Liu and Hebrok, 2017). Our finding might provide a resource for identifying genes that marked and/or regulated the heterogeneous human  $\beta$  cell subsets.

We also sought to enrich  $\beta$ -like cells by identifying specific cell-surface markers. Our scRNA-seq data revealed that *CD9* was the most statistically significant cell-surface marker negatively correlated with *INS* expression. We established a 3D culture system for spontaneous reaggrega-

tion of hESC-islet organoids after negative enrichment against CD9 at S6 by flow cytometry. CD9<sup>-</sup>  $\beta$ -like cells expressed more of the maturation marker MAFA and demonstrated better glucose responsiveness by *in vitro* GSIS compared with CD9<sup>+</sup> cells. Importantly, we validated this by performing immunostaining for CD9 and C-PEPTIDE on frozen sections of fetal and adult human islets. Indeed, a previous report has shown that CD9<sup>-</sup>  $\beta$  cells form a distinct subtype of  $\beta$  cells within human islets, but its



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functional role in  $\beta$  cells has not been investigated (Dorrell et al., 2016). Here, we further demonstrated that CD9 could be used for negative enrichment of glucose-responsive human  $\beta$ -like cells, but CD9 may not have any functional role in  $\beta$  cell specification nor glucose responsiveness, as neither overexpression nor knockout of CD9 altered their differentiation, maturation, or function.

One might argue that we did not completely knock out CD9 expression in our experiments, but we showed that a 50% reduction in the expression level of CD9 did not change  $\beta$  cell function. Another possible role of CD9 may lie in its regulation of  $\beta$  cell proliferation, as we observed more proliferating  $\beta$  cells of human fetal islets expressing CD9 compared with the non-proliferating ones. However, we were unable to identify proliferating  $\beta$  cells in the hPSC differentiation system, as the differentiated  $\beta$ -like cells were rarely Ki67<sup>+</sup> at both S5 and S6. Due to the intrinsic difference in human  $\beta$  cells derived from hPSCs and fetal tissues, we might not be able to delineate the physiological role of CD9 in human  $\beta$  cells through hPSC differentiation. Altogether, our results suggested that CD9 was a negative marker for enrichment of glucose-responsive human  $\beta$ -like cells derived from hPSCs, and CD9 did not have a functional role in  $\beta$  cell differentiation or function. Future studies are needed to explore the functional role of CD9 in  $\beta$  cells using human tissues. Essentially, our results give support to the application, particularly the purification, of hESC-derived  $\beta$ -like cells for potential cell replacement therapy in diabetic individuals.

Recently, ITGA1 has been identified as a specific cell-surface marker for human  $\beta$ -like cells derived from the HUES8 hESC line (Veres et al., 2019). Although ITGA1 was not shown to be co-localized with MAFA nor specifically expressed by  $\beta$  cells within the cadaveric islets (Veres et al., 2019), we confirmed that *ITGA1* indeed labeled some of the  $\beta$ -like cells derived from the H9 hESC line using our protocol, albeit at very low efficiency. Our analyses may indicate that the efficiency of using cell-surface markers for the purification of human  $\beta$ -like cells could vary between sources of hPSCs. Moreover, it is worth noting that batch-to-batch variation in the differentiation of  $\beta$ -like cells from hPSCs is commonly seen even in the same laboratory (Pagliuca et al., 2014). Our protocol targeting negative

enrichment against CD9 appeared to reduce the batch-to-batch variation. Nevertheless, future effort is needed to carefully examine the specificity and labeling efficiency of positive or negative cell-surface markers of  $\beta$  cells using more hPSC lines and human cadaveric islets. Taken together, our results demonstrate that CD9 is a negative enrichment marker for glucose-responsive human  $\beta$ -like cells derived from hPSCs that could support clinical research targeting the therapeutic use of human  $\beta$ -like cells in cell therapy, disease modeling, or drug screening.

## EXPERIMENTAL PROCEDURES

For details of this section, please also refer to the [Supplemental Experimental Procedures](#).

### Human Patients

All procedures were approved by The Chinese University of Hong Kong-Hospital Authority (NTEC) Joint Clinical Research Ethics Committee. Pregnant women who had decided on termination of pregnancy due to trisomy 13/21 in prenatal diagnosis provided consent. Those who took medications that are detrimental to fetal development were excluded from this study. Fetal pancreata were collected from aborted fetuses of the second trimester at gestational week 13–20. In addition, adult pancreatic biopsies were collected from patients with pancreatic cysts or gastrointestinal cancers (Table S5).

### Human ESC Cultures and Pancreatic Islet Differentiation

The H9 hESC line (WA09, WiCell) was maintained in mTesR1 medium (Stemgent). To generate pancreatic islets, confluent cultures were dissociated into single-cell suspensions using Accutase (Thermo Fisher) and reseeded at a density of  $1.5 \times 10^5$  cells/cm<sup>2</sup> on Matrigel (Corning)-coated surfaces supplemented with 10  $\mu$ M Y-27632 (Selleck Chemicals) in mTesR1 for 24 h (day –1). hESCs were then differentiated by stepwise administration of growth factors as follows. On day 0/S1, cells were cultured in RPMI medium (Thermo Fisher) containing 100 ng/mL Activin A (Peprotech) and 2  $\mu$ M CHIR-99021 (Selleck Chemicals). On day 1–2, cells were refreshed with RPMI containing 100 ng/mL Activin A, 5 ng/mL hFGF-basic (Peprotech), and 50  $\mu$ g/mL ascorbic acid (Sigma). On day 3–5/S2, cells were cultured in RPMI containing 1% B27 supplement without vitamin A (Thermo Fisher), 50 ng/mL KGF (Peprotech), and 50  $\mu$ g/mL ascorbic acid. On day

### Figure 7. CD9 May Not Have a Functional Role in the Differentiation of Human $\beta$ -like Cells

(A) Flow cytometric analysis showing the percentage of S5 cells expressing CD9 at day 7 (end of S5) after ectopic expression of CD9-GFP (gain of CD9) or CRISPR/Cas9-GFP targeting CD9 (loss of CD9).

(B and C) Immunostaining of frozen sections and quantification of S6 cells for C-PEPTIDE (blue), GFP (green), and CD9 (red) in S6 cells after (B) gain of CD9 or (C) loss of CD9. Scale bars: 20  $\mu$ m.

(D and E) Quantification of human insulin secreted by S6 human  $\beta$ -like cells generated after (D) gain of CD9 or (E) loss of CD9 by *in vitro* GSIS.

(B–D) Data were obtained from three independent experiments and presented as the mean  $\pm$  SD, \* $p$  < 0.05, and n.s. denotes no statistically significant difference.



6–7/S3, cells were refreshed with DMEM (Thermo Fisher) containing 1% B27 supplement without vitamin A, 0.25  $\mu\text{M}$  SANT-1 (Sigma), 2  $\mu\text{M}$  retinoic acid (RA, Sigma), 50 ng/mL Noggin (Peprotech), 50 ng/mL KGF, and 50  $\mu\text{g}/\text{mL}$  ascorbic acid. On day 8–12/S4, cells were cultured in DMEM containing 1% B27 supplement without vitamin A, 50  $\mu\text{g}/\text{mL}$  ascorbic acid, 50 ng/mL Noggin, 50 ng/mL EGF (Peprotech), and 10 mM nicotinamide (Sigma). Medium was refreshed every day. On day 13/S5, the cells were rinsed with  $1\times$  DPBS and then cultured with 1 U/mL dispase (Thermo Fisher) for 7 min at  $37^\circ\text{C}$ , followed by gentle pipetting to break cells into clumps of 100–200  $\mu\text{m}$ . After that, the cell clumps were transferred into each well of a 6-well ultra-low attachment plate and cultured in MCDB131 (Corning) containing 1.5 g/L  $\text{NaHCO}_3$ , 20 mM D-(+)-glucose, 2% fatty acid-free BSA (Proliant), 1% Glutamax, 1:200 ITS-X (Thermo Fisher), 10  $\mu\text{M}$   $\text{ZnSO}_4$ , 10  $\mu\text{g}/\text{mL}$  heparin, 50  $\mu\text{g}/\text{mL}$  ascorbic acid, 0.25  $\mu\text{M}$  SANT-1, 100 nM RA, 10  $\mu\text{M}$  RepSox (Selleck Chemicals), 1  $\mu\text{M}$  GC1 (R&D Systems), 100 nM LDN193189 (Sigma), 1  $\mu\text{M}$  Compound E (StemCell Technologies), and 10  $\mu\text{M}$  Y-27632 for 3 days. On day 16–19, cell clusters were refreshed with MCDB131 containing 1.5 g/L  $\text{NaHCO}_3$ , 20 mM D-(+)-glucose, 2% fatty acid-free BSA, 1% Glutamax, 1:200 ITS-X, 10  $\mu\text{M}$   $\text{ZnSO}_4$ , 10  $\mu\text{g}/\text{mL}$  heparin, 50  $\mu\text{g}/\text{mL}$  ascorbic acid, 10  $\mu\text{M}$  RepSox, 1  $\mu\text{M}$  GC1, 100 nM LDN193189, 1  $\mu\text{M}$  Compound E, and 10  $\mu\text{M}$  Y-27632. Medium was changed on alternate days. On day 20–28/S6, cell clusters were cultured in MCDB131 containing 1.5 g/L  $\text{NaHCO}_3$ , 20 mM D-(+)-glucose, 2% fatty acid-free BSA, 1% Glutamax, 1:200 ITS-X, 10  $\mu\text{M}$   $\text{ZnSO}_4$ , 10  $\mu\text{g}/\text{mL}$  heparin, 50  $\mu\text{g}/\text{mL}$  ascorbic acid, 10  $\mu\text{M}$  RepSox, 1  $\mu\text{M}$  GC1, 10  $\mu\text{M}$  Trolox (Sigma), 2  $\mu\text{M}$  R428 (Cayman), and 1 mM N-acetyl cysteine (Sigma). Medium was changed on alternate days. To reaggregate purified cells after fluorescence-activated cell sorting (FACS), 600,000  $\text{CD}9^+$ ,  $\text{CD}9^-$ , or dissociated cells were cultured in AggreWell400, 24 wells (StemCell Technologies), with S6 medium supplemented with 10  $\mu\text{M}$  Y-27632 overnight to promote cell survival after sorting.

### Identification of Cell-Surface Markers for $INS^{\text{hi}}$ Mature $\beta$ -like Cells

Cell clusters were defined as  $INS^{\text{hi}}$  or  $INS^{\text{lo}}$  cells according to their expression level of *INS*. Differentially expressed genes were identified by pairwise comparison using Cell Ranger pipelines with the settings of minimum mean expression level of 0.5 and adjusted *p* value with a cutoff of 0.05. Cell-surface marker genes were obtained from the HUGO Gene Nomenclature Committee (Group 471, CD molecules) for further examination. GO enrichment analysis of upregulated genes in  $\text{CD}9^+$  or  $\text{CD}9^-$  cells was performed by DAVID Bioinformatics Resources (v.6.8).

### Statistical Analysis

The data were expressed as the arithmetic mean  $\pm$  SD of biological replicates performed independently under the same conditions at least three times. Statistical analysis was performed using the unpaired Student *t* test with data from two groups, while data from more than two groups were analyzed using an ANOVA followed by Tukey's method for multiple comparisons. Significance was accepted when  $p < 0.05$ .

### Data and Code Availability

scRNA-seq data are deposited under NCBI Bioproject (PRJNA594252).

### SUPPLEMENTAL INFORMATION

Supplemental Information can be found online at <https://doi.org/10.1016/j.stemcr.2020.09.009>.

### AUTHOR CONTRIBUTIONS

X.L. and K.O.L. designed the experiments; X.L. and V.C. performed the experiments; X.L. and K.Y.Y. analyzed the data; K.O.L. interpreted the data; K.T.L., X.Z., and A.S.W. provided reagents; C.C.N.C. and C.C.W. recruited human volunteers and provided clinical samples; M.K. provided optimized protocols for sequencing; K.O.L. supervised the research and wrote the manuscript.

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### REFERENCES

- Almaca, J., Molina, J., Menegaz, D., Pronin, A.N., Tamayo, A., Slepak, V., Berggren, P.O., and Caicedo, A. (2016). Human beta cells produce and release serotonin to inhibit glucagon secretion from alpha cells. *Cell Rep.* 17, 3281–3291.
- Baron, M., Veres, A., Wolock, S.L., Faust, A.L., Gaujoux, R., Vetere, A., Ryu, J.H., Wagner, B.K., Shen-Orr, S.S., Klein, A.M., et al. (2016). A single-cell transcriptomic map of the human and mouse pancreas reveals inter- and intra-cell population structure. *Cell Syst.* 3, 346–360.e4.
- Borka, K., Kaliszky, P., Szabo, E., Lotz, G., Kupcsulik, P., Schaff, Z., and Kiss, A. (2007). Claudin expression in pancreatic endocrine tumors as compared with ductal adenocarcinomas. *Virchows Arch.* 450, 549–557.
- Brissova, M., Fowler, M.J., Nicholson, W.E., Chu, A., Hirshberg, B., Harlan, D.M., and Powers, A.C. (2005). Assessment of human pancreatic islet architecture and composition by laser scanning confocal microscopy. *J. Histochem. Cytochem.* 53, 1087–1097.
- Chetty, S., Engquist, E.N., Mehanna, E., Lui, K.O., Tsankov, A.M., and Melton, D.A. (2015). A Src inhibitor regulates the cell cycle



of human pluripotent stem cells and improves directed differentiation. *J. Cel. Biol.* *210*, 1257–1268.

Dorrell, C., Schug, J., Canaday, P.S., Russ, H.A., Tarlow, B.D., Grompe, M.T., Horton, T., Hebrok, M., Streeter, P.R., Kaestner, K.H., et al. (2016). Human islets contain four distinct subtypes of beta cells. *Nat. Commun.* *7*, 11756.

Ghazizadeh, Z., Kao, D.I., Amin, S., Cook, B., Rao, S., Zhou, T., Zhang, T., Xiang, Z., Kenyon, R., Kaymakcalan, O., et al. (2017). ROCKII inhibition promotes the maturation of human pancreatic beta-like cells. *Nat. Commun.* *8*, 298.

Gleason, C.E., Ning, Y., Cominski, T.P., Gupta, R., Kaestner, K.H., Pintar, J.E., and Birnbaum, M.J. (2010). Role of insulin-like growth factor-binding protein 5 (IGFBP5) in organismal and pancreatic beta-cell growth. *Mol. Endocrinol.* *24*, 178–192.

Gu, C., Stein, G.H., Pan, N., Goebbels, S., Hornberg, H., Nave, K.A., Herrera, P., White, P., Kaestner, K.H., Sussel, L., et al. (2010). Pancreatic beta cells require NeuroD to achieve and maintain functional maturity. *Cell Metab.* *11*, 298–310.

Johnson, J.D. (2016). The quest to make fully functional human pancreatic beta cells from embryonic stem cells: climbing a mountain in the clouds. *Diabetologia* *59*, 2047–2057.

Krentz, N.A.J., Lee, M.Y.Y., Xu, E.E., Sproul, S.L.J., Maslova, A., Sasaki, S., and Lynn, F.C. (2018). Single-cell transcriptome profiling of mouse and hESC-derived pancreatic progenitors. *Stem Cell Rep.* *11*, 1551–1564.

Lantz, K.A., Vatamaniuk, M.Z., Brestelli, J.E., Friedman, J.R., Matschinsky, F.M., and Kaestner, K.H. (2004). Foxa2 regulates multiple pathways of insulin secretion. *J. Clin. Invest.* *114*, 512–520.

Leung, C.S., Yang, K.Y., Li, X., Chan, V.W., Ku, M., Waldmann, H., Hori, S., Tsang, J.C.H., Lo, Y.M.D., and Lui, K.O. (2018). Single-cell transcriptomics reveal that PD-1 mediates immune tolerance by regulating proliferation of regulatory T cells. *Genome Med.* *10*, 71.

Li, J., Li, X., Liang, C., Ling, L., Chen, Z., Wong, C.K., Waldmann, H., and Lui, K.O. (2020). Coreceptor blockade targeting CD4 and CD8 allows acceptance of allogeneic human pluripotent stem cell grafts in humanized mice. *Biomaterials* *248*, 120013.

Li, J., Yang, K.Y., Tam, R.C.Y., Chan, V.W., Lan, H.Y., Hori, S., Zhou, B., and Lui, K.O. (2019). Regulatory T-cells regulate neonatal heart regeneration by potentiating cardiomyocyte proliferation in a paracrine manner. *Theranostics* *9*, 4324–4341.

Liang, C., Yang, K.Y., Chan, V.W., Li, X., Fung, T.H.W., Wu, Y., Tian, X.Y., Huang, Y., Qin, L., Lau, J.Y.W., et al. (2020). CD8(+) T-cell plasticity regulates vascular regeneration in type-2 diabetes. *Theranostics* *10*, 4217–4232.

Liew, C.W., Assmann, A., Templin, A.T., Raum, J.C., Lipson, K.L., Rajan, S., Qiang, G., Hu, J., Kawamori, D., Lindberg, I., et al. (2014). Insulin regulates carboxypeptidase E by modulating translation initiation scaffolding protein eIF4G1 in pancreatic beta cells. *Proc. Natl. Acad. Sci. U S A* *111*, E2319–E2328.

Lioubinski, O., Muller, M., Wegner, M., and Sander, M. (2003). Expression of Sox transcription factors in the developing mouse pancreas. *Dev. Dyn.* *227*, 402–408.

Liu, J.S., and Hebrok, M. (2017). All mixed up: defining roles for beta-cell subtypes in mature islets. *Genes Dev.* *31*, 228–240.

Millman, J.R., and Pagliuca, F.W. (2017). Autologous pluripotent stem cell-derived beta-like cells for diabetes cellular therapy. *Diabetes* *66*, 1111–1120.

Modi, H., Jacovetti, C., Tarussio, D., Metref, S., Madsen, O.D., Zhang, F.P., Rantakari, P., Poutanen, M., Nef, S., Gorman, T., et al. (2015). Autocrine action of IGF2 regulates adult beta-cell mass and function. *Diabetes* *64*, 4148–4157.

Muraro, M.J., Dharmadhikari, G., Grun, D., Groen, N., Dielen, T., Jansen, E., van Gurp, L., Engelse, M.A., Carlotti, F., de Koning, E.J., et al. (2016). A single-cell transcriptome atlas of the human pancreas. *Cell Syst.* *3*, 385–394.e3.

Nostro, M.C., Sarangi, F., Ogawa, S., Holtzinger, A., Corneo, B., Li, X., Micallef, S.J., Park, I.H., Basford, C., Wheeler, M.B., et al. (2011). Stage-specific signaling through TGFbeta family members and WNT regulates patterning and pancreatic specification of human pluripotent stem cells. *Development* *138*, 861–871.

Nostro, M.C., Sarangi, F., Yang, C., Holland, A., Elefanty, A.G., Stanley, E.G., Greiner, D.L., and Keller, G. (2015). Efficient generation of NKX6-1+ pancreatic progenitors from multiple human pluripotent stem cell lines. *Stem Cell Rep.* *4*, 591–604.

O'Brien, C.A., Kreso, A., Ryan, P., Hermans, K.G., Gibson, L., Wang, Y., Tsatsanis, A., Gallinger, S., and Dick, J.E. (2012). ID1 and ID3 regulate the self-renewal capacity of human colon cancer-initiating cells through p21. *Cancer Cell* *21*, 777–792.

Pagliuca, F.W., Millman, J.R., Gurtler, M., Segel, M., Van Dervort, A., Ryu, J.H., Peterson, Q.P., Greiner, D., and Melton, D.A. (2014). Generation of functional human pancreatic beta cells in vitro. *Cell* *159*, 428–439.

Rezania, A., Bruin, J.E., Arora, P., Rubin, A., Batushansky, I., Asadi, A., O'Dwyer, S., Quiskamp, N., Mojibian, M., Albrecht, T., et al. (2014). Reversal of diabetes with insulin-producing cells derived in vitro from human pluripotent stem cells. *Nat. Biotechnol.* *32*, 1121–1133.

Russ, H.A., Parent, A.V., Ringler, J.J., Hennings, T.G., Nair, G.G., Shveygert, M., Guo, T., Puri, S., Haataja, L., Cirulli, V., et al. (2015). Controlled induction of human pancreatic progenitors produces functional beta-like cells in vitro. *EMBO J.* *34*, 1759–1772.

Sahara, M., Hansson, E.M., Wernet, O., Lui, K.O., Spater, D., and Chien, K.R. (2014). Manipulation of a VEGF-Notch signaling circuit drives formation of functional vascular endothelial progenitors from human pluripotent stem cells. *Cell Res.* *24*, 820–841.

Schaffer, A.E., Taylor, B.L., Benthuyssen, J.R., Liu, J., Thorel, F., Yuan, W., Jiao, Y., Kaestner, K.H., Herrera, P.L., Magnuson, M.A., et al. (2013). Nkx6.1 controls a gene regulatory network required for establishing and maintaining pancreatic Beta cell identity. *PLoS Genet.* *9*, e1003274.

Schulz, T.C. (2015). Concise review: manufacturing of pancreatic endoderm cells for clinical trials in type 1 diabetes. *Stem Cell Translational Med.* *4*, 927–931.

Segerstolpe, A., Palasantza, A., Eliasson, P., Andersson, E.M., Andreasson, A.C., Sun, X., Picelli, S., Sabirsh, A., Clausen, M., Bjursell, M.K., et al. (2016). Single-cell transcriptome profiling of human pancreatic islets in health and type 2 diabetes. *Cell Metab.* *24*, 593–607.



- Serafimidis, I., Heximer, S., Beis, D., and Gavalas, A. (2011). G protein-coupled receptor signaling and sphingosine-1-phosphate play a phylogenetically conserved role in endocrine pancreas morphogenesis. *Mol. Cell. Biol.* *31*, 4442–4453.
- Turner, D.J., Cowles, R.A., Segura, B.J., and Mulholland, M.W. (2001). Cholinergic stimulation of rat acinar cells increases c-fos and c-jun expression via a mitogen-activated protein kinase-dependent pathway. *J. Gastrointest. Surg.* *5*, 661–672.
- Veres, A., Faust, A.L., Bushnell, H.L., Engquist, E.N., Kenty, J.H., Harb, G., Poh, Y.C., Sintov, E., Gurtler, M., Pagliuca, F.W., et al. (2019). Charting cellular identity during human in vitro beta-cell differentiation. *Nature* *569*, 368–373.
- Westmoreland, J.J., Drosos, Y., Kelly, J., Ye, J., Means, A.L., Washington, M.K., and Sosa-Pineda, B. (2012). Dynamic distribution of claudin proteins in pancreatic epithelia undergoing morphogenesis or neoplastic transformation. *Dev. Dyn.* *241*, 583–594.
- Xin, Y., Kim, J., Okamoto, H., Ni, M., Wei, Y., Adler, C., Murphy, A.J., Yancopoulos, G.D., Lin, C., and Gromada, J. (2016). RNA sequencing of single human islet cells reveals type 2 diabetes genes. *Cell Metab.* *24*, 608–615.
- Xu, H., Yi, B.A., Wu, H., Bock, C., Gu, H., Lui, K.O., Park, J.H., Shao, Y., Riley, A.K., Domian, I.J., et al. (2012). Highly efficient derivation of ventricular cardiomyocytes from induced pluripotent stem cells with a distinct epigenetic signature. *Cell Res.* *22*, 142–154.
- Yoshida, H., Ohagi, S., Sanke, T., Furuta, H., Furuta, M., and Nanjo, K. (1995). Association of the prohormone convertase 2 gene (PCSK2) on chromosome 20 with NIDDM in Japanese subjects. *Diabetes* *44*, 389–393.
- Zaidi, D., Turner, J.K., Durst, M.A., and Wagner, G.F. (2012). Stanniocalcin-1 co-localizes with insulin in the pancreatic islets. *ISRN Endocrinol.* *2012*, 834359.