Transcriptional Heterogeneity and Cell Cycle Regulation as Central Determinants of Primitive Endoderm Priming.

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Abstract

During embryonic development cells acquire identity at the same time as they are proliferating, implying that an intrinsic facet of cell fate choice requires coupling lineage decisions to rates of cell division. How is the cell cycle regulated to promote or suppress heterogeneity and differentiation? We explore this question combining time lapse imaging with single cell RNA-seq in the contexts of self-renewal, priming and differentiation of mouse embryonic stem cells (ESCs) towards the Primitive Endoderm lineage (PrE). Since ESCs are derived from the Inner Cell Mass of the mammalian blastocyst, ESCs in standard culture conditions are transcriptionally heterogeneous containing subfractions that are primed for either of the two ICM lineages, Epiblast and PrE. These subfractions represent dynamic states that can readily interconvert in culture, and the PrE subfraction is functionally primed for endoderm differentiation. Here we find that differential regulation of cell cycle can tip the balance between these primed populations, such that naïve ESC culture conditions promote Epiblast-like expansion and PrE differentiation stimulates the selective survival and proliferation of PrE-primed cells. In endoderm differentiation, we find that this change is accompanied by a counter-intuitive increase in G1 length that also appears replicated in vivo. While FGF/ERK signalling is a known key regulator of ESCs and PrE differentiation, we find it is not just responsible for ESCs heterogeneity, but also cell cycle synchronisation, required for the inheritance of similar cell cycles between sisters and cousins. Taken together, our results point to a tight relationship between transcriptional heterogeneity and cell cycle regulation in the context of lineage priming, with primed cell populations providing a pool of flexible cell types that can be expanded in a lineage-specific fashion while allowing plasticity during early determination.
Introduction

Naïve mouse Embryonic Stem Cells (mESCs) are karyotypically normal, immortal cell lines derived from the Inner Cell Mass (ICM) of pre-implantation embryos (Martin 1981; Evans and Kaufman 1981). ESCs are pluripotent, able to differentiate into all future cell lineages of the embryo proper, and able to retain pluripotency through successive rounds of self-renewing cell division (Beddington and Robertson 1989; Suemori et al. 1990; Lallemand and Brulet 1990; Martello and Smith 2014). In mouse, pluripotent stem cells can be derived from several stages of development and exhibit gene expression profiles matching these developmental stages (S. Morgani, Nichols, and Hadjantonakis 2017; Riveiro and Brickman 2020).

Under specific conditions, mESCs can recapitulate several aspects of the ICM specification. When cultured in serum and the cytokine LIF, they constitute a dynamically heterogeneous cell culture model that contains populations that are primed, but not committed, for both Primitive Endoderm (PrE) and Epiblast. These populations exhibit biases in differentiation but will readily interconvert when left in self-renewing culture (Canham et al. 2010; S. M. Morgani et al. 2013; Illingworth et al. 2016). While these conditions involve serum, we recently defined a culture condition that supports heterogeneous ESC culture, and at the same time sustains effective propagation of pluripotency and high levels of germline transmission (Anderson et al. 2017). We refer to this culture condition as NACL for N2B27, Activin A, Chiron and LIF. A similar defined media with the same components but a RPMI base (RACL) supports PrE differentiation and expansion (Anderson et al. 2017). As NACL ESC media is almost identical to the media used for PrE differentiation (RACL), this culture model is an ideal system for the comparison of self-renewal and differentiation.

Several time lapse studies have explored the role of heterogeneity in ESCs, and comparisons have been made between naïve culture in serum and media based on small molecule inhibitors of GSK3 and MEK, in addition to LIF (2i/LIF) (Singer et al. 2014; Abranches et al. 2014; A. Filipczyk et al. 2015; Cannon et al. 2015; Hastreiter et al. 2018). Taken together, these studies have focused on the dynamic heterogeneity of pluripotency factors which are associated with supporting the pluripotent state and Epiblast specification in vivo. Although they have explored the role of pluripotency factors in lineage priming (Strebinger et al. 2019), they have not assessed the expression of lineage-specific markers, how cells progress into differentiation and the role of priming in differentiation. Here we explore these questions with respect to PrE priming and differentiation.

In vivo, the segregation of PrE from Epiblast is regulated by the FGF/ERK pathway (Chazaud et al. 2006). The inhibition of this pathway results in an expansion of Epiblast identity and loss of PrE, both in vivo and in vitro (Nichols et al. 2009; Yamanaka, Lanner, and Rossant 2010; Hamilton and Brickman 2014; Saiz et al. 2016). Based on the activity of this pathway in supporting PrE differentiation in vivo, inhibition of the kinase upstream ERK, MEK, with a pharmacological antagonist (PD03) is an important component of the defined ESC culture system known as 2i/LIF (Ying et al. 2008). Additionally, ERK activation is also associated with cell cycle progression and is thought to stimulate G1/S transition (Yamamoto et al. 2006; ter Huurne et al. 2017). Although G1 lengthening has been functionally related to endoderm differentiation (Calder et al. 2013; Pauklin and Vallier 2013; Coronado et al. 2013), it is not clear how ERK stimulation of cell cycle progression

3
relates to its capacity to induce differentiation. Here we focus on the dynamics of PrE priming and differentiation exploiting both time lapse imaging and single cell RNA-seq to link both events to regulation of the cell cycle. ESC culture (NACL) was found to support the more rapid proliferation of the Epiblast-primed population, and PrE differentiation (RACL) promotes the more rapid proliferation of cells primed for endoderm differentiation. We found that FGF signalling regulates cell states and proportions through both coordinating inheritance of cell cycle lengths as well as rates of endoderm priming. This functional regulation of cell cycle in heterogeneous cell cultures indicates that cell cycle synchronisation supports self-renewal as well as preparing cells for further differentiation. Furthermore, we found that G1 length is adjusted independently from the cell cycle, pointing to a model where cells receive signals from cytokines during G1, while still actively proliferating. Taken together, our work suggests that cell cycle length is not only tightly regulated by the culture context, but that this coordination has a functional role in both heterogeneity and lineage choice.

**Results**

Single cell RNA-seq of PrE differentiation reveals the presence of both endoderm and Epiblast-like populations in differentiation

To assess lineage-specific transcriptional heterogeneity in PrE differentiation and compare the events occurring in vitro to those occurring in vivo, we performed single cell RNA sequencing by MARS-seq (Jaitin et al. 2014) on samples from 2i/LIF and days 1, 2, 3, 4 and 7 of in vitro PrE differentiation (Fig 1A). To track both endodermal and Epiblast lineages, we used a Sox2-GFP and Hhex-mCherry double fluorescent reporter cell line (Fig 1A) (Anderson et al. 2017). Indexing based on reporter expression and plate-based MARS-seq enabled us to link individual transcriptomes to the cell types identified by FACS (Fig 1-Supplement 1A-B). We collected equivalent numbers of different populations, i.e. we collected cells expressing different levels of SOX2 and Hhex, to ensure we had a good representation of the spectrum of cell types occurring in these in vitro cultures. As a result, the cell proportions based on cluster composition do not reflect the proportion of these cell types present at different time points during differentiation.

We detected 9 clusters using unsupervised clustering (Fig 1B). Clusters 1, 5 and 6 were composed of 2i/LIF cells (Fig 1-Supplement 1C, Table 1). Differentiating cells (from days 2 to 7) appeared to resolve into two branches: a PrE-like branch (clusters 3, 7 and 4) expressing progressively increasing levels of Hhex-mCherry (Fig 1-Supplement 1A) and PrE markers such as *Dab2*, *Gata6*, *Pdgfra*, and *Sox17* (Fig 1-Supplement 2A); and an Epiblast-like branch (clusters 0 and 2) with cells that appear to remain Epiblast-like, continuing to express pluripotency markers (Sox2-GFP, see Fig 1-Supplement 2B. *Klf2*, *Nanog*, *Sox2*, and *Rex1*, see Fig 1-Supplement 2B). As most Epiblast-like cells maintained expression of pluripotency markers (Fig 1-Supplement 2B), but clearly have distinguished themselves from 2i/LIF ESCs, we refer to these cells as Non-Endodermal/Non-Differentiated (NEDiff) (Fig 1B). Cluster 8 was a tiny cluster that contained non-specific dying cells and thus it was discarded from downstream analysis.

We identified distinct endodermal signatures as early as day 2 (Fig 1C), suggesting that some cells at day 2 were already primed towards endoderm differentiation. The endodermal genes found at day 2 of the PrE
branch (PrE in Fig 1C) were not upregulated at day 2 in the NEDiff branch (NEDiff in Fig 1C), supporting the notion that the transcriptional signature for PrE appeared on day 2 in a sub-population of these cultures.

To compare these cell types to those induced in vivo, we compared our dataset with the already published scRNA-seq dataset of pre-implantation embryos (Nowotschin et al. 2019) using the Cluster Alignment Tool (CAT) (Rothová, Nielsen, Proks, Wong, Riveiro, Linneberg-Agerholm, David, et al. 2022). Our day 7 PrE cluster 4 was most similar to PrE from E4.5, the earlier emerging PrE cluster 7, first appearing at day 2, resembled PrE from E3.5, while the rest of the clusters were most similar to E3.5 Epiblast (Fig 1D). Although cluster 3 was positioned at the beginning of the PrE branch, it aligned to Epiblast, continued to express Sox2 and showed low levels of Hhex. Based on these comparisons, we believe that our in vitro model is a good tool for deconstructing transcriptional signatures of differentiation and that an early PrE-like cell type arises by day 2 in vitro.

**PrE arises through early induction, followed by selective proliferation**

We next sought to determine whether we could detect the emergence of these early (day 2) PrE-like cells and follow their differentiation using time lapse microscopy. We exploited a mESC line that couples a sensitive PrE reporter, Hhex-mCherry, with a second that enables lineage tracing, H2B-Venus (HFHCV) (Illingworth et al. 2016). These cells were used to follow mESC in defined PrE differentiation (RACL) (Fig 2A). To follow a significant number of cell cycles through differentiation, we acquired images every 20 minutes for 6 days (See Video 1).

As with the scRNA-seq time course, we started differentiation from a relatively uniform population of cells cultured in 2i/LIF and then differentiated them to PrE (See Methods, Fig 2A). When we analysed the fluorescence intensity distribution in this setup, we observed a distribution that suggested these cultures contained the same two populations as observed in the scRNA-seq: differentiated PrE and the NEDiff population that failed to progress towards endoderm. We clustered cell intensities using k-means clustering and used this clustering to assign identity in differentiation (Fig 2B, Fig 2- Supplement 1). The identity and time evolution of PrE and NEDiff states were confirmed with GATA 6 and NANO G staining (Fig 2- Supplement 2A-B). Based on the lineage trees (Fig 2C and Fig 2- Supplement 1) and increasing levels of PDGFRA expression (Fig 2- Supplement 2C), the endodermal identity appeared around day 3 from a small founder population. This was also apparent when viewing individual time lapse movies (Video 1).

As possible contributors to the growing PrE population across in vitro differentiation, we aimed to distinguish between a purely selective or inductive process. Over the course of differentiation, selection would imply faster proliferation or enhanced survival of a founder population of primed PrE cells, while induction would be represented by endoderm cells converting continuously from the undifferentiated cell pool. To evaluate these possibilities, we assessed the behaviour of both endodermal and non-endodermal populations over time. We observed a decrease in the division time of the PrE cluster with cell division accelerating primarily on day 3 of differentiation (13.00 ± 4 h for PrE and 20.00 ± 6 h for NEDiff clusters on day 3) (Fig 2D-E, Table 2). This is the point in time when PrE clones became distinguishable from NEDiff cells in the time lapse video (Video 1) and suggested that culture conditions promoted endoderm specification by providing an environment that
favoured the proliferation of a PrE-primed population. We also observed a higher rate of cell death and reduced survival (Table 2) in the NEDiff cells, suggesting an additional level of selective cell survival in the PrE progenitor population.

As these cultures started from a homogeneous population of 2i/LIF cells, we assumed some conversion to endoderm fate preceded the acceleration of proliferation and assessed the probability of cell state transition before and after day 3 (72h). We found that 12.6% ± 0.6 of the total population upregulated Hhex expression during the first 72h, thereby transitioning into the PrE cluster. However, after the 72h time point, only 1.9% ± 1.2 of the cells were able to transit between clusters. This suggested that competence to enter the endoderm lineage was lost after the first 3 days of the differentiation, indicating that proliferation was enhanced following lineage choice. Hence, even though only a small population of cells entered differentiation, the selective expansion of these cells allowed them to take over the final culture.

To assess whether the combination of this small amount of lineage conversion followed by enhanced proliferation was sufficient to account for the behaviour of differentiating cultures, we sought to generate a simple model introducing the transition probability observed in time lapse (t in Fig 3A). This minimal set of parameters was not enough to recapitulate our lineage trees. We found that only after introducing both differential survival rates for PrE and NEDiff cells (s in Fig 3A), as well as different cell cycle contributions (d in Fig 3A) we could reproduce the cell populations observed. Thus, this minimal model predicted that selective cell death was also required to explain differentiation. To quantify the extent of this during differentiation, we determined the survival rates in our cultures. Before commitment took place at day 3, 86% of prospective PrE cells survived to generate colonies of PrE, whereas only 61% of the NEDiff survived (Table 2). This difference in survival was further enhanced following commitment at 72 hours and continuing throughout differentiation: from this point onwards, 92% of cells in the PrE cluster survived, whereas only 39% of the cells in the NEDiff cluster did (Table 2). We explored the possible contributions of proliferation and survival in our mathematical model by tuning the survival rates and the division times for both populations in order to predict which parameter is more important in shaping the distributions of populations observed for each day (Fig 3- Supplement 1). We found that on day 3, the cell cycle contribution has a more significant impact on the population composition, while cell survival has an increasing dominant impact on days 4 and 5. Therefore, it appeared that differentiation was selecting for committed endoderm at two levels: proliferation first, and cell survival later. Furthermore scRNA-seq suggested that the PrE population also accrued more endodermal identity as it expanded, such that endodermal gene expression not only became more homogeneous, but the level of endodermal transcription in individual cells increases from days 2 to 7 (Fig 1C), a process we refer to as progressive induction.

Lastly, given that we found an endodermal transcriptional signature in the scRNA-seq at day 2, we considered whether lineage priming and selection could be occurring prior to our assignment of differentiation (day 3). Thus, we took the dataset from day 2 of differentiation and asked whether low level reporter expression correlated with later differentiation by asking which cells would prospectively give rise to PrE (PrE Fate) and which would never become endoderm by day 3 (NEDiff Fate). We found that there was a tendency for PrE progenitor cells (PrE Fate) to express Hhex at higher levels (0.18) compared to cells that
are non-endodermal progenitors (NEDiff Fate, 0.15) (Fig 3B, Table 3). To confirm the notion that these cells were primed functionally at day 2, we isolated Hhex-high and low populations from day 2 of the PrE differentiation by FACS and cultured them further in PrE differentiation conditions. Consistent with the time lapse analysis, we observed that the day 2 Hhex-high cells produced significantly more PDGFRA positive PrE than either the Hhex-low or unsorted populations (Fig 3C).

**PrE-primed mESCs in steady state culture conditions**

As the priming observed during in vitro PrE differentiation was similar to the spontaneous dynamic priming that occurs in standard ESC culture, but primed PrE remained a minority of the culture, we hypothesized that ESC culture might favour the proliferation of the undifferentiated or Epiblast-like population. As ESC culture can be supported by the same cytokines but with a different base media (Anderson et al. 2017), we reasoned the change in base media might underlie this difference. To explore this issue, we performed time lapse microscopy on the HFHCV mESC line in chemically defined NACL culture (Anderson et al. 2017) (Fig 4A). We observed expansion of mESCs colonies from a small set of 2-8 cells into several hundreds of cells, which produced imaging of up to 7 generations (See Video 2, Fig 4B).

We confirmed our previous observations (Anderson et al. 2017) that NACL culture supports a population of ESCs primed for PrE (Hhex-mCherry positive) and Epiblast (NANOG positive), within the OCT4 positive ESC population (Fig 4- Supplement 1A). The distribution of Hhex expression that corresponded to these states was quite broad and showed a non-normal distribution (Fig 4- Supplement 1B), similar to that observed for the constitutive lineage label H2B-Venus. Ideally, if the PrE-like and Epiblast-like states were well defined, one would expect a bimodal distribution with one peak for each state. However, similar to previous reports for fluorescent reporters in ESC culture (Abranches et al. 2014; Singer et al. 2014), this was not observed. Based on previous analysis of NANOG expression (A. Filipczyk et al. 2015; Hastreiter et al. 2018), we divided the intensity distribution into compartments based on quartiles of the mean fluorescence intensity measurements. The compartments were called High (cells within the highest 25% intensities), Low (cells within the lowest 25% intensities), and Mid (the rest of the intensities) (Fig 4C). We constructed lineage trees using this compartmental distribution (Fig 4D, Fig 4- Supplement 2).

The intersection between selection and induction during PrE differentiation time lapse described how a primed progenitor pool could give rise to a differentiated cell population. In NACL culture, primed cells are heterogeneously maintained, but the mechanisms that support and restrain this population are unknown. We propose that each cell can contribute to a population change by either dying, changing state, or proliferating. Therefore, we sought to determine how cell death, transitions, and cell cycle sustain naïve and primed populations in a dynamic equilibrium at steady state.

In NACL culture, we observed that 86% of cells survived, and cells divided every 17h on average. The level of cell death was not significantly different between the three compartments in our dataset (9% in the High, 12% in the Mid, 21% in the Low, Table 4), so we went on to examine transitions. Based on the lineage trees (Fig 4- Supplement 2), we estimated the probability that a cell would transit between these states by assuming that a cell undergoes transition if its mean intensity, averaged across cell cycle, changes to a
different compartment than its mother cell. Altogether, we observed a similar behaviour between the Mid
compartment and either the High or Low compartment, showing cells entering and exiting each state with the
same probability (Fig 4E).

As this analysis describes the transition rate as the probability of transiting in each cell cycle, and therefore
does not reflect the time required for a transition, we also calculated the transition rate based on the average
time taken by a cell in one compartment to transition to another. We used the division time of each cell to
express transitions per 24h unit and observed a similar rate (Fig 4- Supplement 1C). In addition, we obtained
residence times for each compartment to decipher whether a particular Hhex state was more stable than
others, and we found no difference (Table 4). The residence time was calculated as the number of
generations (or hours) that a cell remains in one state. To compare transitions in NACL to early
differentiation, we measured the transition rates in RACL on day 1 to 3 of PrE differentiation and found that
RACL promotes transitions towards higher Hhex compartments (Fig 4- Supplement 1D).

Lastly, we investigated the influence of cell cycle. In RACL (PrE media) the Hhex-expressing primed
population had a short cell cycle, but in NACL, where ESC self-renewal predominates, we found the
opposite. Here, the Low Hhex cells exhibited significantly shorter division times than the High Hhex cells
(14.67 ± 5 h vs 17.33 ± 6 h, Fig 4F, Table 4). This result suggests a relationship between lineage priming
and cell cycle length, with pluripotency being supported by media conditions that promote faster cycling of
Epiblast-primed cells, while differentiation is supported by initially higher levels of PrE priming followed by
cell cycle regulation and selection.

MEK inhibition affects mESC priming by increasing the fraction of fast proliferating cells

While transition probabilities favour the expansion of the Mid compartment, shorter cell cycle times favour
the Low compartment, and cell death appears indiscriminate. As FGF/ERK signalling both regulates PrE
specification by directly altering enhancers and coordinates the cell cycle promoting G1/S transition
(Yamamoto et al. 2006; Hamilton and Brickman 2014) we asked whether inhibiting this pathway with PD03
acts to accelerate cell state transitions, cell cycle or both. We quantified the changes in both Hhex expression
and cell cycle in response to FGF/ERK inhibition by PD03 (Fig 5A, Fig 5- Supplement 1), and the 3
compartments were defined using the same threshold intensities as for the NACL dataset.

Given the direct relation between ERK stimulation and Hhex upregulation (Hamilton and Brickman 2014), we
found unsurprisingly that cells in PD03 expressed significantly lower levels of Hhex than in the NACL control
(Fig 5B). Thus, the proportion of cells in the Low Hhex compartment increased (Fig 5C). To understand if this
increase stems from changes in cell death, proliferation or switching probabilities, we compared these
between the NACL and PD03 conditions. At the level of cell survival, PD03 treatment had little effect (80%
cells that survived vs 86% in NACL, Table 4). However, culture in PD03 produced significant alterations to
both cell cycle length (Fig. 5D) and cell state transitions (Fig 5- Supplement 2A). While the influence of PD03
on cell state transitions is difficult to quantify robustly as PD03 can induce rapid cell state changes (Hamilton
et al. 2019), we observed a high transition rate from the rare High Hhex cells found in PD03 conditions. We
also observed shorter residence times for the High Hhex state in PD03, and longer times for the Low Hhex
state (Table 4), suggesting that inclusion of PD03 in cell culture media suppresses the stability of the High state, such that any cell that escapes the Low Hhex and Mid compartments, rapidly returns.

We observed a shorter division time in the population of cells treated with PD03 (Fig 5D and Table 4, confirmed by bootstrap analysis, Fig 5- Supplement 2B). Similar to the results observed in NACL, in PD03, cells in the Low Hhex compartment (Epiblast-like) had a shorter cell cycle than those in the other two compartments (Fig 5E, Table 4). However, when we compared the division time in the same compartment, but different media conditions (i.e., plus and minus PD03), we did not observe significant differences (Fig 5E). Together with an increased fraction of cells in the Low Hhex compartment (Fig 5C), this indicated that on a population level, PD03 decreased cell cycle length by increasing the fraction of fast proliferating cells in the Low Hhex (Epiblast-like) state. Thus, the change in cell cycle length observed in Figure 5D appears to be a population effect and not a result of PD03 regulating the cell cycle at the level of individual cells.

It has previously been shown that cell cycle lengths are inherited. This does not occur transgenerationally, as mothers and daughters do not have correlated cell cycle lengths, but sisters and cousins do (Sandler et al. 2015). Does this imply that lineage priming is heritable as well? In NACL, we found that cell cycle length was correlated between sisters and cousins, but not mother-daughter (Fig 5- Supplement 2C). Given that PD03 produced a more homogeneous population of Low Hhex cells that divided faster, we hypothesized that cell cycle inheritance might therefore be better correlated. However, we found that cell cycle correlation between sisters and cousins was reduced or eliminated in the presence of PD03 (Fig 5F, Fig 5- Supplement 2D). This capacity of PD03 to inhibit cell cycle correlations suggests that the mechanisms governing cell cycle entrainment are likely dependent on signalling downstream of MEK.

We considered two possible paradigms for ERK-dependent regulation of cell cycle synchronisation: either the symmetric inheritance of a kinase activity, or the paracrine activity of a cytokine that drives MEK/ERK activation. FGF4 is a prominent cytokine known to activate the ERK pathway in ESCs and early embryos (Kunath et al. 2007; Yamanaka, Lanner, and Rossant 2010). Moreover, defined durations of FGF/ERK signalling can induce ESCs to adopt a PrE primed state homogeneously (Hamilton and Brickman 2014). This suggests that the paracrine signalling with FGF and its receptor (FGFR) may be responsible for cell cycle synchronisation in ESC culture. To test this idea, we followed ESC cell cycle and lineage heterogeneity in response to pharmacological inhibition of FGFR with PD17 (PD173074, an FGFR1/3 inhibitor). Figure 5F shows that culture in NACL with PD17 resulted in the same loss of cousin and sister correlation as that in response to inhibition of its downstream kinase MEK, further supporting the role for this pathway as a primary determinant of cell cycle synchronisation. Furthermore, PD03 was both more effective at inducing Low Hhex populations and producing a general decrease in cell cycle length (Fig 5F right; Table 4). However, despite the reduced effect of PD17 in ESC heterogeneity (Fig 5F right), PD17 was at least as effective as PD03 in its capacity to block synchronisation (Fig 5F left; Fig 5- Supplement 2E). Thus, even though PD17 containing cultures had significant proportions of Mid Hhex and High cells, that proliferated slowly, PD17 still blocked their synchronisation, suggesting that this pivotal pathway independently regulates cell state transitions and cell cycle synchronisation.
**G1 length regulation accompanies the changes observed in cell cycle**

To further elucidate the differences in cell cycle length in this context, we performed time lapse using the FUCCI cell cycle reporter cell line (Sakaue-Sawano et al. 2008), engineered with an H2B lineage reporter (See Methods, Video 3). Using this approach, we measured division time, G1 length and G1 in relation to the total cell cycle length (G1 Ratio) (Fig 6, Table 5). We measured these parameters in NACL, PD03, 2i/L and PrE differentiation.

Comparing NACL, PD03 and 2i/L, PD03 did not seem to affect the average G1 length significantly, yet there appeared a small increase and clear outliers within PD03 and 2i/LIF cultured cells that showed an increased G1. Although the significance of this increased G1 length may require additional measurement, the increase in G1 length relative to cell cycle length was significant. Thus, in steady state, G1 either remains unaffected or is marginally increased despite the decreasing cell cycle time (Fig 6A, Table 5). We confirmed these unexpected changes by bootstrap analysis (Fig 6 - Supplement 1). Collectively our results suggest that G1 length is increased relative to the cell cycle in response to PD03. As we cannot combine the G1 reporter with Hhex lineage, we cannot assess whether it is the High Hhex or Low Hhex cells which present a longer G1.

However, as the impact of PD03 on cell cycle is a consequence of stimulating the Low Hhex population, we presume an increase in this population accounts for the change in the ratio of G1 to the cell cycle. We therefore used division time to infer cell identity and found that fast dividing cells (Low Hhex) have a higher ratio of G1 to cell division than slow cells (0.15 ± 0.055 vs 0.141 ± 0.043), suggesting Low Hhex cells have a longer G1. Taken together, our results suggest that PD03 promotes the faster proliferating Low Hhex population, but that the decreased cell cycle time in this population is not a result of stimulating G1/S transition, consistent with the role of this drug in inhibiting it (ter Huurne et al. 2017).

We also assessed alternation in G1 during PrE differentiation (See Video 4). Since this cell line did not have a Hhex marker, we stained for GATA6 at the end of the time lapse and retrospectively identified PrE lineage trees, mapping the progenitor cells that would give rise to GATA6 positive colonies. Using this approach, we were able to locate the progenitors of fully differentiated PrE cells and determine their cell cycle parameters on different days of differentiation (Fig 6B; Table 5). Despite the decreased cell cycle length observed for endoderm committed cells at day 3, we observed a progressive increase in G1 itself and the G1 Ratio in the PrE colonies (Fig 6B, right). This increase in G1 appeared in parallel with the increase in proliferative capacity that we assumed associated with endoderm commitment arising from day 3 to 4, further strengthening the apparently contradictory correlation between increased G1 and higher rates of cell division. While there is an enhanced ratio of G1 length in Epiblast-primed ESCs, the changes in G1 during differentiation are much more significant, with G1 itself doubling as cells progress in differentiation.

Finally, we assessed the proportion of cells that expressed G1 transcripts on our scRNA-seq dataset from *in vitro* differentiation. As shown in Fig 6C, we observed the same trend of cells entering G1 as they progress through the endoderm lineage. Although the time frame of our *in vitro* differentiation protocol is several days and *in vivo* development occurs more rapidly, we took advantage of the published early embryo dataset used to benchmark our differentiation (Nowotschin et al. 2019), and assessed whether a G1 trend also occurs *in vitro*.
vivo during PrE specification. We found an increase in cells expressing G1 transcripts as they progressed into the endodermal lineage in vivo. Around the time of implantation E4.5, there was a robust difference in cell cycle phase between Epiblast, which was mostly in S phase, and PrE, where almost half of the cells were in G1. This suggests the coupling we observed between cell cycle and differentiation in vitro might be recapitulated in endoderm specification in vivo. Although the shift in cell cycle would need to occur quite rapidly in vivo as the time scale for differentiation is much shorter.

Discussion

In this paper we describe a close relationship between cell cycle length, lineage priming and differentiation. In ESC self-renewal in vitro, naïve Epiblast-like cells proliferate faster than those primed for PrE differentiation, but when the base media is changed, the tides are turned, and the PrE-primed population develops the proliferative advantage. This suggests that differential culture conditions identify the appropriate lineage-biased populations and stimulate their relative expansion. Our observation that similar alterations in cell cycle exist in peri-implantation development suggests that while this facet of differentiation is exploited in vitro, aspects of it could be a fundamental component of cell specification in vivo.

The differentiation process we define is both selective and progressively inductive. Heterogeneities arise, and these appear to be captured in early differentiation. However, the lineage-specific nature of these primed cells increases inductively (or progressively) such that endodermal identity accrues with each cell cycle. Primed cells that fail to enhance endodermal gene expression tend to die. By day 3 in differentiation, all the future founder cells in the culture are set, and further commitment does not occur. At this point, a combination of selective cell survival, increased rates of proliferation and enhanced endodermal transcription leads to the final differentiated cell populations. By the later time points in differentiation, the combination of single cell sequencing, time lapse imaging and mathematical modelling, suggest that cells that fail to enter the endoderm program selectively die, but at early time cell division dominates. Moreover, while differentiation promotes more rapid cell cycling, it also produces apparently contradictory increases in G1 length.

What are the factors that govern a cell’s choice to differentiate? An increase in G1 would give cycling cells more time to respond to inductive signals, ultimately leading to increased responsiveness to differentiation cues. This would suggest that cells progress into early differentiation, lengthening their G1 phase, thereby improving accessibility to cues promoting commitment, and enabling signalling dependent transcription factors to accumulate ahead of replication. While the link between G1 phase and commitment of pluripotent stem cells into differentiation was first described in 1987 in embryonal carcinoma cells (Mummery, van den Brink, and de Laat 1987), the recent development of the cell-cycle reporter cell line FUCCI has allowed for more detailed findings in this field. It has been functionally demonstrated that the G1 fraction of ESCs has an enhanced capacity to respond to endoderm differentiation signals both in mouse (Coronado et al. 2013) and human (Calder et al. 2013; Pauklin and Vallier 2013). In broad terms, these studies support the notion of G1 phase as a window where pluripotent stem cells can respond more effectively to differentiation cues, and specifically towards the endoderm lineage. Our findings that during the early stages of PrE differentiation
cells lengthen their G1 phase as well as proliferate faster provide an explanation for how selected cells can compete with other populations occupying the same niche. In self-renewing ESCs, PrE-primed Hhex-expressing cells are slowed. Culture conditions that promote a more homogeneous expansion of an Epiblast-like state include PD03, an inhibitor of G1/S transition, suggesting that the expansion of Epiblast-like cells could also involve similar cell cycle regulation. The notion that G1 phase lengthening accompanies differentiation has been shown in other cell lineages such as neural (Lange, Huttner, and Calegari 2009; Roccio et al. 2013), pancreatic (Kim et al. 2015; Krentz et al. 2017) and intestinal (Carroll et al. 2018).

In general, we described a tendency for increased rates of proliferation accompanied by increases in G1, and hence cells exhibiting a shorter cell cycle had a longer G1. While G1 progression has previously been linked to phosphorylation of Retinoblastoma protein (Rb) by ERK (ter Huurne et al. 2017), this does not fit with our observations in differentiation or for PrE specification in vivo, where there is a progressive increase in G1 despite the robust activation of ERK signalling. Cell cycle progression is tightly regulated by the activity of cyclin-dependent kinases (CDKs), and inhibition of cyclin E-CDK2 produces G1 lengthening and spontaneous differentiation in pluripotent stem cells (A. A. Filipczyk et al. 2007; Neganova et al. 2009; Coronado et al. 2013). In mESCs, it has been shown that the ERK pathway is a regulator of G1 length upstream of CDK/cyclin complex which phosphorylates Rb. Taking into account the heterogeneous distribution of cyclins and CDK proteins in the different cell types across development (Wianny et al. 1998), we propose that during PrE differentiation a different CDK/cyclin complex is regulating G1 phase length, and this complex is no longer a target of ERK phosphorylation in this context.

Mammalian cells share the striking quality of being synchronised in cell cycle length between members of the same generation (sisters and cousins), but not with the previous generation (mother-daughter). This was originally demonstrated in both a lymphoblast cell line and ESCs (Sandler et al. 2015; Waisman et al. 2019). Moreover, as alluded to above and suggested by previous work, this correlation might be determined based on factors that are inherited by related cells. This means that sister cells would inherit the same amount of determinant, which would be different from the previous generation (Sandler et al. 2015). Our observations suggest that this determinant is a factor located within the ERK pathway downstream of MEK, as culture with either the MEK inhibitor PD03 and/or the FGFR antagonist PD17 eliminates these correlations. Thus FGF/ERK regulation is likely a key nexus for this activity, and our observations suggest this activity is independent of its role in regulating differentiation. Whether this reflects a paracrine interaction of related cells with a common cytokine source or the level of receptor on the surface of these cells cannot be distinguished based on our observations. However, as ERK signalling is a known regulator of the G1/S transition, cell cycle synchronization could be mediated via this check point.

Given that cell cycle synchronization can be observed on both fast and slow proliferating cells its relevance to differentiation is difficult to discern. If changes in proliferation are a response to differentiation cues, then synchronous inheritance could ensure that daughter cells retain an equivalent enhanced cell cycle state from their parents regardless of their position relative to the source of the signal. In vivo, where PrE differentiation occurs in a salt and pepper pattern in three dimensions, synchronization could enable cells to retain the memory of a signal regardless of their position and despite cell mixing. Moreover, if G1 represents the
window of opportunity for cells to act upon signalling cues, we envision cell synchronization could represent inheritance of signalling opportunity, promoting similar durations of active transduction in clones of differentiating cells. If ERK is regulating both differentiation and cell cycle synchronization via G1, it is also possible that cell cycle synchronization is a consequence of ERK mediated alterations to the temporal window over which a cell responds to cytokine signalling.

Differentiation *in vitro* occurs over several days, while in embryonic development the segregation of Epiblast from PrE occurs over a much shorter time scale, approximately 24 hours. While this difference limits the extent to which our observations *in vitro* can be extrapolated to embryonic development, the similarities between both transcriptome and G1 regulation are striking. Therefore, we speculate that cell cycle synchronization could facilitate a coordinated change in cell division time and G1 length in the context of embryonic lineage specification, enabling coordinated signalling responses.

Altogether, our data suggest that ESC cultures and their differentiation are complex models that involve an interplay of both priming-based selection and proliferation. We find that cell state changes are major drivers of culture-specific changes in proliferation that, in turn, contribute to the final state of a culture. Despite the increasing rates of proliferation, cells exploit G1 to integrate the signals coming from their environment and evaluate their choices. Although the time scale of the *in vivo* and *in vitro* differentiation is different, it appears that the use of increasing G1 to drive increasing levels of commitment is a fundamental facet of cell fate choice.
Figure legends

Figure 1. Transcriptome profiling of PrE in vitro differentiation.
A. Schematic of the experiment. Cells were passaged twice in 2i/LIF and then plated in RPMI base media 24 hours before starting the experiment. Bottom panel: Flow cytometry plots showing the time points selected for single cell RNA-seq. The fluorescent information of Sox2 and Hhex was recorded prior to sequencing. Cells from all the populations shown in the plots were collected for sequencing.
B. UMAP projection of the in vitro experiment showing 9 identified clusters using Louvain (upper panel) and stages of differentiation (bottom panel).
C. Heatmap showing expression of selected Epi, ICM and PrE markers in 2i/LIF, day 2 and day 7 of differentiation. Left panel: PrE Diff branch. Right panel: NEDiff branch. Cells at day 2 in the PrE branch already are upregulating endoderm genes while the NEDiff cells are not.
D. Sankey plot visualizing cluster similarity comparison between identified in vitro clusters and in vivo (Nowotschin et al. 2019) experiment using the Cluster Alignment Tool (CAT).

Figure 2. Time lapse of PrE differentiation shows rapid proliferation of PrE primed cells.
A. Schematic of the experimental setup. Cells were imaged for 6 days acquiring 1 time frame every 20 minutes.
B. The Hhex intensity distribution between the populations allowed us to separate PrE differentiated cells (PrE) from the Non-endodermal differentiated cells (NEDiff). p-value < 0.0001 Mann-Whitney test.
C. Example of a lineage tree showing how the PrE branch of the tree arises. The first and last generation were discarded from further analysis since the cell cycle information is not complete. All lineage trees collected in the PrE condition are shown in Fig 2- Supplement 1; this example corresponds to Tree 10 in Fig 2- Supplement 1.
D. Analysis of mESCs division times and cell counts showed that cells that differentiate into PrE are dividing faster at the beginning of the differentiation process (day 3, left panel) and that selected survival likely takes place later in differentiation (day 4 and 5, right panel). *** p-value < 0.001.
E. Cell cycle length at day 3 shows a decrease in the PrE cells division time, compared to a slower dividing non-endodermal cluster (p-value<0.0001 Unpaired t-test).

Figure 3. Analysis of PrE progenitor cells demonstrates functional priming of Hhex-high cells.
A. A mathematical model that considers the difference in cell death rate between the 2 populations as well as the proliferation rate can recapitulate the PrE dataset collected (see Methods for description of the Mathematical Modelling). Based on the experimental dataset, we found the same survival rates predicted by the model. t = transition rate, s = survival rate, d = division time (hours).
B. The NEDiff cluster at day 2 was separated into cells that will give rise to PrE (PrE Fate), and cells that eventually would not differentiate (NEDiff Fate). Analysis of the Hhex intensity distribution shows that cells that will give rise to PrE (PrE Fate) show higher Hhex intensity. Total cell number and fluorescence quantification shown in Table 3.
C. The High Hhex population from day 2 of PrE differentiation, isolated by FACS, shows improved PrE differentiation (scored as percentage of PDGFRA positive cells), demonstrating the functional priming of these cells. * p-value < 0.05 Kruskal-Wallis test.
Figure 4. Single cell quantification of Hhex expression in NACL uncovers a relationship between Hhex levels and cell cycle length.

A. Schematic of the experimental setup. Cells were plated 48 hours before starting the experiment. Cells were imaged for 6 days acquiring 1 time frame every 20 minutes.

B. Example of a cell trace (Time vs Hhex-mCherry intensity) in the setup analysed. Cells survived and divided over 6 days without any apparent effect of cell death. Cells were entering and exiting higher and lower Hhex states without any apparent bias.

C. Hhex intensity distribution was divided into 3 compartments: High (includes cells above 75% percentile), Mid (between 25% and 75% percentiles) and Low (cells below 25% percentile). Y-axis shows the percentage of cells that falls into each bin. See Table 4 for total cell numbers per compartment.

D. Example of a lineage tree with the corresponding compartments of Hhex, by colour. The first and last generation were discarded from further analysis since the cell cycle information is not complete. All lineage trees collected in the NACL condition are shown in Fig 4 – Supplement 2. This example corresponds to Tree 1 in Fig 4 – Supplement 2.

E. Probability of cells to transition compartments between mother and daughter cells, quantified as percentage of cells over 1 generation.

F. The Low Hhex population divides significantly faster than the High Hhex. *** p-value < 0.001, Kruskal-Wallis test. The Mid Hhex population shows an in-between division time, suggesting a linear relationship between Hhex expression level and cell cycle length.

Figure 5. PD03 promotes expansion of the fast proliferating Low Hhex population.

A. Schematic of experimental setup. Cells were plated 48 hours before starting the experiment in NACL, and PD03 was added at the start of the time lapse. Cells were imaged for 6 days acquiring 1 time frame every 20 minutes.

B. Hhex intensity is significantly lower in the PD03 treated population. **** p-value < 0.0001, Wilcoxon test.

C. The lower intensity of Hhex is related to the higher fraction of cells in the Low Hhex population. The Low Hhex population increases from 25 to 50% when PD03 is added.

D. mESCs division time is significantly faster in PD03. *** p-value < 0.001, Mann-Whitney test.

E. Cell cycle in the Low Hhex compartment is faster in PD03 as well as in NACL. *** p-value < 0.001, Kruskal-Wallis test.

F. Left: Both PD03 and PD17 produce a loss in the cell cycle synchronisation between sisters and cousins. All correlation plots are shown in Fig 5 – Supplement 2. * p-value < 0.05. Right: PD17 does not provide the same alterations in Hhex expression or division time that were generated by PD03 *** p-value < 0.001, **** p-value < 0.0001.

Figure 6. The regulation of cell cycle length during priming and differentiation involves G1 length.

A. PD03 addition significantly increases the ratio between G1 and Division Time (* p-value < 0.05, Kruskal-Wallis test), even though it does not significantly change the G1 length itself in FUCCI cells. Cells cultured in 2i/LIF for 2 passages show a faster cell cycle than when PD03 was added for a short period (** p-value < 0.01, **** p-value < 0.0001 Kruskal-Wallis test).

B. PrE differentiated cells show a longer G1 phase and an increase in G1 Ratio as they proceed along the differentiation process. Division time is faster at day 3 and then it slows down, consistent with the previous dataset. * p-value < 0.05, ** p-value < 0.01, *** p-value < 0.001, **** p-value < 0.0001 Kruskal-Wallis test.
C. Proportion of cells that express G1, G2/M or S signature transcriptional profiles. Left: *in vitro* dataset (this study). Right: *in vivo* dataset (Nowotschin et al. 2019).

**Figure 1-Figure Supplement 1. Properties of cells collected for MARS-seq during PrE *in vitro* differentiation.**

A. Fluorescence intensity on the Hhex-mCherry channel recorded by the FACS at the moment of the sample collection for sequencing. Samples were collected from 2i/LIF culture, and days 1, 2, 3, 4 and 7 of PrE differentiation. Cells are labelled PrE or NEDiff according to whether they belong to the PrE branch or the not differentiated branch, respectively. PrE cells show higher Hhex reporter expression than the NEDiff clusters.

B. Fluorescence intensity on the Sox2-GFP channel recorded by the FACS at the moment of the sample collection for sequencing. Samples were collected from 2i/LIF culture, and days 1, 2, 3, 4 and 7 of PrE differentiation. Cells are labelled PrE or NEDiff according to whether they belong to the PrE branch or the not differentiated branch, respectively. NEDiff cells show higher Sox2 reporter expression than the PrE clusters.

C. Cellular proportions of cells in 2i/LIF vs NEDiff vs PrE branch, showing that clusters 1, 5 and 6 belong to the 2i/LIF cells. Cells from day 2, 3 and 4 are separated between differentiated (PrE, clusters 3, 7 and 4) and non-differentiated (NEDiff, clusters 0 and 2).

**Figure 1-Figure Supplement 2. Lineage specific markers expressed in single cell RNA-seq clusters.**

A. Interrogation of endodermal genes (*Dab2, Gata6, Pdgfra, Sox17*), mostly expressed in the PrE branch of the dataset.

B. Interrogation of Epiblast genes (*Nanog, Sox2, Zfp42, Klf2*), mostly expressed in the 2iLif clusters and the NEDiff branch of the dataset.

**Figure 2-Figure Supplement 1. Lineage trees in PrE differentiation.**

Lineage trees generated in the PrE dataset. We manually tracked 1,158 cells. After constructing our lineage trees, cells that died or that had not completed a full division cycle were discarded. The final dataset consisted of 564 cells across 10 lineage trees. Cells are coloured based on clusters described in Figure 2B.

**Figure 2-Figure Supplement 2. Assessing PrE differentiation *in vitro* and *in silico*.**

A. HFHCV mESCs lost pluripotent identity (NANOG) and acquired endodermal identity (GATA6) during PrE differentiation. Scale bar: 50 μm.

B. Quantification of immunofluorescent images obtained at the indicated timepoints. Cells were segmented based on DAPI and GATA6 or NANOG fluorescent was measured in absolute units. Data were converted to log scale for easier visualization. Cells were quantified as NANOG positive, GATA6 positive, Double Positive (DP) and Double Negative (DN) using the thresholds from the Negative Control.

C. Flow cytometry histogram of HFHCV mESCs during PrE differentiation. PDGFRA-APC staining of HFHCV mESCs at day 1, 3 and 5 shows the acquisition of endodermal identity.

**Figure 3-Figure Supplement 1. Algebraic model iterations.**

Phase diagrams based on the algebraic model (Fig3A, Methods) illustrating how the differences in cell death and cell division influence the proportions of the PrE and the NEDiff populations. Each line represents combinations of relative survival and proliferation rates that result in the same PrE:NEDiff ratio, the ratio is indicated by the numbers on each line. N is the initial cell number, t is the transition rate from NEDiff to PrE, d1 is the division rate of NEDiff population; d2 of the PrE population, s1 is the survival rate of the NEDiff population; s2 of the PrE population. Diagrams illustrate that changes
in the survival rates have stronger impact on increasing the PrE/NEDiff ratio at Day 5, compared to division times, whereas on Day 3 the division time has a greater impact.

Figure 4-Figure Supplement 1. Heterogeneity in defined pluripotent stem cell culture.

A. HFHCV mESCs maintained pluripotent identity after 6 days of time lapse, shown by OCT4 and NANOG immunostaining at the end of the experiment. Scale bar: 50 µm.

B. Top: H2B-Venus intensity distribution for all data points collected in NACL. Not normal distribution, p-value > 0.05 in Shapiro-Wilk’s test. Bottom: Hhex-mCherry intensity distribution for all data points collected in NACL. Not normal distribution, p-value > 0.05 in Shapiro-Wilk’s test.

C. Number of transitions between Hhex compartments for each 24h of time lapse in NACL.

D. Left, transition probability for Hhex compartments during priming in early PrE differentiation (days 1-3). Right, number of transitions between Hhex compartments for each 24h of time lapse in days 1-3 of PrE differentiation.

Figure 4-Figure Supplement 2. Lineage trees in pluripotent stem cell culture.

Lineage trees generated in the NACL dataset. We manually tracked 1,063 cells. After constructing our lineage trees, cells that died or that had not completed a full division cycle were discarded. The final dataset consisted of 509 cells across 12 lineage trees. Cells are coloured based on Hhex compartments described in Figure 4C.

Figure 5-Figure Supplement 1. Lineage trees in pluripotent stem cell culture with PD03.

Lineage trees generated in the PD03 dataset. We manually tracked 1,000 cells. After constructing our lineage trees, cells that died or that had not completed a full division cycle were discarded. The final dataset consisted of 490 cells across 9 lineage trees. Cells are coloured based on Hhex compartments described in Figure 4C.

Figure 5-Figure Supplement 2. Transitions and cell cycle synchronization in response to FGF/ERK inhibition.

A. Percentage of cells that transition compartments between mother and daughter cells (left), and number of transitions / 24h (right), in the PD03 dataset.

B. Bootstrap analysis (100 times) of the Division Time median, showing a clear difference between the NACL and PD03 dataset.

C. Spearman correlation plots for Division Times measurements in NACL. From left to right: Mother-daughter correlation, Sister pairs correlation, Cousin pairs correlation. R: Spearman Correlation Coefficient.

D. Spearman correlation plots for Division Times measurements in PD03. From left to right: Mother-daughter correlation, Sister pairs correlation, Cousin pairs correlation. R: Spearman Correlation Coefficient.

E. Spearman correlation plots for Division Times measurements in PD17. From left to right: Mother-daughter correlation, Sister pairs correlation, Cousin pairs correlation. R: Spearman Correlation Coefficient.

Figure 6-Figure Supplement 1. Bootstrap analysis of the FUCCI dataset.

Bootstrap analysis (100 times) of Division Time, G1 Length and G1 Ratio measures in the FUCCI cell line, showing a difference between the NACL and PD03 dataset.

Video Legends

Video 1. Example of a tracked HFHCV colony during PrE differentiation.
Cyan is H2B-Venus, magenta is Hhex-mCherry. Yellow squares show the cell tracking. Scale bar is 300 µm.

Video 2. Example of a tracked HFHCV colony in NACL.  
H2B-Venus is shown in cyan, magenta is Hhex-mCherry. Yellow squares show the cell tracking. Scale bar is 200 µm.

Video 3. Example of an imaged FUCCI colony in NACL.  
mCherry-Cdt1 is shown in cyan, and H2B-miRF670 is shown in magenta. Scale bar is 20 µm.

Video 4. Example of an imaged FUCCI colony during PrE differentiation.  
mCherry-Cdt1 is shown in cyan, and H2B-miRF670 is shown in magenta. Scale bar is 300 µm.
Table 1. Summary of the cell numbers in the different scRNA-seq clusters analysed.

Clusters are annotated as NEDiff, PrE Parental and PrE according to Fig 1B.
<table>
<thead>
<tr>
<th></th>
<th>PrE</th>
<th>NEDiff</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>Day 2</td>
<td>Day 3</td>
</tr>
<tr>
<td>Cells that survive</td>
<td>5</td>
<td>32</td>
</tr>
<tr>
<td>Cells that die</td>
<td>1</td>
<td>4</td>
</tr>
<tr>
<td>Cells total</td>
<td>6</td>
<td>36</td>
</tr>
<tr>
<td>Survival rate</td>
<td>0.83</td>
<td>0.89</td>
</tr>
<tr>
<td>Death rate</td>
<td>0.17</td>
<td>0.11</td>
</tr>
<tr>
<td>Division Time (h)</td>
<td>13.33 ± 4</td>
<td>11.00 ± 3</td>
</tr>
</tbody>
</table>

Table 2. Comparison of survival and proliferation during time lapse of PrE differentiation.

Survival rate is calculated as a ratio between cells that survived between total cells. Death rate is the ratio between cells that died and total number of cells. As total cells, only cells with complete cell cycle information are considered. Division Time (hours) is shown as median ± standard deviation.
<table>
<thead>
<tr>
<th></th>
<th>PrE Fate</th>
<th>NEDiff Fate</th>
</tr>
</thead>
<tbody>
<tr>
<td>Cells</td>
<td>20</td>
<td>151</td>
</tr>
<tr>
<td>Division Time (h)</td>
<td>17.67 ± 6</td>
<td>17.33 ± 6</td>
</tr>
<tr>
<td>Hhex-mCherry (a.u.)</td>
<td>0.18 ± 0.03</td>
<td>0.15 ± 0.02</td>
</tr>
</tbody>
</table>

Table 3. Analysis of PrE parental cells.

Division Time (hours) is shown as median ± standard deviation. Hhex-mCherry fluorescence (absolute units) is shown as median ± standard deviation.
Table 4. Comparison of survival and proliferation between Hhex compartments.

Survival rate is calculated as a ratio of the number of cells that survived to the total number of cells. Death rate is the ratio of the number of cells that died to the total number of cells. As total cells, only cells with complete cell cycle information are considered. Division Time (hours) is shown as median ± standard deviation. Residence times is shown as mean ± standard deviation of generations (or hours below) in which a cell stays in the same state.
Table 5. Summary of dataset collected in the FUCCI cell line.

<table>
<thead>
<tr>
<th></th>
<th>NAACL</th>
<th>PD03</th>
<th>2i/LIF</th>
<th>PrE</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>Day 2</td>
<td>Day 3</td>
<td>Day 4</td>
<td></td>
</tr>
<tr>
<td>Division Time (h)</td>
<td>20.4 ± 5</td>
<td>19.5 ± 7</td>
<td>15.0 ± 5</td>
<td>16.33 ± 1</td>
</tr>
<tr>
<td>G1 Length (h)</td>
<td>2.7 ± 2.5</td>
<td>3.1 ± 1.9</td>
<td>3.0 ± 0.9</td>
<td>2.7 ± 1.2</td>
</tr>
<tr>
<td>G1 Ratio</td>
<td>0.14 ± 0.1</td>
<td>0.15 ± 0.1</td>
<td>0.19 ± 0.1</td>
<td>0.16 ± 0.1</td>
</tr>
<tr>
<td>Cells total</td>
<td>126</td>
<td>104</td>
<td>110</td>
<td>12</td>
</tr>
</tbody>
</table>

Division Time (hours) is shown as median ± standard deviation. G1 Length (hours) is shown as median ± standard deviation. G1 Ratio is produced as the ratio between the G1 Length and the total Division Time, and it is shown as median ± standard deviation.
Methods

Mouse ESC Culture

Mouse ESC lines were cultured in standard conditions in NACL as previously described in Anderson et al., 2017. For NACL+PD03 experiments, PD 0325901 (PD03) was added at the final concentration of 1μM. For PrE experiments, cells were cultured previously in 2i/LIF containing CHI 99021 (Chiron), PD03 and LIF, and then in RACL as described in Anderson et al., 2017.

Cell Lines

Mouse ESCs lines used in this study are E14JU with a 129/Ola background.

The cell line HFHCV was previously reported in (Illingworth et al. 2016). It contains Hhex-3xFLAG-IRES-H2b-mCherry (HFHCVa), and a pCAG-H2b-Venus vector (HFHCVe). Using this cell line Hhex transcription can be visualized by translational amplification of Hhex, which drives the expression of the monomeric fluorescent protein mCherry (Canham et al. 2010; S. M. Morgani et al. 2013; Illingworth et al. 2016).

The FUCCI-H2B-miRF670 reporter construct was constructed as follows. The H2B and miRFP670 sequences were fused by overlap extension PCR. The miRFP670 sequence was cloned from pY42-pmiRFP670AAA-NLS-Myc, a kind gift from YH Kim. The resulting fragment H2B-miRFP670 was inserted into the PCR-Blunt II-TOPO backbone by TOPO cloning. The H2B-miRFP670 fragment was digested with the Cpol (RsrII) and KlfI enzymes and inserted upstream of the Hygromycin resistance gene cassette of the ES-FUCCI plasmid (Addgene #62451). RAF-ERT2 (Hamilton and Brickman 2014) cells were electroporated with BglI-linearised FUCCI-H2B-miRFP670 DNA (25μg), and stable transfectants were selected for with hygromycin (125μg/ml). Cell lines were validated by flow cytometry, fluorescence microscopy and karyotyping.

All cell lines have been routinely tested for mycoplasma.

Time lapse

Mouse ESC lines were cultured in NACL or 2i/LIF medium on Laminin 511(BioLamina) -coated 8-well slides (Ibidi) and imaged at 20 minutes intervals for 6 days in mCherry and Venus fluorescent light channels, in 5%CO2 and 20%O2 at 37°C under a Deltavision Widefield Screening microscope. ESCs were seeded at 300 cells/cm² 48h before the beginning of the time lapse for NACL and PD03 experiments, or at 30.000 cells/cm² 24h before for PrE differentiation. For PD03 experiments, cells were cultured in NACL for at least 2 passages and PD03 was added just before starting the time lapse. For PrE experiments, cells were cultured in 2i/LIF for 2 passages and then changed to RPMI minimal medium just before starting the experiment. Activin A, Chiron and LIF (RACL) were added 24h after the time lapse started. In all experiments, the media was changed every day of the time lapse. To test that the laminin coating was not affecting the behaviour of the HFHCVe cell line, we sorted Hhex-high and low populations seeded in both gelatine and laminin and analysed them 24 and 48h later to test that their re-equilibration rates are the same.

Flow cytometry
Cells were collected by trypsinisation and stained against a marker of undifferentiated mESCs, Pecam-1 (BD Biosciences, APC-conjugated, 551262; 1:200), or a marker for PrE differentiated cells, PDGFRA (BD Biosciences, APC-conjugated, 562777; 1:200), and DAPI (Molecular Probes, D1306, 1 μg/ml) to exclude dead cells. mESCs were stained for 15 min at 4°C before being washed and resuspended in FACS buffer (10%FCS in PBS) with DAPI. Flow cytometry analysis was carried out using a BD LSR Fortessa, and flow cytometry sorting was carried out in a BD FACS Aria III. Data analysis was carried out using FCS Express 6 Flow software (De Novo Software) by gating on forward and side scatter to identify a cell population and eliminate debris, then gating DAPI negative, viable cells before assessing the levels of GFP, mCherry or APC.

mESCs immunostaining

Mouse ESCs were cultured in 8-wells slides (Ibidi). ESC immunostaining was carried out as previously described in Canham et al., 2010. The following antibodies were used: anti-NANOG (eBioscience, 14-5761, 1:200), anti-OCT4 (Santa Cruz, sc-5279, 1:200), anti-GATA6 (Cell Signalling Technologies, 5851, 1:1600). Secondary antibodies used are from the Alexa fluor series (Molecular Probes, ThermoFisher). mESCs were imaged using a Deltavision Widefield Screening microscope.

Cell tracking

We performed manual cell tracking using Imaris v9.5 (Bitplane). Nuclei were segmented using the H2B marker, and we measured the Hhex-mCherry fluorescence intensity of a circular area of 50 μm diameter inside the segmented nuclei. For each area measured, we took the median fluorescence intensity as the measure for that given data point. Intensity measurements were linked to its time point and lineage, allowing us to infer the division time for each cell that was tracked, as well as the expression level of Hhex in each time point. Only cells with completed cell cycle information were used for cell cycle and compartment analysis.

Data Analysis

Data mining was performed with Matlab. A script was generated to take the separated output data frames from Imaris and convert into a single file containing all the dataset information, by cell. This file also contains the lineage tree information, mean fluorescence intensities and division times. Alive and dead cells, as well as cells without complete cell cycle information, are located into groups for further analysis. Another file organised by time frame is generated in order to perform time dynamics analysis.

Statistical analysis and plotting were performed in R. Hhex compartments were determined by dividing the Hhex-mCherry intensity distribution into quartiles. All cells above the first quartile (0.1648) are considered High, and all cells below the third quartile (0.1376) are Low. The same quartiles are used for the PD03 dataset (Table 4). The PrE dataset was divided into PrE cluster and NEDiff cluster using k-means clustering. Plots were created with R ggplot2 package, and GraphPad Prism.

Mathematical modelling in Figure 3
The model describes the growth of the NEDiff population as an exponential growth function where NEDiff cells transition to PrE at a constant rate $t$, where $N$ is the initial number of cells and $s_1$ is their survival rate.

Each generation number is described as $g_1 = 24(x - 1)/d_1$ where $d_1$ is the division time of the NEDiff cells in hours and $x$ is the number of days, starting with 1.

$$N_{\text{NEDiff}} = N \cdot \left[2s_1(1 - t)\right]^{24(x-1)/d_1}$$

PrE cells are described as the sum of cells that transition from NEDiff to PrE at each generation with rate $t$ and consequently divide with division time $d_2$ and survive with survival rate $s_2$:

$$N_{\text{PrE}} = \sum_{i=1}^{g_1} N(2s_1)^i(1-t)^{-1}t(2s_2)^{d_1} \cdot \left\{ \frac{d_2}{d_1} \left( \frac{2s_2}{2s_1} \right)^{24(x-1)/d_1} - (2s_2(1 - t))^{24(x-1)/d_1} \right\} / 2s_1(t - 1) + (2s_2)^{d_1}
$$

The sum was solved using Wolfram Alpha Mathematica.

**scRNA-seq analysis**

Single cell libraries were sequenced using Illumina NextSeq 500. Pre-processing steps and quality control was done as described previously in (Jaitin et al. 2014; Rothová, Nielsen, Proks, Wong, Riveiro, Linneberg-Agerholm, Eyal, et al. 2022). In short, the reads were aligned using HISAT (version 0.1.6) and mapped to mouse mm9 genome. Further downstream analysis was done using sc anpy (version 1.4.6). After filtering 2,028 cells and 17,769 genes were normalized and log-transformed. We identified 2,000 highly variable genes using seurat flavor. Genes were further scaled to mean-variance followed by PCA and UMAP dimension reduction. No cell cycle regression and batch correction were necessary. Finally, we used unsupervised Louvain clustering with resolution set to 0.8 and which identified 9 overall clusters (04_analysis.Rmd). Cell cycle was estimated using Seurat’s (4.0.1) CellCycleScoring function.

**Cluster Alignment Tool (CAT)**

To estimate similarity between clusters we used CAT (Rothová, Nielsen, Proks, Wong, Riveiro, Linneberg-Agerholm, David, et al. 2022). First, the tool normalized the datasets using non-zero median which removes the influence of outlier genes. Both datasets are subset for unique and common genes. Next, Euclidean distance is calculated between each pair of clusters by randomly sampling cells with replacement to cluster size. This step is repeated 1,000 times generating two distributions. If the distance is significant (sigma = 1.6 representing p-val 0.05) we define these clusters transcriptionally similar.

**Code availability**

We deposited the original MATLAB scripts behind the data mining and mathematical models on Github:

https://github.com/SilasBoyeNissen/TranscriptionalHeterogeneityAndCellCycleRegulationAsCentralDeterminantsOfPrimitiveEndodermPriming

All scRNA-seq analysis were also uploaded to Github at:

http://github.com/brickmanlab/perera_et_al_2022/
Data Availability

The sc-RNAseq data used in this study have been deposited in the Gene Expression Omnibus, https://www.ncbi.nlm.nih.gov/geo/, the accession number is GSE200534. Previously published Nowotschin et al., 2019 data that were used here are available under accession number GSE123046.

Materials Availability

All materials will be available upon reasonable request to the corresponding author.

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Competing interests

The authors declare no competing interests.

References


Figure 1

(A) Time course of 2iLIF and PrE (RPMI + Activin A, Chiron, LIF) treatment.

(B) UMAP plot showing the transition from PrE Parental to NEDiff with time.

(C) Heatmap displaying gene expression changes during 2iLIF and PrE treatments.

(D) Stacked bar chart illustrating gene expression levels for in vitro and in vivo conditions.
Figure 1 - Figure Supplement 2

A

<table>
<thead>
<tr>
<th>Gene</th>
<th>Expression Level</th>
<th>Cluster</th>
<th>UMAP 1</th>
<th>UMAP 2</th>
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B

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<td>Klf2</td>
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</table>
Figure 2

A

2i/LIF  RPMI  PrE (RPMI+ACL)

Day 3
Division Time (h)

30,000 cells/cm²

PrE differentiation

Base media  RPMI

Cytokines  Activin A, Chiron, LIF

B

% Fraction of cells

Log₁₀ Hhex-mCherry intensity

NEDiff  PrE

C

Time

<0.0001

D

Division Time (h)

Day

E

Division Time (h)

<0.0001
Figure 2 - Figure Supplement 1
**Figure 2 - Figure Supplement 2**

A

<table>
<thead>
<tr>
<th>GATA6</th>
<th>H2B-Venus</th>
<th>Hhex-mCherry</th>
<th>NANOG</th>
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</thead>
</table>

Day 1

Day 3

Day 5

2i/LIF

B

Day 1

Day 3

Day 5

NegControl

C

Day 1

Day 3

Day 5

Count

PDGFRA-APC
Figure 3

A

Model

Experimental

B

Fate

NEDiff Fate

PrE Fate

C

E14

HFHCV

LOW

25%

HIGH

25%
Figure 3 - Figure Supplement 1

\[ N = 1; \ T = 0.12; \ d_1 = 17h; \ s_1 = 0.6; \text{ On day 3} \]

\[ N = 1; \ T = 0.12; \ d_1 = 17h; \ s_1 = 0.6; \text{ On day 4} \]

\[ N = 1; \ T = 0.12; \ d_1 = 17h; \ s_1 = 0.6; \text{ On day 5} \]
Figure 4

A

NACL  NACL
48h
300 cells/cm²
day 0
Steady State
Base media | N2B27
Cytokines | Activin A, Chiron, LIF
day 6

B

Hhex-mCherry intensity

C

D

E

Transition probability
Hhex mother compartment
Low  Mid  High
78.91%  10.63%  0%
18.75%  78.74%  23.62%
2.34%   10.63%  76.38%

F

Division Time (h)
Figure 4 - Figure Supplement 2
Figure 5

A

NACL  PD03  PD17
Division Time (h)

Hhex-mCherry intensity

B

% Fraction of cells

Log₁₀ Hhex-mCherry intensity

C

% Fraction of cells

Hhex

High
Mid
Low

D

Division Time (h)

NACL  PD03

E

Division Time (h)

Hhex

High
Mid
Low

F

Cell Cycle Length

Spearman coefficient

Mother-Daughter  Sisters  Cousins

Hhex-mCherry intensity

Condition

NACL  PD03  PD17

Division Time (h)

Condition

NACL  PD03  PD17
A) Transition probability

<table>
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<td>Hhex mother compartment</td>
<td>90.48%</td>
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<td>Hhex daughter compartment</td>
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<td>64.58%</td>
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<table>
<thead>
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<td>1.59</td>
<td>0.28</td>
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<tr>
<td>Hhex daughter compartment</td>
<td>0.16</td>
<td>1.32</td>
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</table>

B) Transitions / 24h

<table>
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<th>Mid</th>
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<tbody>
<tr>
<td>Hhex mother compartment</td>
<td>0.39%</td>
<td>6.81%</td>
<td>35.42%</td>
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<tr>
<td>Hhex daughter compartment</td>
<td>0.01</td>
<td>0.12</td>
<td>0.54</td>
</tr>
</tbody>
</table>

C) Division Time (h) Bootstrapped

B) Count

D) PD03

C) PD17

E) PD03

Figure 5 - Figure Supplement 2
Figure 6 - Figure Supplement 1

The figure consists of three subplots, each showing a histogram with two distributions labeled 'NACL' and 'PD03'.

- **Left subplot**: Division Time (h) Bootstrapped.
  - The x-axis represents the division time in hours, ranging from 19 to 24.
  - The y-axis represents the count, with values ranging from 0 to 400.
  - Green and purple bars represent the NACL and PD03 distributions, respectively.

- **Middle subplot**: G1 Length (h) Bootstrapped.
  - The x-axis represents the G1 length in hours, ranging from 3.0 to 4.0.
  - The y-axis represents the count, with values ranging from 0 to 1250.
  - Green and purple bars represent the NACL and PD03 distributions, respectively.

- **Right subplot**: G1 Ratio Bootstrapped.
  - The x-axis represents the G1 ratio, ranging from 0.14 to 0.18.
  - The y-axis represents the count, with values ranging from 0 to 500.
  - Green and purple bars represent the NACL and PD03 distributions, respectively.