# Gain of 20q11.21 in Human Pluripotent Stem Cells Impairs TGF- $\beta$ -Dependent Neuroectodermal Commitment

C. Markouli,<sup>1</sup> E. Couvreu De Deckersberg,<sup>1</sup> M. Regin,<sup>1</sup> H.T. Nguyen,<sup>2</sup> F. Zambelli,<sup>1,3</sup> A. Keller,<sup>1</sup> D. Dziedzicka,<sup>1</sup> J. De Kock,<sup>4</sup> L. Tilleman,<sup>5</sup> F. Van Nieuwerburgh,<sup>5</sup> L. Franceschini,<sup>6</sup> K. Sermon,<sup>1</sup> M. Geens,<sup>1</sup> and C. Spits<sup>1,\*</sup> <sup>1</sup>Research Group Reproduction and Genetics, Faculty of Medicine and Pharmacy, Vrije Universiteit Brussel, Brussels, Laarbeeklaan 103, 1090 Brussels, Belgium

<sup>2</sup>Center for Molecular Biology, Institute of Research and Development, Duy Tan University, K7/25 Quang Trung, Danang 550000, Vietnam <sup>3</sup>Clínica EUGIN, Travessera de les Corts 322, 08029 Barcelona, Spain

<sup>4</sup>Department of In Vitro Toxicology & Dermato-Cosmetology, Faculty of Medicine and Pharmacy, Vrije Universiteit Brussel, Brussels, Laarbeeklaan 103, 1090 Brussels, Belgium

<sup>5</sup>Laboratory of Pharmaceutical Biotechnology, Faculty of Pharmaceutical Sciences, Ghent University, Ottergemsesteenweg 460, 9000 Ghent, Belgium <sup>6</sup>Laboratory of Molecular & Cellular Therapy, Department of Immunology - Physiology, Faculty of Medicine and Pharmacy, Vrije Universiteit Brussel, Brussels, Laarbeeklaan 103, 1090 Brussels, Belgium

\*Correspondence: claudia.spits@vub.be

https://doi.org/10.1016/j.stemcr.2019.05.005

#### **SUMMARY**

Gain of 20q11.21 is one of the most common recurrent genomic aberrations in human pluripotent stem cells. Although it is known that overexpression of the antiapoptotic gene *Bcl-xL* confers a survival advantage to the abnormal cells, their differentiation capacity has not been fully investigated. RNA sequencing of mutant and control hESC lines, and a line transgenically overexpressing *Bcl-xL*, shows that overexpression of *Bcl-xL* is sufficient to cause most transcriptional changes induced by the gain of 20q11.21. Moreover, the differentially expressed genes in mutant and *Bcl-xL* overexpressing lines are enriched for genes involved in TGF- $\beta$ - and SMAD-mediated signaling, and neuron differentiation. Finally, we show that this altered signaling has a dramatic negative effect on neuroectodermal differentiation, while the cells maintain their ability to differentiate to mesendoderm derivatives. These findings stress the importance of thorough genetic testing of the lines before their use in research or the clinic.

#### **INTRODUCTION**

Human embryonic stem cells (hESCs) can be cultured in vitro for extended periods of time without losing their ability to differentiate into all three germ layers. Their terminally differentiated derivatives have become a potent tool in disease modeling and may play important future roles in regenerative medicine, toxicology tests, and drug screening. As all these applications will require between millions and billions of cells, prolonged culture periods are almost inevitable (Avior et al., 2016; Serra et al., 2012). hESC cultures tend to acquire chromosomal abnormalities that vary in size from small structural variants to full chromosome gains and losses (Keller et al., 2018; Nguyen et al., 2013). Several aberrations are known to be recurrent, such as gains of chromosomes 1, 12, 17, and X, or parts thereof (Amps et al., 2011; Baker et al., 2007; Cowan et al., 2004; Draper et al., 2004; Herszfeld et al., 2006; Inzunza et al., 2004; Maitra et al., 2005; Mitalipova et al., 2005; Yang et al., 2010). Of special interest is the gain of 20q11.21 found in more than 20% of lines worldwide (Amps et al., 2011; Laurent et al., 2011; Lefort et al., 2008; Närvä et al., 2010; Spits et al., 2008; Wu et al., 2008). The smallest region of amplification includes the antiapoptotic gene BCL2L1 (Amps et al., 2011). We, and others, have found that the mutant cells overexpress BclxL, the predominantly expressed isoform of BCL2L1. This

confers a survival advantage to these mutant cells that allows them to quickly take over the culture (Avery et al., 2013; Nguyen et al., 2014).

Although it is generally assumed that chromosome abnormalities influence the functional characteristics of hESCs, particularly on differentiation, only a handful of reports on this topic have been published (Ben-David et al., 2014; Fazeli et al., 2011; Herszfeld et al., 2006; Keller et al., 2018; Werbowetski-Ogilvie et al., 2009; Yang et al., 2008). Undifferentiated chromosomally abnormal hESCs have been found to acquire characteristics such as increased cloning efficiency, decreased population doubling times (Fazeli et al., 2011), increased capacity for cell proliferation and self-renewal, antiapoptotic properties (Baker et al., 2007; Yang et al., 2008), growth factor independence, and an increase in teratoma-initiating cells (Werbowetski-Ogilvie et al., 2009). These studies also demonstrated that hESCs carrying chromosomal abnormalities show altered gene expression patterns when compared with normal cell lines, while retaining theirpossibly reduced-differentiation capacity (Fazeli et al., 2011; Werbowetski-Ogilvie et al., 2009). Karyotypically abnormal hESCs tend to produce immature teratomas when injected in vivo, containing a higher proportion of poorly differentiated or undifferentiated cells when compared with normal hESCs (Herszfeld et al., 2006; Werbowetski-Ogilvie et al., 2009; Yang et al., 2008). These





(legend on next page)



studies also show an upregulation of a number of oncogenes, concurrent with a downregulation of genes related to differentiation, which has been interpreted as a first step toward malignant transformation (Gopalakrishna-Pillai and Iverson, 2010; Werbowetski-Ogilvie et al., 2009; Yang et al., 2008). Furthermore, similarly to malignant cancer cells, mutant hESCs migrate faster in three-dimensional collagen gels than normal hESCs (Werbowetski-Ogilvie et al., 2009). Overall, these studies were limited in that they were carried out on a small number of lines carrying different abnormalities, or even one hESC line carrying a 20q11.21 duplication (Werbowetski-Ogilvie et al., 2009), while only one study consistently described one type of aberration using multiple carrier lines (Ben-David et al., 2014).

Our aim was to elucidate if and how the gain of 20q11.21 impacts the differentiation capacity of hESCs. This is of particular importance given that most of these gains fall below the size detection limit of conventional G-banding, which is still the most commonly used method for monitoring the karyotype of human pluripotent stem cells (hPSCs). We studied nine hESC lines, of which four carry a gain of 20q11.21 and one line transgenically overexpresses Bcl-xL. Two other genes present in the smallest common region of gain, ID1 and HM13, are not further considered in this work because, as already described, ID1 protein level does not differ in the mutant cells as compared with normal lines and the function of HM13 is limited and relates to immune function, making it a poor candidate in relation to differentiation (Nguyen et al., 2014).

Our results show that hESC lines carrying a 20q11.21 amplification have a transcriptome that is significantly

different from their chromosomally normal isogenic counterparts as reflected in multiple deregulated pathways, in particular for transforming growth factor  $\beta$  (TGF- $\beta$ )- and SMAD-mediated signaling genes. We show that *Bcl-xL* overexpression is the main driver of these changes. Finally, we show that this results in a strong impairment of ectodermal differentiation in the mutant cells, while their capacity for differentiation into mesendodermal derivatives remains intact.

#### RESULTS

#### hESCs with a Gain of 20q11.21 Show an Altered Transcriptomic Profile Similar to the *Bcl-xL* Overexpressing Line

As a first step, we investigated the transcriptomic differences between lines with a gain of 20q11.21 and their genetically normal counterparts, and the role of Bcl-xL in these differences. Our study included nine hESC lines derived and kept in culture in our laboratory: four lines with gains of 20q11.21 (VUB01\_mt, VUB02\_mt1, VUB02\_mt2, and VUB03\_mt) of different sizes, their chromosomally balanced isogenic counterparts (VUB01, VUB02, and VUB03), an additional normal line (VUB14) and a line transgenically overexpressing Bcl-xL (VUB03\_Bcl-xL) characterized by Nguyen et al. (2014) (Table S1). The karyotypes of all our lines were assessed by array comparative genomic hybridization (aCGH) before the experiments and the number of copies of 20q11.21 was established by real-time qPCR. Figure 1A shows a diagram of the chromosomal content of the mutant lines with a magnified chromosome 20. The size

#### Figure 1. HESCS with a Gain of 20q11.21 Show an Altered Transcriptomic Profile Similar to VUB03\_BcL-xL

(A) Graphical representation of the chromosomal content of the mutant lines in this study, established by aCGH. Chromosome 20 is enlarged to show the breakpoints and region of gain. From outside to inside: VUB01\_mt, VUB02\_mt1, VUB02\_mt2, and VUB03\_mt. Regions of gain are represented in red, loss in blue.

(B) Copy number of the 20q11.21 region established by qPCR in all studied lines (n = 3).

(C and D) (C) *BCL2L1* mRNA (n = 3) and (D) Bcl-xL protein levels in mutant and control hESCs and in VUB03\_BcL-xL as established by sandwich ELISA. Data are shown as means  $\pm$  SEM (n = 3).

(E and F) (E) Unsupervised cluster analysis and (F) multidimensional scaling plot of dimension 1 versus dimension 2 of all coding genes with a count per million greater than one in at least two samples.

(G and H) Volcano plots of the differential gene expression analysis with a cutoff value of  $|\log_2 fold change| > 1$  and FDR < 0.05 for control versus mutant (G) and control versus VUB03\_BcL-xL (H).

(I and J) Venn diagrams comparing the deregulated genes in VUB03\_BcL-xL with those deregulated in the mutant lines. (I) Shows the upregulated genes and (J) the downregulated genes.

(K) Venn diagram comparing the deregulated genes in all mutant lines.

(L) Shows the percentage of deregulated genes that are unique or common, or common between at least two lines.

(M) Smoothened gene expression data of all genes on chromosome 20, for the four lines carrying a gain of 20q11.21. The blue lines show the region of chromosomal gain, the red line the region of loss.

(N) Gene set enrichment analysis using the MSigDB database C1, for the deregulated genes in the mutant lines and in VUB03\_BcL-xL. The plot shows the chromosomal positions with significant enrichment in deregulated genes. In blue are regions with a negative normalized enrichment score (NES) and in red, with a positive NES.



of the amplification ranged between 0.9 and 4 Mb with an identical proximal and a variable distal breakpoint. VUB02\_mt2 carried an isochromosome 20 (loss of the p arm and duplication of the q arm). All the control lines had a fully balanced genetic content, and VUB03\_BcL-xL also carried a gain of 1q32.1q41. The exact breakpoints of the chromosomal abnormalities, along with the passage range of each hESC line used in the study can be found in Table S1. The gain of 20q11.21 is often an amplification ranging from three to five copies rather than a simple duplication (Figure 1B). The *Bcl-xL* mRNA levels in the overexpressing line were nearly 70 times higher than in the control lines and were 10-fold that of VUB01\_mt and VUB02\_mt1 (Figure 1C), although the protein levels were similar to those of VUB02\_mt1 (Figure 1D).

We carried out RNA sequencing on two to five replicates per line collected from different dishes. We only considered coding genes with a count per million greater than one in at least two samples. Unsupervised hierarchical cluster analysis using all expressed genes shows that the mutant hESC lines and the VUB03\_Bcl-xL line display an expression motif different from the control lines, resulting in the clustering of the mutant and the Bcl-xL lines separate from the control lines (Figure 1E). The same pattern appears in the multidimensional scaling plot generated considering all expressed genes, showing the clustering of the control lines separate from the mutant lines and together with VUB03\_BcL-xL (Figure 1F), demonstrating that overexpression of Bcl-xL is sufficient to result in a transcriptome close to that of a mutant line. Furthermore, the clustering pattern of VUB03\_Bcl-xL suggests that the impact of the overexpression of Bcl-xL on the transcriptome of the cells is stronger than that of the gain of 1q32.1q41, which the line also carries.

Differential gene expression analysis with a cutoff value of  $|\log_2 \text{ fold change}| > 1$  and false discovery rate q value (FDR) < 0.05 shows 1,431 upregulated and 1,505 downregulated genes in mutant versus control lines. VUB03\_BcLxL shows 1,968 upregulated and 2,206 downregulated genes compared with the normal lines (Figures 1G and 1H). Approximately 65% of the genes that are differentially expressed by the mutant lines are in common with the deregulated genes in VUB03\_BcL-xL (Figures 1I and 1J). Next, we plotted the overlap in deregulated genes of the mutant lines compared with the control lines. All mutant lines have a subset of deregulated genes that are unique to the line, representing between 15% and 32% of the differential gene expression. Conversely, 22% to 30% of genes were common to all lines, and between 44% and 53% were in common with at least one other mutant line (Figures 1K and 1L). This suggests that a core of 889 genes are deregulated due to the overexpression of genes located in the common region of 20q11.21 irrespective of the line-toline variation. Furthermore, 763 of these 889 genes (85.8%) are also deregulated in the *Bcl-xL* overexpressing line, strongly suggesting that Bcl-xL plays a predominant role in the transcriptomic profile of the cells with a gain of 20q11.21.

Finally, we mapped the differential gene expression to chromosomal position. First, we calculated and plotted the smoothened log<sub>2</sub> fold-change expression of all genes on chromosome 20 for each mutant line individually, and compared this with the control lines as a group (Figure 1M, raw data in Figure S1). In VUB01\_mt, VUB02\_mt1, and VUB02\_mt2 the overexpression of genes located in the region of gain of chromosome 20 is clearly observed. VUB03\_mt carries the smallest region of gain and no differences can be observed in the expression in that region. Second, we used the gene set enrichment analysis using the MSigDB database C1 for the deregulated genes in the mutant lines and in VUB03\_BcL-xL. The mutant lines have a positive enrichment score for 20q, which is absent in VUB03\_BcL-xL. However, there is a similar enrichment score across the genome of the mutant lines and VUB03\_BcL-xL, showing 16 of the 18 enriched regions to be in common (Figure 1N). These results illustrate a number of salient points. Expectedly, the higher copy number has an effect on the gene expression of most-but not all-genes in the amplified region, which is why gene expression data can be used to karyotype cells (Ben-David et al., 2013). However, smaller gains fall under the detection level unless they induce very strong gene expression changes. More importantly, a variant copy number of one region can strongly act in trans on the expression of genes located on other chromosomes.

In summary, mutant lines show a different transcriptome from their normal counterparts, which can largely be attributed to the overexpression of *Bcl-xL*. The overexpression of other genes located within the mutation has a minimal, if any, effect.

#### The 20q11.21 Mutation Affects TGF-β- and SMAD-Mediated Signaling through *Bcl-xL* Overexpression

In a next step, we carried out pathway analysis using multiple bioinformatic tools. First, we carried out ingenuity pathway analysis (IPA) using all genes with a  $|\log_2$  fold change| > 1 and FDR < 0.05, for both the mutant versus control groups, and the VUB03\_BcL-xL line versus a control group. This analysis predicts the state of upstream regulators based on the expression of their downstream targets. IPA considers a pathway to be activated with a *Z* score >2, and inhibited with a score less than -2. When the p value is significant and the activation *Z* score is between -2 and 2, it is considered to be significantly affected, without being able to establish whether it is activated or inhibited. In our dataset, the activation score in





#### Figure 2. Pathway Analysis in hESCs with a Gain of 20q11.21 and in VUB03\_BcL-xL

(A) Ingenuity Pathway Analysis of the upstream regulators of pathways with an activation score between -2 and 2 and a p value < 0.05 in the wild-type (WT) versus mutant (MT) lines and their behavior in VUB03\_BcL-xL.

(B) DAVID Enrichment Analysis of the 1,000 top deregulated genes in the mutant group and VUB03\_BcL-xL. In parenthesis are the geneontology term numbers.

(C and D) Gene set enrichment analysis using the MSigDB C2 library (C) and Enrichr-based prediction of protein-protein interactions for transcription factors (D). All results are statistically significant with a p value < 0.05 unless the value is given. All the analyses were performed using the differentially expressed genes between WT versus mutant group and WT versus VUB03\_BcL-xL with a cutoff value of  $|\log_2 \text{ fold change}| > 1$  and FDR < 0.05.

VUB03\_BcL-xL follows that of the mutant lines in all cases, and, in the case of pathways not reaching the *Z* score >2 or less than -2, the p value is still always significant (Figure 2A).

We then subjected the 1,000 genes with the highest log fold change in absolute value (563 up- and 437 downregulated for the 20q11.21 lines, 485 up- and 515 downregulated for VUB03\_BcL-xL) to DAVID functional annotation enrichment analysis. The analysis retrieved a total of 75 annotations, of which we selected those gene ontology terms referring to cellular processes and that had a fold enrichment >2, and a p value < 0.05 in at least one of the groups (Figure 2B). Interestingly, the deregulated genes in both mutant lines and VUB03\_BcL-xL are enriched for factors in the TGF- $\beta$  and SMAD signaling, as well as in genes involved in neuron differentiation and cochlea morphogenesis, which are full or partial ectodermal derivatives, respectively. Next, we carried out gene set enrichment analysis using the C2 library (full list in Table S2). The results did not yield any significantly deregulated pathways when using the Kyoto Encyclopedia of Genes and Genomes, but revealed 17 significantly enriched processes as annotated in the Reactome library. These can broadly be categorized into related to mRNA processing, cell cycle, and TGF- $\beta$  and SMAD signaling (Figure 2C).

Subsequently, we analyzed the transcription factor enrichment and protein-protein interactions in the differentially expressed genes in the mutant lines and in VUB03\_BcL-xL with a  $|\log_2$  fold change| > 1 and FDR < 0.05, using Enrichr (Chen et al., 2013; Kuleshov et al., 2016). Our datasets show a negative *Z* score for protein interaction with SMAD2 (Figures 2D and S2).

Overall, these results suggest that hESCs with a gain of 20q11.21 appear to have a perturbed TGF- $\beta$  and SMAD signaling and that *Bcl-xL* overexpression is responsible for most of these changes. Given the pivotal role of TGF- $\beta$  and SMAD signaling in gastrulation and early lineage commitment, we hypothesized that the gain of 20q11.21





Figure 3. Bcl-xL Overexpression Due to a Gain of 20q11.21 Results in Impaired Neuroectoderm Differentiation

(A) Examples of immunostaining for PAX6 (green) and POU5F1 (red) in mutant and control lines and in VUB03\_BcL-xL, after 4 days of neuroectoderm differentiation.

(B) Percentage of PAX6- and POU5F1-positive cells. The mutant lines and VUB03\_BcL-xL yield less PAX6-positive cells than the control lines.

(C) Relative mRNA expression as measured by qPCR for ectoderm markers *PAX6* and *SOX1* (n = 3-6). Data are shown as means  $\pm$  SEM, each dot represents an independent differentiation experiment and the horizontal bars with asterisks represent statistical significance between samples (p < 0.05, t test).

may have an impact on the differentiation capacity of the cells.

# Gain of 20q11.21 Results in Impaired Neuroectoderm Differentiation

We first assessed the neuroectodermal differentiation efficiency of all our control and mutant lines and that of VUB03\_BcL-xL. We performed a 4-day induction protocol recapitulating neuroectoderm commitment using Noggin and SB431542, both of which are TGF- $\beta$  superfamily antagonists (Chambers et al., 2009; Chetty et al., 2013). We differentiated all our lines in three to six independent differentiation experiments to ensure the reproducibility and consistency of the experiments. At the fourth day of neuroectoderm induction, we analyzed the mRNA of markers for each lineage (endo-, neuroecto-, and mesoderm), and the stem cell markers *POU5F1* and *NANOG*. We stained for PAX6 as neuroectodermal marker and POU5F1 as pluripotency marker and quantified the number of positive cells (Figure 3A). The data show that all samples derived from mutant lines and VUB03\_BcL-xL display statistically significantly lower levels of *PAX6* and *SOX1* mRNA (Figure 3C), and between 1.8 and 3.3 times less PAX6-positive cells (Figures 3B and S3). Next to the neuroectoderm and stem cell markers, we also tested for the expression of mesendoderm markers (Figure S3). The results show that, while the mutant cells do exit the pluripotent state, they do not differentiate into any early, specific germ line detectable with the





#### Figure 4. Control and Mutant Lines and VUB03\_BcL-xL Equally Differentiate to Mesendoderm Derivatives

(A) Representative examples of immunostaining for T (green) and POU5F1 (red) in control (VUB01\_wt) and mutant (VUB01\_mt) lines after mesendoderm induction.

(B) Percentage of T/POU5F1 double-positive (mesendoderm cells) and POU5F1-only positive cells.

(C) Examples of immunostaining for SOX17 (green) and POU5F1 (red) in control (VUB01\_wt and VUB03\_wt) and mutant (VUB01\_wt and VUB03\_mt) lines, and VUB03\_BcL-xL after definitive endoderm differentiation.

(legend continued on next page)



markers we used. The fact that VUB03\_BcL-xL follows the same pattern as the mutant cells, showing practically no expression of neuroectodermal markers after the 4-day induction, supports the hypothesis that the overexpression of *Bcl-xL* alone is sufficient to cause this abnormal differentiation. Finally, we also differentiated control and mutant hESCs to neuroectoderm in a 12-day protocol, confirming the difference between the control and mutant hESCs after extended differentiation (Figure S3).

# Mutant and Control Lines Equally Differentiate toward Mesendoderm Derivates

Finally, we assessed the impact of the mutation and Bcl-xL overexpression on mesendodermal lineage commitment using a 24-h protocol that drives the differentiation through the first events of the primitive streak formation by TGF- $\beta$  and WNT activation. We measured the protein levels of Brachyury (T) in our lines and found that they all underwent mesendoderm induction with an equally good efficiency (Figures 4A and 4B). To investigate the ability of the lines to further commit to derivatives of this germ layer, we directed the cells toward definitive endoderm. We differentiated all eight lines (with three to six replicates per line) and evaluated the gene expression at the mRNA and protein levels. Figure 4E shows the mRNA expression results, which are in line with the immunostaining results for SOX17 and POUF51 (Figures 4C and 4D). All the lines increased their expression of endoderm markers, and no consistent expression of markers for other lineages was observed (Figure S5). NANOG and POU5F1 were overall slightly but not completely downregulated, as expected given their important roles in early endoderm differentiation (Teo et al., 2011; Ying et al., 2015). Overall, in all cases, control and mutant lines as well as VUB03\_BcL-xL readily and similarly differentiated to definitive endoderm.

# Downregulation of *CHCHD2* Is a Transcriptomic Marker for the Gain of 20q11.21

The deregulation of the TGF- $\beta$  and the SMAD signaling suggested by the DAVID analysis and the well-established relationship of this pathway to pluripotency and ectoderm differentiation prompted us to further investigate the differentially expressed genes to understand the driving mechanism for this deregulation. For this, we annotated the function of the top 100 differentially expressed genes (Table S3) in both mutant and *Bcl-xL* overexpressing cells, and searched the literature for their potential relationship to *Bcl-xL* and the TGF- $\beta$ /SMAD signaling. The most interesting candidate in this list is *CHCHD2* because the protein binds Bcl-xL, resulting in a decreased oligomerization of apoptotic activator Bax (Liu et al., 2015). Furthermore, low levels of *CHCHD2* have been mechanistically linked to disrupted TGF- $\beta$ /SMAD signaling and decreased neuroectodermal commitment in hPSCs (Zhu et al., 2016). Our RNA sequencing data showed that *CHCHD2* is strongly downregulated in the lines with a gain of 20q11.21 and in VUB03\_BcL-xL. Hence, we decided to investigate if *CHCHD2* was effectively the mediator of the decreased neuroectoderm commitment of the mutant cells.

We validated the CHCHD2 RNA sequencing findings by measuring the mRNA and protein levels in normal and mutant lines as well as VUB03\_BcL-xL. All mutant lines and VUB03\_BcL-xL showed statistically significantly lower levels of CHCHD2 at the mRNA level, while the endogenous expression levels varied up to a 4-fold change among the control lines (Figure 5A). Immunocytochemistry of normal and mutant lines and VUB03\_BcL-xL showed absence of CHCHD2 protein in the mutant and VUB03\_BcL-xL cells (Figure 5B). To assess if this downregulation affected solely the pluripotent state, we differentiated the VUB03\_wt, VUB03\_mt, and VUB03\_BcL-xL to neuroectoderm and definitive endoderm. Figure 5C shows the real-time qPCR results showing that CHCHD2 remains stably downregulated after differentiation in both VUB03\_mt and VUB03\_BcL-xL.

To functionally address the potential link between CHCHD2 downregulation and decreased neuroectoderm commitment, we used small interfering RNA (siRNA) to knockdown CHCHD2 in control hESCs, and mRNA transfection to exogenously overexpress CHCHD2 in mutant cells. Figure 6A shows the mRNA levels of CHCHD2 in undifferentiated VUB01\_wt cells 24, 48, and 72 h after transfection, and Figure 6B shows the immunostaining for the protein 72 h posttransfection. The results show downregulation both at the mRNA and protein levels. We induced neuroectoderm commitment in VUB01\_wt treated with siRNA against CHCHD2 as well as untreated cells and cells treated with a nontargeting siRNA. We measured CHCHD2, PAX6, and SOX1 expression each day of a 4-day differentiation. This experiment was repeated four times; the results are shown in Figures 6C and 6D. We found that the knockdown of CHCHD2 did not change the ability of the cells to differentiate to neuroectoderm in any of the replicates. We also exogenously overexpressed CHCHD2 in VUB01\_mt (Figure 6E) and measured the PAX6 and SOX1 expression on day 0, 2, and 4 of neuroectoderm induction (Figure 6F).

<sup>(</sup>D) Percentage of SOX17- and POU5F1-positive cells.

<sup>(</sup>E) Relative mRNA expression as measured by qPCR (n = 3 to 6). Data are shown as means  $\pm$  SEM, each dot represents an independent differentiation experiment and the horizontal bars with asterisks represent statistical significance between samples (p < 0.05, t test).





#### Figure 5. Lines with a Gain of 20q11.21 Stably Downregulate CHCHD2 Due to Bcl-xL Overexpression

(A and B) (A) *CHCHD2* expression as measured by qPCR in undifferentiated cells. All mutant lines show a significantly decreased expression compared with their normal counterparts (n = 4-9). (B) CHCHD2 immunostaining (in green) in VUB01 showing the presence of the protein in the control subline and its absence in the mutant subline.

(C) CHCHD2 expression as measured by qPCR in the three sublines of VUB03 (control, mutant, and VUB03\_BcL-xL) in the differentiated state. DE, definite endoderm; EC, neuroectoderm (n = 7-10).

(A and C) Data are shown as means  $\pm$  SEM, each dot represents an independent differentiation experiment and the horizontal bars with asterisks represent statistical significance between samples (p < 0.05, t test).

In line with the siRNA data, the results show that exogenous *CHCHD2* expression does not rescue the effect of the gain of 20q11.21.

In summary, while *CHCHD2* is consistently downregulated in mutant hESCs both before and after differentiation, our results strongly suggest that it is not the link between the *Bcl-xL* upregulation in the mutant cells and their decreased neuroectodermal commitment.

#### DISCUSSION

The aim of our study was to investigate the impact of one of the most commonly found chromosomal abnormalities in hPSCs, a gain of 20q11.21, on their differentiation capacity (Amps et al., 2011). The awareness of genome instability in hPSCs has increased in the past years, along with the realization that we lack answers on what the functional consequences of these mutations are on differentiating cells, especially when considering clinical applications (Andrews et al., 2017). Our work was prompted by the clear need for systematic studies of the impact of recurrent chromosomal abnormalities on the differentiation capacity and malignant potential of hPSCs.

To reach our aim, we included four mutant lines and their isogenic normal counterparts, and one *Bcl-xL* overexpressing line. Remarkably, transcriptomic analysis showed that

all mutant lines have a significantly different transcriptome from their chromosomally normal isogenic counterparts, and which is very similar to that of cells transgenically overexpressing Bcl-xL. This is despite the fact that the mutant lines carried different copy numbers, leading to a difference in overexpression of genes within the region. This strongly suggests that overexpression of Bcl-xL alone, which is also the driver for the selective advantage of the cells in their undifferentiated state (Avery et al., 2013; Nguyen et al., 2014), is sufficient to explain the majority of transcriptomic changes. Interestingly, an important part of the differential expression was of genes related to the TGF-β- and SMAD-mediated signaling, which led us to investigate the behavior of the mutant hESCs during the lineage commitment to neuroectoderm and mesendoderm. Our differentiation experiments show that the lines with a gain of 20q11.21 and those overexpressing Bcl-xL have an impaired neuroectodermal lineage commitment, with no differences in their capacity for differentiation into mesendodermal derivatives.

Next, *CHCHD2* was identified as a prime candidate linking *Bcl-xL* to the transcriptomic changes, because it is consistently downregulated in mutant cells and the protein binds Bcl-xL, resulting in a decreased oligomerization of Bax (Liu et al., 2015). This downregulation may be through a self-regulatory feedback loop, as CHCHD2 is able to translocate to the nucleus to transactivate itself as well as other genes that contain oxygen-responsive





#### Figure 6. Knockdown and Overexpression of CHCHD2 Do Not Affect Neuroectoderm Differentiation

(A) CHCHD2 expression as measured by qPCR in VUB01\_wt 24, 48, and 72 h after transfection with siRNA against CHCHD2 (n = 1).
(B) Representative immunostaining of untreated and transfected cells 72 h posttransfection (the CHCHD2 protein can be seen in green).
(C and D) CHCHD2 (C) and PAX6 and SOX1 (D) expression as measured by qPCR in VUB01 WT during a 4-day induction to neuroectoderm. NT, nontargeting siRNA (n = 1).

(E) Immunostaining of untreated cells and after 72 h of exogenous CHCHD2 expression (in green).

(F) *PAX6* and *SOX1* expression as measured by qPCR in VUB01\_mt during a 4-day induction to neuroectoderm in untreated, control (GFP) and *CHCHD2*-overexpressing cells (n = 1).



element sequences in their promoter region (Aras et al., 2013; Grossman et al., 2017). Another interesting function of CHCHD2 is its capacity to interact with the SMADs (2/ 3/4) and thus modulate the transcription of TGF- $\beta$ -mediated target genes (Zhu et al., 2016). Zhu et al. also showed that endogenous low levels of CHCHD2 in hPSCs result in a decreased capacity for ectodermal differentiation. The findings in our transcriptome analysis showing deregulation of both TGF-β/SMAD signaling and genes involved in neural differentiation in hESCs with a 20q11.21 mutation and Bcl-xL overexpressing cells are consistent with the known functions of CHCHD2. Finally, the TGF- $\beta$ / SMAD signaling is known to have a pivotal role during the first-lineage commitment (Sumi et al., 2008). We therefore carried out functional tests, assessing the impact on neuroectoderm differentiation of siRNA knockdown of CHCHD2 in control cells and CHCHD2 mRNA transfection in mutant cells. Unexpectedly, we found that CHCHD2 does not mediate the effect on differentiation under our experimental conditions. We have no immediate explanation for these differences, although it is worth noting that Zhu et al. did not assess ectodermal differentiation in the same manner as we did, i.e., using a TGF- $\beta$  inhibitor. In their work, the differentiation bias was assessed using spontaneous differentiation without modulating the TGF-B signaling, which may explain some of the differences we see. Another point of interest is that, in the last part of their work, they show that the use of the TGF- $\beta$  inhibitor SB431542 during differentiation cancels the effect of downregulating CHCHD2 using siRNA. This conclusion is based on qPCR results for PAX6 between control and siRNA-treated cells. Although the authors found a statistically significant upregulation of PAX6, the relative fold change was less than 0.3 which may be not biologically relevant. This is in line with our results for siRNA CHCHD2 knockdown. Taken together, this suggests that, although Zhu et al. clearly prove that CHCHD2 interacts with SMAD4, the relationship between CHCHD2 and neuroectoderm commitment is less direct than hypothesized. Nevertheless, this gene appears as an excellent transcriptomic marker for the gain of 20q11.21.

In summary, our work shows the significant impact genetic changes can have on hPSCs, and provides, to the best of our knowledge, one of the few studies pinpointing a specific effect of a recurrent aberration and identifies the mechanisms behind it. The results of our study are of particular importance when taking into account that the 20q11.21 amplification occurs in more than 20% of hPSC lines worldwide and that G-banding as the most widely used method for karyotyping fails to detect it. The mutation may bias experimental data in a research setting if unnoticed, although it is unlikely that it would be undetected in a clinical setting, because in clinical trials the genetic screening protocols are more stringent. Nevertheless, if the mutation is in the process of culture take-over, it could remain undetected and result in poor differentiation in the clinically relevant cell types.

#### **EXPERIMENTAL PROCEDURES**

#### hESC Lines and Culture

hESC were derived and characterized as described previously (Mateizel et al., 2006, 2009). All lines are registered with the EU hPSC registry (https://hpscreg.eu/). hESCs were cultured on dishes coated with 10  $\mu$ g/mL laminin-521 (Biolamina) in NutriStem hESC XF medium (NS medium; Biological Industries) with 100 U/mL penicillin/streptomycin (Thermo Fisher Scientific), and passaged as single cells in a 1:10 to 1:100 ration using TrypLE Express (Thermo Fisher Scientific) when 70%–80% confluent. The cells were grown at 37°C in 5% CO<sub>2</sub>. VUB03\_BcL-xL was generated by lentiviral transduction, as described by Nguyen et al. (2014) and in the Supplemental Information.

A large bulk of frozen cells was generated for each line. After thawing, the lines were used at the lowest passage possible (Table S1), and were checked for the 20q11.21 amplification by copynumber assay 3 to 4 passages after thawing.

#### aCGH

Oligonucleotide aCGH was carried out based on the protocol provided by the manufacturer (Agilent Technologies). A total of 400 ng of DNA was labeled with Cy3, while the reference DNA (Promega) was labeled with Cy5. The samples are hybridized on the microarray slide (4 × 44K Human Genome CGH Microarray, Agilent Technologies). The slides were scanned using an Agilent dual laser DNA microarray scanner G2566AA. Only arrays with an SD  $\leq$  0.20, signal intensity > 50, background noise < 5, and a derivative log-ratio < 0.2 were taken into account. Cutoff values were set at three consecutive probes with an average log<sub>2</sub> ratio over 0.3 for gains and of -0.45 for loss.

#### Gene Copy Number Using Real-Time qPCR

Copy-number quantification was performed on the ViiA 7 thermocycler (Thermo Fisher Scientific), ViiA 7 software v.1.2 (Thermo Fisher Scientific), and Applied Biosystems Copy Caller v.2.1. We used the copy-number assays for RNAseP (4403326) as a reference and POFUT1 (Hs02487189\_cn) to assess the number of copies of the 20q11.21 region.

#### **RNA Sequencing**

RNA (150 ng) was used to perform an Illumina sequencing library preparation using the QuantSeq 3' mRNA-Seq Library Prep Kits (Lexogen) according to manufacturer's protocol. During library preparation 17 PCR cycles were used. Libraries were quantified by qPCR, according to Illumina's protocol "Sequencing Library qPCR Quantification protocol guide," version February 2011. A high-sensitivity DNA chip (Agilent Technologies) was used to control the library's size distribution and quality. Sequencing was performed on a high-throughput Illumina NextSeq 500 flow cell generating 75 bp single reads.



Details on the bioinformatics processing can be found in the Supplemental Information.

#### **hESC Differentiation**

The protocol for neuroectoderm was adapted from Chetty et al. (2013) and Chambers et al. (2009). hESCs were passaged on laminin-521, as described above, 1-2 days before EC differentiation in a ratio of 50,000 cells per cm<sup>2</sup> so that they were 90% confluent on the starting day. The neuroectoderm differentiation medium was refreshed daily, and consisted of KnockOut DMEM (Thermo Fisher Scientific) with 10% KnockOut Serum Replacement (Thermo Fisher Scientific) and supplemented with 500 ng/mL Recombinant Human Noggin Protein (R&D Systems) and 10 µM SB431542 (Tocris). Endoderm differentiation was carried out using a protocol based on Sui et al. (2012). hESCs were passaged on laminin-521, as described above, 1-2 days before differentiation in a ratio of 30,000 cells per cm<sup>2</sup> so that they were 80%-90% confluent on the starting day. Definitive endoderm differentiation medium contains RPMI 1640 supplemented by GlutaMAX (Thermo Fisher Scientific), 0.5% B27 supplement (Thermo Fisher Scientific), 100 ng recombinant human/mouse/ rat activin A (R&D Systems) and 3 µM CHIR99021 (Stemgent). One day later the medium was changed to differentiation medium without CHIR99021 and the cells were cultured for 2 more days. For mesendoderm induction, the same protocol as for endoderm was used, for 1 day.

#### Protein and mRNA Analysis

Real-time qPCR was carried out on a ViiA 7 thermocycler (Thermo Fisher Scientific) and using standard protocol as provided by the manufacturer. Details on the probes, assays and primers are listed in the Supplemental Information. Sandwich ELISA was conducted using the human total Bcl-xL ELISA kit for Bcl-xL (DuoSet IC, R&D Systems) following the manufacturer's protocol. All samples were analyzed in triplicate. Immunostaining was carried out on cells fixed and permeabilized with 4% paraformaldehyde and 100% methanol (Sigma-Aldrich), and blocked with fetal bovine serum (Thermo Fischer Scientific). The list with antibodies can be found in the Supplemental Information. Imaging was performed on a LSM800 confocal microscope (Carl Zeiss), and cell counts were done using the Zen 2 (blue edition) imaging software.

#### **Statistics**

Data are presented as means. Unpaired two-tailed t test (GraphPad Prism 5.0b) was used to determine significance between groups. For all statistical tests, the 0.05 level of confidence was accepted for statistical significance.

#### siRNA Knockdown

The siRNAs used in this study were purchased from Healthcare/ Dharmacon: ON-TARGET*plus* Human *CHCHD2* siRNA SMARTpool (cat. no L-019120-100005) and ON-TARGET*plus* no-targeting siRNA as a negative control (cat. no. D-001810-01-05). The siRNA was dissolved in  $1 \times$  siRNA buffer and a final concentration of 50 nM was transfected with lipofectamine RNAiMAX (13778150) in Opti-MEM (11058021) following the manufacturer's protocols (Thermo Fischer Scientific).

# Plasmid Preparation and *In Vitro* Transcription of Capped mRNA

The synthetic gene encoding for *CHCHD2* was purchased from Integrated DNA Technologies and cloned as NcoI-XhoI fragment in the vector pEtheRNA-v2 as previously described (Van Lint et al., 2016). *In vitro* mRNA transcription and quality controls were performed as described in Bonehill et al. (2004). In brief, pEtheRNAv2 plasmid was linearized with BfuAI (Fermentas) and *in vitro* mRNA transcription was performed with T7 polymerase according to the manufacturer instructions. mRNA integrity, concentration, and purity were tested on Agilent 2100 Bioanalyzer (Agilent Technologies).

#### **ACCESSION NUMBERS**

All data have been deposited in the GEO repository with accession number GEO: GSE116372.

#### SUPPLEMENTAL INFORMATION

Supplemental Information can be found online at https://doi.org/ 10.1016/j.stemcr.2019.05.005.

#### **AUTHOR CONTRIBUTIONS**

C.M. carried out all of the experiments unless stated otherwise and co-wrote the manuscript. E.C.D.D. did the bioinformatics analysis. M.R. performed the microscopy and cell counting. H.T.N. provided the *Bcl-xL* overexpressing line. F.Z. assisted with the gene expression analysis. A.K. provided the isochromosome line. D.D. provided the control samples for RNA sequencing. J.D.K. assisted with the microscopy. L.T. and F.V.N. performed the RNA sequencing and assisted in the bio-informatic analysis. L.F. supervised the mRNA production. K.S. proofread the paper. M.G. proofread the paper and supervised the experimental work. C.S. cowrote the paper, designed and supervised the experimental work.

#### ACKNOWLEDGMENTS

The authors acknowledge their colleagues from the human embryonic stem cell lab for the derivation and culture of the lines and professor Kris Thielemans from the LMCT laboratory of the VUB for providing the mRNA for overexpressing *CHCHD2*. This work was supported by the Fonds for Scientific Research in Flanders (Fonds Wetenschappelijk Onderzoek – Vlaanderen [FWO]) and the Methusalem Grant of the Research Council of the VUB. C.M. is a doctoral fellow supported by the Instituut voor Innovatie door Wetenschap en Technologie (IWT). A.K. and D.D. are doctoral fellows at the FWO.

Received: July 10, 2018 Revised: May 6, 2019 Accepted: May 6, 2019 Published: June 6, 2019

#### REFERENCES

Amps, K., Andrews, P.W., Anyfantis, G., Armstrong, L., Avery, S., Baharvand, H., Baker, J., Baker, D., Munoz, M.B., Beil, S., et al.



(2011). Screening ethnically diverse human embryonic stem cells identifies a chromosome 20 minimal amplicon conferring growth advantage. Nat. Biotechnol. *29*, 1132–1144.

Andrews, P.W., Ben-David, U., Benvenisty, N., Coffey, P., Eggan, K., Knowles, B.B., Nagy, A., Pera, M., Reubinoff, B., Rugg-Gunn, P.J., et al. (2017). Assessing the safety of human pluripotent stem cells and their derivatives for clinical applications. Stem Cell Reports *9*, 1–4.

Aras, S., Pak, O., Sommer, N., Finley, R., Hüttemann, M., Weissmann, N., Grossman, L.I., and Grossman, L.I. (2013). Oxygendependent expression of cytochrome c oxidase subunit 4-2 gene expression is mediated by transcription factors RBPJ, CXXC5 and CHCHD2. Nucleic Acids Res. *41*, 2255–2266.

Avery, S., Hirst, A.J., Baker, D., Lim, C.Y., Alagaratnam, S., Skotheim, R.I., Lothe, R.A., Pera, M.F., Colman, A., Robson, P., et al. (2013). BCL-XL mediates the strong selective advantage of a 20q11.21 amplification commonly found in human embryonic stem cell cultures. Stem Cell Reports *1*, 1–8.

Avior, Y., Sagi, I., and Benvenisty, N. (2016). Pluripotent stem cells in disease modelling and drug discovery. Nat. Rev. Mol. Cell Biol. *17*, 170–182.

Baker, D.E.C., Harrison, N.J., Maltby, E., Smith, K., Moore, H.D., Shaw, P.J., Heath, P.R., Holden, H., and Andrews, P.W. (2007). Adaptation to culture of human embryonic stem cells and oncogenesis in vivo. Nat. Biotechnol. *25*, 207–215.

Ben-David, U., Mayshar, Y., and Benvenisty, N. (2013). Virtual karyotyping of pluripotent stem cells on the basis of their global gene expression profiles. Nat. Protoc. *8*, 989–997.

Ben-David, U., Arad, G., Weissbein, U., Mandefro, B., Maimon, A., Golan-Lev, T., Narwani, K., Clark, A.T., Andrews, P.W., Benvenisty, N., et al. (2014). Aneuploidy induces profound changes in gene expression, proliferation and tumorigenicity of human pluripotent stem cells. Nat. Commun. *5*, 4825.

Bonehill, A., Heirman, C., Tuyaerts, S., Michiels, A., Breckpot, K., Brasseur, F., Zhang, Y., Van Der Bruggen, P., and Thielemans, K. (2004). Messenger RNA-electroporated dendritic cells presenting MAGE-A3 simultaneously in HLA class I and class II molecules. J. Immunol. *172*, 6649–6657.

Chambers, S.M., Fasano, C.A., Papapetrou, E.P., Tomishima, M., Sadelain, M., and Studer, L. (2009). Highly efficient neural conversion of human ES and iPS cells by dual inhibition of SMAD signaling. Nat. Biotechnol. *27*, 275–280.

Chen, E.Y., Tan, C.M., Kou, Y., Duan, Q., Wang, Z., Meirelles, G.V., Clark, N.R., and Ma'ayan, A. (2013). Enrichr: interactive and collaborative HTML5 gene list enrichment analysis tool. BMC Bioinformatics *14*, 128.

Chetty, S., Pagliuca, F.W., Honore, C., Kweudjeu, A., Rezania, A., and Melton, D.A. (2013). A simple tool to improve pluripotent stem cell differentiation. Nat. Methods *10*, 553–556.

Cowan, C.A., Klimanskaya, I., McMahon, J., Atienza, J., Witmyer, J., Zucker, J.P., Wang, S., Morton, C.C., McMahon, A.P., Powers, D., et al. (2004). Derivation of embryonic stem-cell lines from human blastocysts. N. Engl. J. Med. *350*, 1353–1356.

Draper, J.S., Smith, K., Gokhale, P., Moore, H.D., Maltby, E., Johnson, J., Meisner, L., Zwaka, T.P., Thomson, J.A., and Andrews, P.W.

(2004). Recurrent gain of chromosomes 17q and 12 in cultured human embryonic stem cells. Nat. Biotechnol. *22*, 53–54.

Fazeli, A., Liew, C.-G., Matin, M.M., Elliott, S., Jeanmeure, L.F.C., Wright, P.C., Moore, H., and Andrews, P.W. (2011). Altered patterns of differentiation in karyotypically abnormal human embryonic stem cells. Int. J. Dev. Biol. *55*, 175–180.

Gopalakrishna-Pillai, S., and Iverson, L.E. (2010). Astrocytes derived from trisomic human embryonic stem cells express markers of astrocytic cancer cells and premalignant stem-like progenitors. BMC Med. Genomics *3*, 12.

Grossman, L.I., Purandare, N., Arshad, R., Gladyck, S., Somayajulu, M., Hüttemann, M., and Aras, S. (2017). MNRR1, a biorganellar regulator of mitochondria. Oxid. Med. Cell. Longev. *2017*, 6739236.

Herszfeld, D., Wolvetang, E., Langton-Bunker, E., Chung, T.-L., Filipczyk, A.A., Houssami, S., Jamshidi, P., Koh, K., Laslett, A.L., Michalska, A., et al. (2006). CD30 is a survival factor and a biomarker for transformed human pluripotent stem cells. Nat. Biotechnol. *24*, 351–357.

Inzunza, J., Sahlén, S., Holmberg, K., Strömberg, A.M., Teerijoki, H., Blennow, E., Hovatta, O., and Malmgren, H. (2004). Comparative genomic hybridization and karyotyping of human embryonic stem cells reveals the occurrence of an isodicentric X chromosome after long-term cultivation. Mol. Hum. Reprod. *10*, 461–466.

Keller, A., Dziedzicka, D., Zambelli, F., Markouli, C., Sermon, K., Spits, C., and Geens, M. (2018). Genetic and epigenetic factors which modulate differentiation propensity in human pluripotent stem cells. Hum. Reprod. Update *24*, 162–175.

Kuleshov, M.V., Jones, M.R., Rouillard, A.D., Fernandez, N.F., Duan, Q., Wang, Z., Koplev, S., Jenkins, S.L., Jagodnik, K.M., Lachmann, A., et al. (2016). Enrichr: a comprehensive gene set enrichment analysis web server 2016 update. Nucleic Acids Res. *44*, W90–W97.

Laurent, L.C., Ulitsky, I., Slavin, I., Tran, H., Schork, A., Morey, R., Lynch, C., Harness, J.V., Lee, S., Barrero, M.J., et al. (2011). Dynamic changes in the copy number of pluripotency and cell proliferation genes in human ESCs and iPSCs during reprogramming and time in culture. Cell Stem Cell *8*, 106–118.

Lefort, N., Feyeux, M., Bas, C., Féraud, O., Bennaceur-Griscelli, A., Tachdjian, G., Peschanski, M., and Perrier, A.L. (2008). Human embryonic stem cells reveal recurrent genomic instability at 20q11.21. Nat. Biotechnol. *26*, 1364–1366.

Van Lint, S., Renmans, D., Broos, K., Goethals, L., Maenhout, S., Benteyn, D., Goyvaerts, C., Du Four, S., Van der Jeught, K., Bialkowski, L., et al. (2016). Intratumoral delivery of TriMix mRNA results in T-cell activation by cross-presenting dendritic cells. Cancer Immunol. Res. *4*, 146–156.

Liu, Y., Clegg, H.V., Leslie, P.L., Di, J., Tollini, L.A., He, Y., Kim, T.-H., Jin, A., Graves, L.M., Zheng, J., et al. (2015). CHCHD2 inhibits apoptosis by interacting with Bcl-x L to regulate Bax activation. Cell Death Differ. *22*, 1035–1046.

Maitra, A., Arking, D.E., Shivapurkar, N., Ikeda, M., Stastny, V., Kassauei, K., Sui, G., Cutler, D.J., Liu, Y., Brimble, S.N., et al. (2005). Genomic alterations in cultured human embryonic stem cells. Nat. Genet. *37*, 1099–1103.



Mateizel, I., De Temmerman, N., Ullmann, U., Cauffman, G., Sermon, K., Van de Velde, H., De Rycke, M., Degreef, E., Devroey, P., Liebaers, I., et al. (2006). Derivation of human embryonic stem cell lines from embryos obtained after IVF and after PGD for monogenic disorders. Hum. Reprod. *21*, 503–511.

Mateizel, I., Spits, C., Verloes, A., Mertzanidou, A., Liebaers, I., and Sermon, K. (2009). Characterization of CD30 expression in human embryonic stem cell lines cultured in serum-free media and passaged mechanically. Hum. Reprod. *24*, 2477–2489.

Mitalipova, M.M., Rao, R.R., Hoyer, D.M., Johnson, J.A., Meisner, L.F., Jones, K.L., Dalton, S., and Stice, S.L. (2005). Preserving the genetic integrity of human embryonic stem cells. Nat. Biotechnol. *23*, 19–20.

Närvä, E., Autio, R., Rahkonen, N., Kong, L., Harrison, N., Kitsberg, D., Borghese, L., Itskovitz-Eldor, J., Rasool, O., Dvorak, P., et al. (2010). High-resolution DNA analysis of human embryonic stem cell lines reveals culture-induced copy number changes and loss of heterozygosity. Nat. Biotechnol. *28*, 371–377.

Nguyen, H.T., Geens, M., and Spits, C. (2013). Genetic and epigenetic instability in human pluripotent stem cells. Hum. Reprod. Update *19*, 187–205.

Nguyen, H.T., Geens, M., Mertzanidou, A., Jacobs, K., Heirman, C., Breckpot, K., and Spits, C. (2014). Gain of 20q11.21 in human embryonic stem cells improves cell survival by increased expression of Bcl-xL. Mol. Hum. Reprod. *20*, 168–177.

Serra, M., Brito, C., Correia, C., and Alves, P.M. (2012). Process engineering of human pluripotent stem cells for clinical application. Trends Biotechnol. *30*, 350–359.

Spits, C., Mateizel, I., Geens, M., Mertzanidou, A., Staessen, C., Vandeskelde, Y., Van der Elst, J., Liebaers, I., and Sermon, K. (2008). Recurrent chromosomal abnormalities in human embry-onic stem cells. Nat. Biotechnol. *26*, 1361–1363.

Sui, L., Mfopou, J.K., Geens, M., Sermon, K., and Bouwens, L. (2012). FGF signaling via MAPK is required early and improves Activin A-induced definitive endoderm formation from human

embryonic stem cells. Biochem. Biophys. Res. Commun. 426, 380–385.

Sumi, T., Tsuneyoshi, N., Nakatsuji, N., and Suemori, H. (2008). Defining early lineage specification of human embryonic stem cells by the orchestrated balance of canonical Wnt/beta-catenin, Activin/Nodal and BMP signaling. Development *135*, 2969–2979.

Teo, A.K.K., Arnold, S.J., Trotter, M.W.B., Brown, S., Ang, L.T., Chng, Z., Robertson, E.J., Dunn, N.R., and Vallier, L. (2011). Pluripotency factors regulate definitive endoderm specification through eomesodermin. Genes Dev. *25*, 238–250.

Werbowetski-Ogilvie, T.E., Bossé, M., Stewart, M., Schnerch, A., Ramos-Mejia, V., Rouleau, A., Wynder, T., Smith, M.-J., Dingwall, S., Carter, T., et al. (2009). Characterization of human embryonic stem cells with features of neoplastic progression. Nat. Biotechnol. *27*, 91–97.

Wu, H., Kim, K.J., Mehta, K., Paxia, S., Sundstrom, A., Anantharaman, T., Kuraishy, A.I., Doan, T., Ghosh, J., Pyle, A.D., et al. (2008). Copy number variant analysis of human embryonic stem cells. Stem Cells *26*, 1484–1489.

Yang, S., Lin, G., Tan, Y., Zhou, D., Deng, L., Cheng, D., Luo, S., Liu, T., Zhou, X., Sun, Z., et al. (2008). Tumor progression of cultureadapted human embryonic stem cells during long-term culture. genes. Chromosomes Cancer 47, 665–679.

Yang, S., Lin, G., Tan, Y.-Q., Deng, L.-Y., Yuan, D., and Lu, G.-X. (2010). Differences between karyotypically normal and abnormal human embryonic stem cells. Cell Prolif. *43*, 195–206.

Ying, L., Mills, J.A., French, D.L., and Gadue, P. (2015). OCT4 coordinates with WNT signaling to pre-pattern chromatin at the SOX17 locus during human ES cell differentiation into definitive endoderm. Stem Cell Reports *5*, 490–498.

Zhu, L., Gomez-Duran, A., Saretzki, G., Jin, S., Tilgner, K., Melguizo-Sanchis, D., Anyfantis, G., Al-Aama, J., Vallier, L., Chinnery, P., et al. (2016). The mitochondrial protein CHCHD2 primes the differentiation potential of human induced pluripotent stem cells to neuroectodermal lineages. J. Cell Biol. *215*, 187–202. Stem Cell Reports, Volume 13

### **Supplemental Information**

### Gain of 20q11.21 in Human Pluripotent Stem Cells Impairs TGF-β-De-

### pendent Neuroectodermal Commitment

C. Markouli, E. Couvreu De Deckersberg, M. Regin, H.T. Nguyen, F. Zambelli, A. Keller, D. Dziedzicka, J. De Kock, L. Tilleman, F. Van Nieuwerburgh, L. Franceschini, K. Sermon, M. Geens, and C. Spits



Figure S1 (relates to figure 1 in the main text). Raw gene expression data of all genes expressed on chromosome 20, for the four lines carrying a gain of 20q11.21. Each plot represents the differential gene expression for that line against the whole group of control lines. Data plotted as a  $Log_2$  Fold Change.



Figure S2 (relates to figure 2 in the main text). Supplementary Figure 2A shows an *in silico* prediction of the differentially activated transcription factors, based on the binding motifs identified at the promoter region of each gene that is differentially expressed between wt vs mt or wt vs VUB03\_Bcl-xL (with a  $|log_2$  Fold Change|>1 and FDR<0.05). The prediction was done using the TRANSFAC and JASPAR databases in Enrichr (Chen et al., 2013; Kuleshov et al., 2016). The plot shows the Z-scores for the transcription factors. All results are statistically significant with a p-value<0.05 unless the value is specified. Supplementary figure 2B shows the results of the analysis using ENCODE and ChEA consensus, which searches for transcription binding models based on the ENCODE project and already published CHIP-seq data. The plot shows the Z-score for the transcription factors predicted to be differentially activated. All results are statistically significant with a p-value<0.05), unless otherwise indicated.



**Figure S3 (relates to figure 3 in the main text).** Figure S3A shows relative mRNA expression as measured by qPCR for *POU5F1, NANOG, FOXA2, SOX17, HAND1* and *T* after 4 days of neuroectoderm differentiation (n=3 to 5). Data are shown as mean  $\pm$ SEM, each dot represents an independent differentiation experiment and the horizontal bars with asterisks represent statistical significance between samples (P<0.05, t-test).

Figure S3B shows examples of immunostaining for PAX6 (green) and POU5F1 (red) in the lines not shown in figure 3 of the main text (VUB02\_wt, VUB02\_mt1 and VUB02\_mt2, VUB03\_mt), after 4 days of neuroectoderm differentiation. Figure 3SC shows the results of a 12-day neuroectoderm differentiation. The top panel shows the relative mRNA expression as measured by qPCR for *PAX6* and *SOX1* in VUB01\_wt and VUB01\_mt after 12 days of differentiation, and as compared to a 4-days differentiation. Under, are examples of immunostaining for PAX6 (green) and POU5F1 (red) in VUB01\_wt and VUB01\_mt after 12 days of neuroectoderm differentiation. The lower panel shows a plot with the percentages of PAX6 and POU5F1-positive cells in VUB01\_wt and VUB01\_mt after 12 days of neuroectoderm differentiation (n=1).



Figure S4, relates to figure 4 in main text. Immunostaining for T (green) and POU5F1 (red) after 24h mesendoderm induction for the lines not shown in figure 4A (VUB02\_wt, VUB02\_mt1 and VUB02\_mt2, VUB03 wt versus VUB03 mt and VUB03 Bcl-xL.



**Figure S5 (relates to figure 4 in the main text).** Figure S5A shows relative mRNA expression as measured by qPCR for *FOXA2, NANOG, HAND1, T, PAX6* and *SOX1* after definitive endoderm differentiation for all the lines (n=3 to 5). Data are shown as mean  $\pm$ SEM, each dot represents an independent differentiation experiment and the horizontal bars with asterisks represent statistical significance between samples (P<0.05, t-test). Figure S5B shows immunostaining for SOX17 (green) and POU5F1 (red) after definitive endoderm differentiation in lines not shown in Figure 4 (VUB02\_wt, VUB02\_mt1, VUB02\_mt2 and VUB03\_mt).

| Line         | Passage<br>range | Karyotype               | Breakpoints (size)               |
|--------------|------------------|-------------------------|----------------------------------|
| VUB01        | 75-89            | 46, XY                  |                                  |
| VUB01_mt     | 289-303          | 46, XY,dup(20)(q11.21)  | 20: 31300536 - 35306783 (3.9Mb)  |
| VUB02        | 15               | 46, XY                  |                                  |
| VUB02_mt1    | 377-383          | 46, XY,dup(20)(q11.21)  | 20: 31300536 - 32533536 (1.2Mb)  |
| VUB02_mt2    | 19-25            | 46, XY,i(20)(p11.1)     | 20: 90359 – 26095364 (26Mb)      |
|              |                  |                         | 20: 26108364 - 64262203 (36.3Mb) |
| VUB03        | 23-29            | 46, XX                  |                                  |
| VUB03_mt     | 207-209          | 46, XX,dup(20)(q11.21)  | 20: 31300536 - 32212536 (0.9Mb)  |
| VUB03_Bcl-xL | 106-109          | 46, XX,dup(1)(q32.1q41) | 1: 19705020 - 21919120 (22.1Mb)  |
| VUB14        | 22-25            | 46, XX                  |                                  |

Table S1. List of lines and sublines used in the study, passage range and details on the genetic content of the lines

Table S2. Gene set enrichment analysis for the C2 library

| NAME                                       | SIZE | NES    | FDR q-<br>val |
|--|------|--------|---------------|
| SHEN SMARCA2 TARGETS UP                    | 413  | -2.706 | 0.00          |
| OUELLET OVARIAN CANCER INVASIVE VS LMP UP  | 113  | -2.565 | 0.00          |
| MILI PSEUDOPODIA HAPTOTAXIS UP             | 476  | -2.508 | 0.00          |
| SEIDEN ONCOGENESIS BY MET                  | 82   | -2.441 | 0.00          |
| SENGUPTA NASOPHARYNGEAL CARCINOMA UP       | 254  | -2.400 | 0.00          |
| JOHNSTONE PARVB TARGETS 2 DN               | 309  | -2.370 | 0.00          |
| ZHANG BREAST CANCER PROGENITORS UP         | 394  | -2.369 | 0.00          |
| KAMMINGA EZH2 TARGETS                      | 40   | -2.333 | 0.00          |
| DING LUNG CANCER EXPRESSION BY COPY NUMBER | 96   | -2.252 | 0.00          |
| BIDUS METASTASIS UP                        | 203  | -2.230 | 0.00          |
| DE YY1 TARGETS DN                          | 88   | -2.189 | 0.00          |
| DAZARD RESPONSE TO UV SCC UP               | 106  | -2.182 | 0.00          |
| BORCZUK MALIGNANT MESOTHELIOMA UP          | 288  | -2.130 | 0.00          |
| ABRAMSON INTERACT WITH AIRE                | 42   | -2.126 | 0.00          |
| MALONEY RESPONSE TO 17AAG DN               | 77   | -2.124 | 0.00          |

| CHIANG LIVER CANCER SUBCLASS UNANNOTATED DN         | 178 | -2.114 | 0.00 |
|---|-----|--------|------|
| RHEIN ALL GLUCOCORTICOID THERAPY DN                 | 342 | -2.107 | 0.00 |
| GENTILE UV RESPONSE CLUSTER D4                      | 54  | -2.104 | 0.00 |
| FISCHER G2 M CELL CYCLE                             | 216 | -2.101 | 0.00 |
| SAKAI TUMOR INFILTRATING MONOCYTES DN               | 73  | -2.100 | 0.00 |
| SCHLOSSER MYC TARGETS REPRESSED BY SERUM            | 153 | -2.099 | 0.00 |
| MARTINEZ RESPONSE TO TRABECTEDIN DN                 | 264 | -2.098 | 0.00 |
| IKEDA MIR30 TARGETS UP                              | 111 | -2.096 | 0.00 |
| JAATINEN HEMATOPOIETIC STEM CELL UP                 | 267 | -2.095 | 0.00 |
| DACOSTA UV RESPONSE VIA ERCC3 COMMON DN             | 463 | -2.087 | 0.00 |
| PYEON CANCER HEAD AND NECK VS CERVICAL UP           | 162 | -2.068 | 0.00 |
| ENK UV RESPONSE KERATINOCYTE DN                     | 471 | -2.041 | 0.00 |
| GABRIELY MIR21 TARGETS                              | 269 | -2.038 | 0.00 |
| RAMALHO STEMNESS UP                                 | 197 | -2.036 | 0.00 |
| WINNEPENNINCKX MELANOMA METASTASIS UP               | 149 | -2.036 | 0.00 |
| KENNY CTNNB1 TARGETS UP                             | 41  | -2.035 | 0.00 |
| GARY CD5 TARGETS DN                                 | 394 | -2.028 | 0.00 |
| WAMUNYOKOLI OVARIAN CANCER LMP DN                   | 176 | -2.019 | 0.00 |
| ONDER CDH1 TARGETS 1 DN                             | 138 | -2.017 | 0.00 |
| IKEDA MIR1 TARGETS UP                               | 52  | -2.011 | 0.00 |
| CHEOK RESPONSE TO HD MTX DN                         | 23  | -2.007 | 0.00 |
| SPIRA SMOKERS LUNG CANCER UP                        | 31  | -2.006 | 0.00 |
| HAHTOLA MYCOSIS FUNGOIDES CD4 DN                    | 108 | -2.005 | 0.00 |
| LI WILMS TUMOR VS FETAL KIDNEY 2 UP                 | 24  | -2.000 | 0.00 |
| NIKOLSKY BREAST CANCER 8Q12 Q22 AMPLICON            | 105 | -1.986 | 0.00 |
| DEBIASI APOPTOSIS BY REOVIRUS INFECTION UP          | 285 | -1.984 | 0.00 |
| YU MYC TARGETS UP                                   | 39  | -1.980 | 0.00 |
| WELCSH BRCA1 TARGETS UP                             | 186 | -1.978 | 0.00 |
| FEVR CTNNB1 TARGETS DN                              | 499 | -1.978 | 0.00 |
| GENTILE UV HIGH DOSE DN                             | 290 | -1.975 | 0.00 |
| FLECHNER BIOPSY KIDNEY TRANSPLANT REJECTED VS OK DN | 479 | -1.973 | 0.00 |

| BOYAULT LIVER CANCER SUBCLASS G3 UP                               | 181 | -1.968 | 0.00 |
|---|-----|--------|------|
| REACTOME METABOLISM OF NON CODING RNA                             | 47  | -1.958 | 0.00 |
| WILCOX RESPONSE TO PROGESTERONE UP                                | 125 | -1.951 | 0.00 |
| DAZARD RESPONSE TO UV NHEK DN                                     | 296 | -1.951 | 0.00 |
| GREENBAUM E2A TARGETS UP  | 31  | -1.947 | 0.00 |
| PENG GLUCOSE DEPRIVATION DN                                       | 150 | -1.945 | 0.00 |
| CAIRO LIVER DEVELOPMENT UP  | 148 | -1.942 | 0.00 |
| FLORIO NEOCORTEX BASAL RADIAL GLIA DN                             | 182 | -1.940 | 0.00 |
| XU HGF TARGETS INDUCED BY AKT1 48HR DN                            | 24  | -1.939 | 0.00 |
| HORIUCHI WTAP TARGETS DN  | 284 | -1.938 | 0.00 |
| FERREIRA EWINGS SARCOMA UNSTABLE VS STABLE UP                     | 144 | -1.938 | 0.00 |
| SENGUPTA NASOPHARYNGEAL CARCINOMA WITH LMP1 UP                    | 329 | -1.937 | 0.00 |
| HU ANGIOGENESIS DN  | 35  | -1.935 | 0.00 |
| WHITFIELD CELL CYCLE S  | 144 | -1.935 | 0.00 |
| CHEN HOXA5 TARGETS 9HR UP   | 201 | -1.934 | 0.00 |
| LOPEZ MBD TARGETS IMPRINTED AND X LINKED                          | 15  | -1.932 | 0.00 |
| GRAHAM NORMAL QUIESCENT VS NORMAL DIVIDING DN                     | 80  | -1.922 | 0.00 |
| PUJANA XPRSS INT NETWORK  | 157 | -1.922 | 0.00 |
| BONOME OVARIAN CANCER POOR SURVIVAL UP                            | 30  | -1.919 | 0.00 |
| VANTVEER BREAST CANCER METASTASIS DN                              | 106 | -1.918 | 0.00 |
| KIM WT1 TARGETS DN  | 410 | -1.914 | 0.00 |
| TIEN INTESTINE PROBIOTICS 2HR DN                                  | 84  | -1.912 | 0.01 |
| KEGG CELL CYCLE   | 120 | -1.903 | 0.01 |
| ZHENG FOXP3 TARGETS IN T LYMPHOCYTE DN                            | 29  | -1.900 | 0.01 |
| IKEDA MIR133 TARGETS UP   | 41  | -1.896 | 0.01 |
| KANG DOXORUBICIN RESISTANCE UP                                    | 50  | -1.882 | 0.01 |
| RHODES UNDIFFERENTIATED CANCER                                    | 65  | -1.881 | 0.01 |
| ROME INSULIN TARGETS IN MUSCLE UP                                 | 391 | -1.880 | 0.01 |
| SAKAI CHRONIC HEPATITIS VS LIVER CANCER UP                        | 73  | -1.879 | 0.01 |
| ZHANG TLX TARGETS 36HR DN   | 181 | -1.878 | 0.01 |
| REACTOME CLEAVAGE OF GROWING TRANSCRIPT IN THE TERMINATION REGION | 42  | -1.875 | 0.01 |

| CHIARADONNA NEOPLASTIC TRANSFORMATION KRAS UP               | 111 | -1.870 | 0.01 |
|---|-----|--------|------|
| LEE EARLY T LYMPHOCYTE UP                                   | 88  | -1.869 | 0.01 |
| RODWELL AGING KIDNEY NO BLOOD DN                            | 138 | -1.868 | 0.01 |
| MORI IMMATURE B LYMPHOCYTE DN                               | 87  | -1.867 | 0.01 |
| LEE LIVER CANCER SURVIVAL DN                                | 163 | -1.860 | 0.01 |
| LY AGING OLD DN   | 54  | -1.854 | 0.01 |
| BURTON ADIPOGENESIS 12                                      | 31  | -1.848 | 0.01 |
| ALONSO METASTASIS UP  | 173 | -1.846 | 0.01 |
| REACTOME PROCESSING OF CAPPED INTRON CONTAINING PRE<br>MRNA | 132 | -1.844 | 0.01 |
| CHIARETTI T ALL RELAPSE PROGNOSIS                           | 16  | -1.844 | 0.01 |
| WU APOPTOSIS BY CDKN1A VIA TP53                             | 52  | -1.843 | 0.01 |
| VERHAAK GLIOBLASTOMA NEURAL                                 | 106 | -1.842 | 0.01 |
| MARKEY RB1 ACUTE LOF UP                                     | 218 | -1.836 | 0.01 |
| MMS MOUSE LYMPH HIGH 4HRS UP                                | 32  | -1.829 | 0.01 |
| MOREAUX MULTIPLE MYELOMA BY TACI DN                         | 153 | -1.829 | 0.01 |
| BROWNE HCMV INFECTION 10HR DN                               | 48  | -1.828 | 0.01 |
| TOOKER GEMCITABINE RESISTANCE DN                            | 118 | -1.827 | 0.01 |
| LEE RECENT THYMIC EMIGRANT                                  | 182 | -1.823 | 0.01 |
| RICKMAN METASTASIS UP                                       | 309 | -1.822 | 0.01 |
| MAYBURD RESPONSE TO L663536 DN                              | 50  | -1.822 | 0.01 |
| OSMAN BLADDER CANCER UP                                     | 360 | -1.821 | 0.01 |
| WHITEFORD PEDIATRIC CANCER MARKERS                          | 110 | -1.821 | 0.01 |
| EPPERT PROGENITOR   | 119 | -1.818 | 0.01 |
| TURASHVILI BREAST DUCTAL CARCINOMA VS LOBULAR NORMAL<br>UP  | 69  | -1.818 | 0.01 |
| MISSIAGLIA REGULATED BY METHYLATION DN                      | 113 | -1.818 | 0.01 |
| ZHANG TLX TARGETS DN  | 87  | -1.815 | 0.01 |
| PICCALUGA ANGIOIMMUNOBLASTIC LYMPHOMA DN                    | 122 | -1.814 | 0.01 |
| ZHENG FOXP3 TARGETS UP                                      | 22  | -1.812 | 0.01 |
| ROSTY CERVICAL CANCER PROLIFERATION CLUSTER                 | 132 | -1.811 | 0.01 |
| BENPORATH ES 1  | 355 | -1.808 | 0.02 |

| ZHANG TLX TARGETS 60HR DN                              | 257 | -1.807 | 0.02 |
|--|-----|--------|------|
| ZHENG FOXP3 TARGETS IN THYMUS UP                       | 170 | -1.805 | 0.02 |
| FINETTI BREAST CANCERS KINOME GRAY                     | 15  | -1.804 | 0.02 |
| REACTOME MRNA 3 END PROCESSING                         | 33  | -1.799 | 0.02 |
| SEIDEN MET SIGNALING                                   | 19  | -1.798 | 0.02 |
| MORI PRE BI LYMPHOCYTE UP                              | 72  | -1.795 | 0.02 |
| PECE MAMMARY STEM CELL DN                              | 127 | -1.795 | 0.02 |
| BENPORATH PROLIFERATION                                | 134 | -1.795 | 0.02 |
| BOYAULT LIVER CANCER SUBCLASS G23 UP                   | 49  | -1.794 | 0.02 |
| THUM SYSTOLIC HEART FAILURE UP                         | 313 | -1.793 | 0.02 |
| LE EGR2 TARGETS UP                                     | 103 | -1.793 | 0.02 |
| FLECHNER PBL KIDNEY TRANSPLANT OK VS DONOR DN          | 36  | -1.791 | 0.02 |
| BOYAULT LIVER CANCER SUBCLASS G123 UP                  | 44  | -1.791 | 0.02 |
| BLALOCK ALZHEIMERS DISEASE INCIPIENT DN                | 151 | -1.790 | 0.02 |
| TARTE PLASMA CELL VS PLASMABLAST DN                    | 288 | -1.789 | 0.02 |
| BIOCARTA PROTEASOME PATHWAY                            | 28  | -1.787 | 0.02 |
| BECKER TAMOXIFEN RESISTANCE DN                         | 45  | -1.776 | 0.02 |
| BIOCARTA CHEMICAL PATHWAY                              | 22  | -1.775 | 0.02 |
| HEDENFALK BREAST CANCER BRCA1 VS BRCA2                 | 153 | -1.775 | 0.02 |
| HADDAD T LYMPHOCYTE AND NK PROGENITOR UP               | 68  | -1.774 | 0.02 |
| CHIARADONNA NEOPLASTIC TRANSFORMATION CDC25 UP         | 104 | -1.770 | 0.02 |
| ALONSO METASTASIS EMT UP                               | 30  | -1.770 | 0.02 |
| DEN INTERACT WITH LCA5                                 | 25  | -1.770 | 0.02 |
| CHANG CYCLING GENES                                    | 135 | -1.769 | 0.02 |
| CHESLER BRAIN HIGHEST EXPRESSION                       | 36  | -1.766 | 0.02 |
| BAELDE DIABETIC NEPHROPATHY DN                         | 400 | -1.766 | 0.02 |
| TURASHVILI BREAST DUCTAL CARCINOMA VS DUCTAL NORMAL UP | 40  | -1.764 | 0.02 |
| VILLANUEVA LIVER CANCER KRT19 UP                       | 158 | -1.762 | 0.02 |
| REICHERT MITOSIS LIN9 TARGETS                          | 27  | -1.761 | 0.02 |
| REACTOME MRNA PROCESSING                               | 149 | -1.759 | 0.02 |
| NIKOLSKY BREAST CANCER 6P24 P22 AMPLICON               | 19  | -1.758 | 0.02 |

| WANG SMARCE1 TARGETS DN  | 328 | -1.758 | 0.02 |
|--|-----|--------|------|
| BOYAULT LIVER CANCER SUBCLASS G12 UP                                   | 36  | -1.757 | 0.02 |
| REACTOME SIGNALING BY TGF BETA RECEPTOR COMPLEX                        | 60  | -1.757 | 0.02 |
| JI RESPONSE TO FSH DN  | 56  | -1.757 | 0.02 |
| KYNG WERNER SYNDROM AND NORMAL AGING UP                                | 81  | -1.754 | 0.02 |
| TCGA GLIOBLASTOMA COPY NUMBER DN                                       | 24  | -1.753 | 0.02 |
| ZHOU CELL CYCLE GENES IN IR RESPONSE 24HR                              | 116 | -1.750 | 0.02 |
| FINETTI BREAST CANCER KINOME RED                                       | 16  | -1.749 | 0.02 |
| LU EZH2 TARGETS DN   | 338 | -1.748 | 0.02 |
| GRAHAM CML DIVIDING VS NORMAL QUIESCENT UP                             | 161 | -1.746 | 0.02 |
| VERNELL RETINOBLASTOMA PATHWAY UP                                      | 68  | -1.746 | 0.02 |
| KIM GERMINAL CENTER T HELPER UP  | 55  | -1.743 | 0.02 |
| REACTOME DOWNREGULATION OF SMAD2 3 SMAD4<br>TRANSCRIPTIONAL ACTIVITY   | 19  | -1.742 | 0.03 |
| PUJANA BRCA CENTERED NETWORK   | 114 | -1.741 | 0.03 |
| ODONNELL TFRC TARGETS DN   | 114 | -1.740 | 0.03 |
| KRIEG KDM3A TARGETS NOT HYPOXIA  | 166 | -1.739 | 0.03 |
| APPIERTO RESPONSE TO FENRETINIDE DN                                    | 46  | -1.735 | 0.03 |
| REACTOME TRANSPORT OF MATURE TRANSCRIPT TO CYTOPLASM                   | 51  | -1.733 | 0.03 |
| LINDGREN BLADDER CANCER CLUSTER 3 UP                                   | 293 | -1.723 | 0.03 |
| WANG CLIM2 TARGETS DN  | 173 | -1.721 | 0.03 |
| REACTOME TRANSCRIPTIONAL ACTIVITY OF SMAD2 SMAD3<br>SMAD4 HETEROTRIMER | 36  | -1.721 | 0.03 |
| GENTILE UV RESPONSE CLUSTER D6   | 34  | -1.718 | 0.03 |
| LAIHO COLORECTAL CANCER SERRATED UP                                    | 102 | -1.716 | 0.03 |
| REACTOME REGULATION OF MITOTIC CELL CYCLE                              | 75  | -1.715 | 0.03 |
| CHIANG LIVER CANCER SUBCLASS PROLIFERATION UP                          | 160 | -1.711 | 0.03 |
| MARTORIATI MDM4 TARGETS NEUROEPITHELIUM DN                             | 121 | -1.706 | 0.03 |
| SHEDDEN LUNG CANCER POOR SURVIVAL A6                                   | 410 | -1.706 | 0.03 |
| REACTOME PROCESSING OF CAPPED INTRONLESS PRE MRNA                      | 23  | -1.705 | 0.03 |
| KOBAYASHI EGFR SIGNALING 24HR DN                                       | 238 | -1.705 | 0.03 |
| SOTIRIOU BREAST CANCER GRADE 1 VS 3 UP                                 | 141 | -1.705 | 0.03 |

| SARRIO EPITHELIAL MESENCHYMAL TRANSITION UP | 168 | -1.704 | 0.03 |
|---|-----|--------|------|
| BROWNE HCMV INFECTION 18HR UP               | 157 | -1.704 | 0.03 |
| PEDERSEN METASTASIS BY ERBB2 ISOFORM 3      | 15  | -1.704 | 0.03 |
| YANG BREAST CANCER ESR1 LASER DN            | 47  | -1.704 | 0.03 |
| RODWELL AGING KIDNEY DN                     | 125 | -1.703 | 0.03 |
| AIYAR COBRA1 TARGETS UP                     | 33  | -1.701 | 0.03 |
| REACTOME MRNA SPLICING                      | 104 | -1.701 | 0.03 |
| STEIN ESR1 TARGETS                          | 78  | -1.699 | 0.04 |
| DITTMER PTHLH TARGETS UP                    | 108 | -1.699 | 0.04 |
| ZHENG BOUND BY FOXP3                        | 396 | -1.698 | 0.04 |
| GOLDRATH ANTIGEN RESPONSE                   | 285 | -1.697 | 0.04 |
| YANAGIHARA ESX1 TARGETS                     | 27  | -1.695 | 0.04 |
| PUIFFE INVASION INHIBITED BY ASCITES DN     | 136 | -1.692 | 0.04 |
| WANG TUMOR INVASIVENESS DN                  | 196 | -1.690 | 0.04 |
| ISHIDA E2F TARGETS                          | 49  | -1.690 | 0.04 |
| GENTILE UV RESPONSE CLUSTER D2              | 39  | -1.690 | 0.04 |
| GOLDRATH HOMEOSTATIC PROLIFERATION          | 159 | -1.690 | 0.04 |
| CHARAFE BREAST CANCER LUMINAL VS BASAL DN   | 381 | -1.689 | 0.04 |
| REACTOME G1 S TRANSITION                    | 106 | -1.689 | 0.04 |
| FOURNIER ACINAR DEVELOPMENT LATE 2          | 264 | -1.689 | 0.04 |
| IGLESIAS E2F TARGETS UP                     | 132 | -1.686 | 0.04 |
| TERAO AOX4 TARGETS SKIN DN                  | 19  | -1.686 | 0.04 |
| PETRETTO CARDIAC HYPERTROPHY                | 33  | -1.684 | 0.04 |
| DEURIG T CELL PROLYMPHOCYTIC LEUKEMIA DN    | 244 | -1.683 | 0.04 |
| EGUCHI CELL CYCLE RB1 TARGETS               | 23  | -1.682 | 0.04 |
| MOHANKUMAR HOXA1 TARGETS UP                 | 370 | -1.678 | 0.04 |
| WONG EMBRYONIC STEM CELL CORE               | 330 | -1.678 | 0.04 |
| RUIZ TNC TARGETS DN                         | 132 | -1.677 | 0.04 |
| REACTOME PHOSPHORYLATION OF THE APC C       | 16  | -1.675 | 0.04 |
| AMUNDSON GAMMA RADIATION RESPONSE           | 38  | -1.675 | 0.04 |
| BROWNE HCMV INFECTION 6HR DN                | 143 | -1.674 | 0.04 |

| DACOSTA UV RESPONSE VIA ERCC3 XPCS DN  | 79  | -1.671 | 0.04 |
|--|-----|--------|------|
| MOLENAAR TARGETS OF CCND1 AND CDK4 DN  | 49  | -1.668 | 0.04 |
| PAL PRMT5 TARGETS UP   | 194 | -1.667 | 0.04 |
| MATZUK EMBRYONIC GERM CELL   | 15  | -1.667 | 0.04 |
| BONCI TARGETS OF MIR15A AND MIR16 1  | 81  | -1.667 | 0.04 |
| SCIBETTA KDM5B TARGETS DN  | 77  | -1.666 | 0.04 |
| GAZDA DIAMOND BLACKFAN ANEMIA PROGENITOR DN  | 61  | -1.665 | 0.04 |
| BIOCARTA CTCF PATHWAY  | 20  | -1.664 | 0.04 |
| PETROVA ENDOTHELIUM LYMPHATIC VS BLOOD UP  | 114 | -1.664 | 0.04 |
| HOSHIDA LIVER CANCER SUBCLASS S2   | 109 | -1.663 | 0.04 |
| SASAKI ADULT T CELL LEUKEMIA   | 159 | -1.662 | 0.04 |
| KAYO AGING MUSCLE DN   | 111 | -1.661 | 0.04 |
| EHLERS ANEUPLOIDY UP   | 36  | -1.661 | 0.04 |
| FARMER BREAST CANCER CLUSTER 2   | 32  | -1.661 | 0.04 |
| DAZARD UV RESPONSE CLUSTER G6  | 142 | -1.659 | 0.04 |
| KONG E2F3 TARGETS  | 87  | -1.659 | 0.04 |
| BIOCARTA CCR3 PATHWAY  | 18  | -1.658 | 0.04 |
| MATTIOLI MGUS VS PCL   | 84  | -1.658 | 0.04 |
| JIANG AGING CEREBRAL CORTEX UP   | 32  | -1.658 | 0.04 |
| BURTON ADIPOGENESIS 3  | 98  | -1.653 | 0.05 |
| REACTOME MITOTIC G1 G1 S PHASES  | 128 | -1.649 | 0.05 |
| PLASARI TGFB1 TARGETS 10HR DN  | 201 | -1.649 | 0.05 |
| SUNG METASTASIS STROMA DN  | 45  | -1.649 | 0.05 |
| FRASOR RESPONSE TO SERM OR FULVESTRANT UP  | 20  | -1.648 | 0.05 |
| KOKKINAKIS METHIONINE DEPRIVATION 96HR UP  | 104 | -1.647 | 0.05 |
| STEARMAN LUNG CANCER EARLY VS LATE UP  | 117 | -1.645 | 0.05 |
| XU HGF SIGNALING NOT VIA AKT1 48HR DN  | 20  | -1.645 | 0.05 |
| PUJANA BRCA2 PCC NETWORK   | 380 | -1.644 | 0.05 |
| PID NFKAPPAB CANONICAL PATHWAY   | 21  | -1.644 | 0.05 |
| REACTOME INHIBITION OF THE PROTEOLYTIC ACTIVITY OF APC C<br>REQUIRED FOR THE ONSET OF ANAPHASE BY MITOTIC SPINDLE<br>CHECKPOINT COMPONENTS | 17  | -1.641 | 0.05 |

| BERENJENO TRANSFORMED BY RHOA UP  | 491 | -1.641 | 0.05 |
|---|-----|--------|------|
| NIKOLSKY BREAST CANCER 16P13 AMPLICON   | 87  | 2.136  | 0.01 |
| LU EZH2 TARGETS UP  | 239 | 2.041  | 0.02 |
| NIKOLSKY BREAST CANCER 7P22 AMPLICON  | 30  | 2.005  | 0.03 |
| LI DCP2 BOUND MRNA  | 83  | 2.005  | 0.02 |
| SCHLOSSER SERUM RESPONSE UP   | 114 | 1.997  | 0.02 |
| SENGUPTA EBNA1 ANTICORRELATED   | 122 | 1.997  | 0.01 |
| DIRMEIER LMP1 RESPONSE LATE DN  | 28  | 1.990  | 0.01 |
| WALLACE JAK2 TARGETS UP   | 22  | 1.983  | 0.01 |
| NIKOLSKY BREAST CANCER 16Q24 AMPLICON   | 43  | 1.958  | 0.02 |
| REACTOME FORMATION OF THE TERNARY COMPLEX AND<br>SUBSEQUENTLY THE 43S COMPLEX | 48  | 1.950  | 0.02 |
| DACOSTA UV RESPONSE VIA ERCC3 UP  | 292 | 1.947  | 0.02 |
| RICKMAN METASTASIS DN   | 211 | 1.931  | 0.02 |
| CERIBELLI GENES INACTIVE AND BOUND BY NFY                                     | 20  | 1.930  | 0.02 |
| HAMAI APOPTOSIS VIA TRAIL DN  | 155 | 1.926  | 0.02 |
| MARTENS TRETINOIN RESPONSE UP   | 440 | 1.896  | 0.03 |
| CHNG MULTIPLE MYELOMA HYPERPLOID UP   | 50  | 1.872  | 0.03 |
| MIKKELSEN MCV6 HCP WITH H3K27ME3  | 292 | 1.860  | 0.04 |
| KESHELAVA MULTIPLE DRUG RESISTANCE  | 68  | 1.854  | 0.04 |
| GINESTIER BREAST CANCER ZNF217 AMPLIFIED DN                                   | 293 | 1.847  | 0.04 |
| SCHLOSSER MYC AND SERUM RESPONSE SYNERGY                                      | 32  | 1.845  | 0.04 |
| MEDINA SMARCA4 TARGETS  | 33  | 1.843  | 0.04 |
| HOLLEMAN ASPARAGINASE RESISTANCE B ALL UP                                     | 24  | 1.828  | 0.05 |
| KORKOLA CORRELATED WITH POU5F1  | 32  | 1.826  | 0.04 |
| NAKAMURA METASTASIS MODEL UP  | 35  | 1.817  | 0.05 |

**Table S3.** List of 100 top deregulated genes

| Transcript name | LogFC | FDR      | Gene_function   |
|-----------------|-------|----------|---|
|                 |       | 1 45 05  | nuclear pore complex interacting protein family member A8         |
| NPIPA8          | 7,46  | 1,4E-05  | [Source:HGNC Symbol;Acc:HGNC:41983]                               |
| HIST1H4K        | 7 18  | 5 2E-04  | Symbol Acc: HGNC: 4784]   |
|                 | ,,10  | 0,22 01  | chondrosarcoma associated gene 1 [Source:HGNC                     |
| CSAG1           | 6,80  | 3,5E-05  | Symbol;Acc:HGNC:24294]  |
| INCOOD WDD1     | (72)  | 0.75.04  | INO80B-WBP1 readthrough (NMD candidate) [Source:HGNC              |
| INO80B-WBP1     | 6,72  | 9,7E-04  | Symbol;Acc:HGNC:49199]  |
| TTR             | 6,06  | 3,8E-08  | transthyretin [Source:HGNC Symbol;Acc:HGNC:12405]                 |
| C15orf38-AP3S2  | 5 76  | 1 7E-06  | Symbol: Acc: HGNC: 388241   |
|                 | 5,70  | 1,72.00  | CSAG family member 2 [Source:HGNC                                 |
| CSAG2           | 5,70  | 1,1E-04  | Symbol;Acc:HGNC:16847]  |
|                 | 5 70  | 1 15 04  | CSAG family member 3 [Source:HGNC                                 |
| CSAG3           | 5,70  | 1,1E-04  | Symbol;Acc:HGNC:26237]  |
|                 |       |          | acetylglucosaminyltransferase [Source:HGNC                        |
| MGAT2           | 5,54  | 2,7E-03  | Symbol;Acc:HGNC:7045]   |
|                 |       |          | MAGE family member A12 [Source:HGNC                               |
| MAGEA12         | 5,32  | 1,9E-04  | Symbol;Acc:HGNC:6799]   |
| TBX1            | 5,27  | 3,2E-06  | T-box 1 [Source:HGNC Symbol;Acc:HGNC:11592]                       |
| CVCL11          | 5 25  | 2 25 04  | C-X-C motif chemokine ligand 11 [Source:HGNC                      |
| CACLII          | 5,25  | 2,2E-04  | deleted in azoospermia 1 [Source:HGNC                             |
| DAZ1            | 4,06  | 6,0E-04  | Symbol;Acc:HGNC:2682]   |
|                 |       |          | tubulin beta 8 class VIII [Source:HGNC                            |
| TUBB8           | 3,97  | 2,6E-09  | Symbol;Acc:HGNC:20773]  |
| NKX6-1          | 3,96  | 8,0E-04  | NK6 homeobox 1 [Source:HGNC Symbol;Acc:HGNC:7839]                 |
| NOVOI           | 2 87  | 2 OF 05  | NADPH oxidase organizer 1 [Source:HGNC<br>Symbol: Ace:HGNC:19404] |
| NOXOI           | 5,67  | 5,012-05 | ras-related C3 botulinum toxin substrate 3 (rho family, small     |
|                 |       |          | GTP binding protein Rac3) [Source:HGNC                            |
| RAC3            | 3,84  | 1,6E-12  | Symbol;Acc:HGNC:9803]   |
| 1192974         | 2.76  | 2 95 04  | heparan sulfate-glucosamine 3-sulfotransferase 6                  |
| 0,000           | 3,70  | 2,0E-04  |   |
| 0090            | 3,02  | 2,4E-00  | CHKB-CPT1B readthrough (NMD candidate) [Source:HGNC               |
| CHKB-CPT1B      | 3,61  | 1,5E-03  | Symbol;Acc:HGNC:41998]  |
| DEFB124         | 3,57  | 1,6E-04  | defensin beta 124 [Source:HGNC Symbol;Acc:HGNC:18104]             |
|                 |       |          | NPHP3-ACAD11 readthrough (NMD candidate)                          |
| NPHP3-ACAD11    | 3,55  | 1,9E-04  | [Source:HGNC Symbol;Acc:HGNC:48351]                               |
| MVDI 2          | 2 27  | 7.5E 12  | MYB proto-oncogene like 2 [Source:HGNC                            |
| WIIDL2          | 5,27  | 7,3E-12  | NLR family pyrin domain containing 5 [Source:HGNC                 |
| NLRP5           | 3,27  | 2,7E-03  | Symbol;Acc:HGNC:21269]  |
|                 |       |          | myocyte enhancer factor 2B [Source:HGNC                           |
| MEF2B           | 3,26  | 2,2E-03  | Symbol;Acc:HGNC:6995]   |
| FMX2            | 3 25  | 1 3E-02  | Symbol: Acc: HGNC:33411   |
| SGCA            | 3 20  | 1.9E-03  | sarcoglycan alpha [Source:HGNC Symbol: Acc:HGNC:10805]            |
| GLS2            | 3.17  | 4 5E-05  | glutaminase 2 [Source:HGNC Symbol: Acc:HGNC:20570]                |
|                 | 5,17  | 7,51-05  | RBAK-RBAKDN readthrough [Source:HGNC                              |
| RBAK-RBAKDN     | 3,15  | 1,2E-02  | Symbol;Acc:HGNC:42971]  |

|                 |         |          | RNA polymerase II subunit J2 [Source:NCBI                                  |
|-----------------|---------|----------|--|
| POLR2J2         | 3,08    | 1,7E-02  | gene;Acc:246721]   |
|                 | 2.06    |          | transcription factor AP-2 epsilon [Source:HGNC                             |
| TFAP2E          | 3,06    | 2,2E-03  | Symbol;Acc:HGNC:307/4]   |
| POTEE           | 3.05    | 2 8E 03  | POTE ankyrin domain family member E [Source:HGNC                           |
| TOTEL           | 5,05    | 2,812-03 | BNASEK_C17orf/9 readthrough [Source:HGNC                                   |
| RNASEK-C17orf49 | 3 04    | 1 8E-13  | Symbol: Acc: HGNC:44419]   |
|                 | 5,01    | 1,02 15  | transmembrane protein 121 [Source:HGNC                                     |
| TMEM121         | 3.04    | 7.8E-10  | Symbol:Acc:HGNC:20511]   |
|                 | ,       | ,        | dipeptidyl peptidase 7 [Source:HGNC  |
| DPP7            | 3,01    | 4,9E-11  | Symbol;Acc:HGNC:14892]   |
|                 |         |          | growth differentiation factor 5 [Source:HGNC                               |
| GDF5            | 2,99    | 2,2E-04  | Symbol;Acc:HGNC:4220]  |
|                 | 2.07    | 0.15.05  | paraneoplastic Ma antigen family member 6F [Source:HGNC                    |
| PNMA6F          | 2,97    | 9,1E-05  | Symbol;Acc:HGNC:53119  |
| 71C1            | 2.06    | 2 4E 03  | Zic family member 1 [Source:HGNC   |
|                 | 2,90    | 2,411-03 | arginyl aminopentidase like 1 [Source:HGNC                                 |
| RNPEPL1         | 2.95    | 3 9E-12  | Symbol: Acc: HGNC:100791   |
|                 | _,, , , | 0,7212   | phosphatase and actin regulator 3 [Source:HGNC                             |
| PHACTR3         | 2,95    | 1,9E-04  | Symbol;Acc:HGNC:15833]   |
|                 |         | ,        | IgLON family member 5 [Source:HGNC   |
| IGLON5          | 2,94    | 8,9E-14  | Symbol;Acc:HGNC:34550]   |
|                 |         |          | cell division cycle 34 [Source:HGNC  |
| CDC34           | 2,93    | 6,4E-18  | Symbol;Acc:HGNC:1734]  |
| EVA1B           | 2,93    | 3,2E-08  | eva-1 homolog B [Source:HGNC Symbol;Acc:HGNC:25558]                        |
|                 |         |          | RNA binding motif protein 46 [Source:HGNC                                  |
| RBM46           | 2,92    | 6,2E-05  | Symbol;Acc:HGNC:28401]   |
| CD1 401         | 2 0 1   | 2 15 04  | SP140 nuclear body protein like [Source:HGNC                               |
| SP140L          | 2,91    | 2,1E-04  | Symbol;Acc:HGNC:25105]   |
| NTAN1           | 2 90    | 1 0E 06  | N-terminal asparagine amidase [Source:HGNC<br>Symbol: Acc:HGNC:20000]      |
|                 | 2,90    | 1,012-00 | golgin A6 family member D [Source:HGNC                                     |
| GOLGA6D         | 2.89    | 6.9E-03  | Symbol: Acc: HGNC:322041   |
|                 | _,      | -,       | glutamate ionotropic receptor NMDA type subunit 1                          |
| GRIN1           | 2,89    | 2,1E-04  | [Source:HGNC Symbol;Acc:HGNC:4584]   |
|                 |         |          | undifferentiated embryonic cell transcription factor 1                     |
| UTF1            | 2,88    | 1,6E-06  | [Source:HGNC Symbol;Acc:HGNC:12634]  |
| CLDN16          | 2,88    | 3,5E-03  | claudin 16 [Source:HGNC Symbol;Acc:HGNC:2037]                              |
|                 |         |          | hematopoietically expressed homeobox [Source:HGNC                          |
| HHEX            | -2,53   | 4,5E-04  | Symbol;Acc:HGNC:4901]  |
|                 |         |          | zinc finger protein 280C [Source:HGNC                                      |
| ZNF280C         | -2,55   | 2,0E-07  | Symbol;Acc:HGNC:25955  |
| DI DA           | 257     | 5 20 02  | phospholipase D family member 6 [Source:HGNC                               |
| PLD0            | -2,37   | 5,3E-05  | Symbol, Acc. HONC. 30447]<br>S100 calcium binding protein A6 [Source: HGNC |
| S100A6          | -2 57   | 3 4E-04  | Symbol: Acc:HGNC:104961  |
| 5100110         | 2,07    | 5,12 01  | ISY1-RAB43 readthrough [Source:HGNC  |
| ISY1-RAB43      | -2,59   | 3,0E-03  | Symbol;Acc:HGNC:42969]   |
|                 |         |          | MAGE family member L2 [Source:HGNC   |
| MAGEL2          | -2,61   | 4,0E-05  | Symbol;Acc:HGNC:6814]  |
| EPHA6           | -2,63   | 5,5E-04  | EPH receptor A6 [Source:HGNC Symbol;Acc:HGNC:19296]                        |
|                 |         |          | coiled-coil-helix-coiled-coil-helix domain containing 2                    |
| CHCHD2          | -2,69   | 2,5E-03  | [Source:HGNC Symbol;Acc:HGNC:21645]  |
|                 |         |          | WAP four-disulfide core domain 1 [Source:HGNC                              |
| WFDC1           | -2,69   | 1,7E-04  | Symbol;Acc:HGNC:15466]   |
| RWDD2B          | -2,71   | 2,7E-03  | RWD domain containing 2B [Source:HGNC                                      |

|            |       |         | Symbol;Acc:HGNC:1302]   |
|------------|-------|---------|---|
|            |       |         | nuclear pore complex interacting protein family member A7                             |
| NPIPA7     | -2,77 | 2,3E-02 | [Source:HGNC Symbol;Acc:HGNC:41982]   |
| FAM71D     | -2,79 | 4,5E-05 | Symbol:Acc:HGNC:20101]  |
|            | ,     | ,       | VANGL planar cell polarity protein 2 [Source:HGNC                                     |
| VANGL2     | -2,80 | 2,0E-10 | Symbol;Acc:HGNC:15511]  |
| INPP4B     | -2.80 | 5 3E-03 | inositol polyphosphate-4-phosphatase type II B [Source:HGNC<br>Symbol: Acc:HGNC:6075] |
|            | 2,00  | 0,0100  | ankyrin repeat and sterile alpha motif domain containing 1B                           |
| ANKS1B     | -2,83 | 1,9E-08 | [Source:HGNC Symbol;Acc:HGNC:24600]   |
| NTS        | -2,84 | 5,8E-07 | neurotensin [Source:HGNC Symbol;Acc:HGNC:8038]  |
| MAGER3     | 2.80  | 1.8E.03 | MAGE family member B3 [Source:HGNC<br>Symbol: Acc:HGNC:6810]                          |
| WAGED5     | -2,07 | 1,01-05 | 3-hydroxyisobutyrate dehydrogenase [Source:HGNC                                       |
| HIBADH     | -2,90 | 2,8E-07 | Symbol;Acc:HGNC:4907]   |
|            | 2.00  | 5.50.04 | histone cluster 1 H1 family member a [Source:HGNC                                     |
|            | -2,90 | 5,5E-04 | Symbol;Acc:HGNC:4/15]   |
| ANXAI      | -2,92 | 2,6E-05 | annexin A1 [Source:HGNC Symbol;Acc:HGNC:533]  |
| NR1I2      | -2,94 | 1,9E-04 | Symbol;Acc:HGNC:7968]   |
| BCL2L10    | -2,97 | 4,7E-04 | BCL2 like 10 [Source:HGNC Symbol;Acc:HGNC:993]  |
|            |       |         | CTAGE family member 8 [Source:HGNC  |
| CTAGE8     | -3,02 | 7,7E-05 | Symbol;Acc:HGNC:37294]  |
| PCDH15     | -3,02 | 3.0E-03 | Symbol:Acc:HGNC:14674]  |
|            | ,     | ,       | serpin family B member 4 [Source:HGNC   |
| SERPINB4   | -3,21 | 1,8E-04 | Symbol;Acc:HGNC:10570]  |
| RIPPLY2    | -3.33 | 1.7E-04 | Symbol: Acc: HGNC:213901  |
|            | -,    |         | vascular endothelial growth factor C [Source:HGNC                                     |
| VEGFC      | -3,39 | 2,8E-05 | Symbol;Acc:HGNC:12682]  |
| RNF128     | -3 39 | 6 8E-07 | ring finger protein 128, E3 ubiquitin protein ligase                                  |
| SRR        | -3.43 | 5.8E-10 | serine racemase [Source:HGNC Symbol: Acc:HGNC:14398]                                  |
| bitt       | 5,15  | 5,01 10 | CREB regulated transcription coactivator 2 [Source:HGNC                               |
| CRTC2      | -3,50 | 1,2E-07 | Symbol;Acc:HGNC:27301]  |
| SIV 1      | 2 5 2 | 1 2E 02 | salt inducible kinase 1 [Source:HGNC<br>Symbol: A co:HGNC:11142]                      |
| MTDND 21 1 | -5,52 | 7.0E.04 | MT PNP2 like 1 [Source:HCNC Symbol: Acc:HCNC:27155]                                   |
| WITKINK2L1 | -3,30 | 7,0E-04 | estrogen related receptor alpha [Source:HGNC  |
| ESRRA      | -3,70 | 2,4E-07 | Symbol;Acc:HGNC:3471]   |
| EDMD1      | 2 72  | 4 25 04 | FERM domain containing 1 [Source:HGNC   |
| FRMDI      | -3,/3 | 4,2E-04 | Symbol;Acc:HGNC:21240]<br>Rho GTPase activating protein 36 [Source:HGNC               |
| ARHGAP36   | -3,75 | 2,6E-05 | Symbol;Acc:HGNC:26388]  |
| NKX2-5     | -3,80 | 9,7E-03 | NK2 homeobox 5 [Source:HGNC Symbol;Acc:HGNC:2488]                                     |
| PDCL2      | -3,81 | 1,5E-04 | phosducin like 2 [Source:HGNC Symbol;Acc:HGNC:29524]                                  |
|            |       |         | C-X-C motif chemokine receptor 5 [Source:HGNC   |
| CXCR5      | -3,84 | 1,4E-04 | Symbol;Acc:HGNC:1060]<br>ZEP36 ring finger protein [Source:HGNC                       |
| ZFP36      | -3,84 | 6,1E-08 | Symbol;Acc:HGNC:12862]  |
| PRR16      | -4,11 | 1,7E-07 | proline rich 16 [Source:HGNC Symbol;Acc:HGNC:29654]                                   |
|            |       | ,       | serpin family B member 3 [Source:HGNC   |
| SERPINB3   | -4,19 | 5,3E-04 | Symbol;Acc:HGNC:10569]  |
| HSPB8      | -4,22 | 6,6E-07 | heat shock protein family B (small) member 8 [Source:HGNC                             |

|         |       |         | Symbol;Acc:HGNC:30171]                                |
|---------|-------|---------|---|
|         |       |         | Rhox homeobox family member 2 [Source:HGNC            |
| RHOXF2  | -5,01 | 5,4E-03 | Symbol;Acc:HGNC:30011]                                |
| LGALS7B | -5,05 | 5,7E-03 | galectin 7B [Source:HGNC Symbol;Acc:HGNC:34447]       |
|         |       |         | zinc finger BED-type containing 6 [Source:HGNC        |
| ZBED6   | -5,24 | 1,5E-02 | Symbol;Acc:HGNC:33273]                                |
|         |       |         | syncoilin, intermediate filament protein [Source:HGNC |
| SYNC    | -5,86 | 1,0E-10 | Symbol;Acc:HGNC:28897]                                |
|         |       |         | hemoglobin subunit delta [Source:HGNC                 |
| HBD     | -5,88 | 5,4E-03 | Symbol;Acc:HGNC:4829]                                 |
|         |       |         | zinc finger protein 717 [Source:HGNC                  |
| ZNF717  | -6,54 | 4,3E-08 | Symbol;Acc:HGNC:29448]                                |
|         |       |         | nucleosome assembly protein 1 like 5 [Source:HGNC     |
| NAP1L5  | -6,79 | 9,7E-07 | Symbol;Acc:HGNC:19968]                                |
| TSPYL5  | -7,91 | 2,3E-08 | TSPY like 5 [Source:HGNC Symbol;Acc:HGNC:29367]       |

## Supplemental experimental procedures

#### Transgenic overexpression of Bcl-xL in hESC

The human *Bcl-xL* gene was cloned into the LV500A-1 lentiviral vector pCDH (System Biosciences), expressed by the activity of the elongation factor-1alpha (EF-1alpha) promoter. The expression of GFP and puromycin resistance gene was driven by the phosphoglycerate kinase I gene promoter (PGK). The packaging plasmid (pCMVDR8.9) and encoding plasmid (VSV.G/ pMD.G) were donated by D. Trono (University of Geneva). Lentiviral particles were generated by transient co-transfection of human embryonic kidney 293T cells. The viral particles were 300-fold concentrated by ultracentrifugation, suspended in PBS containing 10mg/ml protamine sulphate (LeoPharma) and stored at -80°C. Virus titers were determined by measuring the reverse transcriptase activity. A genetically normal subline of VUB03 was used for double transduction, first with 10 mlof1 × 10<sup>6</sup> TU/ml viral particles, and 6–8 h later 30 mlof 1 × 10<sup>6</sup> TU/ml viral particles. GFP-positive cells were visualized using an IX-81 fluorescent microscope (Olympus) and selected by continuously adding 1 mg/ml of puromycin (Sigma-Aldrich) to the culture medium. After two passages during which the puromycin-containing medium was daily refreshed, 80% of the cells were GFP positive.

#### **Fastq files**

After RNA sequencing, on average  $14.3 \times 10^6 \pm 6.4 \times 10^6$  reads were generated per sample. First, the reads were trimmed using cutadapt version 1.11 to remove the "QuantSEQ FWD" adaptor sequence. To assess the quality of the reads, the FastQC algorithm was used on our sequences (Love et al., 2014). A Quality Control tool for High Throughput Sequence Data, website: http://www.bioinformatics.babraham.ac.uk/projects/fastqc/.

#### **Mapping Sequences**

To obtain the count table for the genes, the reads were mapped against the Genome Reference Consortium Human Build 38 patch release 10 (GRCh38.p10) combined with a general transfer format (GTF) file, both downloaded from the ensembl database(Zerbino et al., 2018). The software used for the mapping was STAR (version 2.5.3)(Dobin et al., 2013).

#### **Count Tables**

The RNA- Seq by Expectation Maximization (RSEM)(Li and Dewey, 2011) software (version 1.3.0) was used to produce the count table for each sample. RSEM algorithm was chosen because it is optimized for multimapped reads. On the 63967 ensembl's genes, only the 19847 coding genes were considered, and we removed the long non-coding RNAs, which were not useful for our analysis.

#### **RNA-seq analysis**

The RNA-seq analysis was performed using the R software (version 3.3.2) with the edgeR (Robinson et al., 2010) and DESeq2 (Love et al., 2014) libraries. Only genes with a count per million (cpm) greater than 1 in at least two samples were considered. The raw counts were normalized using the trimmed mean of M values (Robinson and Oshlack, 2010) (TMM) algorithm. For each comparison, a different general linear model was built. Statistical testing was done using the empirical Bayes quasi-likelihood F-test. The normalized counts were then transformed in a log<sub>2</sub> fold-change (log<sub>2</sub>FC) table with their associated statistics, p-value and false discovery rate (FDR). In each comparison, genes with a  $|log_2FC| > 1$  and an FDR < 0.05 were considered as significantly differentially expressed. A  $|log_2FC| > 1$  means at least two times more or two times less transcript in the mutant group in comparison to the wild-type group.

The data was represented using two different methods; in both cases, all expressed genes were included. First, a heatmap and unsupervised hierarchical clustering was created using the heatmap.2 function from the gplot R library. Second, the data were represented using a multidimensional scaling (MDS) plot of distances between digital gene expression profiles. With the MDS method, the distance between the samples was calculated based on the log<sub>2</sub>FC. In the MDS, the Euclidean distances between samples were calculated and were then are regressed against the original distance matrix and the predicted ordination distances for each pair.

#### Ingenuity pathway analysis

Ingenuity Pathway Analysis (Krämer et al., 2014) (IPA) (QIAGEN Inc., https://www.qiagenbioinformatics.com/products/ingenuity-pathway-analysis) was used for the pathway analysis based on the differential gene expression between groups. The data were uploaded with their respective  $\log_2 FC$ , FDR and p-value. IPA predicts the activation state of regulators by correlating literature reported effects with observed gene expression. In order to predict if a pathway is activated or inhibited, it computes the z-score. A zscore>2 means activated, z-score<-2 means inhibited and between means affected. Each z-score is associated with a p-value. To compute this z-score, for each prediction for each gene  $x_i$ , a score is associated to it.

#### **Enrichr** analysis

The enrichment signatures was done using Enrichr (Chen et al., 2013; Kuleshov et al., 2016). The deregulated genes were used as input ( $|log_2FC|>1$ , FDR<0.05). The outputs were selected from two libraries, 1) ENCODE and ChEA Consensus TFs from ChIP-X and 2) TRANSFAC and JASPAR PWMs. Only the enrichment with p-value<0.05 in both comparisons were taken.

#### **David analysis**

The pathway enrichment analysis was done using DAVID 6.8(Huang et al., 2009a, 2009b). The top 1'000 genes with the highest  $\log_2 FC$  in absolute value were selected. In the different categories, only the GO term were taken for account. The cutoff value was at least one of the two comparisons had to have a p-value below 0.05 for each GO-term.

#### Gene set enrichment analysis

The Gene set enrichment analysis (GSEA) software was downloaded from (http://software.broadinstitute.org/gsea/). The ranking score for each score was computed for each coding gene CPM>1 in at least two samples. The parameters set for each analysis were: enrichment statistic as weighted, number of permutation was 1000, exclude sets larger than 500 and exclude sets smaller than 15. The libraries used from Molecular Signatures Database v6.2 (MSigDB) were: positional gene sets (C1) and curated gene sets (C2). The gene sets were statistically relevant if their FDR was below 0.05. The gene sets were considered as positively enriched if their normalized enriched score (NES) was above 1.4 and negatively enriched if their NES<-1.4 (Subramanian et al., 2005)

### Probes, assays and primers used for qPCR.

| Gene   | Taqman Assay / Sequence  |  |  |  |  |  |
|--------|--|--|--|--|--|--|
| GUSB   | Hs99999908_m1  |  |  |  |  |  |
| РАХ6   | Hs00240871_m1  |  |  |  |  |  |
| SOX1   | Hs01057642_s1  |  |  |  |  |  |
| SOX17  | Hs00751752_s1  |  |  |  |  |  |
| FOXA2  | Hs00232764_m1  |  |  |  |  |  |
| Т      | Hs00610080_m1  |  |  |  |  |  |
| HAND1  | Hs02330376_s1  |  |  |  |  |  |
| CHCHD2 | Hs00853326_g1  |  |  |  |  |  |
| GAPDH  | Forward 5'-ATG-GAA-ATC-CCA-TCA-CCA-TCT-T-3'<br>Reverse 5'-CGC-CCC-ACT-TGA-TTT-TGG-3'<br>Probe 6-FAM- CAG-GAG-CGA-GAT-CC-MGB              |  |  |  |  |  |
| OCT3A  | Forward 5'-GGA-CAC-CTG-GCT-TCG-GAT-TT-3'<br>Reverse 5'-CAT-CAC-CTC-CAC-CAC-CTG-G-3'<br>Probe 6-FAM- GCC-TTC-TCG-CCC-CC-MGB               |  |  |  |  |  |
| NANOG  | Forward 5'-TGC-AAA-TGT-CTT-CTG-CTG-AGA-TG-3'<br>Reverse 5'-TCC-TGA-ATA-AGC-AGA-TCC-ATG-GA-3'<br>Probe 6-FAM- CAG-AGA-CTG-TCT-CTC-CTC-MGB |  |  |  |  |  |
| UBC    | Forward 5'-CGC-AGC-CGG-GAT-TTG-3'<br>Reverse 5'-TCA-AGT-GAC-GAT-CAC-AGC-GA-3'<br>Probe 6-FAM- TCG-CAG-TTC-TTG-TTT-GTG-MGB                |  |  |  |  |  |

#### Antibodies

Primary antibodies were incubated overnight: PAX6 (Mouse Monoclonal IgG, Abcam, Cat# ab78545), OCT3A (Rabbit Monoclonal IgG, Cell Signalling, Cat# C30A3), SOX17 (Goat Polyclonal IgG, R&D Systems, Cat# AF1924), CHCHD2 (Rabbit Polyclonal, Proteintech #19424-I-AP) T (Goat Polyclonal, R & D Systems #AF2085). Secondary antibodies were incubated for 2-3h: Goat anti-Mouse (H+L) Alexa Fluor 488 (Thermo Fisher Scientific, Cat# A11001), Donkey anti-Goat IgG (H+L) Alexa Fluor 488 (Thermo Fischer Scientific, Cat# A-11055), Goat anri-Rabbit (H+L) Alexa Fluor 488 (Thermo Fischer Scientific, Cat# A-11034), Donkey anti-Rabbit (H+L) Alexa Fluor 546 (Thermo Fisher Scientific, Cat# A10040), Donkey anti-Mouse IgG (H+L) Alexa Fluor 594 (Thermo Fischer Scientific, Cat# R37115). Nuclear staining was performed with Hoechst 33342 (Thermo Fischer Scientific).

#### References

Chen, E.Y., Tan, C.M., Kou, Y., Duan, Q., Wang, Z., Meirelles, G.V., Clark, N.R., and Ma'ayan, A. (2013). Enrichr: interactive and collaborative HTML5 gene list enrichment analysis tool. BMC Bioinformatics *14*, 128.

Dobin, A., Davis, C.A., Schlesinger, F., Drenkow, J., Zaleski, C., Jha, S., Batut, P., Chaisson, M., and Gingeras, T.R. (2013). STAR: ultrafast universal RNA-seq aligner. Bioinformatics 29, 15–21.

Huang, D.W., Sherman, B.T., and Lempicki, R.A. (2009a). Bioinformatics enrichment tools: paths toward the comprehensive functional analysis of large gene lists. Nucleic Acids Res. *37*, 1–13.

Huang, D.W., Sherman, B.T., and Lempicki, R.A. (2009b). Systematic and integrative analysis of large gene lists using DAVID bioinformatics resources. Nat. Protoc. *4*, 44–57.

Krämer, A., Green, J., Pollard, J., and Tugendreich, S. (2014). Causal analysis approaches in Ingenuity Pathway Analysis. Bioinformatics *30*, 523–530.

Kuleshov, M. V, Jones, M.R., Rouillard, A.D., Fernandez, N.F., Duan, Q., Wang, Z., Koplev, S., Jenkins, S.L., Jagodnik, K.M., Lachmann, A., et al. (2016). Enrichr: a comprehensive gene set enrichment analysis web server 2016 update. Nucleic Acids Res. 44, W90-7.

Li, B., and Dewey, C.N. (2011). RSEM: accurate transcript quantification from RNA-Seq data with or without a reference genome. BMC Bioinformatics *12*, 323.

Love, M.I., Huber, W., and Anders, S. (2014). Moderated estimation of fold change and dispersion for RNA-seq data with DESeq2. Genome Biol. *15*, 550.

Robinson, M.D., and Oshlack, A. (2010). A scaling normalization method for differential expression analysis of RNA-seq data. Genome Biol. 11, R25.

Robinson, M.D., McCarthy, D.J., and Smyth, G.K. (2010). edgeR: a Bioconductor package for differential expression analysis of digital gene expression data. Bioinformatics *26*, 139–140.

Subramanian, A., Tamayo, P., Mootha, V.K., Mukherjee, S., Ebert, B.L., Gillette, M.A., Paulovich, A., Pomeroy, S.L., Golub, T.R., Lander, E.S., et al. (2005). Gene set enrichment analysis: a knowledge-based approach for interpreting genome-wide expression profiles. Proc. Natl. Acad. Sci. U. S. A. *102*, 15545–15550.

Zerbino, D.R., Achuthan, P., Akanni, W., Amode, M.R., Barrell, D., Bhai, J., Billis, K., Cummins, C., Gall, A., Girón, C.G., et al. (2018). Ensembl 2018. Nucleic Acids Res. 46, D754–D761.