

STEM CELLS AND REGENERATION

RESEARCH ARTICLE

FGF/MAPK signaling sets the switching threshold of a bistable circuit controlling cell fate decisions in embryonic stem cells

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ABSTRACT

Intracellular transcriptional regulators and extracellular signaling pathways together regulate the allocation of cell fates during development, but how their molecular activities are integrated to establish the correct proportions of cells with particular fates is not known. Here we study this question in the context of the decision between the epiblast (Epi) and the primitive endoderm (PrE) fate that occurs in the mammalian preimplantation embryo. Using an embryonic stem cell (ESC) model, we discover two successive functions of FGF/MAPK signaling in this decision. First, the pathway needs to be inhibited to make the PrE-like gene expression program accessible for activation by GATA transcription factors in ESCs. In a second step, MAPK signaling levels determine the threshold concentration of GATA factors required for PrE-like differentiation, and thereby control the proportion of cells differentiating along this lineage. Our findings can be explained by a simple mutual repression circuit modulated by FGF/MAPK signaling. This might be a general network architecture to integrate the activity of signal transduction pathways and transcriptional regulators, and serve to balance proportions of cell fates in several contexts.

KEY WORDS: Embryonic stem cells, GATA factor, Cell fate decision, Dynamic systems, Live cell imaging, Preimplantation development

INTRODUCTION

To ensure the faithful development of multicellular organisms, cell fate decisions in populations of undifferentiated cells have to be tightly balanced. It is now well established that transcriptional networks and extracellular signals together control these decisions, but how their interactions determine the proportions of cells differentiating along particular lineages is often not known. This question is of particular importance in one of the first cell fate decisions in the mammalian preimplantation embryo, where a small number of inner cell mass (ICM) cells have to reliably populate both the epiblast (Epi) lineage that will give rise to the embryo proper, as well as the primitive endoderm (PrE) lineage, which differentiates into tissues that function in patterning and nutrient supply of the embryo (Rossant and Tam, 2009). The factors underlying this fate decision have been studied in embryos and embryonic stem cells (ESCs) (Cho et al., 2012; Fujikura et al., 2002; Shimosato et al., 2007), clonal derivatives of ICM cells that are biased towards the Epi fate but harbor a latent PrE differentiation potential (Beddington

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and Robertson, 1989; Morgani et al., 2013). Mutant analysis indicates that a transcriptional network centered on the transcription factor NANOG marks and defines the Epi fate (Chambers et al., 2007; Frankenberg et al., 2011), whereas a network centered on GATA transcription factors underlies the PrE fate (Bessonnard et al., 2014; Schrode et al., 2014). NANOG and GATA6 are co-expressed in early ICM cells, but their expression patterns become mutually exclusive as cells commit to specific fates (Plusa et al., 2008), suggesting mutually repressive interactions between the two programs (Frankenberg et al., 2011; Schrode et al., 2014). Studies using genetic mutants and pharmacological inhibitors have furthermore shown that the FGF/MAPK signaling pathway promotes the PrE fate at the expense of the Epi fate in embryos (Kang et al., 2012; Nichols et al., 2009; Yamanaka et al., 2010), and that it is required for PrE-like differentiation of ESCs (Cho et al., 2012). How the activities of the transcriptional networks are integrated with the activity of the FGF/MAPK signaling pathway, and how these inputs together control the proportion of cells differentiating along either lineage has not been systematically investigated.

Recently, a mathematical model for the decision between the Epi and the PrE fate has been proposed (Bessonnard et al., 2014), in which *Nanog* and *Gata6* repress each other, and reinforce their own expression through direct positive feedback. This defines a dynamic system with three stable states in which cells either express GATA6 or NANOG alone, or co-express the two markers. In this model, FGF/MAPK signaling both promotes GATA6 expression and inhibits NANOG expression, and differences in FGF/MAPK signaling between cells have been proposed to underlie fate choice from the co-expression state (Bessonnard et al., 2014). Although this model is consistent with static phenotypes of wildtype embryos and genetic mutants, the gene expression dynamics proposed have not directly been tested. It is also not clear whether all proposed links are required to explain the behavior of the genetic circuit underlying this cell fate decision, and which one of the two inputs into the system – signaling or transcription factor activity – most influences the fate decision. Addressing these open questions requires quantitative modulation of the inputs into the genetic circuit regulating fate choice, and following its dynamics in single cells in real time. Here, we achieve this by transiently expressing fluorescently tagged GATA factors in ESCs carrying live reporters for the Epi and the PrE fate. This allows us to recreate a state of coexpression of Epi and PrE determinants akin to the state of ICM cells in the embryo, and to follow the resolution of this state in real time. We find that cells rapidly exit the co-expression state towards one of two mutually exclusive states, i.e. the system is bistable. PrElike differentiation occurs in cells exposed to GATA factor levels above a threshold, and the function of FGF/MAPK signaling is to set this threshold dose. This provides a mechanism through which both transcription factor activity and signaling can tune the proportions of cells with specific fates. Recapitulating the

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dynamic behavior of the circuit *in silico* only requires mutual repression between the transcriptional networks underlying the Epi and the PrE fates without any positive feedback loops, and a single repressive input of MAPK signaling on the Epi-specific program. This data-based model for the Epi-versus-PrE fate decision, much simpler than previously proposed models, will serve as a basis to guide further experimental and theoretical exploration of this crucial fate decision of mammalian embryogenesis. Furthermore, our finding that FGF/MAPK signaling can balance the proportions of alternative fates in cell populations by setting the response threshold of a regulatory network to a transcription factor input is a novel principle for this signaling pathway which might be relevant in developing tissues beyond the ICM.

RESULTS

An ESC model system to investigate PrE-like fate choice in culture

To model in culture the transition from GATA6/NANOG coexpression to mutually exclusive expression of Epi and PrE markers that characterizes the Epi-versus-PrE fate decision (Plusa et al., 2008), we used a doxycycline-inducible system to transiently express GATA6-FLAG in ESCs (Beard et al., 2006; Mulvey et al., 2015; Wamaitha et al., 2015) (Fig. 1A). Individual cells coexpressed inducible GATA6-FLAG and endogenous NANOG protein after a 6 h doxycycline pulse (Fig. 1B). Twenty-four hours after doxycycline removal, the cells had degraded the exogenous GATA6-FLAG, but a subset now stained positive for the endogenous PrE marker GATA4 (Fig. 1C). Virtually all GATA4positive cells were negative for NANOG staining, suggesting that following GATA6/NANOG co-expression, ESCs transition to one of two mutually exclusive states, marked by the expression of Epi and PrE markers, respectively. This is similar to the behavior of ICM cells, and suggests that a previously reported stable state of coexpression of NANOG and endogenous GATA factors (Bessonnard et al., 2014) is not accessible in our system.

Consistent with previous studies (Fujikura et al., 2002; Mulvey et al., 2015; Shimosato et al., 2007), we found that transient expression of doxycycline-inducible GATA4-FLAG instead of GATA6-FLAG led to the same expression pattern of endogenous GATA factors, but doubled the proportion of differentiating cells (Fig. 1D-F, Fig. S1). This led us to induce PrE-like differentiation with GATA4 and to use endogenous GATA6 expression to monitor the differentiation event in all following experiments. Furthermore, we tagged the inducible GATA4 protein with an mCherry fluorescent protein. This did not compromise the activity of the fusion protein to induce PrE-like differentiation (Fig. S2), and allowed us to follow the heterogeneous expression of the doxycycline-induced transgene in individual live cells.

ESC culture conditions affect the expression of endogenous PrE markers following a GATA4-mCherry pulse

For an induced transcription factor to trigger a specific differentiation program, this program needs to be molecularly accessible. We therefore set out to determine culture conditions for which transient GATA4-mCherry expression led to efficient expression of endogenous GATA6. In the presence of feeders and 15% serum, a 6 h pulse of GATA4-mCherry expression resulted in ~10% GATA6-positive cells 24 h later. This proportion dropped to ~1.5% GATA6-positive cells when cells were cultured without feeders in 10% serum (Fig. S3A,B), even though GATA4-mCherry was efficiently induced in both conditions (Fig. S3C) and cells were positive for the pluripotency marker NANOG (Fig. S3A). Next, we pre-cultured cells

in 2i+leukemia inhibitory factor (LIF), a condition reported to promote extraembryonic differentiation potential (Morgani et al., 2013), before simultaneous addition of doxycycline and transfer into serum-containing medium. This increased the proportion of GATA6-positive cells induced by a 6 h doxycycline pulse from 11.3±1.8% (mean±s.d.) for 1 day of pre-culture in 2i+LIF to 51.7±9.8% for 7 days of pre-culture (Fig. 2A-C). Because the duration of the preculture in 2i+LIF also affected the levels of GATA4-mCherry expression induced by doxycycline (Fig. S4A), we determined the ratio between the fraction of GATA6-positive cells one day after a 6 h doxycycline pulse and the fraction of GATA4-mCherry-positive cells immediately after the pulse as a measure for the efficiency of PrE-like differentiation. This ratio plateaus at ~55% after 3 days of pre-culture in 2i+LIF (Fig. 2C).

To assess the influence of the components of 2i+LIF, we removed each of them from the complete 2i+LIF medium or added them individually to serum-containing medium during 3 days of preculture. All conditions led to an increase in the percentage of GATA6-positive cells 24 h after a 6 h doxycycline pulse, albeit to different degrees (Fig. 2D-F). The largest proportion of GATA6-positive cells was obtained for pre-culture in serum, LIF and the MEK inhibitor PD0325901 (PD03) (Fig. 2F, Fig. S4B). We conclude that inhibition of MAPK signaling prior to the induced expression of GATA factors efficiently restores PrE-like differentiation potential in ESCs. For all following experiments, we therefore pre-cultured cells for 3 days in the presence of PD03 in medium containing serum and LIF.

Transient expression of exogenous GATA4-mCherry induces stable PrE-like differentiation

Having established an experimental regime which induced PrE-like differentiation in ESCs with an efficiency mimicking PrE differentiation in the embryo (Schrode et al., 2014), we next wanted to investigate the stability of the GATA6-positive state and the dynamics with which it evolved. To this end we created a Gata6:H2B-Venus transcriptional reporter (Freyer et al., 2015) in cells carrying the inducible GATA4-mCherry transgene, which faithfully recapitulated GATA6 protein expression between one and three days after the doxycycline pulse (Fig. 3A,B; Fig. S5). Transient GATA4-mCherry expression led to a characteristic bimodal distribution of Gata6:H2B-Venus expression (Fig. 3C). Venus expression levels of cells in the Venushigh peak were constant between 32 h and 80 h after the end of a 6 h doxycycline pulse (Fig. 3C,D). Furthermore, whereas cells with intermediate Venus levels progressively disappeared from the distribution (Fig. 3C), cells sorted for highest Venus expression levels maintained their fluorescence intensity over several cell divisions for 48 h (Fig. 3E). Together, these findings indicate that strong reporter expression marks a stable state in individual cells, and suggests that the decrease in the proportion of Venushigh cells is mainly a result of reduced proliferation of the Venushigh cells compared with the Venus low cells, although we cannot rule out that undifferentiated cells induce reversion of Venus-positive cells in unsorted populations. Finally, to follow the dynamics of Gata6:H2B-Venus expression over time in individual cells, we performed time-lapse microscopy and tracking of reporter cells (Movie 1). Clustering of traces according to H2B-Venus expression levels identified two distinct classes of cells (Fig. 3F, Fig. S6). Expression traces corresponding to these two classes were separated throughout the experiment. Whereas some cells with intermediate Venus levels reverted to a Venus-negative state, consistent with the depletion of this population that we had observed by flow cytometry, cells with

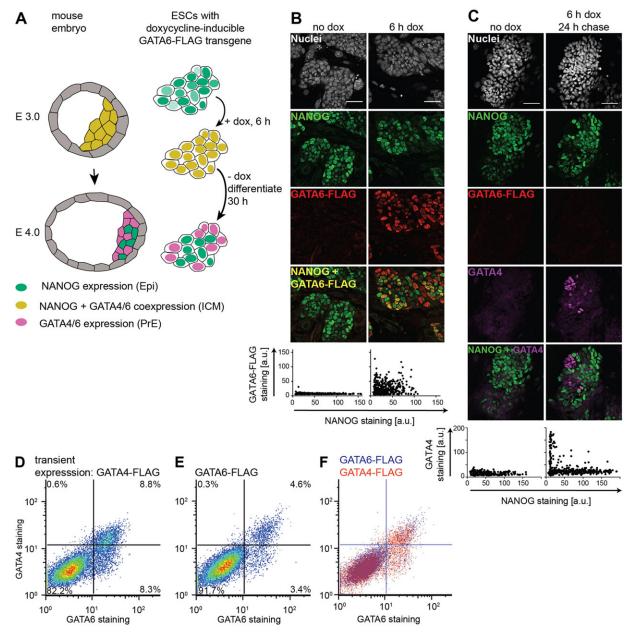


Fig. 1. Expression of endogenous markers of PrE-like differentiation following transient expression of GATA6-FLAG and GATA4-FLAG.

(A) Experimental approach. Doxycycline-induced transgene expression creates a GATA6/NANOG co-expression state in ESCs similar to the situation in the ICM, from which cells can embark on PrE-like differentiation, or return to the NANOG-positive state. (B) Immunostaining (upper panel) and quantification (lower panel) of untreated (left) or doxycycline-treated (right) inducible ESCs indicates co-expression of NANOG and GATA6-FLAG in individual cells after 6 h of doxycycline treatment. Co-expression is limited because of heterogeneous NANOG and GATA6-FLAG expression in the presence of serum and feeders.

(C) Immunostaining (upper panels) and quantification (lower panels) of NANOG and GATA4 expression 24 h after the end of a 6 h doxycycline pulse. GATA4 expression depends on doxycycline treatment, and is mutually exclusive with NANOG expression. (D-F) Flow cytometry of cells immunostained for endogenous GATA4 and GATA6 one day after transient GATA4-FLAG (D) or GATA6-FLAG (E) expression. (F) Overlay of D and E. Scale bars: 50 µm.

highest Venus expression remained in this class throughout the experiment (Fig. 3F). These results show that a transient GATA4-mCherry input elicits stable expression of one of two mutually exclusive expression programs, suggesting the system behaves as an irreversible switch with two stable states.

A threshold level of GATA4-mCherry controls PrE-like differentiation

We then asked whether the flipping of the bistable switch that we had identified depended on the expression levels of the doxycycline-induced GATA4-mCherry protein. Varying the duration and levels of GATA4-mCherry exposure by applying doxycycline pulses of different lengths (Fig. S7) smoothly tuned the proportion of Gata6:H2B-Venushigh cells (Fig. 4A,B). Furthermore, we observed more differentiating GATA6-positive cells and fewer undifferentiated NANOG-positive cells in populations that had been sorted for high GATA4-mCherry expression levels immediately after the doxycycline pulse compared with populations sorted for low GATA4-mCherry expression (Fig. 4C,D; Fig. S8). Together, this suggests that GATA4-mCherry expression levels control the proportion of cells undergoing PrE-like differentiation.

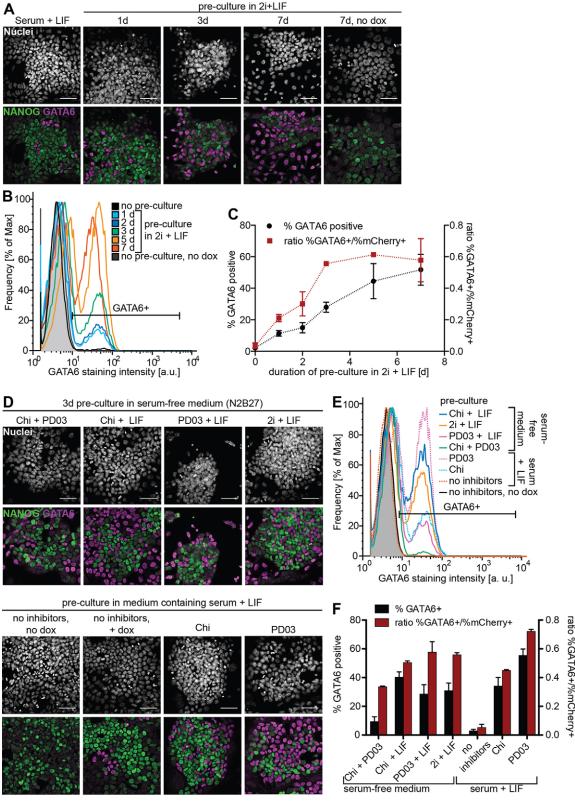


Fig. 2. Culture conditions affect responsiveness to GATA4-mCherry expression. (A) Immunostaining of ESCs cultured for indicated times in 2i+LIF before a 6 h pulse of GATA4-mCherry expression followed by a 24 h chase in medium containing serum+LIF. (B) Flow cytometry of cells treated as in A and stained for GATA6. (C) Percentage of GATA6-positive cells (black) and ratio of the percentages of GATA6-positive and mCherry-positive cells (red) for different durations of pre-culture in 2i+LIF. Data averaged from three (% GATA6-positive) or two (ratios) independent experiments, errors bars state s.d. (D) Immunostaining of ESCs cultured for 3 days in the indicated media before a 6 h pulse of GATA4-mCherry expression followed by a 24 h chase in medium containing serum+LIF. Chi, CHIR99021. (E) Flow cytometry of cells treated as in D stained for GATA6. (F) Average percentage of GATA6-positive cells (black) and ratio of the percentages of GATA6-positive and mCherry-positive cells (red) for different pre-culture media. Data averaged from three (% GATA6-positive) or two (ratios) independent experiments, errors bars indicate s.d. Scale bars: 50 μm.

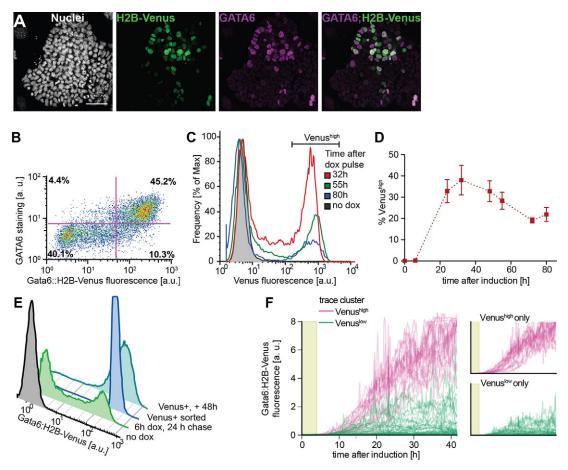


Fig. 3. Transient GATA4-mCherry expression induces stable expression of PrE marker genes. (A) Immunostaining for Venus and GATA6 protein in Gata6:H2B-Venus reporter cells 24 h after a 6 h pulse of doxycycline-induced GATA4-mCherry expression. Scale bar: 50 µm. (B) Flow cytometry of GATA6-reporter cells treated as in A. (C) Flow cytometry detecting Gata6:H2B-Venus expression at indicated time-points after a 6 h pulse of GATA4-mCherry induction. (D) Percentages of Venus^{high} cells at different times after a 6 h doxycycline pulse. Data points represent mean±s.d. from three independent experiments. (E) Flow cytometry of Venus^{high} cells sorted 18 h after the end of a 6 h doxycycline pulse (royal blue), cultured for 48 h and analyzed for Venus expression. (F) Venus fluorescence intensity values of individual GATA6-reporter cells tracked in time-lapse movies during and following a 6 h doxycycline pulse (light green shaded area). Color-code is informed by hierarchical clustering based on Venus expression levels. Small panels on the right show traces for each cluster separately. See also Fig. S6 and Movie 1.

To correlate GATA4-mCherry input levels more precisely with subsequent fate choice in single cells, we performed time-lapse imaging of GATA4-mCherry-inducible cells during and after a doxycycline pulse, followed by immunostaining for NANOG and GATA6 (Movie 2; Fig. S9A,B). We found that most cells with GATA6-positive progeny had experienced higher GATA4mCherry expression levels than cells with NANOG-positive progeny (purple and green datapoints in Fig. 4E,F and in Fig. S9C). We used receiver operating characteristics (ROC) analysis (Fawcett, 2006) (for details see the supplementary materials and methods) to assess how well the two classes of cells could be separated by a threshold value of GATA4-mCherry expression. Plotting the ratio of correctly and incorrectly separated events over the total number of cells (true positive ratio, TPR; false positive ratio, FPR) for varying threshold values gives a characteristic curve for a single time-point (Fig. 4G); the larger the area under this curve (AUC), the better the differentiation outcomes can be separated or predicted from GATA4-mCherry expression levels. The AUC increased quickly upon doxycycline addition and reached a plateau between 0.8 and 0.9 after ~3 h (Fig. 4H). Similar results were obtained when we used cumulative instead of instantaneous GATA4-mCherry expression

measurements (not shown), suggesting that non-systematic measurement errors are not a major limitation of predictive power. The optimal prediction threshold that maximizes the difference between TPR and FPR tracked the expression dynamics of the GATA4-mCherry protein throughout the experiment (black line in Fig. 4E and Fig. S10A,B). Using this threshold, more than 80% of all fate decisions could be correctly predicted based on the GATA4-mCherry classifier (Fig. S10C). This predictability of fate choice by GATA4-mCherry expression levels suggests this transcription factor is a dominant input into the decision in ESCs.

FGF/MAPK signaling modulates the proportion of cells with PrE-like differentiation

In the mouse embryo, both GATA factors and FGF/MAPK signaling are required to establish PrE identity. Having shown above that inhibiting MAPK signaling prior to doxycycline-induced GATA expression increases the proportion of cells with PrE-like differentiation, we next wanted to test how MAPK signaling affected the decision to embark on PrE-like differentiation during and after the GATA pulse. MAPK activity required for PrE-like differentiation was almost completely saturated in serum-free medium, possibly through autocrine FGF signaling (Figs S11, S12), prompting

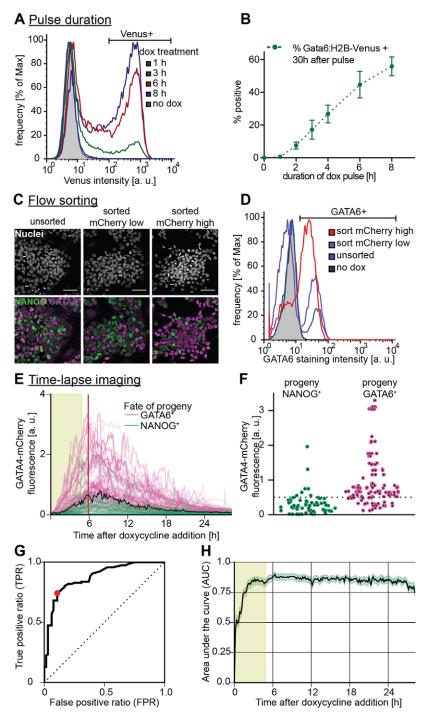


Fig. 4. A GATA4-mCherry threshold dose determines PrElike differentiation. (A) Flow cytometry for Gata6:H2B-Venus fluorescence one day after transient GATA4-mCherry expression triggered by doxycycline pulses of indicated lengths. (B) Quantitative analysis of results from A. Data points show mean±s.d. from three independent experiments. (C) Cells sorted for low (middle) and high (right) GATA4mCherry expression levels after a 6 h doxycycline pulse and immunostained 30 h after re-plating. Unsorted control is on the left. Scale bar: 50 µm. (D) Flow cytometry of cells treated as in C stained for GATA6 expression. Purification increases the proportion of differentiating cells in both sorted pools compared with the unsorted control, and a larger proportion of GATA4mCherryhigh cells activate GATA6 expression compared with GATA4-mCherry low cells. (E) GATA4-mCherry fluorescence traces of cells filmed during and after a 6 h doxycycline pulse. Color-code of individual traces is informed by immunostaining for NANOG and GATA6 at the end of the time-lapse. Area shaded in light green indicates duration of doxycycline pulse, red bar indicates time point analyzed in F,G, and black curve indicates optimal threshold calculated by ROC. See also Movie 2 and Fig. S9. (F) GATA4-mCherry fluorescence intensity of cells from the experiment shown in E at a single time-point (red vertical line in E). Optimal threshold to predict fate choice estimated by ROC analysis is indicated by a black dotted line. (G) ROC curve for the time-point shown in F. The optimal threshold maximizing the difference between the true positive and false positive prediction rate (TPR and FPR) is indicated by a red dot. (H) Area under the curve (AUC) values from ROC analysis in all time frames of the experiment shown in E. Error margin indicates s.d. determined by bootstrapping

us to tune the levels of Erk phosphorylation following removal of the pre-culture medium with subsaturating doses of PD03 (Fig. 5A). Partial inhibition of MAPK signaling during the 6 h doxycycline pulse and the 24 h chase period reduced the fraction of GATA6-positive cells, but not the expression levels of GATA6 in individual differentiated cells (Fig. 5B,C), with a quasi-linear relationship between the level of Erk phosphorylation and the percentage of differentiating cells (Fig. 5D). We obtained similar results using the FGF receptor inhibitor PD173074 (Fig. S12), indicating that most of the MAPK activity relevant for PrE-like differentiation of ESCs is triggered by FGF ligands, consistent with literature reports (Kunath et al., 2007). FGF/MAPK signaling levels therefore control the fraction of cells that embark on the PrE-like differentiation path.

To investigate how partial MEK inhibition affected the GATA4-mCherry threshold required for PrE-like differentiation, we performed time-lapse imaging and cell tracking for maximal and reduced MAPK signaling in parallel (Fig. 5E,F), using a PD03 concentration that led to a significant reduction of the number of differentiating cells without inducing cell death (Movie 3). ROC analysis gave similar AUC values for both conditions, indicating that differentiation can be predicted based on GATA4-mCherry expression levels with similar confidence at different signaling levels (Fig. 5G). However, the optimal prediction threshold was consistently increased upon partial MEK inhibition (Fig. 5F,H). We conclude that MAPK signaling levels set the GATA4-mCherry threshold dose required to trigger differentiation.

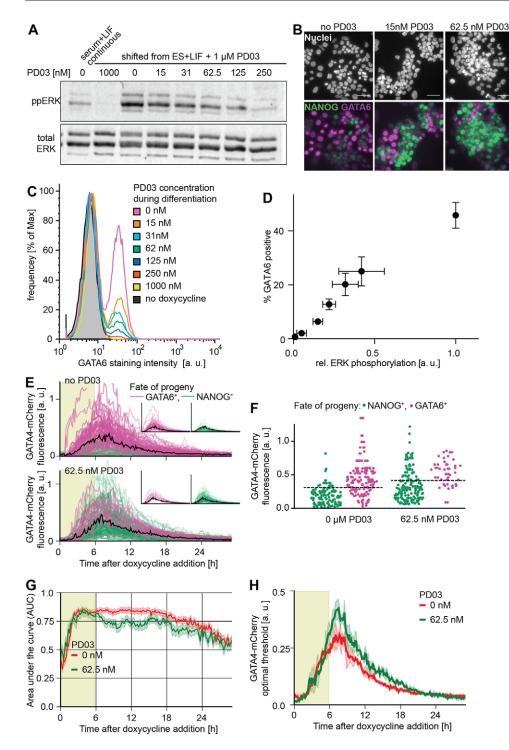


Fig. 5. MAPK signaling controls the proportion of cells with PrE-like differentiation. (A) Immunoblot detecting phosphorylated ERK (top) and total ERK (bottom) in cells grown for 3 days in the presence of serum and 1 µM PD03 1 h after transfer into medium containing indicated concentrations of PD03. (B) Immunostaining of ESCs after a 6 h pulse of doxycycline-induced GATA4mCherry expression and 24 h of differentiation in the indicated concentrations of PD03. Scale bars: 50 µm. (C) Flow cytometry of GATA6 expression in cells treated as in B. (D) Plot of relative Erk phosphorylation levels versus percentage of GATA6-positive cells for different concentrations of PD03. Data points show mean±s.d. from three independent experiments per condition. (E) GATA4-mCherry fluorescence traces of cells filmed during and after a 6 h doxycycline pulse in the absence of PD03 (top) or with 62.5 nM PD03 (bottom). Color-code of individual traces is informed by immunostaining for NANOG and GATA6 at the end of the time-lapse. Light green shaded area indicates presence of doxycycline, black trace indicates optimal threshold estimated by ROC, and insets show traces for cells with GATA6- and NANOG-positive progeny separately. (F) GATA4-mCherry fluorescence intensity of cells from the experiment shown in E at a single time-point 1 h after removal of doxycycline in the absence of PD03 (left) and in 62.5 nM PD03 (right). (G) AUC values determined by ROC analysis of the dataset shown in E for no PD03 (red) and 62.5 nM PD03 (green). AUC values decay after ~20 h as a result of the very low levels of GATA4-mCherry expression at the end of this experiment. Error margin indicates s.d. determined by bootstrapping (n=1000). (H) The optimal threshold to predict differentiation from GATA4-mCherry expression in the absence of PD03 (red) and in the presence of 62.5 nM PD03 (green) increases with decreasing MAPK signaling. Error margins indicate s.d. determined by bootstrapping (n=1000)

We noticed that the distribution of GATA4-mCherry expression levels in differentiating and non-differentiating cells changed upon partial inhibition of signaling (Fig. 5E,F). In addition to setting the transcription factor threshold dose, partial MEK inhibition therefore appears to modulate heterogeneities in the population that affect PrE-like differentiation.

A simple mutual repression circuit recapitulates the experimentally observed gene expression dynamics

To gain insights into the formal nature of the interactions between signaling and transcriptional regulators, we then sought to identify the minimal circuit model of the components of the decision machinery that would recapitulate our data. The irreversible, switch-like behavior of our system indicates the presence of positive feedback in the underlying genetic network. Because NANOG directly represses *Gata6* (Singh et al., 2007), and GATA expression led to rapid repression of NANOG expression in our system, we chose a network of two mutually repressive nodes, GATA and NANOG, as a minimal system with net positive feedback to formalize a bistable genetic switch (Cherry and Adler, 2000; Plahte et al., 1995; Snoussi, 1998; Thomas, 1981) (Fig. 6A; see supplementary materials and methods for a detailed description of the model). This system is described by two coupled ordinary differential equations that account for the dynamics of NANOG (*N*)

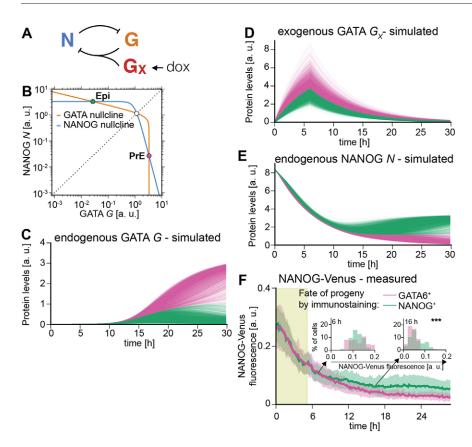


Fig. 6. A simple mutual repression circuit recapitulates experimentally observed expression dynamics. (A) Connectivity of the mutual repression circuit used in dynamic simulations. (B) Phase portrait depicting the autonomous dynamics of the system in A. Intersections of the NANOG nullcline (blue) and the GATA nullcline (orange) define three steady states, two of which are stable and correspond to the NANOGhigh GATAlow Epi state (green dot) or the NANOGlow, $\mathsf{GATA}^\mathsf{high}$ PrE state (purple). (C-E) Simulated time traces of endogenous GATA G (C), exogenous GATA4mCherry G_X (D), and NANOG N expression (E). Color code is informed by final GATA expression levels in C (GATAhigh, purple; GATAlow, green), and corresponding traces have same color in C, D and E. (F) Average NANOG-Venus expression levels in cells carrying a NANOG-Venus translational reporter during and after 6 h of doxycycline-induced GATA4-mCherry expression. Cells were classified as GATA6-positive and NANOG-positive by immunostaining after the timelapse. Presence of doxycycline is indicated by light green shading. Purple and green lines and shaded areas indicate mean NANOG-Venus fluorescence levels±s.d. Insets show histograms for distributions of NANOG-Venus fluorescence in the two classes of cells at 6 h and 16 h after the start of recording; ***P≤0.0001 (Mann-Whitney U-test). See also Movie 4.

and endogenous GATA (G) as markers for the Epi and PrE programs in individual cells, respectively:

$$\frac{dN}{dt} = \frac{\alpha_N}{1 + (G + G_X)^p} - \lambda_N N,\tag{1}$$

$$\frac{dG}{dt} = \frac{\alpha_G}{1 + (N)^q} - \lambda_G G. \tag{2}$$

A third equation models the externally supplied pulse of GATA (G_X) that drives the endogenous circuit:

$$\frac{dG_X}{dt} = D\pi_T(t) - \lambda_G G_X. \tag{3}$$

To reflect the experimentally observed heterogeneous expression of exogenous GATA factors, we varied the maximum transcription rate D of exogenous GATA between cells (for details see the supplementary materials and methods). This was the only source of cell-to-cell variability in our model. As initial conditions, we endowed cells with high levels of NANOG and no GATA to reflect pre-culturing in the presence of PD03.

To assess the dynamics of the endogenous circuit described by this model we plotted the nullclines dG/dt=0 and dN/dt=0 for the specific set of parameters used. Two of the three equilibrium states defined by the intersections of the nullclines are stable and correspond to the fully differentiated GATA-positive and the undifferentiated NANOG-positive state, respectively (Fig. 6B). A boundary in the phase space (dashed line in Fig. 6B) separates the combinations of GATA and NANOG levels which will evolve into the fully differentiated GATA-positive state from those that lead to the undifferentiated NANOG-positive state. To induce PrE-like differentiation, the exogenous GATA input has to exceed the threshold required to move cells across this boundary by sufficiently

repressing NANOG and allowing for endogenous GATA expression. For the chosen parameter set, simulated time traces of individual cells closely resembled the experimentally observed expression dynamics of the endogenous *Gata6* gene (Fig. 6C, compare with Fig. 3F), and exogenous GATA4-mCherry (Fig. 6D, compare with Fig. 4E), suggesting this simple mutual repression circuit is sufficient to capture essential dynamics of the experimental system.

To further test the model, we compared the dynamics of NANOG expression *in silico* and *in vivo*. In model simulations, NANOG expression levels first decreased rapidly in all cells from the initial conditions chosen to represent the effects of the pre-culture regime towards lower steady state levels, before differences in NANOG expression levels in differentiating and non-differentiating cells became apparent (Fig. 6E). To monitor NANOG expression dynamics experimentally, we integrated a previously described NANOG-Venus translational fusion reporter (Filipczyk et al., 2013) into the inducible cell line. Following transient GATA4-mCherry expression, this reporter showed expression dynamics that were in close agreement with the model simulations, further supporting the idea that a simple mutual repression circuit is sufficient to capture the dynamics of the system.

Inhibition of the Epi program by MAPK signaling controls the proportion of cells with PrE-like differentiation

To pinpoint the main mechanism by which FGF/MAPK signaling controls the fraction of cells with PrE-like differentiation, we considered two simple extensions of the model, one in which FGF/MAPK signaling promotes expression of the PrE program (Fig. 7A), and an alternative model in which signaling inhibits the Epi program (Fig. 7B). In both cases a reduction of signaling led to a simulated increase in the number of cells in the NANOG-positive peak and a decrease of cells in the GATA-positive peak (Fig. 7A,B, middle). However, expression levels in the respective positive peaks changed

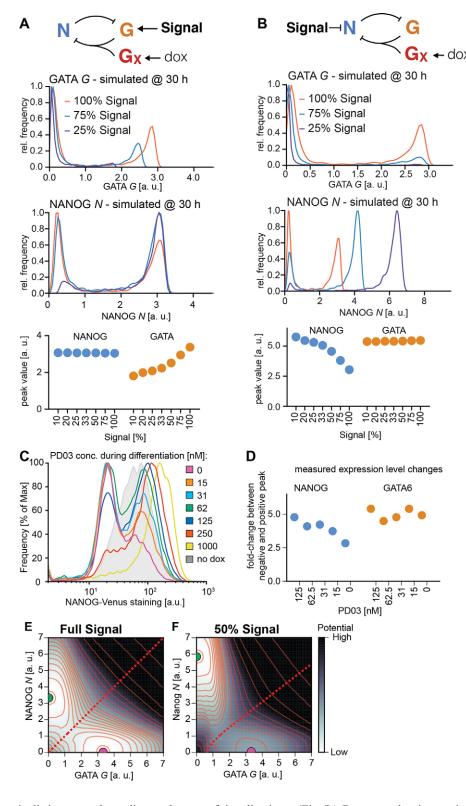


Fig. 7. MAPK signaling controls the proportion of PrE-like cells through inhibition of the Epi program. (A,B) Top panels: modes of signaling interactions tested in the model. (A) Signaling promotes GATA production; (B) signaling inhibits NANOG production. Middle panels: simulated histograms for GATA and NANOG expression at varying signaling levels (*t*=30 h; *n*=2000). Bottom panels: location of high peaks in the above histograms. (C) Flow cytometry of NANOG-Venus reporter cells stained with antibodies directed against the Venus tag 30 h after a 6 h doxycycline pulse. This method detected a bimodal distribution of NANOG-Venus-positive and -negative cells with a higher signal-to-noise ratio than direct staining for NANOG. Traces are smoothened to show positions of peaks more clearly. (D) Fold-change of the NANOG-Venus-positive (blue) and GATA6-positive (orange) peaks relative to the respective negative peaks estimated from the flow cytometry experiments in C (NANOG-Venus) and Fig. 5C (GATA6) for different concentrations of PD03. See Fig. S13 for details on estimation of peak positions. (E,F) Quasi-potentials derived from the autonomous dynamics of the system in B for two signaling levels. Darker regions have higher potential, i.e. faster dynamic changes. The dashed red line indicates the separatrix (ridge) separating the basins of attraction of the NANOGhigh, GATAlow Epi fate (green dot) and the NANOG $^{\text{low}}$, $\text{GATA}^{\text{high}}$ PrE fate (purple dot). Lowered signaling (F) shifts and bends the separatrix, thereby changing the relative sizes of the two basins of attraction.

in distinct ways depending on the type of signaling input (Fig. 7A,B, middle and bottom). Estimating changes in GATA6 and NANOG expression levels upon partial MEK inhibition from flow cytometry data showed that GATA6 expression levels in individual cells remained approximately constant in the presence of different doses of PD03, whereas the NANOG-Venus positive peak consistently shifted to higher expression levels with lowered signaling (Fig. 7C,D; Fig. S13). While not ruling out a more

complex integration of FGF/MAPK signaling into the regulatory circuit underlying PrE-like differentiation, these results suggest that a major route by which FGF/MAPK signaling controls the fraction of cells with PrE-like differentiation is through inhibition of the Epispecific gene expression program. This conclusion is further supported by a recent report showing direct inhibition of NANOG expression by FGF/MAPK signaling mediated by chromatin modifications (Hamilton and Brickman, 2014).

Finally, we sought to develop a visual representation of the system's dynamics in different signaling regimes by estimating the path-integral quasi-potential surfaces (Bhattacharya et al., 2011) of the system for two different signaling levels (Fig. 7E,F). This representation highlights two basins of attraction corresponding to the NANOG-positive state and the GATA-positive state, respectively. A reduction in signaling bends the ridge that separates the basins towards the GATA-positive state, making its basin of attraction narrower and shallower relative to that of the NANOG-positive state (Fig. 7E,F).

We conclude that a simple mutual repression circuit is sufficient to capture the dynamic hallmarks of the Epi-versus-PrE fate decision, and that through repression of the Epi program, FGF/MAPK signaling sets the relative sizes of the basins of attraction corresponding to the two fates defined by this circuit, allowing signaling to regulate the proportions of cells adopting either fate.

DISCUSSION

Here we have used engineered mouse ESC lines to study the mechanism underlying the decision between the Epi and the PrE fate. Our experimental system allowed us to modulate and measure quantitatively the transcription factor and signaling inputs into the decision, and to follow the dynamics of the decision at the level of single cells. We have uncovered two successive functions of MAPK signaling in the ESC system. Before the induced expression of GATA factors, inhibition of MAPK signaling is required to make the PrElike differentiation program accessible in ESCs. Once exogenous GATA factors are expressed, MAPK signaling is required to execute the decision of PrE-like differentiation. The Epi-versus-PrE differentiation event displays hallmarks of an irreversible bistable switch, as co-expression of determinants of the Epi and the PrE fate resolves into one of two mutually exclusive stable states characterized by NANOG and GATA expression, respectively. We detect a welldefined threshold level of exogenous GATA factor expression required to flip this switch and induce differentiation, and find that MAPK signaling sets this threshold dose. This decision is therefore a strongly regulated process that is largely determined by few welldefined transcriptional and signaling inputs.

The accessibility of the PrE program depends on ESC culture conditions

We find that cells cultured in the presence of serum are refractory to PrE-like differentiation upon induced GATA expression, but responsiveness to doxycycline-induced GATA factors can be restored by extended exposure to GSK3 or MEK inhibitors, e.g. in 2i medium. One interpretation of this finding is that ESCs cultured in serum are strongly biased towards embryonic fates, and as a consequence have blocked the PrE-like differentiation program. In line with this idea, ESCs grown in the presence of serum display higher levels of repressive chromatin marks on a subset of promoters, including the Gata6 promoter, than cells grown in 2i+LIF (Marks et al., 2012). Furthermore, the transcriptome of ICM cells resembles more closely that of ESCs cultured in 2i medium than that of ESCs cultured in serum (Boroviak et al., 2014). This suggests that pre-culture in 2i brings ESCs to a molecular state mirroring that of early ICM cells, from which, upon induced GATA expression, the decision between the Epi and the PrE fate can be taken similarly to the situation in the embryo.

Extraembryonic fate choice is determined by the output of a simple mutual repression circuit

Our finding that precise measurements of GATA4-mCherry expression levels allow prediction of fate decisions in individual

ESCs with high confidence before endogenous fate markers appear led us to formulate a minimal genetic circuit model with deterministic regulation to formalize the mechanism of the decision process. Our model solely consists of mutually repressive interactions between the Epi- and the PrE-like program, modulated by a repressive input of FGF/MAPK on the Epi program (Fig. 7B). This is sufficient to recapitulate the experimentally observed dynamics of lineage marker expression, to model bistable behavior, and to formalize our finding that the role of MAPK signaling is to set a GATA threshold required for PrE-like differentiation. Our minimal model is a subnetwork of a more complex model for the Epi-versus-PrE fate decision recently developed by Bessonnard et al. (2014). Bessonnard's model posits an additional positive input of FGF/MAPK signaling onto GATA expression, and contains positive autoregulatory feedback loops centered on both NANOG and GATA, which endow the dynamic system with a third stable state of NANOG and GATA coexpression. This allowed Bessonnard et al. to simulate both the establishment and the resolution of the co-expression state in a single model. Focusing on the resolution of the co-expression state, our data suggest that the additional links of Bessonnard's model are not required to explain the dynamics of this phase of the decision. It remains, however, possible that positive autoregulation of the Epi and PrE programs and a positive input of FGF/MAPK signaling on GATA expression fine-tune the response of cells during this stage of the decision process.

We note that not all cells abide by the GATA4-mCherry threshold that best predicts PrE-like differentiation. This might reflect persistent heterogeneous chromatin configurations that block PrE-like differentiation in individual cells, or be a consequence of heterogeneous MAPK signaling among ESCs. Signaling heterogeneities have been detected in other cell lines (Albeck et al., 2013; Aoki et al., 2013), and we expect they will be functionally relevant for PrE-like differentiation of ESCs.

Integration of signaling into the mutual repression circuit serves to balance proportions of cell fates in developing tissues

The mathematical model of a mutual repression circuit has previously been applied to describe the dynamics of the switch between the lysogenic and lytic phases of the lifecycle of bacteriophage lambda (Ptashne, 2004), and a genetically engineered toggle switch circuit in Escherichia coli (Gardner et al., 2000). Our work is one of the first experimentally supported examples demonstrating that this network can be used to formalize the decision between two fates during mammalian development. Extending the model with a signaling input allows for dynamic control of the sizes of the basins of attraction corresponding to the different states of the bistable system. The mammalian preimplantation embryo might harness this property to balance the proportion of Epi and PrE cells. The initial expression of transcriptional regulators driving lineage choice is stochastic, possibly as a consequence of the mechanisms that control gene expression in the early embryo (Dietrich and Hiiragi, 2007; Ohnishi et al., 2014). The resulting heterogeneous distributions of transcription factor concentrations will bias ICM cells towards specific fates (Xenopoulos et al., 2015). It has been shown that lineage commitment occurs non-synchronously in the cells of the ICM, and that the first cells to commit are fated towards the epiblast (Grabarek et al., 2012). Because Epi cells produce FGF4 (Frankenberg et al., 2011; Nichols et al., 1998), FGF4 levels will reflect the number of Epi-committed cells and act on the as yet

uncommitted cells. By modulating the bistable switch operating in these cells, this process might ultimately place the appropriate number of uncommitted cells in the basin of attraction corresponding to the PrE fate. FGF/MAPK signaling might thus acts as a feedback mechanism to balance proportions of two distinct cell fates in populations (Lander et al., 2009). It will be interesting to see whether this new principle applies to differentiation decisions beyond those in the preimplantation embryo.

MATERIALS AND METHODS

ESC culture and genetic manipulation

For genetic engineering, ESCs were grown on mitotically inactivated mouse embryonic fibroblasts in Knockout DMEM (Gibco) supplemented with 15% fetal bovine serum (FBS), 50 μ M β -mercaptoethanol, glutamax, non-essential amino acids and 1 μ g/ml LIF. After line derivation, feeders were removed by serial passaging, and cells were maintained on gelatin-coated dishes in GMEM-based medium supplemented with 10% FBS, sodium pyruvate, 50 μ M β -mercaptoethanol, glutamax, non-essential amino acids and LIF.

Serum-free media were based on N2B27 (NDiff 227, Stem Cells) and supplemented with 3 μ M CHIR99021, 1 μ M PD0325901 and 1 μ g/ml LIF to give 2i+LIF. For the experiments described in Fig. S11, N2B27 was supplemented with 10 ng/ml BMP4 (R&D), 1 μ g/ml LIF and 1 μ g/ml heparin.

All cell lines used in this study were based on the KH2 ESC line (Beard et al., 2006). Engineering of ESCs is described in more detail in the supplementary materials and methods. Transgene expression was induced by adding 500 ng/ml doxycycline to the culture medium.

Immunocytochemistry

Cells for immunocytochemistry were grown on ibidi μ -slides and stained as described in Kalmar et al. (2009). Primary antibodies were anti-NANOG (1:200; eBiosciences, 14-5761), anti-FLAG (1:1000; Sigma M2, F3165), anti-GATA6 (1:200; R&D, AF1700) and anti-GATA4 (1:200; Santa Cruz, sc-9053). Detection was performed using Alexa Fluor-conjugated secondary antibodies at 4 μ g/ml (Molecular Probes). Nuclei were visualized using Hoechst 33342 dye at 100 μ g/ml (Molecular Probes, H1399). Cells were imaged on a Zeiss LSM700 confocal microscope with a 40× oil immersion lens (NA 1.3).

Flow cytometry

Cells for flow cytometry were trypsinized and either analyzed immediately or fixed for 15 min in 3% PFA/PBS. Intracellular antigens were stained in suspension using the same primary and secondary antibodies as used for immunostaining. mCherry fluorescence was measured on a BD Fortessa Flow cytometer, all other flow cytometric analysis was performed using a Beckman Coulter CyAn ADP analyzer. Cell sorting was done on a Beckman Coulter MoFlo. To estimate peak positions, histograms were smoothened, followed by detection of local maxima with custom-written Python scripts.

Immunoblotting

For immunoblotting, cells were lysed in RIPA buffer and lysates were separated on polyacrylamide gels before transfer to nitrocellulose membranes. Antibodies used were anti-ppErk (Sigma, M9692) and anti-Erk1/2 (Millipore, 06-182) at 1:500 dilution. Detection was performed using fluorescently labeled secondary antibodies at $0.1\,\mu\text{g/ml}$ (LI-COR) and scanning in a LI-COR Odyssey system. Intensities of bands were quantified in ImageStudio (LI-COR).

Time-lapse imaging and cell tracking

Time-lapse imaging was performed in DMEM-based medium without Phenol Red, supplemented as detailed above. We used a Zeiss Axiovert M200 microscope equipped with a SOLA LED light source, an Andor iXON Ultra 888 EMCCD camera and a heated stage with $\rm CO_2$ supply. Hardware was controlled by MicroManager software (Edelstein et al., 2001). Time-lapse movies were acquired using a $\rm 40\times$ long-working distance lens. See the supplementary materials and methods for details on image analysis.

Mathematical modeling

Numerical simulations of the model were implemented in Python language. Parameter values used in the simulations are given in Table S1. For details on the model see the supplementary materials and methods.

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Competing interests

The authors declare no competing or financial interests.

Author contributions

C.S., P.R. and A.M.A. conceived the study; C.S. performed experiments; C.S., P.R. and J.P.M. analyzed the data; P.R. developed the mathematical model; C.S. wrote the manuscript with input from P.R. and A.M.A.; all authors approved the manuscript.

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Supplementary information

Supplementary information available online at http://dev.biologists.org/lookup/suppl/doi:10.1242/dev.127530/-/DC1

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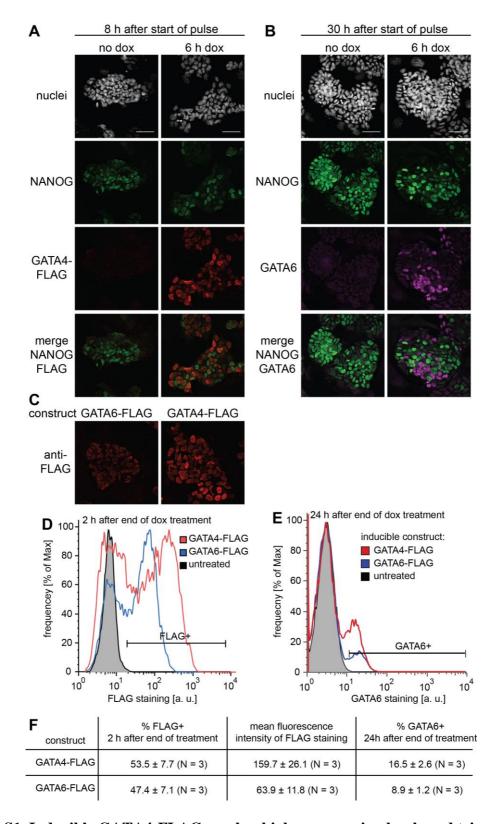


Fig. S1. Inducible GATA4-FLAG reaches higher expression levels and triggers PrE-like differentiation in a larger proportion of cells compared to GATA6-FLAG. (A,B) Immunostaining of ESCs carrying a doxycycline-inducible GATA4-FLAG transgene 2 h (A) or 24 h (B) after 6 h of treatment with doxycycline.

Untreated controls are on the left. Exogenous GATA4-FLAG is co-expressed with NANOG shortly after the treatment, but degraded one day later. Endogenous GATA6 is expressed one day after the treatment in a mutually exclusive pattern with NANOG. Scale bar, 50 µm. (C,D) Comparison of GATA6-FLAG and GATA4-FLAG transgene induction efficiency. Cells were immunostained for FLAG 2 h after a 6 h doxycycline pulse and analysed by confocal microscopy (C) or flow cytometry (D). The percentage of expressing cells is comparable between the two constructs, but GATA4-FLAG is expressed at higher levels in individual cells. One representative clone shown. (E) Flow cytometric analysis of cells immunostained for GATA6 24 h after transient expression of GATA4-FLAG (red) or GATA6-FLAG (blue). Inducible GATA4-FLAG expression triggers endogenous GATA6 expression in a larger proportion of cells compared to inducible GATA6-FLAG expression. One representative clone shown. (F) Quantitation of results from D and E; numbers state mean and standard deviation from three independent clones.

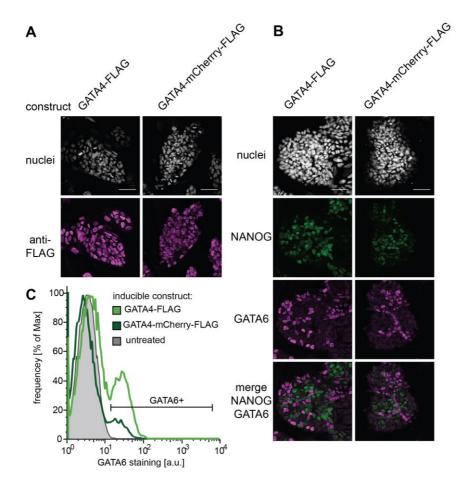


Fig. S2. Transient expression of GATA4-mCherry-FLAG can induce endogenous GATA6 expression. (A) Immunostaining for FLAG in cells expressing GATA4-FLAG (left) or GATA4-mCherry-FLAG (right) following 6 h of doxycycline treatment. Both inducible proteins are expressed in a comparable proportion of cells, but FLAG staining intensity is lower for the mCherry-tagged protein, suggesting lower expression levels in individual cells. (B) Immunostaining for NANOG and GATA6 of cells carrying a doxycycline-inducible GATA4-FLAG (left) or GATA4-mCherry-FLAG (right) transgene 24 h after a 6 h treatment with doxycycline. Scale bars in A, B, 50 μm. (C) Flow cytometric analysis of cells treated as in B stained for GATA6 expression. GATA6 expression levels do not depend on the inducible protein used, but GATA4-mCherry-FLAG induces expression of endogenous GATA6 in a smaller proportion of cells than GATA4-FLAG, possibly as a consequence of lower GATA4-mCherry expression levels in individual cells.

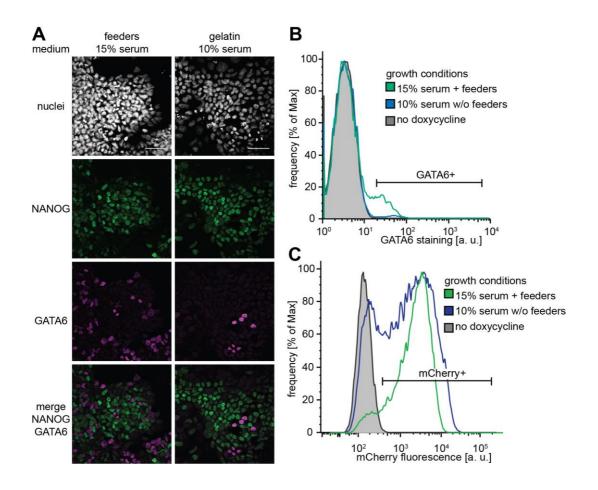


Fig. S3. Removal of feeders and reduction of serum levels reduces the accessibility of the PrE-like differentiation program. (A) Immunostaing of cells carrying an inducible GATA4-mCherry transgene cultured on feeder cells in the presence of 15% serum (left) or in the absence of feeders in 10% serum (right) 24 h after a 6 h doxycycline pulse. Scale bar, 50 μm. (B) Flow cytometric analysis of cells treated as in A and stained for GATA6. The proportion of GATA6-positive cells is severely reduced in the absence of feeders and lowered serum concentrations. (C) Flow cytometric analysis of GATA4-mCherry expression in cells treated as in A 2h after the end of the doxycycline treatment. Both conditions give robust expression of the inducible GATA4-mCherry protein.

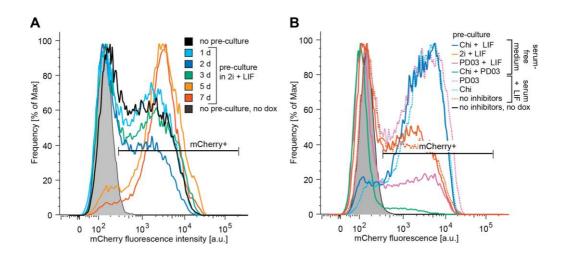


Fig. S4. Pre-culture regimes and –times affect the expression efficiency of the doxycycline-inducible transgene. Cells grown for increasing periods of time in 2i +
LIF medium (A) or cultured for 3 days in the indicated media (B) were changed to
medium containing serum + LIF and doxycycline, followed by flow cytometric
analysis for GATA4-mCherry expression 2 h after the end of a 6 h doxycycline pulse.

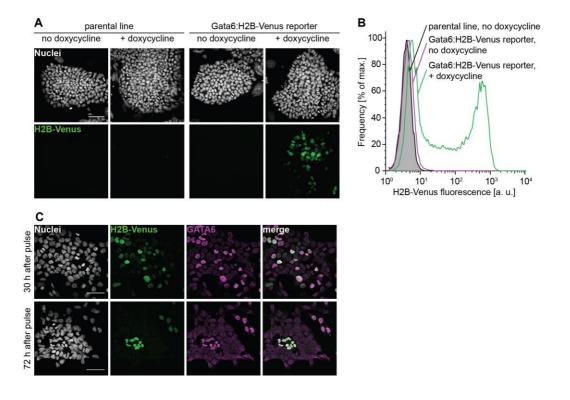


Fig. S5. The Gata6:H2B-Venus reporter is specifically expressed following doxycycline treatment, and recapitulates GATA6 protein expression over several days. (A) Immunostaining for Venus expression in the parental cell line carrying the doxycycline-inducible GATA4-mCherry transgene (left) and the Gata6:H2B-Venus reporter cell line derived from it (right). Cells were either left untreated (left panels for each line), or treated with doxycycline for 6 h, followed by a 24 h chase period (right panel for each line). Scale bar, 50 μm. (B) Flow cytometry of cells treated as in A. Venus expression can only be detected in reporter cells that have been treated with doxycycline. (C) Confocal microscopy of Gata6:H2B-Venus reporter cells immunostained for GATA6 protein 30 h (upper panels) or 72 h (lower panels) after a 6h doxycycline pulse. Correlation between GATA6 and reporter expression in individual cells increases for the 72 h time-point.

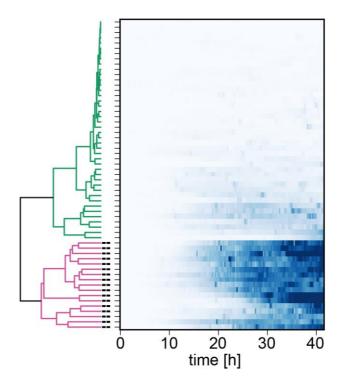


Fig. S6. Hierarchical clustering distinguishes groups of cells with high and low H2B-Venus expression in the Gata6 reporter line. Gata6:H2B-Venus reporter cells were hierarchically clustered according to H2B-Venus fluorescence intensity values recorded during and after a 6 h doxycycline pulse. Dark blue indicates strong fluorescence. This analysis identifies two main groups that markedly differ in their H2B-Venus expression intensity in the second half of the experiment. These two groups are highlighted by different branch colors (green: H2B-Venus^{low}, purple: H2B-Venus^{high}), and inform the color code in Fig. 3G; see also supplementary material Movie 1.

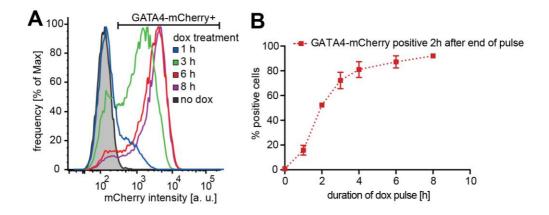


Fig. S7. Titration of GATA4-mCherry exposure by changing doxycycline pulselength. (A) Flow cytometric analysis of GATA4-mCherry expression in cells 2 h after the end of doxycycline pulses of indicated duration. (B) Quantification of results from A. Datapoints represent mean \pm standard deviation from three independent experiments.

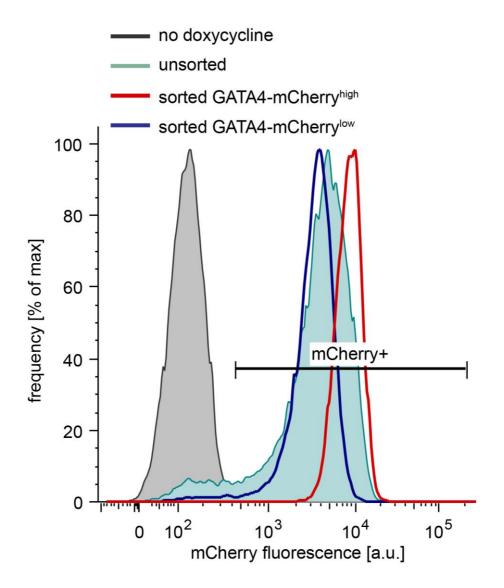


Fig. S8. Separation of GATA4-mCherry^{high} and GATA4-mCherrylow cells by flow cytometry. Cells carrying a doxycycline-inducible GATA4-mCherry transgene were stimulated with doxycycline for 5 h, trypsinised and sorted into two fractions according to mCherry fluorescence intensity. Shows is the post-sort control, where fractions were analyzed on a separate cytometer approx. 2 h after the end of the sort for fluorescence levels and purity. The GATA4-mCherry^{high} population is in red, the GATA4-mCherry^{low} population is in blue, unsorted cells are in shaded in turquoise, and uninduced control is shaded in grey.

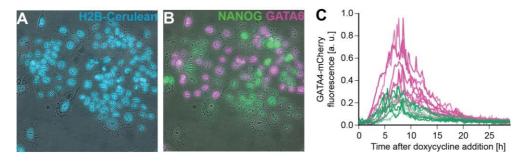


Fig. S9. Immunostaining of filmed cells for correlating GATA4-mCherry expression levels with fate choice. (A) Overlay of brightfield and Cerulean fluorescence (blue) and (B) overlay of brightfield and immunostaining for NANOG (green) and GATA6 (purple) in cells carrying an inducible GATA4-mCherry transgene that had been filmed for 30 h during and after a doxycycline pulse. (C) Individual GATA4-mCherry fluorescence traces recorded from cells shown in supplementary material Movie 2 and panels A, B, color-coded according to staining detected in B. Cells without clear GATA6 or NANOG immunostaining are not shown in C.

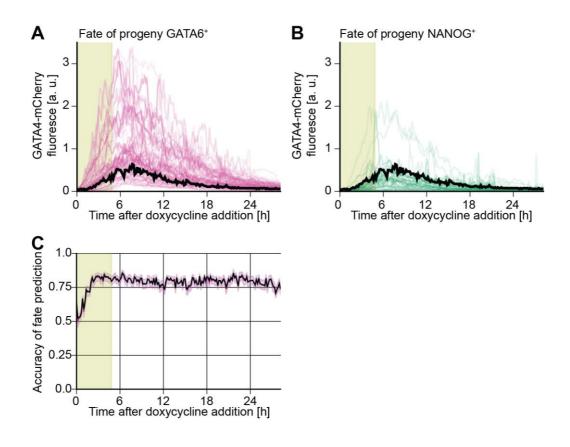


Fig. S10. Identification of an optimal threshold to predict fate choice from GATA4-mCherry expression levels.

(A,B) Fluorescence time traces of individual cells carrying an inducible GATA4-mCherry transgene filmed during and after a 6 h doxycycline pulse. Cells with GATA6-positive progeny are depicted with purple traces in A, cells with NANOG-positive progeny are depicted with green traces in B. The optimal threshold detected by ROC analysis (Fig. 4G) is shown in black. (C) Accuracy of fate prediction using GATA4-mCherry fluorescence and optimal threshold depicted in A, B. Fate choice can be predicted with greater than 80% accuracy approx. 3 h after addition of doxycycline. Area shaded in green indicates presence of doxycycline, area shaded in purple indicates standard deviation determined by bootstrapping.

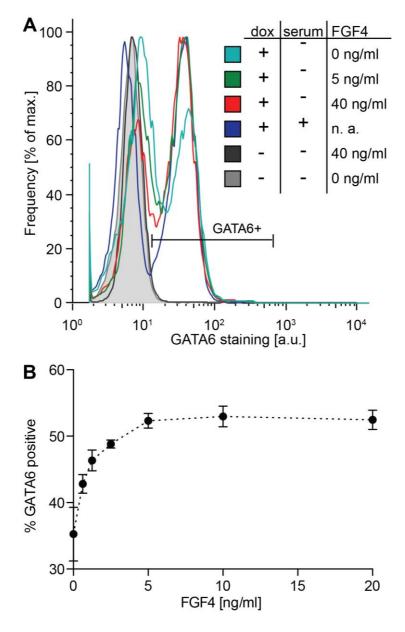


Fig. S11. Signaling in serum-free medium supports PrE-like differentiation.

(A) Flow cytometry of cells stained for GATA6 that had been subjected to a 6 h doxycycline pulse and a 24 h chase period in the indicated media conditions. A large proportion of cells expresses GATA6 following doxycycline-treatment and differentiation in serum-free medium, and this proportion can only moderately be increased by addition of recombinant FGF4. (B) Quantification of results from A. Data points show mean and standard error from two independent experiments. Note that the serum-free medium used in these experiments was supplemented with 1 μg/ml heparin.

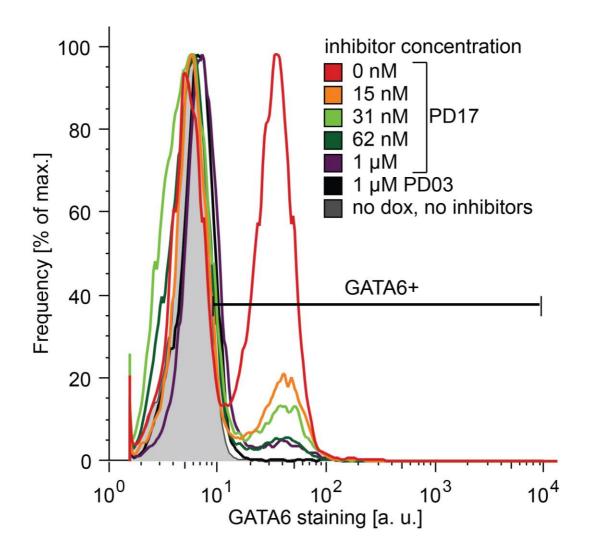


Fig. S12. MAPK signaling required for PrE-like differentiation is mainly triggered through FGF receptors. Flow cytometric analysis of cells stained for GATA6 following a 6 h doxycycline pulse and a 24 h chase period in serum-containing medium with the indicated concentrations of the FGF receptor inhibitor PD17, or the Mek inhibitor PD03. PD17 inhibits most of PrE-like differentiation, indicating that the signaling input required for this differentiation decision is mainly transmitted through FGF receptors.

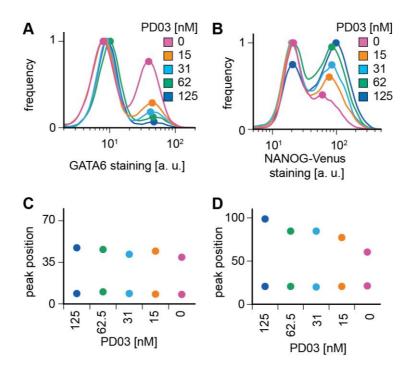


Fig. S13. Estimation of peak positions from flow cytometry data. (A,B)

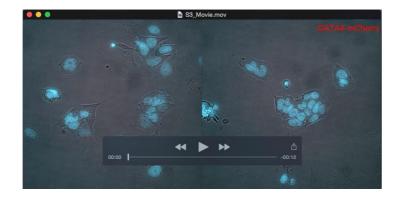
Smoothened flow cytometry data from Fig. 5 C (GATA6 staining, A) and Fig. 7 C (NANOG-Venus staining, B) with peak positions indicated by dots. Histograms were smoothened by transforming each bin of the original data into a gaussian distribution of values around the center of the bin, and peaks were identified as local maxima in the smoothened distributions. (C,D) Peak positions identified in A, B plotted for different PD03 concentrations. The position of the peak with low staining levels comprising of GATA6-negative and NANOG-Venus-negative cells is constant for different PD03-concentrations, whereas the position of the NANOG-Venus-positive, but not the GATA6-positive peak, changes with signaling levels.



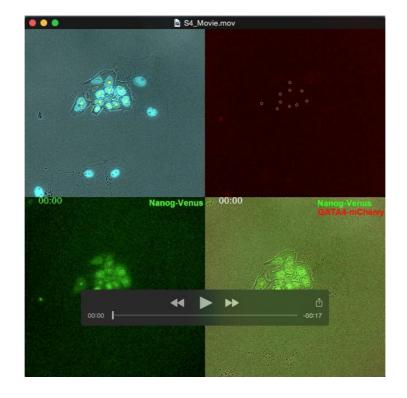
Movie 1. Gata6:H2B-Venus expression dynamics following transient doxycycline treatment. ESCs carrying the inducible GATA4-mCherry transgene, the transcriptional Gata6:H2B-Venus reporter and a randomly integrated H2B-Cerulean transgene under the control of the CAGS promoter were filmed during and after a 6 h doxycycline pulse. Left panel shows overlay of brightfield image and Gata6:H2B-Venus fluorescence, left panel shows overlay of brightfield image and H2B-Cerulean fluorescence. Cell tracking is indicated by yellow circles (Venus channel) or yellow dots (Cerulean channel). See also Fig. 3G, Fig. S6.



Movie 2. Tracking of GATA4-mCherry expression levels following transient doxycycline treatment. ESCs carrying a doxycycline-inducible GATA4-mCherry transgene and a randomly integrated H2B-Cerulean transgene under the control of the CAGS promoter were filmed during and after a 6 h doxycycline pulse. Left panel shows overlay of brightfield image and GATA4-mCherry fluorescence, right panel shows overlay of brightfield image and H2B-Cerulean fluorescence. Cell tracking is indicated by yellow circles (mCherry channel) or yellow dots (Cerulean channel). See also Fig. 4, Fig. S9.



Movie 3. Subsaturating doses of PD03 do not affect cell viability. ESCs carrying a doxycycline-inducible GATA4-mCherry transgene and a randomly integrated H2B-Cerulean transgene under the control of the CAGS promoter were filmed during and after a 6 h doxycycline pulse in the absence of PD03 (left) or in 62.5 nM PD03 (right). Movie shows overlay of brightfield image, H2BCerulean (cyan) and GATA4-mCherry (red) fluorescence. Subsaturating doses of PD03 do not lead to increased cell death.



treatment. Time-lapse movie of ESCs carrying a randomly integrated H2B-Cerulean transgene under the control of the CAGS promoter (blue, upper left, overlay with brighfield image), the inducible GATA4-mCherry transgene (red, upper right), and a Nanog-Venus translational reporter (green, lower left) during and after a 6 h doxycycline pulse. Lower right shows overlay of brightfield, GATA4-mCherry and Nanog-Venus fluorescence; note the widespread co-expression of GATA4-mCherry and Nanog-Venus. Cell tracking is indicated by yellow dots and circles. See also Fig.

6E.

Movie 4. Nanog-Venus expression dynamics following transient doxycycline

Table S1. Parameter values of the model.

Param.	Value	Units	Description
α_{N0}	1 *	adimensional concentration units/h	Maximum NANOG production rate in 0% signaling conditions.
α_{NI}	1/2	adimensional concentration units/h	Increase in the max. NANOG production rate in 100% signaling conditions.
α_{G0}	1/ ₂ *	adimensional concentration units/h	Maximum endogenous GATA production rate in 0% signaling conditions.
α_{GI}	1/2	adimensional concentration units/h	Maximum endogenous GATA production rate in 100% signaling conditions.
λ_N	0.15	1/h	NANOG protein degradation rate.
λ_G	0.15	1/h	GATA protein degradation rate.
p	4	-	Hill coefficient for the inhibition of <i>Nanog</i> by GATA.
q	4	-	Hill coefficient for the inhibition of <i>Gata</i> by NANOG.
σ D	0.25	adimensional concentration units/h	Scale parameter of the lognormal distribution of the maximum production rate of exogenous GATA in the presence of doxycycline.
τ	6	h	Doxycycline pulse duration

^{*}signaling inhibits NANOG production.

^{*}signaling promotes GATA production.

Supplementary Materials and Methods

Generation of engineered ESC lines

Inducible transgenes were integrated into the KH2 cell line as described (Beard et al., 2006). The *Gata6* reporter cell line was generated using knock-out first targeting arms of the EUCOMM project (Skarnes et al., 2011), combined with a H2B-Venus reporter cassette and a neomycin resistance gene driven from a human β -actin promoter. The targeting construct to generate the NANOG-Venus translational fusion has been described previously (Filipczyk et al., 2013). The construct used for permanent expression of the H2B-Cerulean marker was generated from pCX::H2B-mCherry described in (Nowotschin et al., 2009) by replacing the mCherry coding sequence with a Cerulean coding sequence. To generate reporter lines, approx. 2*10⁶ cells were electroporated with 2 µg of the linearized targeting vector, plated onto feeder cells and put under selection one day after electroporation. Resistant colonies were picked after seven days, and PCR-genotyped for correct insertion events (reporter constructs) or visually screened for transgene expression. Karyotypes of all genetically modified clones were determined according to standard procedures (Nagy et al., 2008), and clones with a median chromosome count of 40 were selected for experiments. Two subclones of the cell line carrying the inducible Gata4-mCherry construct gave highcontribution chimaeras with germline transmission, confirming that the ESCs used here retain full developmental potential.

Image processing and analysis

To quantify immunofluorescence intensity in single fixed cells, images were segmented based on nuclear fluorescence using methods available in FIJI (Schindelin

et al., 2012), and mean fluorescence intensities for individual channels measured in segmented regions after manual curation.

Spatial heterogeneities in fluorescence intensity in time-lapse recordings resulting from uneven illumination across the field of view were removed by taking 50 flatfield images without any cells, and normalizing fluorescence intensities from experimental movies with the average of the flatfield images. Temporal heterogeneities in fluorescence signal in the movies due to varying illumination intensities and medium autofluorescence were removed by measuring fluorescence intensity for at least three cell-free positions per movie, and subtracting their average fluorescence values from all measured pixel intensities. For some experiments, cells were fixed and immunostained for marker gene expression and returned to the microscope for imaging. Cells were tracked manually using the MTrackJ plugin of ImageJ (Erik Meijering, 2012), and fluorescence intensities in a region of interest around the trackpoint were extracted with custom-written Python scripts.

Receiver operating characteristics analysis

To compute receiver operating characteristics, we used a varying threshold level of GATA4-mCherry expression to make predictions based on the assumption that all cells above the threshold will differentiate, and those below it will not. These predictions were then compared to the real outcome, and for each threshold level we determined the ratio of correct and false predictions to the overall number of events (true positive ratio TPR, and false positive ratio, FPR). Plotting FPR versus TPR for all threshold values gives a characteristic curve for a single time-point (see Fig. 4G for an example). The area under this curve (AUC) is a measure of the ability of a classifier to predict an outcome – classifiers without predictive value have an AUC of

0.5, while a perfect predictor gives an AUC of 1.0. The ROC curve also allows determining the optimal threshold; in our case we used the threshold value that maximized the difference between TPR and FPR (red dot in Fig. 4G).

Mathematical modeling

The mathematical model proposed is based on the well studied mutual repression circuit (Gardner et al., 2000) and describes the dynamics of endogenous GATA (G) and NANOG (N) expression driven by externally induced GATA expression (G_X) with three rate equations (see results). The transient exogenous GATA G_X production rate was modeled with a rectangular step function π_{τ} of duration τ =6 h. To account for the experimentally observed heterogeneity in the response to doxycycline, the maximum production rate parameter of G_X , D, was varied from cell to cell according to a log-normal distribution with scale parameter σ_D . Even though the experimentally observed distribution of GATA4-mCherry expression levels has a more complex distribution (Supplementary Fig. S7), we chose this simple, positively defined distribution to test generic dynamic behavior of the system following a range of GATA4-mCherry inputs. GATA and NANOG mutually repress each other's expression and this was accounted for by inhibitory Hill functions with cooperativity coefficients p and q. Exogenous GATA also participates in the repression of NANOG. For a given level of signaling, the maximal GATA and NANOG production rates α_G and α_N , which are attained in absence of their respective repressor, were assumed constant.

Regarding the interaction of signaling with this transcription network, we have considered two scenarios. In the first one we assumed that the maximum transcription rate for NANOG decreases linearly with the signal level s, $a_N(s) = a_{NI} s + a_{NO} (1-s)$,

where $a_{NI} \le a_{N0}$ while the maximum GATA production rate is not affected. The second scenario we considered is a linear increase of the maximum GATA production rate with signal level, $a_G(s) = a_{GI} s + a_{GO} (1-s)$, $a_{GO} \le a_{GI}$, and a constant NANOG production rate. In both cases signaling was assumed to be constant and equal in all cells. The model expresses concentrations normalized to the half-maximum inhibition concentration of the Hill functions, i.e., in arbitrary adimensional units. Time is expressed in dimensional units. Fitting exponential decay curves to normalized GATA4-mCherry fluorescence traces following the removal of doxycycline indicated a half-life of approx. 4 h for GATA4-mCherry, motivating us to set the decay rate λ_G for both exogenous and endogenous GATA factors to 0.15h⁻¹. We chose the same value for the NANOG protein decay rate λ_N , consistent with half-lives reported in the literature (Abranches et al., 2013; Muñoz-Descalzo et al., 2013). Thus, all but four parameter values of this system were constrained by experimental data (see Table S1 for all parameters used for simulations). Sensitivity analysis indicated that all parameter values could be changed at least two-fold without affecting the bistable behavior of the system. To reflect the pre-culturing of cells in the presence of PD03 we chose as initial condition for NANOG expression levels its steady state levels in the absence of signaling. Initial endogenous GATA levels were set to zero, reflecting the absence of detectable GATA expression in our ESCs in the absence of doxycycline stimulation. The visual representations of the potential landscape in Fig. 7E, F correspond to the path-integral quasi-potential surfaces as proposed by (Bhattacharya et al., 2011). These have been computed assuming no external supply of GATA factors.

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