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Single-Cell Transcriptome Profiling Reveals β Cell Maturation in Stem Cell-Derived Islets after Transplantation

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SUMMARY

Human pluripotent stem cells differentiated to insulin-secreting β Cells (SC- β Cells) in islet organoids could provide an unlimited cell source for diabetes cell replacement therapy. However, current SC- β Cells generated *in vitro* are transcriptionally and functionally immature compared to native adult β Cells. Here, we use single-cell transcriptomic profiling to catalog changes that occur in transplanted SC- β Cells. We find that transplanted SC- β Cells exhibit drastic transcriptional changes and mature to more closely resemble adult β Cells. Insulin and IAPP protein secretions increase upon transplantation, along with expression of maturation genes lacking with differentiation *in vitro*, including *INS*, *MAFA*, *CHGB*, and *G6PC2*. Other differentiated cell types, such as SC- α and SC-enterochromaffin (SC-EC) cells, also exhibit large transcriptional changes. This study provides a comprehensive resource for understanding human islet cell maturation and provides important insights into maturation of SC- β Cells and other SC-islet cell types to enable future differentiation strategy improvements.

In Brief

Augsornworawat et al. demonstrate that *in vitro* human stem-cell-derived islets have immature transcriptome profiles when compared to native human islets. After transplantation, immature SC-islet cells undergo drastic changes in transcriptome and acquire mature gene expression. Grafted

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AUTHOR CONTRIBUTIONS

P.A., K.G.M., and J.R.M. conceived the experimental design and contributed to the *in vitro* and *in vivo* experiments. P.A., K.G.M., and L.V.-C. performed the computational analysis. P.A., K.G.M., and J.R.M. wrote the manuscript. All authors edited and reviewed the manuscript.

SUPPLEMENTAL INFORMATION

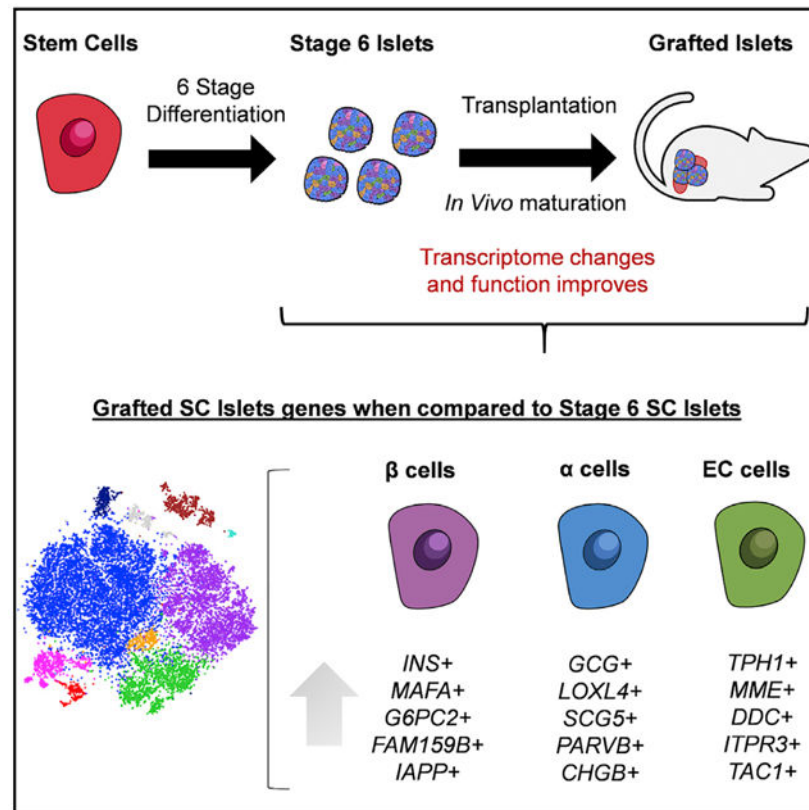
Supplemental Information can be found online at <https://doi.org/10.1016/j.celrep.2020.108067>.

DECLARATION OF INTERESTS

L.V.-C. and J.R.M. are inventors on patent applications related to SC- β Cell technology described in this manuscript.

SC- β Cells express mature β Cell genes, including MAFA and G6PC2, resembling native human islets.

Graphical Abstract



INTRODUCTION

Diabetes is a global disease caused by death or dysfunction of pancreatic insulin (INS)-producing β Cells. Current conventional therapeutic strategies, such as exogenous INS treatment, are insufficient in recapitulating the role of healthy endogenous β Cells for many patients (Atkinson et al., 2014). Transplantation of replacement human islets (HIs) is a promising alternative (Latres et al., 2019; Shapiro et al., 2006, 2000). However, this therapy faces the challenge of limited availability from cadaveric donors. This is compounded by the need of multiple donors to treat one diabetic patient in most cases. Human pluripotent stem cells (hPSCs) differentiated into functional islets (SC-islets) containing β Cells (SC- β Cells) would provide a renewable cell source for cell replacement therapy (Aguayo-Mazzucato and Bonner-Weir, 2010). Recently, differentiation strategies have been developed to successfully specify fate selection of differentiating hPSCs into SC-islets (Pagliuca et al., 2014; Rezania et al., 2014). Further refinements to these protocols have improved function and gene expression (Ghazizadeh et al., 2017; Hoglebe et al., 2020; Millman et al., 2016; Nair et al., 2019; Velazco-Cruz et al., 2020b, 2019). Nonetheless, SC-islets generated *in vitro* remain unequal to cadaveric islets both functionally and transcriptionally.

Single-cell RNA sequencing (scRNA-seq) and other assays of global transcription have been used to rigorously study and uncover pancreatic identities (Augsornworawat and Millman, 2020), including assessment of SC- β Cell populations in diabetic models (Balboa et al., 2018; Maxwell et al., 2020), analysis of SC-islets from *in vitro* differentiation (Pagliuca et al., 2014; Veres et al., 2019), and studying islets or islet development (Baron et al., 2016; Byrnes et al., 2018; Enge et al., 2017; Hoglebe et al., 2020; Muraro et al., 2016; Russell et al., 2020; Scavuzzo et al., 2018; Segerstolpe et al., 2016; Velazco-Cruz et al., 2020a; Xin et al., 2018). When compared to β Cells from cadaveric islets, these technologies revealed that *in-vitro*-derived SC- β Cells lack or have low expression of many important maturation genes, such as *MAFA* and *G6PC2* (Hoglebe et al., 2020; Pagliuca et al., 2014; Veres et al., 2019). However, after transplantation, the function and amount of INS secreted by SC- β Cells increases (Balboa et al., 2018; Hoglebe et al., 2020; Nair et al., 2019; Pagliuca et al., 2014; Rezanian et al., 2014; Vegas et al., 2016; Velazco-Cruz et al., 2019). The cause of this increase is unknown and may be due to differentiation of accompanying progenitors, remodeling of the graft, and the maturation state of cells not being set by the *in vitro* conditions under which they were derived. However, further assessment of these transplanted cells has been limited to immunostaining and functional assessment of *ex vivo* grafts (Balboa et al., 2018; Bruin et al., 2015; Pepper et al., 2017; Robert et al., 2019; Velazco-Cruz et al., 2019).

Here, we utilize scRNA-seq to elucidate the cellular identity, maturation, and changes in gene expression of transplanted (grafted) SC-islets compared to *in-vitro*-generated (stage 6) SC-islets and primary cadaveric islets. We demonstrate that β and α cells differentiated from both human embryonic stem cell (hESC) and human induced pluripotent stem cell (hiPSC) lines undergo functional and drastic transcriptional changes after transplantation to closely resemble β and α cells from cadaveric islets. Specifically, for SC- β Cells, we find that transplantation increases expression of many missing or lowly expressed β Cell maturation and identity genes, including *MAFA*, *G6PC2*, *MNX1*, and *INS*, while decreasing *GCG* and *SST*. In addition, we chart the transcriptional changes of stem-cell-derived enterochromaffin (SC-EC) cells that were recently described to be generated during SC-islet differentiation (Veres et al., 2019). This is a critical resource for understanding and advancing current directed differentiation technologies to develop novel cell therapies for diabetes.

RESULTS

Retrieval and Identification of SC-Islet Cell Populations after Transplantation

We differentiated a hESC and hiPSC line with our six-stage differentiation protocol into SC-islets (Hoglebe et al., 2020) (Figures S1A and S1B). Differentiated SC-islets were then transplanted into the kidney capsule of streptozotocin (STZ)-induced diabetic mice (Figure 1A). Glucose tolerance test (GTT) was performed in transplanted diabetic mice, showing improvements in blood glucose regulation after 4 weeks and further reversal of diabetes at 6 months (Figure 1B). Moreover, we detected increasing glucose stimulated human C-peptide (CP) secretion in serum of transplanted mice (Figure 1C). After 6 months, we harvested the kidneys from mice to extract transplanted SC-islets. These grafts display endocrine cell protein markers including chromogranin A (CHGA), Homeobox protein Nkx-6.1 (NKX6.1),

CP, and glucagon (GCG) (Figure 1D). The extracted SC-islet grafts were processed for *ex vivo* analysis by single-cell dispersing the excised kidney with collagenase D and enriching grafted cells with a magnetic bead mouse cell depletion kit. After library preparation with the 10x Genomics Chromium platform, we sequenced 45,674 cells from isogenic matched stage 6 (*in vitro*) and grafted (*in vivo*) cells with the NovaSeq 6000 (Figures 1E and 1F). Filtering was performed to remove cells with high mitochondrial content or high gene number, indicative of apoptotic cells and doublets, respectively. To remove residual mouse kidney cells, we performed unsupervised clustering of the grafted samples to generate t-distributed Stochastic Neighbor Embedding (tSNE) plots (Figure S1C). We identified a cluster of cells in each sample containing low human-mapped gene counts, which marked predominantly mouse cells (Figure S1D). TTC36, a kidney gene marker that aligns to both the mouse and human genome, is represented in each cluster with low gene counts in all graft samples. To verify, we generated violin plots to show upregulated expression of TTC36 in the identified low gene count population (Figure S1E; Table S1) (Zhou et al., 2016). For all grafted samples, we removed all cells enriched with TTC36 as a method to distinguish mouse cells and remove them from subsequent analysis.

After filtering, we had 15,914 cells for analysis from stage 6 hiPSC-islets, stage 6 hESC-islets, hESC-islet grafts from three mice, and hiPSC-islet grafts from two mice. Single-cell datasets of the same condition, three hESC-islet grafts and two hiPSC-islet grafts, were pooled to obtain sufficient cell numbers for subsequent analyses, comparable to previously published literature (Enge et al., 2017; Segerstolpe et al., 2016; Wang et al., 2016; Xin et al., 2016). Single-cell analysis revealed the majority of cell types to be pancreatic in nature for both stage 6 and grafted cells. Within the individual sample tSNE projections, we identified key pancreatic endocrine cell populations, including SC- β , stem-cell-derived α (SC- α), and stem-cell-derived δ (SC- δ) cells. The SC- β Cells identified in the sequencing data appear to match prior reports that defined SC- β Cells by the expression of CP and NKX6.1, while the polyhormonal cells identified in prior reports appear to be within the SC- α and SC- δ cell populations in the sequencing data (Pagliuca et al., 2014; Velazco-Cruz et al., 2019). Other cell types, including exocrine, also persist to some extent, as found in previous transplantation studies (Velazco-Cruz et al., 2019) (Figures 1E–1H and S1F). The fate of these exocrine cells is hard to determine with our dataset and has been similarly hard in other datasets (Korbitt et al., 1996). Our cluster-matched cell types were assigned based on cell-type-specific genes found in published scRNA-seq literature for cadaveric and SC-islets (Table S2) (Muraro et al., 2016; Veres et al., 2019). The fractional yields and defining genes of each cell type can be found in Table S2. SC- β and SC- α cells are present in both stage 6 and grafted populations. We also identify populations of proliferating SC- α cells (*GCG*, *ARX*, *CRYBA2*, *MKI67*, *PCNA*, and *MCM2*) in stage 6 SC-islets (Figure S2A), similar to as previously reported (Balboa et al., 2018). These proliferative genes are not expressed in other endocrine cell types. Similarly, identifiable SC- δ cell populations are only present in stage 6 SC-islets (Figures 1E–1H). While *SST*⁺/*HHEX*⁺ cells are found in the grafted samples, their overall gene expression signatures are not sufficiently different from SC- α cells to cluster separately. Recently, SC-EC cells were found to be an off-target cell type generated from SC-islet differentiation protocols and have been implicated as an inhibitory cell type for SC-islet *in vitro* function (Veres et al., 2019). These cells synthesize and secrete

serotonin (*TPHI*, *SLC18A1*) and are typically found in the gastrointestinal tract or gastric glands (Grün et al., 2015). We identify SC-EC cells in stage 6 and grafted SC-islets (Figures 1E–1H). Our analysis shows that many cell types generated *in vitro* by our six-stage differentiation protocol persist in grafted SC-islets.

SC-β Cells Mature within Transplanted Grafts

To study gene expression changes that occur in SC-β Cells after transplantation, we projected individually sequenced stage 6 and grafted cells onto a combined tSNE, separated by cell line, and quantified the percentage of each cell type in the combined plots (Figure 2A). It is important to note that combined plots are used for subsequent gene and gene set analysis, as the dimensional reduction provided by tSNE plots depends on the samples used, and absolute distances should not be compared across different plots. Similarly, we designated cell types based on literature of pancreatic cell types matched to upregulated genes within each cluster (Figure S2A; Table S3) (Muraro et al., 2016; Veres et al., 2019). We detected 1,671 and 1,683 β Cells derived from hESC and hiPSC lines, respectively. Focusing on the SC-β Cell population (Figure 2B), we identify 5,867 genes with differential expression (adjusted p value <0.05) in grafted compared to stage 6 SC-β Cells (Table S4). Despite some variations among SC-β Cells from hiPSC and hESC sources (Figures S2B and S2C; Table S3), which we expected due to differences in genetic background (Kim et al., 2009; Wang et al., 2016), we observe substantial reductions in transcriptome variations among SC-β Cells after transplantation when compared between the two lines (Figures S2D and S2E; Table S3). Drastic and congruent transcriptome changes are observed in transplanted SC-β Cells when segmented by the original derivation line (Figures 2C, 2D, S2F, and S2G; Table S4).

Of particular interest, studied maturation genes such as *INS*, *MAFA*, *SIX2*, *MNX1*, and *G6PC2* are now more highly expressed in a greater fraction of cells within the grafted SC-β Cells, whereas they were previously missing or had lower expression in SC-β Cells *in vitro* (Figures 2C and 2D; Table S4). Moreover, many additional genes associated with mature β Cells are found more highly expressed in grafted compared to stage 6 SC-β Cells. *UCN3*, recognized as a β Cell maturation marker from mouse studies (Blum et al., 2012), is increased. *KLF9* and *HOPX*, which were identified to be upregulated in adult β Cells when compared to fetal primary β Cells, are increased (Hrvatin et al., 2014). *FAM159B*, *ITM2B*, and *IGFBP7*, which are regulators of physiological function expressed in cadaveric β Cells (Camunas-Soler et al., 2020; Segerstolpe et al., 2016; Tyler et al., 2019), are found upregulated in our grafted SC-β Cells. Gene set enrichment analysis (GSEA) reveals higher expression of KEGG and REACTOME pathways pertaining to β Cell identity and processes in the grafted SC-β Cells (Figure 2E and S2H; Table S4).

To verify our identified SC-β Cell maturation genes, we performed histology stains of *in vitro*-derived and transplanted SC-islets. We stained the graft of transplanted cells for maturation markers including MAFA, FAM159B, NAA20, and islet amyloid polypeptide (IAPP) (Figure 2F). Transplanted SC-β Cells show marked expression of protein products from these upregulated genes. Because *IAPP* encodes a hormone that is also secreted by β Cells, we confirmed that the transcript was lower using real-time PCR and detected lower

secretion of the protein in stage 6 SC- β Cells compared to primary islets (Figure 2G). To test if secreted IAPP protein could be a useful biomarker correlating with maturation, we measured IAPP in the serum of transplanted mice 3 and 26 weeks after transplantation (Figure 2H). We found that IAPP secretion increased 10.1 ± 2.63 , correlating with the scRNA-seq results of increased IAPP transcript (Figure 2C). This is also a greater dynamic range than what we observed with CP, which only increased $2.7 \pm 0.5\times$ during the same time period (Figure 1C). The protein analysis here is consistent with the scRNA-seq data.

Other misexpressed genes have lower expression in SC- β Cells after transplantation (Figures 2C and 2D; Table S4). We and others previously identified several genes (*CHGA*, *MAFB*, *GCK*, and *GLUT1*) that were overexpressed in stage 6 SC-islets compared to cadaveric islets (Augsornworawat et al., 2019; Hoglebe et al., 2020; Nair et al., 2019; Velazco-Cruz et al., 2019; Veres et al., 2019) and here find that they have reduced expression in grafted compared to stage 6 SC- β Cells. We observe reductions in *GCG* and *SST* gene expression and other genes expressed by α and δ cells (*ALDH1A1*, *FTL*, and *CRYBA2*) with transplantation. Genes enriched in non-functional stem-cell-derived INS-expressing endocrine compared to adult cadaveric β Cells (*FOXA1*, *NR2F1*, *FEV*, *SOX11*, *ONECUT2*, and *TCF3*) (Hrvatin et al., 2014) are lowly expressed in grafted SC- β Cells.

Next, we reconstructed the single-cell data from stage 6 and grafted SC- β Cells into developmental trajectories to obtain a greater understanding of the dynamic changes in β Cell maturation transcripts. Stage 6 SC- β Cells from hESC and hiPSC lines form separate branches at the initial pseudo-time state and merge to a single trajectory that consists mainly of grafted SC- β Cells (Figures 3A and 3B), suggesting that the transcriptomes among different cell lines become more similar upon maturation. Reduction of *GCG* and *SST* is also observed with pseudo-time, thus verifying our observation of β Cell fate commitment after transplantation (Figure 3C). Using the top 100 most differentially expressed genes, we were able to observe a multitude of genes that trend similarly to *GCG* and *SST* including *ADLH1A1*, *MAP1B*, and *CRYBA2* (Figure 3D; Table S6). Conversely, key β Cell maturation genes, specifically *MAFA* and *G6PC2*, increase in expression with pseudo-time (Figures 3E and 3F). Of note, we identified additional regulatory and identity genes including *FXRD2*, *IAPP*, *MTIX*, and *SAT1* to increase in concert with *MAFA* and *G6PC2*. When evaluating the most differentially expressed genes, *JUN*, *NEAT1*, *PPP1R1A*, *SLC30A1*, and *ASB9* are upregulated at the terminal end of the trajectory (Figure 3D), indicating further β Cell development.

We also analyze additional gene sets pertaining to β Cell function and maturation. We see upregulation of *KCNK3*, *SLC30A8*, and *IAPP*, known to support β Cell function (Figures 3E, 3F, and S3) (Camunas-Soler et al., 2020; Velazco-Cruz et al., 2019). *CACNA1C*, a calcium channel subunit important for INS secretion, lessens with maturation; *VIPR1* and *GPR119*, potent GSIS activators (Ohishi and Yoshida, 2012; Tsutsumi et al., 2002), have intermediate activation; and *ABCC9* and *G6PC2*, expressed in functional β Cells, are present at the final state in grafted SC- β Cells (Figure 3F). Consistent with previous HI and SC- β Cell comparison studies, we also observe reduced expression of *GCK* in the grafted SC- β Cells. Looking into identified β Cell maturation gene sets (Veres et al., 2019), we observe all transcripts, with the exception of *MAFB*, to increase with pseudo-time (Figures

3F and S3). Though categorized as maturation genes, the expression pattern of *MAFB* trends similar to primary human β Cells (Hrvatin et al., 2014; Veres et al., 2019). Altogether, our clustering and pseudo-time ordering analyses suggest that transplanted SC- β Cells display dynamic gene patterns leading to β Cell maturity.

Grafted SC- β Cells Closely Resemble Primary Human β Cells

Previous studies show that SC- β Cells are markedly different from native adult β Cells, possessing key β Cell identity genes but short of many other genes by global perspective (Pagliuca et al., 2014). To explore if our grafted SC- β Cells acquired gene expression that better resemble native adult β Cells, we performed subsequent comparisons by incorporating scRNA-seq data from three healthy cadaveric donor HIs (Xin et al., 2018) into a new combined tSNE projection. We pooled 3,368 SC- β Cells (1,765 from hESC and 1,603 hiPSC) with cadaveric HI β Cells, making a total of 4,696 β Cells for our analysis. With a total of 10 single-cell sequencing samples, we detected all cell populations identified previously in Figure 1, which includes pancreatic endocrine and exocrine cell types (Figures 4A, 4B, and S4A; Table S5) (Muraro et al., 2016; Veres et al., 2019). With the addition of primary islet data, we now identify endothelial cells marked by high expression of *PECAMI1*, *CD34*, and *ENTPDI*. Notably, we do not detect SC-EC or proliferating α cells within cadaveric HIs (Figures 4A and 4B).

We performed differential gene expression analysis of β Cells from SC-islet grafts and native HIs. β Cell identity genes (*INS*, *NEUROD1*, and *NKX2-2*), maturation genes (*MAFA* and *G6PC2*), and other notable genes (*ITM2B*, *PDX1*, *GCK*, and *STX1A*) are strikingly similar across the two conditions (Figures 4C, S4B, and S4C; Table S6). Furthermore, β Cells from native islets have similar transcriptome profiles when compared to grafted SC- β Cells (Figure 4D). Quantitatively, Pearson correlation shows that native β Cells are more similar to grafted SC- β Cells when compared across all samples (Figure 4E; Table S6). These results suggest that SC- β Cells have the ability to acquire native adult β Cell genes when placed in an *in vivo* setting.

We also observe genes that are misexpressed in our grafted SC- β Cells when compared to native adult β Cells. Some key functional and β Cell identity genes we identified as reduced in our grafted SC- β Cells, including *NKX6-1*, *CHGA*, *IAPP*, *HOPX*, and *EROL1B*, continue to have higher expression when compared to native islet β Cells (Figures 4C, S4B, and S4C; Table S6). Conversely, β Cells from native islets have higher expression of multiple endocrine hormone genes, specifically *PPY*, *SST*, and *GCG* (Figures 4C, S4B, and S4C; Table S6). We also observe Human Leukocyte Antigen (HLA) genes (*B2M*, *HLA-B*, and *HLA-A*) and ribosomal protein small (*RPS*) and other large (*RPL*) genes to be upregulated in native adult β Cells (Table S6). Of note, no major β Cell identity genes were under-expressed in our grafted SC- β Cells when compared to native adult β Cells.

In addition to these marked differences, we refined our differentially expressed list of genes upregulated in both grafted SC- β Cells and native adult β Cells (Tables S4 and S6) and established a curated list of genes that are shared across the two conditions (Table S6). In our list, metallothionein (*MT1E*, *MT1F*, *MT1X*, and *MT2A*) and β Cell function regulatory (*FAM159B*, *G6PC2*, and *IAPP*) genes are highlighted. Notably, *IAPP*, *FAM159B*, and

MT1X were previously associated with adult HIs and are now confirmed as maturation genes (Camunas-Soler et al., 2020; Muraro et al., 2016). Additional genes including *PEBPI*, *MT2A*, *FXYD2*, *NAA20*, *RASD1*, and *SAT1* are also upregulated. Pseudo-time ordering analysis also verified these identified genes to be upregulated at similar expression values for both grafted SC- β Cells and native adult β Cells (Figures S4D–S4F). We validated some of our identified maturation genes using qPCR (Figure S4G). Furthermore, we observed that a very small fraction (2.09% and 1.20%) of stage 6 SC- β Cells expressed *MAFA* but still lacked expression of other important genes, such as *G6PC2* (Figures S4H and S4I). Collectively, the results support that our grafted SC- β Cells have transcriptional profiles that more closely resemble native β Cells in cadaveric HIs compared to stage 6 cells.

SC- α Cells Mature within Transplanted Grafts

SC- α cells are generated from our six-stage SC-islet differentiation protocol and account for an average of 51.8% and 11.1% cell proportions in stage 6 and grafted SC-islets, respectively (Table S2). While we see some variation in stage 6 SC- α cells from different genetic backgrounds (Kim et al., 2009; Wang et al., 2016), there is considerable convergence of grafted transcriptome profiles after transplantation (Figure S5A; Table S3). Further analysis of the SC- α cell population (Figure 5A) indicates grafted SC- α cells undergo significant transcriptome changes with greater expression of specific maturation genes compared to stage 6 SC- α cells (Figures 5B–5E; Table S6). However, the grafted SC- α cells are not as similar to HI α cells as SC- β Cells are to HI β Cells (Figures 4E and 5D; Table S6). A marked difference is the reduced level of *GCG* and increased expression of *INS* in the grafted SC- α cells compared to native islet α cells (Figures 5C, 5E, and S5B). In fact, this degree of polyhormonality and this higher expression of *FEV*, an immature α cell marker (Veres et al., 2019), are key characteristics reported in precursor α cells, found in juvenile HIs (Ramond et al., 2018; Veres et al., 2019). Of note, *ARX*, a key α cell marker, remains elevated in both stage 6 and grafted SC- α cells compared to HI α cells (Figures 5E and S5B). The expression of proliferating genes (*MKI67*, *PCNA*, and *MCM2*) are also found predominantly in the stage 6 SC- α cell population (Figure S2A), but we did not extensively study this population here. This population is not detected in grafted SC-islets (Figures 1E–1H and S4A) or adult HIs and is not detectable in other HI α cell studies (Baron et al., 2016; Muraro et al., 2016). Despite these differences, differential gene expression analysis indicates stage 6 SC- α cells are maturing to a transcriptional state similar to primary islet α cells. For further examination of the SC- α cell maturation state, we curated a maturation gene list (Table S6) from upregulated genes in grafted (Table S4) and HI α cells (Table S6) compared to stage 6 SC- α cells.

To dynamically visualize transcriptional changes, we reconstructed our stage 6 and grafted SC- α cell data into a pseudo-time trajectory (Figures 5G and 5H). Similar to SC- β Cells, the hiPSC- α and the hESC- α cells formed separate branches at the initial pseudo-time. hESC- α cells, however, are more representative across the bulk of the trajectory. These branches merged to form a population that consists mainly of grafted hiPSC- α and hESC- α cells at the terminal pseudo-time, as was observed in our β Cell analysis. Of particular note, well-known (*CHGB*, *GCG*, and *LOXLA*) and newly identified (*SCG5* and *PARVB*) genes from our α cell maturation gene list increase with pseudo-time (Figures 5I and S5C). On the other

hand, expression of *CHGA* and *FTL* reduces with pseudo-time, following trends observed when incorporating primary islet α cells into the analysis (Figures S5C–S5G; Table S4). Altogether, our results support that transplantation of SC- β and SC- α cells induce drastic transcriptome changes to more closely resemble their respective islet endocrine cell type.

Transcriptional Changes of EC Cells within Transplanted Grafts

We identify SC-EC cells, an off-target of SC-islet and SC- β Cell differentiation protocols, in all stem-cell-derived samples. However, we did not detect EC cells in cadaveric HI samples (Figures 6A and S6A), consistent with prior reports (Veres et al., 2019). We performed a comparison of the SC-EC cells before and after transplantation. Several transcriptional changes occur after transplantation (Figure 6B), and interestingly, transcriptome similarity between the grafted SC-EC cells has the highest Pearson correlation compared to other interrogated cell types (Figure 6C; Table S4). Following transplantation, EC cell genes, including *MME*, *DDC*, *ITPR3*, *TAC1*, *CHGA*, *SLC18A1*, and *CHGB*, are up-regulated, and TPH1 protein is expressed (Figures 6D and 6E; Table S4) (Grün et al., 2015; Veres et al., 2019). We also identify new EC cell genes that increase after transplantation, such as *DUSP1* and *ZFP36*. Conversely, islet endocrine genes (*INS*, *GCG* and *SST*) are reduced, suggesting further commitment to the EC cell fate.

Pseudo-time ordering analysis reveals similar reconstruction patterns observed with SC- α cells and SC- β Cells (Figures 6F and 6G). The grafted SC-EC cell populations continue to overlap at the terminal point in pseudo-time, suggesting a uniform commitment to EC cell fate. Genes previously found upregulated in SC-EC cells following transplantation from differential gene expression analysis are also increased with pseudo-time (Figures 6H, S6B, and S6C; Table S4). *ZFP36* and *MME* are initially lowly expressed in a few cells. However, along the pseudo-time, they are upregulated in a greater number of cells. Elevated genes in the grafted SC-EC cells (Table S4) may serve as maturation markers. Yet, we are unable to validate this list, as HIs do not have EC cell populations, and there are limited EC cell primary data available. Overall, we establish SC-EC cells are present in our differentiated SC-islets, and following transplantation, they continue to exist and change gene expression *in vivo*.

DISCUSSION

The ability to robustly generate pancreatic islets from hPSCs marks an important accomplishment in developmental science and bioregenerative medicine. Nonetheless, SC- β Cells generated from current protocols have transcriptome and functional attributes that resemble juvenile, immature β Cells rather than adult mature β Cells (Hogrebe et al., 2020; Pagliuca et al., 2014; Velazco-Cruz et al., 2019). Herein, we demonstrate that SC- β Cells, derived from both ES and iPS cell lines, can develop into mature β Cells after transplantation. Previous publications display enhanced INS secretion with prolonged transplantation times, which we replicate in our study. Herein, we use scRNA-seq to characterize and explore the transcriptome changes within these functionally improved cells, which has not previously been explored. We performed scRNA-seq on *in-vitro*-generated stage 6 and grafted SC-islets following 6 months transplantation in diabetic mice. In our SC-

islets, we identify key pancreatic and islet cell types, including SC- β , SC- α , SC- δ , and exocrine cells. After transplantation, the grafted SC- β cell population acquired expression of adult HI β Cell genes, expressing known maturation markers, including *MAFA* and *G6PC2*.

The expression of genes important to β Cell phenotype changed with transplantation of SC- β Cells. *MAFA* is widely considered a marker of β Cell maturation, but function in SC- β Cells *in vitro* has been achieved with little to no *MAFA* (Hogrebe et al., 2020; Liu and Hebrok, 2017; Nair et al., 2019; Velazco-Cruz et al., 2019). Thus, the precise role of *MAFA* in β Cell maturation is unclear. As we show SC- β Cells can further mature to express *MAFA* *in vivo*, our platform could be used in the future to interrogate transcriptional changes in this and other genes. We also observe reduction of endocrine genes overexpressed in SC- β Cells *in vitro* (*CHGA*, *MAFB*, *GCK*, and *GLUT1*) to be more consistent with primary HIs and reduction of *GCG* and *SST* gene expression. An interesting observation was that *GCG* and *SST* gene expression was actually lower in grafted SC- β Cells compared to primary HIs, likely due in part to isolation of these primary cells (Teo et al., 2018). While prior reports have demonstrated *GCG* and *SST* transcript in β Cells from primary HIs (Segerstolpe et al., 2016; Teo et al., 2018; Tyler et al., 2019), their molecular role in primary β Cells and SC- β Cells is unclear. Furthermore, in our study, we have also provided a new list of genes corresponding with SC- β Cell maturation *in vivo*. We validated protein expression of some new and pre-defined β Cell maturation genes. A limitation of this study and opportunities for further investigation are further validation of other β Cell and newly identified α and EC cell markers. Another limitation of this study is that we did not trace individual cells across different comparisons through the report.

While the focus of this study is on β Cells, α and EC cells are also explored, as they constitute major endocrine cell populations with current differentiation methodologies. Stage 6 SC- α cells mature after transplantation, indicated by increased α cell maturation marker expression. However, the SC- α cells do not resemble human primary α cells as closely as SC- β Cells do to their primary counterparts. This may be a result of our six-stage differentiation protocol targeting the generation of SC- β , rather than SC- α , cells. Nonetheless, we have generated a list of α cell maturation markers that provides insight on enhancing α cell function and targeting further maturation in SC-islet differentiations. EC cells are an intestinal, serotonin-secreting endocrine off-target cell type generated during endocrine differentiation (Veres et al., 2019). They are present in both the stage 6 and grafted SC-islet populations, but their effects on SC-islet function and maturation is unknown.

GSEA and pseudo-time ordering analysis revealed multiple transcriptional genes and gene sets enriched in grafted SC-islet subpopulations. A shared observation in grafted SC- β , SC- α , and SC-EC cells is the increased expression of metallothionein and *FOS/JUN* genes. Enrichment of these pathways indicates further development and terminal differentiation of these cell types. Interestingly, several identified SC- β Cell maturation genes are highly expressed prior to *MAFA* expression in pseudo-time, possibly indicating they regulate *MAFA* expression. Potentially, prolonged exposure to factors associated with these signaling components may lead to SC-islet, namely, SC- β and SC- α cell, maturity *in vitro*. Targeting these pathways could result in improved *in vitro* differentiation protocols.

The approach in this study involved the transplantation SC- β Cells into mice with pre-existing STZ-induced diabetes. However, the conditions of optimal maturation, such as transplantation time, diabetic model, and STZ induction before or after transplant, are unknown and would be an interesting study. Cells in an *in vivo* setting, particularly when not in their natural organ, may undergo de-differentiation or trans-differentiation to become other cell types (Teo et al., 2018; Ye et al., 2015). Because we did not observe progenitor populations in our sequencing data, we believe that the majority of our transplanted populations are retained to their identity. However, it may be possible that some SC- α cell or exocrine cell populations may trans-differentiate into INS-producing cells as demand for blood INS and GCG changes overtime (Ye et al., 2015), and this study did not utilize lineage tracing. An additional limitation of this study was the yields of SC- β Cells we recovered from individual mice, ranging from 111 to 560 SC- β Cells. This prompted us to pool the results from five mice for most of the analysis in this study, but improvements, such as better purification, additional mice, and more differentiations, would better enable robust studies. Furthermore, incorporating the primary HI datasets caused small variations in identified cell types, although overall gene expression differences were not meaningfully affected. An additional limitation is the technical processing of scRNA-seq, which conceivably may yield free-floating mRNA transcripts yielding false positives (Sachs et al., 2020). However, our analysis here of the cell-defining and hormone transcripts comparisons among cell types was significantly different between endocrine and non-endocrine cell types, as we have shown previously (Maxwell et al., 2020), making this possibility unlikely.

In conclusion, we provide a resource thoroughly detailing the maturation of SC- β Cells through *in vivo* transplantation. SC- β Cells derived from both hiPSC and hESC lines are capable of developing into cells transcriptionally similar to primary human β Cells. This dataset provides valuable information on potential genes and target pathways that may contribute to understanding human β Cell maturation following transplantation. More importantly, it can lead to further developments in SC- β Cell generation for cell replacement therapies.

STAR★METHODS

RESOURCE AVAILABILITY

Lead Contact—Further information and requests for resources and reagents should be directed to and will be fulfilled by the Lead Contact, Jeffrey R. Millman (jmillman@wustl.edu).

Materials Availability—HUES8 cell line is available through Harvard Stem Cell Institute (HSCI). The WS4^{corr} cell line is available upon request to Lead Contact with required MTA.

Data and Code Availability—The single cell RNA sequencing data from this study is made available at the Gene Expression Omnibus (GEO). The accession number for the raw and processed Stage 6 hESC-islet and all Grafted SC-islet data is GEO: GSE151117. The accession number for the raw and processed Stage 6 hiPSC-islet data is GEO: GSE139535. The accession number for the raw and processed human islet data is GEO: GSE114297.

EXPERIMENTAL MODEL AND SUBJECT DETAILS

Animal models—Male, 7 wk old, NOD.Cg-*Prkdc^{scid} Il2rg^{tm1Wjl}/SzJ* (NSG) mice (Jackson Laboratories; stock no. 005557) were used in this study. Mice were fed on chow diet and on a 12 hour light/dark cycle. Animals were randomly assigned to experimental groups. All animal studies performed in this research were in accordance with Washington University International Care and Use Committee (IACUC) regulations.

Human cell lines—Two human PSC lines were used in this study including an hESC line (HUES8) and an hiPSC (WS4^{corr}) line. Both cell lines are authenticated and have normal karyotype. The sex of HUES8 and WS4^{corr} are male and female, respectively. The cells were cultured in mTeSR1 (StemCell Technologies; 05850) in a 5% CO₂ incubator at 37°C. Cells were single cell dispersed with TrypLE (Life Technologies; 12-604-039) and passaged every 3–4 days. A Vi-Cell XR (Beckman Coulter) counted viable single cells and we seeded 1.1×10⁵ cells/cm² cells onto tissue culture-treated flasks, coated with DMEM-diluted (GIBCO, 11965–084) Matrigel-coated (Fisher, 356230) for propagation in mTeSR1 with 10µM Y27532 (Abcam; ab120129). All work for this study was performed in accordance with the Embryonic Stem Cell Research Oversight (ESCRO) committee through Washington University in St. Louis.

Primary cell culture—Cadaveric human islets were purchased from Prodo Labs and cultured in islet media (CMRL Supplemented (Mediatech; 99–603-CV) with 10% Fetal Bovine Serum (GE Healthcare; SH3007003)). For RNA, donor islets were from a 54 year-old Hispanic female. Details for donor islets for sequencing comparison are as follows (1) Caucasian, 32 years, female, (2) Hispanic, 23 years, male, (3) Caucasian, 49 years, male.

Stem cell-derived β Cell differentiation—The differentiation is based on our previous publication (Hogrebe et al., 2020). Undifferentiated hPSCs were single cell dispersed, counted, and seeded onto tissue culture plastic treated flasks with mTeSR1 and 10µM Y27532 at 5.2×10⁵ cells/cm². After 24 hours, differentiation began using medias and added factors. The differentiation protocol including base media formulation and differentiation factors is available in Table S1. 7 days into stage 6, cells were dispersed with TrypLE and seeded ~5×10⁶ cells into an individual well of a 6-well plate with 4 mL of ESFM media on an OrbiShaker (Benchmark) at 100 RPM. Cells were used for transplantation between day 13–16 in stage 6.

METHOD DETAILS

Mouse Transplants—All animal studies performed in this research were in accordance with Washington University International Care and Use Committee (IACUC) regulations. Prior to transplantation of cells, male, 7 wk old, NOD.Cg-*Prkdc^{scid} Il2rg^{tm1Wjl}/SzJ* (NSG) mice (Jackson Laboratories; stock no. 005557) were treated with 45 mg/kg streptozotocin (STZ; R&D; 1621500) in 0.9% sterile saline (Moltox; 51–405022.052) for 5 consecutive days. Mice were diabetic (blood glucose > 500 mg/dL) 8 days after the final STZ injection. Surgery and assessments were performed by unblinded individuals and mice were randomly assigned to experimental groups. For SC-islet transplantation, mice were anesthetized with isoflurane and injected with ~5×10⁶ SC-islet cells under the kidney capsule, from either

hiPSC (n = 3) or hESC (n = 2) derived SC- β Cells. Mice were monitored for 6 months after transplantation before removal of the transplanted kidney for SC-islet retrieval. For glucose tolerance tests (GTT) and *in vivo* glucose stimulated c-peptide secretion, mice were fasted for 4 hr and injected with 2 g glucose/kg body weight. For GTT, blood glucose was measured every 30 min from 0 to 120 min with a Contour Blood Glucose Monitoring System (Bayer; 9545C). For *in vivo* glucose stimulated c-peptide secretion, serum was collected before and 1 hr after glucose stimulation. Hormones were quantified by collecting serum and measuring C-peptide and IAPP with the Human Ultrasensitive C-Peptide ELISA kit (Merckodia; 10-1141-01) and Human Amylin ELISA kit (Miltenyi; EZHA-52K), respectively.

Immunostaining—Stage 6 clusters and excised transplant kidneys were fixed overnight in 4% paraformaldehyde (PFA) (Electron Microscopy Science; 15714) at 4°C. Fixed kidneys and Stage 6 clusters, suspended in Histogel (Thermo Scientific; hg-4000-012), were further processed by the Division of Comparative Medicine (DCM) Research Animal Diagnostic Laboratory Core at Washington University. HistoClear (Electron Microscopy Sciences; 64111-04) removed paraffin from slides containing both Stage 6 and kidney sections. Sections were then rehydrated and antigens were retrieved in a pressure cooker (Proteogenix; 2100 Retriever) with 0.05 M EDTA (Ambion; AM9261). Slides were blocked and stained with primary antibodies diluted in immunostaining solution (PBS (Fisher; MT21040CV) with 0.1% Triton X (Acros Organics; 327371000) and 5% donkey serum (Jackson ImmunoResearch; 017000-121)) overnight at 4°C, stained with diluted secondary antibodies for 2 hr at room temperature, and stained for DAPI (SouthernBiotech; 0100-20). The immunostained cells and grafts were imaged with a Nikon A1RSi confocal microscope. Antibody details and dilutions are available in Table S7.

Tissue and Cell Preparation for Sequencing

Stage 6 SC-islet preparation.: At stage 6 day 14, SC-islets were washed with PBS and single cell dispersed with TrypLE at 37°C for ~20 minutes. The dispersed cells were centrifuged, counted, and resuspended in DMEM for library prep.

Grafted SC-islet cell retrieval.: Transplanted mice were euthanized through cervical dislocation and the kidney transplanted with SC-islets were removed. Excess scar tissue and fat was removed from around the kidney. Images were taken of the kidneys to visualize the transplanted cells. The kidney was sliced into several small pieces with a razor blade and placed into a solution of 2mg/mL collagenase D (Sigma; 11088858001) in RPMI (GIBCO; 11875-085). The tissue was incubated at 37°C for 45 min. PBS was added to the solution and additional breakup was enforced with a pipette before filtering the cells through a 70mm cell strainer (Corning; 431751). Collected flow through was centrifuged, supernatant was removed, and resuspended with MACS buffer (0.05% BAS in PBS). A Miltenyi mouse cell isolation kit (kit, 130-104-694; LS column, 130-042-401) was used to remove excess mouse cells from the cell solution. Cells in flow through were collected, centrifuged, counted, and resuspended in DMEM for library prep.

Single-cell RNA sequencing preparation—Single cell dispersed cells were delivered to Washington University in St. Louis Genome Technology Access Center (GTAC) for library preparation and sequencing. For library preparations, the Chromium Single Cell 3' Library and Gel Bead Kit v2 was used following the provided protocol. In summary, a microfluidic platform is used to profile digital gene expression for individual cells by creating an emulsion for each cell with a unique barcoded cDNA, breaking the emulsion, and amplifying the cDNA. The library was sequenced with a NovaSeq 6000 System (Illumina) at the recommended 26×98bp. Gene expression levels found in violin plots and heatmaps are displayed in Log(normalized read count) and normalized average gene expression, respectively.

Single-cell RNA sequencing data analysis: Raw Data Processing—Seurat v2.3.4 was used for single cell analyses and comparison between all groups (Butler et al., 2018). Monocle v2.12.0 was used for pseudotime analysis between Stage 6 and grafted SC-β Cells (Qiu et al., 2017; Trapnell et al., 2014) and WS4^{corr} Stage 6 data is from Maxwell et al. (<https://doi.org/10.1126/scitranslmed.aax9106>) SC-islet samples were aligned to the human genome and filtered out low gene counts (< 500 for grafted and < 3000 for Stage 6) and high mitochondrial percentages (> 20%) for further data analysis, indicating doublets, debris, and dying cells. This filtering removed several mouse cells present in the grafted SC-islet samples. The minimum number of genes is lower for the grafted compared to Stage 6 SC-islet samples to filter out the mouse cells, because our datasets are aligned to the human genome, therefore the mouse cells have low gene counts. Therefore, we clustered the grafted SC-islet samples and identified the clusters with low gene counts. We identified TTC36, a kidney gene which is present in both mouse and human genomes, to also be highly expressed in the low gene number clusters. We removed all cells with TTC36 log-normalized expression > 3, to remove all remaining mouse cells from further analysis. The genes defining the cell cluster that was identified as mouse cells can be found in Table S1. Each sample dataset was normalized with global-scaling normalization. *FindVariableGenes* function removed outlier genes using a scaled z-score dispersion.

Clustering—For individual tSNE plots, cells with similar gene expression patterns were plotted near each other based on PCA using the *FindClusters* function. We used a resolution of 0.2 and 5 dimensions to generate tSNE plots for each individual sample (Stage 6 iPS SC-islets, Stage 6 ES SC-islets, 3 Grafted ES SC-islets, 2 Grafted iPS SC-islets). The top 50 genes that separated each cluster within the individual samples were identified with *FindAllMarkers* and these gene sets were used to designate the different SC-islet cell types including beta, alpha, and delta cells. These gene lists can be found in Table S2. The *FeaturePlot* function was used to visualize expression of specific genes across the different clusters, represented in tSNE plots. Violin plots were generated to compare the expression of specific genes for the SC-β Cell populations within the SC-islets for each sample.

DE between Stage 6 and Grafted SC-islets—We combine datasets for the same hPSC source using canonical correlation analysis (CCA) with *RunMultiCCA* (num.ccs = 10). The CCA subspaces are aligned with *AlignSubspace*. Unsupervised tSNE plots were generated for the combined dataset with *RunTSNE* using 17 dimensions. Clusters were designated

specific cell types based on differentially expressed genes in each cluster compared to all other clusters, identified with *FindMarkers*. These gene lists can be found in Table S3. For further analyses, we compare Stage 6 and Grafted SC- β Cells by only comparing the most enriched INS β Cell cluster. Additionally, we do this for SC- α and SC-EC cells. We are able to identify all differentially expressed genes for SC- β , SC- α , and SC-EC cells between conditions using *FindMarkers* with a log fold change threshold of 0.25; these genes can be found in Table S4. We generate a heatmap for the top differentially expressed genes.

Pathway Enrichment—Genes defining branch points in pseudotime analysis and between sample groups were analyzed for KEGG and GO pathway enrichment and differential expression of HALLMARK gene sets by GSEA (4.0.2). Top enriched genes for the identified pathways and gene sets, with NES scores above 1.0 or below -1.0 and FDR q -value < 0.25 for either or both of the derived cell line conditions, were considered in our analysis.

Pseudotime Trajectory with Monocle—Filtered scRNA-seq data containing only β , α , or EC cells from Seurat was transferred for subsequent pseudotime trajectory analysis using Monocle v 2.12.0 (Trapnell et al., 2014). The data was reanalyzed by clustering the datasets using *clusterCells* to identify Stage 6 and Grafted populations. Differentially expressed genes between the two identities were calculated using *differentialGeneTest*. We used the top 800, 1000, 1500 genes by lowest q -value to reduce dimensions using *DDRTree* method for β , α , or EC cells, respectively. Cells were ordered using the *orderCells* function and pseudotime was defined by selecting states representative of Stage 6 cells being the initial state. The pseudotime heatmap and gene plots were generated using *plot_pseudotime_heatmap* and *plot_genes_in_pseudotime*, respectively. The top differentially expressed genes between branches of pseudotime were defined for β , α , and EC cell populations. The list of genes can be found in Table S4.

Comparison to human islets—Next, we compare our Stage 6 and Grafted SC-islets, and specifically SC- β and SC- α cells, to primary human islets from cadaveric donors. The human islet datasets come from Xin et al., 2018 (<https://doi.org/10.2337/db18-0365>) and can be found at Gene Expression Omnibus database with accession number GEO: GSE114297. We selected three human islet patients for our comparison analysis. As previously described, 10 datasets (Stage 6 SC-islets (iPSC and ESC), grafted SC-islets (iPSC ($n = 2$) and ESC ($n = 3$)), human islet donors ($n = 3$)) were normalized and subspaces were aligned using CCA to generate unsupervised tSNE plots with resolution of 0.1 and 30 dimensions. Clusters were designated specific cell types based on differentially expressed genes in each cluster compared to all other clusters, identified with *FindMarkers*. These gene lists can be found in Table S5. The combined tSNE plot is used to specifically compare β , α , and EC cells among samples, by selecting cells containing the INS, GCG, or TPH1 gene (low.thresholds = $c(0.1)$). In addition we analyzed MAFA+ β Cells from within the β Cell enriched cluster (MAFA log-normalized expression > 0.2). Differential expression of the β , MAFA+ β , and α cells from each sample (Stage 6, Grafted, Human Islet) were identified. A heatmap and/or correlation matrix was generated reflecting each sample's expression of the differentially expressed genes or transcriptome similarity, respectively. A list of the genes differentially

expressed for a specific cell type, between human islet and Stage 6 or human islet and Grafted stem cell-derived cells can be found in Table S6. For correlation matrix, the average expression levels of the most differentially expressed genes were used and generated by Pearson method using *cor*. Values for the correlation matrix can be found in Table S6. Pseudotime trajectory construction with monocle was also used for β and α cells in combination with human islet data to generate branching trajectories and gene plots in pseudo-time.

Real-Time PCR—RNA from human islets and Stage 6 hiPSC- β and hESC- β Cells was extracted using an RNeasy Mini Kit (QIAGEN; 74016) and DNase treatment (QIAGEN; 79254). cDNA was synthesized using the High Capacity cDNA Reverse Transcriptase Kit (Applied Biosystems; 4368814) and a thermocycler (Applied Biosystems; A37028). PowerUp SYBR Green Master Mix (Applied Biosystems; A25741) generated real-time PCR reactions in a StepOne Plus (Applied Biosystems). Data was analyzed with the Ct methodology. TBP and GUSB were used for normalization and primer sequences are available in Table S1.

Software—Data was analyzed using Rstudio version 3.6.1 with Seurat version 2.3.4 (Butler et al., 2018) and Monocle version 2.12.0 (Qiu et al., 2017; Trapnell et al., 2014).

IAPP Secretion *in vitro*—To quantify IAPP protein secretion *in vitro*, the cells were cultured on transwells in a solution of 128 mM NaCl, 5 mM KCl, 2.7 mM CaCl₂, 1.2 mM MgSO₄, 1 mM Na₂HPO₄, 1.2 mM KH₂PO₄, 5 mM NaHCO₃, 20 mM glucose, 10 mM HEPES (GIBCO; 15630–080) and 0.1% bovine serum albumin (Proliant; 68700) for 1 hr. The solution was collected and IAPP quantified with the Human Amylin ELISA kit.

QUANTIFICATION AND STATISTICAL ANALYSIS

GraphPad Prism 8.2.1 was used to calculate two-sided unpaired and paired t tests. $p < 0.05$ was considered statistically significant. Data is displayed as mean \pm s.e.m. Sample size, n , represents total biological replicates. Tests used for individual panels, sample size (n), and statistical parameters are detailed in figure legends.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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Highlights

- SC-islets show improved insulin and IAPP release with time in transplanted diabetic mice
- SC-islet cells undergo drastic transcriptome changes after 6 months *in vivo*
- Grafted SC- β Cells mature and express MAFA, CHGB, G6PC2, and FAM159B *in vivo*
- Differentially expressed genes upon transplantation resemble native human islet cells

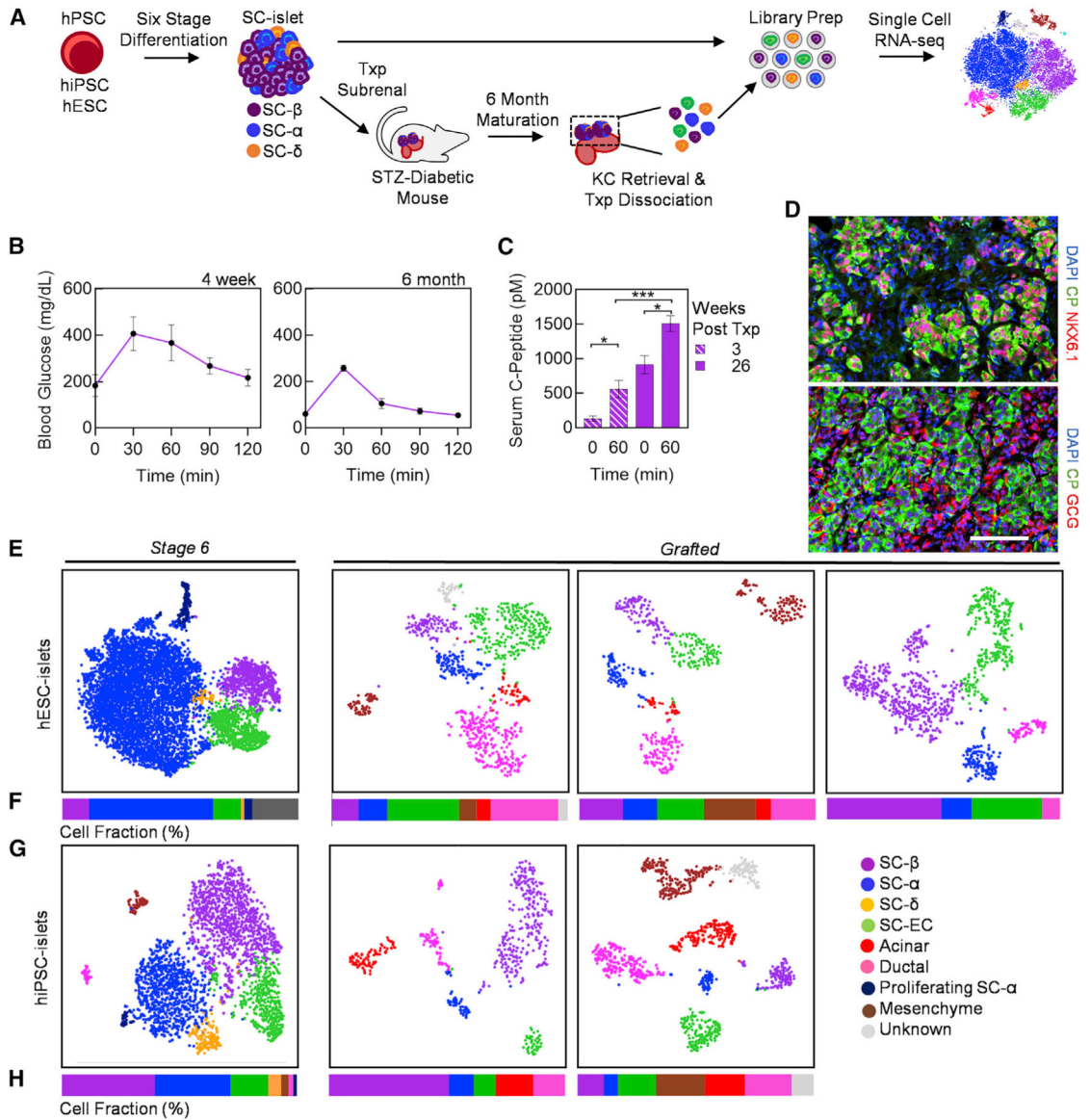


Figure 1. Single-Cell Transcriptional Characterization of Stage 6 and Grafted hPSC-Islets Identifies Endocrine and Non-Endocrine Cell Populations

(A) Schematic summary of single-cell analysis of stage 6 SC-islets and grafted SC-islets following 6 months of *in vivo* maturation in diabetic mice.

(B) Glucose tolerance test (GTT) at 4 weeks and 6 months after transplantation of SC-islets (n = 5).

(C) *In vivo* glucose-stimulated CP secretion at 0 min, before, and 60 min after glucose injection at 3 and 26 weeks post-transplantation (n = 5). *p < 0.05, ***p < 0.001 by two-way unpaired t test.

(D) Immunostaining of kidney graft explanted from SC-islet transplanted mice at 6 months. Scale bar, 100 μm.

(E–H) Individual tSNE projection (E and G) and cell population fractions (F and H) from unsupervised cluster of stage 6 and grafted hESC- and hiPSC-islets. CHGA, chromogranin

A; CP, C-peptide; EC, enterochromaffin; GCG, glucagon. Error bars represent SEM. See also Figure S1 and Table S2.

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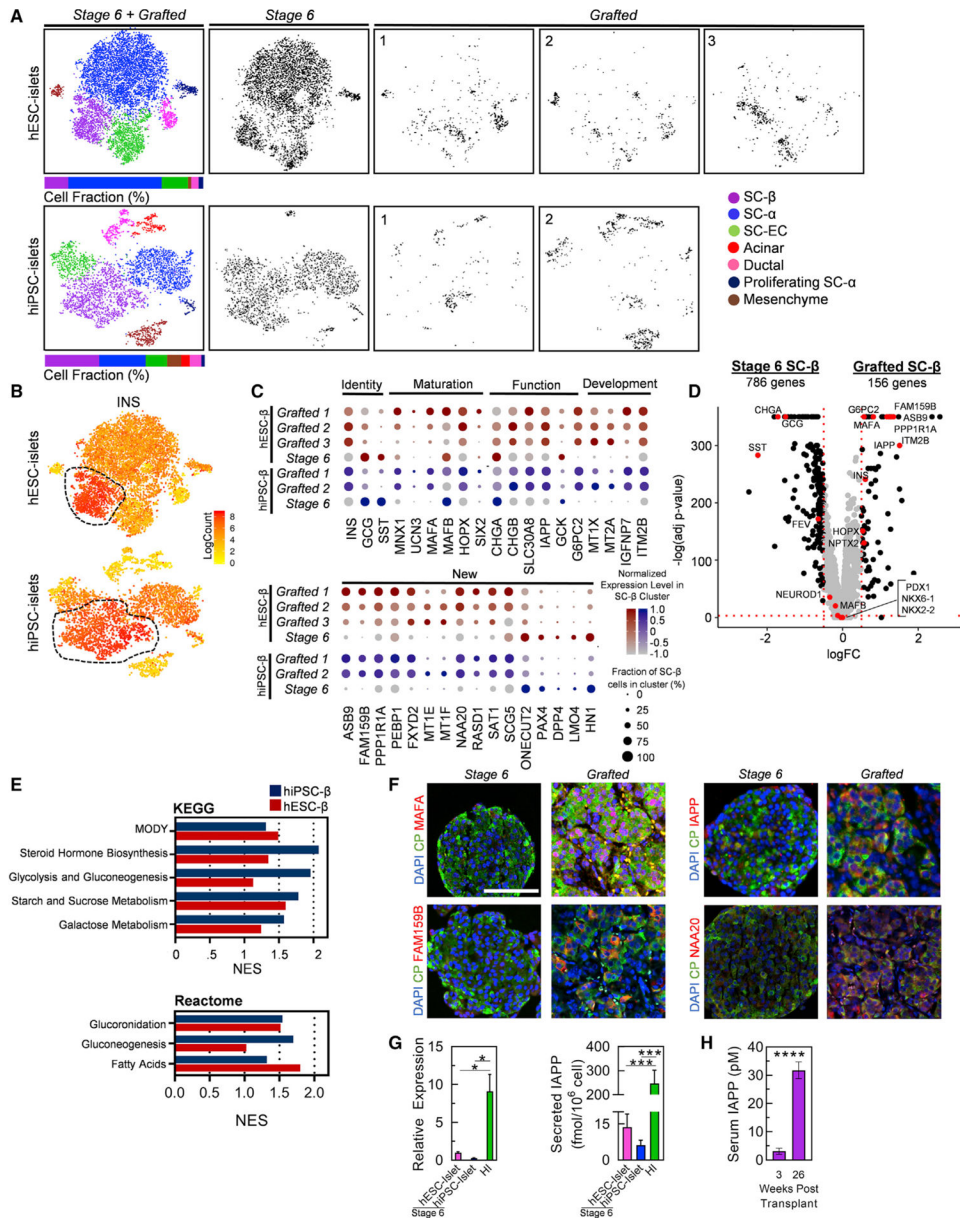


Figure 2. Comparison of Stage 6 and Grafted hiPSC-β and hESC-β Cell Transcriptomes
 (A) Unsupervised clustering tSNE projections of hESC-islets and hiPSC-islets with islet cell-type identification and cell proportions for each individual sample (gray).
 (B) Heatmap of INS gene expression to distinguish SC-β Cell population for both hESC-islet and hiPSC-islet samples.
 (C) Normalized expression values for key β Cell identity, maturation, functional, developmental, and newly identified gene sets compared between stage 6 and grafted SC-β Cells for both hiPSC-β and hESC-β datasets. Percentage of cells positive for designated gene is represented by circle size, and saturation indicates low (gray) or high (blue/red) expression of the gene.
 (D) Volcano plot displaying fold change (FC) differences of β Cell genes between stage 6 and grafted SC-β Cells of all hESC- and hiPSC-derived samples combined. Dashed lines are

drawn to define restriction of log FC value of 0.25 and $-\log$ of adjusted p value 0.001. Key β Cell genes are labeled and colored red.

(E) KEGG and Reactome GSEA, quantified by the normalized enrichment score (NES), for pathways upregulated in grafted hESC- β (red) and hiPSC- β (blue) compared to stage 6 hESC- β or hiPSC- β Cells, respectively. NES values and gene lists are available in Table S4.

(F) Immunostaining of stage 6 and 6-month kidney grafts containing SC-islets for identified β Cell maturation markers (red) co-stained with CP (green). Scale bar, 100 μ m.

(G) Analysis of IAPP gene expression with real-time PCR (left; n = 4) and secreted IAPP protein (right; n = 11, n = 8, n = 9 for stage 6 hESC-islet, stage 6 hiPSC-islet, and HIs, respectively) *in vitro*. *p < 0.05, ***p < 0.001 by two-way unpaired t test.

(H) IAPP protein in serum of mice transplanted with SC-islets for 3 and 26 weeks (n = 5). ****p < 0.0001 by two-way unpaired t test.

INS, insulin; MODY, maturity onset diabetes of the young; CHGB, chromogranin B; IAPP, islet amyloid polypeptide; HI, human islet. Error bars represent SEM. See also Figures S1 and S2 and Table S3.

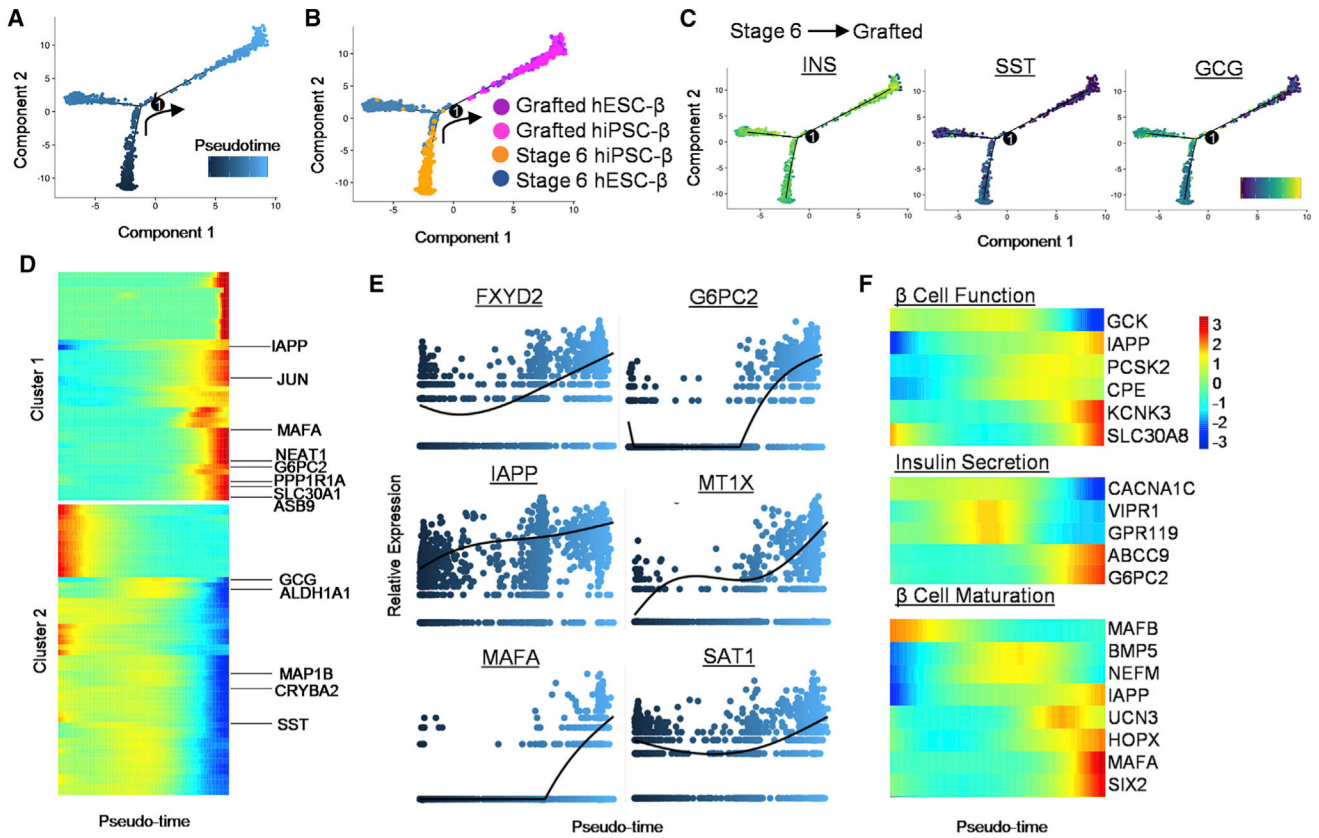


Figure 3. Pseudo-Time Analysis Projects Stage 6 SC-β Cell Maturation into Grafted SC-β Cells after Transplantation

(A) Pseudo-time trajectory of stage 6 and grafted SC-β Cells with one branching point. (B) Distribution of SC-β Cells from grafted hESC-β (purple), grafted hiPSC-β (pink), stage 6 hiPSC-β (orange), and stage 6 hESC-β Cells (blue). (C) Changes in gene expression of endocrine hormones—INS, somatostatin (SST), and GCG—along pseudo-time projection for SC-β Cells. Scale: relative expression. (D) Analysis of top 100 branch-dependent genes determined based on clusters identified through pseudo-time analysis of SC-β Cells, found in Table S4. Scale: relative expression. (E) Relative expression level of selected β Cell genes along SC-β Cell pseudo-time. (F) Gene expression heatmap of select β Cell genes focused on function and maturation along pseudo-time. Scale: normalized expression. See also Figure S3 and Table S4.

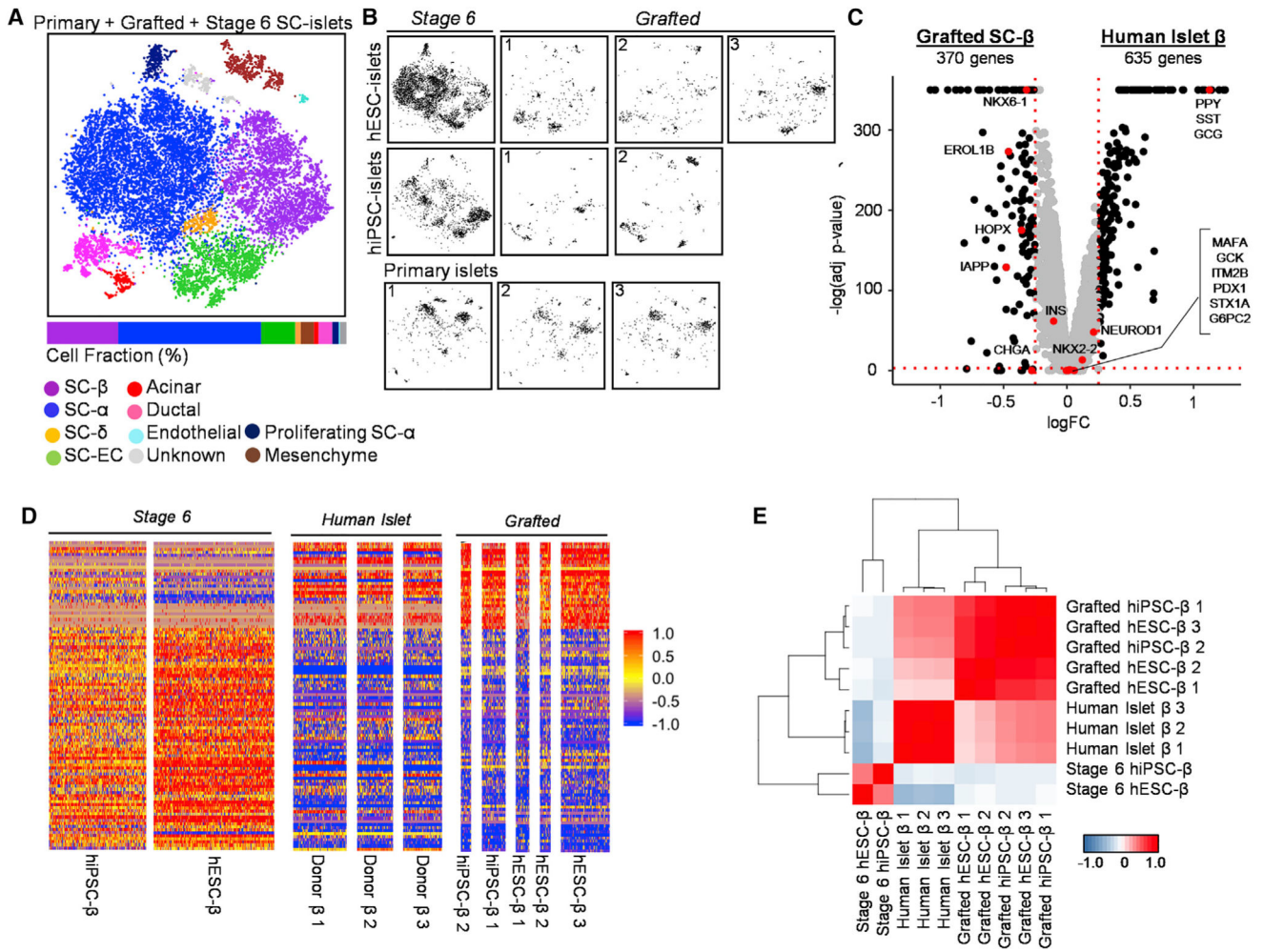


Figure 4. Grafted SC-β Cells Resemble Primary Human β Cells Compared to Stage 6 SC-β Cells

(A) Unsupervised tSNE projection from 10 islet datasets including stage 6 hiPSC- and hESC-islets, three grafted hESC-islets, two grafted hiPSC-islets, and three primary HIs. (B) Individual location of different samples within combined tSNE projection. (C) Volcano plot displaying FC differences of β Cell genes between grafted SC-β (left) and HI β Cells (right). Dashed lines are drawn to define restriction of log FC value of 0.25 and $-\log$ of adjusted p value 0.001. Key β Cell genes are labeled and colored red. (D) Heatmap showing gene expression values for stage 6, grafted SC-β, and primary HI (donor) β Cells of the 100 most differentially expressed genes between stage 6 and grafted SC-β Cells listed in Table S6. Scale: normalized expression. (E) Pearson correlation matrix and hierarchical clustering to identify most similar populations among all β Cell samples using top 430 variable genes. Pearson correlation values detailed in Table S6. Scale: correlation coefficient. See also Figure S4 and Tables S4, S5, and S6.

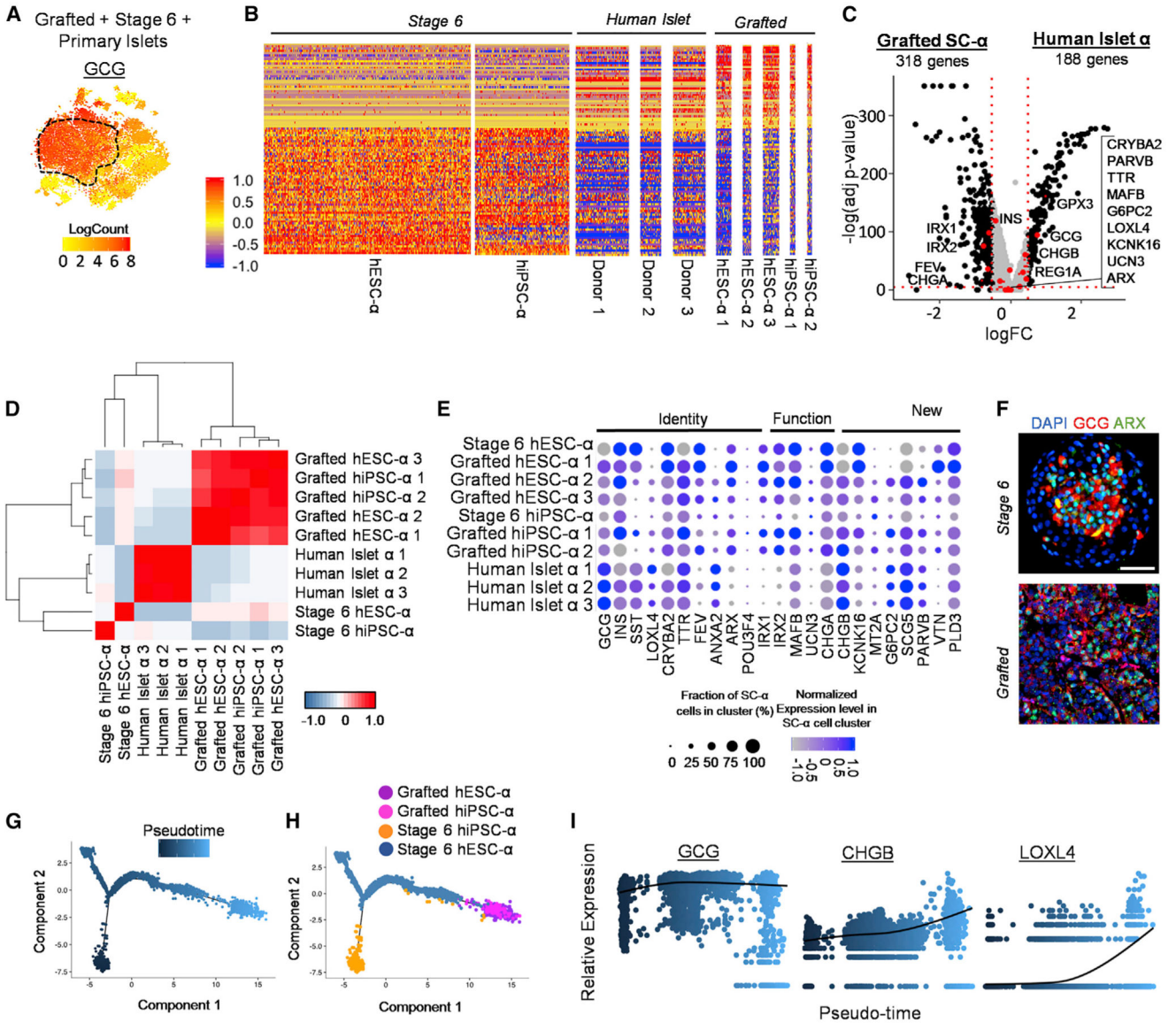


Figure 5. Single-Cell Transcriptome and Pseudo-Time Analysis Indicates Stage 6 SC- α Cells Mature during Transplantation to More Closely Resemble HI α cells

(A) Heatmap of GCG gene expression to distinguish SC- α cell populations within tSNE plot from Figure 4A.

(B) Normalized gene expression values for two stage 6 SC- α , five grafted SC- α , and three primary HI (donor) α cells of the 100 most differentially expressed genes between stage 6 and grafted SC- α cells listed in Table S6. Scale: normalized expression.

(C) Volcano plot displaying FC differences of α cell genes between grafted SC- α (left) and HI α cells (right). Dashed lines are drawn to define restriction of log FC value of 0.25 and $-\log$ of adjusted p value 0.001. Key α cell genes are labeled and colored red.

(D) Pearson correlation matrix and hierarchical clustering to identify most similar populations among all α cell samples using top 430 variable genes. Pearson correlation values detailed in Table S6. Scale: correlation coefficient.

(E) Normalized expression values for key α cell identity, function, and newly identified genes among stage 6 SC- α , grafted SC- α , and primary human α cells. Percentage of cells positive for designated gene is represented by circle size, and saturation indicates low (gray) or high (blue) expression of the gene.

(F) Immunostaining of stage 6 and 6-month kidney graft containing SC-islets for α cell markers. Scale bar, 50 μm .

(G and H) Pseudotime trajectory (G) and distribution (H) of SC- α cells from seven hPSC- α samples.

(I) Relative expression level of selected α cell genes along SC- α cell pseudo-time. Scale: relative expression. Each dot represents a different cell. See also Figure S5 and Tables S3, S4, and S6.

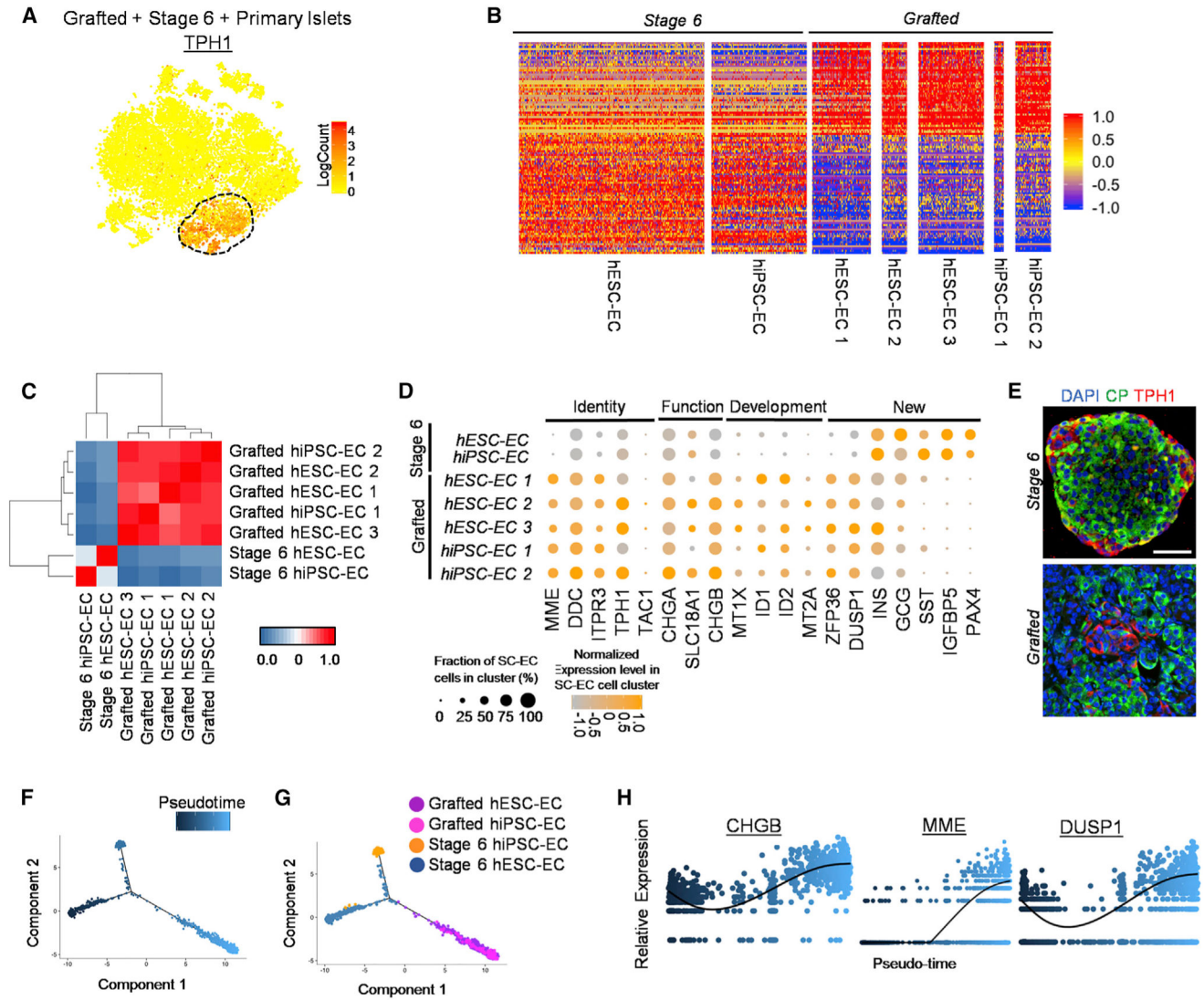


Figure 6. Analysis of Pseudo-Time and Single-Cell Transcriptomes of Stage 6 hPSC-ECs and Grafted hPSC-EC Cells Following Transplantation

(A) Heatmap of TPH1 gene expression to distinguish SC-EC cell population within tSNE plot from Figure 4A.

(B) Gene expression values for two stage 6 SC-EC cells and five grafted SC-EC cells for the 100 most differentially expressed genes between stage 6 and grafted SC-EC cells listed in Table S6. Scale: normalized expression.

(C) Pearson correlation matrix and hierarchical clustering to identify most similar populations among all EC cell samples using top 430 variable genes. Scale: correlation coefficient.

(D) Expression values for key EC cell identity, function, development, and newly identified genes between stage 6 and grafted SC-EC cells.

(E) Immunostaining of stage 6 and 6-month kidney graft containing SC-islets for EC cell marker TPH1. Scale bar, 50 μ m.

(F and G) Distribution (F) of SC-EC cells along pseudo-time trajectory (G) from seven SC-EC samples.

(H) Relative expression of select EC cell genes along SC-EC cell pseudo-time. Scale: relative expression. Each dot represents a different cell.

TPH1, tryptophan hydroxylase 1. See also Figure S6 and Table S4.

KEY RESOURCES TABLE

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Antibodies		
Rat anti C-peptide	DSHB	Cat#GN-ID4; RRID:AB_2255626
Mouse anti NKX6-1	DSHB	Cat#F55A12; RRID:AB_532379
Rabbit anti Glucagon	Cell Marque	Cat#259A-18; RRID:AB_1158356
Goat anti PDX1	R&D Systems	Cat#AF2419; RRID:AB_355257
Rabbit anti CHGA	ABCAM	Cat#ab15160; RRID:AB_301704
Rabbit anti MAFA	LifeSpan Bioscience	Cat#LP9872; RRID:AB_2665528
Rabbit anti FAM159B	Invitrogen	Cat#PA5-52855; RRID:AB_2641287
Rabbit anti NAA20	Invitrogen	Cat#PA5-66574; RRID:AB_2663038
Rabbit anti IAPP	Sigma Aldrich	Cat#PA5-84142; RRID:AB_2791294
Sheep anti ARX	Invitrogen	Cat#PA5-47896; RRID:AB_2605931
Sheep anti TPH1	EMD Millipore	Cat#AB1541; RRID:AB_90754
Sheep anti Trypsin	R&D	Cat#AF3586; RRID:AB_2846900
Mouse anti KRT19	Dako	Cat#M0888; RRID:AB_2234418
anti-rat-alexa fluor 488	Invitrogen	Cat#a21208; RRID:AB_141709
anti-rabbit-alexa fluor 488	Invitrogen	Cat#a21206; RRID:AB_2535792
anti-rat-alexa fluor 488	Invitrogen	Cat#a21208; RRID:AB_141709
anti-mouse-alexa fluor 594	Invitrogen	Cat#a21203; RRID:AB_141633
anti-rabbit-alexa fluor 594	Invitrogen	Cat#a21207; RRID:AB_141637
anti-goat-alexa fluor 594	Invitrogen	Cat#a11058; RRID:AB_2534105
anti-sheep-alexa fluor 594	Invitrogen	Cat#a11016; RRID:AB_10562537
Biological Samples		
Healthy Human Islets	Prodo Labs	N/A
Chemicals, Peptides, and Recombinant Proteins		
mTeSR1	StemCell Technologies	Cat#05850
Y27632	Abcam	Cat#ab120129
Matrigel	Corning	Cat#356230
TrypLE	Life Technologies	Cat#12-604-039
DNase	QIAGEN	Cat#79254

REAGENT or RESOURCE	SOURCE	IDENTIFIER
HEPES	GIBCO	Cat#15630-080
Tris	MilliporeSigma	Cat#T6066
EDTA	Ambion	Cat#327371000
Paraformaldehyde	Electron Microscopy Science	Cat#15714
Donkey Serum	Jackson ImmunoResearch	Cat#017-000-121
Triton X-100	Acros Organics	Cat#327371000
DMEM	MilliporeSigma	Cat#D6429
Fetal Bovine Serum	MilliporeSigma	Cat#F4135
Histo-clear II	Electron Microscopy Sciences	Cat#64111-04
Histogel	Thermo Scientific	Cat#Hg-4000-012
0.5 M EDTA	Ambion	Cat#AM9261
200 proof ethanol	Decon	Cat#2716
STZ	R&D	Cat#1621500
Critical Commercial Assays		
Ultrasensitive C-Peptide Elisa	Mercodia	Cat#10-1141-01
Human Amylin Elisa	Miltenyi	Cat#EZHA-52K
RNeasy Mini Kit	QIAGEN	Cat#74016
High Capacity cDNA Reverse Transcriptase Kit	Applied Biosystems	Cat#4368814
PowerUp SYBR Green Master Mix	Applied Biosystems	Cat#A25741
Chromium Single Cell 3' Library & Gel Bead Kit	10X Genomics	Cat#PN-120267
Deposited Data		
raw and processed single cell RNA seq data - Stage 6 hESC-islet, 2 Grafted hiPSC-islet	This Paper	GEO: GSE151117
raw and processed single cell RNA seq data - Stage 6 hiPSC-islet	Maxwell et al., 2020	GEO: GSE139535
raw and processed single cell RNA seq data - Human Islets	Xin et al., 2018	GEO: GSE114297
Experimental Models: Cell Lines		
Human: HUES8 hESC	HSCI	hES Cell Line: HUES-8
Human: WS4 ^{corr}	Maxwell et al., 2020	N/A
Experimental Models: Organisms/Strains		
Mouse: <i>NOD.Cg-Pkdx^{cid}J129^{mi}Wj/SzJ</i> (NSG)	The Jackson Laboratories	JAX: 005557; RRID:IMSR_JAX:005557
Oligonucleotides		

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Primers for this study, see Table S1	This paper	N/A
Software and Algorithms		
Fiji ImageJ	ImageJ public freeware	https://imagej.net/Fiji/Downloads ; RRID:SCR_003070
GraphPad Prism 8.2.1	GraphPad	https://www.graphpad.com/scientific-software/prism/ ; RRID:SCR_002798
FLOWJO	FLOWJO	https://www.flowjo.com/solutions/flowjo/downloads ; RRID:SCR_008520
GSEA 4.0.2	GSEA	https://www.gsea-msigdb.org/gsea/index.jsp ; RRID:SCR_003199
RStudio	RStudio	https://rstudio.com/products/rstudio/download/ ; RRID:SCR_000432
R	R	https://cran.r-project.org/src/base/R-4/
Seurat v2.3.4	Butler et al., 2018	https://satijalab.org/seurat/install.html ; RRID:SCR_007322
Monocle v2.12.0	Qiu et al., 2017	http://cole-trapnell-lab.github.io/monocle-release/docs/#installing-monocle
Other		
Vi-Cell XR	Beckman Coulter	Cat#Vi-Cell XR
Tanswells	Corning	Cat#431752
#1.5 glass bottom 96 well plate	Corning	Cat#963-1.5H-N
8-channel peristaltic pump	Cellvis	Cat#ISM931C
Inlet/outlet two-stop tubing	ISMATEC	Cat#070602-04i-ND
Dispensing nozzle	ISMATEC	Cat#Peri-Nozzle
Connection tubing	BioRep	Cat#Peri-TUB-040
Bio-Gel P-4	Bio-Rad	Cat#150-4124
Cell Chamber	BioRep	Cat#Peri-Chamber
Pressure cooker	Electron Microscopy Sciences	Model#Retriever 2100
DAPI Fluoromount-G	SouthernBiotech	Cat#0100-20
Phosphate-Buffered Saline (PBS)	Corning	Cat#21-040-CV
micro coverslip	VWR	Cat#48393-081