Towards elucidating the connection between epithelial–mesenchymal transitions and stemness

Mohit Kumar Jolly1,2, Bin Huang1,3, Mingyang Lu1, Sendurai A. Mani6,7, Herbert Levine1,2,4 and Eshel Ben-Jacob1,5,8

1Center for Theoretical Biological Physics, 2Department of Bioengineering, 3Department of Chemistry, 4Department of Physics and Astronomy, and 5Department of Biosciences, Rice University, Houston, TX 77005-1827, USA
6Department of Translational Molecular Pathology, and 7Metastasis Research Center, The University of Texas MD Anderson Cancer Center, Houston, TX 77030, USA
8School of Physics and Astronomy and The Sagol School of Neuroscience, Tel-Aviv University, Tel-Aviv 69978, Israel

Epithelial cells undergoing epithelial-to-mesenchymal transitions have often been shown to behave as cancer stem cells, but the precise molecular connection remains elusive. At the genetic level, stemness is governed by LIN28/let-7 double inhibition switch, whereas EMT/MET is controlled by miR-200/ZEB double inhibition circuit and LIN28 is inhibited by miR-200, coupling the two modules. Here, using a specially devised theoretical framework to investigate the dynamics of the LIN28/let-7 system, we show that it can operate as a three-way switch (between low, high and intermediate LIN28 levels termed the D, U and hybrid D/U states) similar to the three-way operation of the miR-200/ZEB circuit that allows for the existence of a hybrid epithelial/mesenchymal (E/M) phenotype. We find significant correspondence between the existence of the three states of the two circuits: E–D, M–U and E/M–D/U. Incorporating the activation of OCT4 by LIN28, we find that the hybrid E/M phenotype has high likelihood (when compared with either the E or M states) to gain stemness. Combining the LIN28/let-7 regulation by NF-kB and c-MYC, we find that NF-kB, but not c-MYC, elevates the likelihood of E/M phenotype to gain stemness. Our results are consistent with emerging concept that partial EMT can lead to stemness.

1. Introduction

Understanding cell fate decisions during tumour progression remains a major research challenge in modern biology. For instance, metastasis and relapse, the two deadliest aspects of cancer, continue to elude us and remain clinically insurmountable [1]. Metastasis involves aberrant transitions between epithelial and mesenchymal phenotypes, whereas tumour relapse is caused by wake-up of a few dormant therapy-resistant cancer stem cells (CSCs) [2]. It is now established that the genetic regulatory network for epithelial–mesenchymal transitions (EMTs) is interconnected with the stemness regulatory network [2]. However, the underlying dynamics and operative principles of these interconnections between metastasis and stemness remain elusive. Understanding these principles is likely to provide important clues for assisting therapeutic advances.

Metastases of carcinomas typically begin when epithelial (E) cells of the primary tumour undergo EMT to lose their cell–cell adhesion and gain migratory and invasive mesenchymal (M) characteristics. These newly transformed motile cells navigate through the extracellular matrix and enter the bloodstream as circulating tumour cells (CTCs) [3]. These CTCs exit the bloodstream at multiple organs and undergo a mesenchymal-to-epithelial transition (MET), regaining their epithelial characteristics to establish micrometastases that later mature into fully developed secondary tumours. Recent theoretical work has indicated that the core decision network regulating carcinoma EMT/MET also allows for
transition into a hybrid epithelial/mesenchymal (E/M) phenotype [4]. This hybrid E/M phenotype, often referred to as a partial EMT (pEMT) state, has also been observed experimentally in ovarian carcinoma cell lines [5]. Cells belonging to this phenotype have combined epithelial (cell–cell adhesion) and mesenchymal (motility) traits that enable them to migrate collectively, as seen during wound healing and branching morphogenesis [6]. In cancer, such cohort migration is manifested as the migration of clusters of CTCs in the bloodstream, as observed with lung, prostate and breast cancer patients [7–10]. Such collective migration obviates the need for all cells to detect external signals for migration and facilitates subsequent rounds of dissemination [11]. Therefore, collective migration of CTCs possibly plays an important functional role in metastatic progression [6].

To successfully complete the last step of metastasis, i.e. colonization, the CTCs that exit the bloodstream should self-renew as well as regenerate the heterogeneity of the parental tumour. These two traits are usually considered to be associated with stemness characterizing CSCs [2]. Recent studies have shown that cells undergoing EMT acquire these stem-cell- or tumour-initiating capabilities [12,13], through aberrant activation of several pathways such as NF-xB, Notch, Wnt and TGF-β [2]. However, how these signalling networks mediate this interconnection between EMT and stemness has not yet been elucidated. For example, it has been shown that mesenchymal cells can adopt stemness [12,13], yet the fundamental question, whether hybrid E/M cells can also adopt stem-cell characters, remains open. This fundamental question is also associated with a major dilemma in the clinic—whether to isolate single CSCs or a cluster of CSCs in the bloodstream to characterize the prognostic risk.

Addressing this question calls for understanding regulation of both EMT/MET and stemness and elucidating the operating principles of the connection between them. EMTs are regulated by the miR-200/ZEB mutually inhibitory circuit that operates as a three-way switch with the three possible states being the epithelial, mesenchymal and hybrid E/M phenotypes [4]. Similarly, stemness is regulated by a mutually inhibitory circuit between RNA binding factor LIN28 and microRNA let-7 [14]. The LIN28/let-7 system is connected to the miR-200/ZEB circuit in multiple ways—miR-200 inhibits LIN28 directly [15], and LIN28 activates the pluripotency marker OCT4 [16] that is linked to miR-200 [17]. Studies in both embryonic development and reprogramming indicate that cells with intermediate levels of OCT4 are closely associated with maximum stemness (or pluripotency). Consistently, both very high and very low levels of OCT4 lead to differentiation into specific phenotypes [18–20]. Here, we focus on the coupling of OCT4, LIN28/let-7 and miR-200/ZEB. In addition, because the LIN28/let-7 circuit receives external signals from the oncogene c-MYC and the inflammatory response regulator NF-xB [21–24] (figure 1a,b), we also investigate the effect of these signals on the coupling between LIN28/let-7 and miR-200/ZEB circuits.

Here, we have devised a specific theoretical framework to investigate the dynamics of the LIN28/let-7 double inhibitory circuit and show that it can operate as a three-way switch. Several previous studies show that mutually inhibitory circuits—either those comprising two transcription factors (canonical TF–TF toggle switch) or those comprising a transcription factor and a microRNA (chimera TF–miR toggle switch)—can act as three-way switches when one or two of the components are self-activating [4,25–29]. Motivated by these studies, we expected the LIN28/let-7 circuit will also allow tristability, because both LIN28 and let-7 are self-activating elements [30–32]. However, because the modes of regulation in the LIN28/let-7 circuit present unique dynamical properties that are different from those of the previously studied circuits, we had to devise a new theoretical framework. More specifically, modelling the dynamics of the LIN28/let-7 circuit poses a special theoretical challenge because it involves three unique regulatory mechanisms that have not been modelled before: (i) translational self-activation (of let-7 by LIN28) [14], and (ii) self-activation of microRNA processing (of let-7 by LIN28) [14], and (iii) self-activation of microRNA processing (of let-7) [32] (see table S1 in the electronic supplementary material, §S1, for circuit details).

To devise the theoretical framework presented here, we started from our previously devised framework for modeling miRNA-mediated translational repression [4,29]. We have generalized this framework to include the novel modes of regulation in the LIN28/let-7 circuit mentioned earlier. With the new framework at hand, first, we investigate the dynamics of the LIN28/let-7 system as a stand-alone circuit (i.e. when driven by miR-200 alone). Subsequently, we

---

**Figure 1.** The regulatory network coupling EMT and stemness. (a) Novel modes of regulation in the LIN28/let-7 circuit. LIN28 promotes its own translation (green solid line), and inhibits let-7 processing (orange solid line); let-7 promotes its own processing (red solid line) and inhibits LIN28 translation (black dashed line). NF-xB activates both LIN28 and let-7, whereas c-MYC activates LIN28 and inhibits let-7. miR-200 inhibits LIN28, that translationally acts OCT4 (orange solid arrow) that activates miR-200. (b) Effective circuit showing the LIN28/let-7 double negative feedback loop that receives external input signals from miR-200, c-MYC and NF-xB; and has OCT4 as the output. The activation of miR-200 by OCT4 has not been considered in our current framework. A blue solid line shows conversion of one species to another, a solid black arrow shows transcriptional activation, a solid black bar denotes transcriptional repression, and a black dashed line shows microRNA-mediated translational repression.
investigate the dynamics of the circuit when it is driven by miR-200 in combination with external inputs from c-MYC and NF-kB. It may be noted that we do not include the regulation of miR-200 by OCT4 in our current model.

Exploiting our new model, we find that LIN28/let-7 can operate as a three-way (ternary) switch between three possible states: (i) (high LIN28, low let-7) state—(1, 0) or up (U) state, (ii) (low LIN28, high let-7) state—(0, 1) or down (D) state, and (iii) (medium LIN28, medium let-7) state—(1/2, 1/2) or down/up (D/U) state. Importantly, we show that these three states can typically be expected to correspond to the mesenchymal, epithelial and hybrid E/M phenotypes, respectively. Analysing the effects of external signals on LIN28/let-7 circuit, we found that c-MYC and NF-kB drive the circuit to (1, 0) and (1/2, 1/2) states, respectively. We also show that intermediate levels of OCT4, the proposed read-out for stemness, can be attained by intermediate levels of LIN28, i.e. (1/2, 1/2) or D/U state. Because the (1/2, 1/2) or D/U state can correspond to the hybrid E/M phenotype, especially under the influence of NF-kB, we indicate that E/M state is also likely to be associated with stemness.

2. Material and methods

2.1. Model formulation

We generalized and extended the recent theoretical framework devised by Lu et al. [29] to incorporate the special modes of regulation operative in the LIN28/let-7 circuit—inhomogeneity and self-activation of microRNA processing, and translational self-activation. Effects of miR-200, c-MYC and NF-kB are incorporated as external signals. The indirect feedback of LIN28 on miR-200 through OCT4 is not included in the current framework. Equations (2.1) and (2.2) represent time evolution of the levels of mature microRNA let-7 (\( \mu \)) and LIN28 protein (\( B \)), respectively.

We used shifted Hill functions to describe the effect of regulation of one species by the other. Shifted Hill functions [4] are defined as weighted sum of excitatory Hill function \( H^+ \) and inhibitory Hill function \( H^- \), thus \( H^+(X, \lambda) = H^+(X) + \lambda H^-(X) \), where the weight factor \( \lambda \) represents the fold-change in production rate owing to the regulation. Therefore, for activation, \( \lambda > 1 \); for repression, \( \lambda < 1 \); and for no effect, \( \lambda = 1 \). As per our notation, \( \lambda_{X,Y} \) denotes the weight factor (\( \lambda \)) for the regulation of \( X \) by \( Y \).

More specifically, the concentration of mature microRNA let-7 (\( \mu \)) depends on the innate degradation rate of mature let-7 (depicted by \( k_{\mu} \)) and innate processing rate of the precursors to mature miRNAs (depicted by \( g_{\mu} \)). This innate processing rate is affected in two ways— it is decreased due to the inhibition of processing by LIN28 (\( B \)), but it is increased owing to autocatalytic activity of mature let-7 (\( \mu \); figure 1a). Thus, two shifted Hill functions are multiplied to \( g_{\mu} H^+(B, \lambda_{\mu,B}) \) with \( \lambda_{\mu,B} < 1 \) (denoting inhibition by LIN28 (\( B \))), and \( H^+(\mu, \lambda_{\mu,\mu}) \) with \( \lambda_{\mu,\mu} > 1 \) (denoting self-activation of let-7 (\( \mu \))).

Therefore, the dynamics of the level of mature let-7 (\( \mu \)) is governed by equation (2.1) given as

\[
\frac{d\mu}{dt} = g_{\mu} H^+(B, \lambda_{\mu,B}) H^+(\mu, \lambda_{\mu,\mu}) - k_{\mu} \mu. 
\] (2.1)

Typically, miRNAs are more stable than the mRNAs [4], so we can assume that microRNA always reaches steady states. The steady-state level of the LIN28 mRNA (\( m \)) can be determined simply by \( m = g_{m}/k_{m} \), where \( g_{m} \) and \( k_{m} \) are the production and degradation rates for LIN28 mRNA (\( m \)), respectively.

Next, the concentration of LIN28 protein (\( B \)) depends on the innate degradation rate of LIN28 (depicted by \( k_{B} \)), and the steady-state mRNA (\( m \)) levels times the innate translation rate of \( m \) to \( B \) (depicted by \( g_{B} \)). But, this innate translation rate is decreased owing to the interference of mature let-7 (\( \mu \)) with the translation, and increased due to the binding of LIN28 (\( B \)) to its own mRNA promoting translation (figure 1a). Thus, two shifted Hill functions are multiplied to \( g_{B} H^+(\mu, \lambda_{B,B}) H^+(B, \lambda_{B,B}) \) with \( \lambda_{B,B} > 1 \) (denoting translational self-activation of LIN28 (\( B \))).

Therefore, the dynamics of the level of LIN28 protein (\( B \)) is governed by equation (2.2) given as

\[
\frac{dB}{dt} = g_{B} H^+(\mu, \lambda_{B,B}) H^+(B, \lambda_{B,B}) - k_{B} B. 
\] (2.2)

3. Results

3.1. LIN28/let-7 can operate as a three-way switch

We start by analysing the LIN28/let-7 circuit when LIN28 is inhibited by a constant level of miR-200 as an input signal. A typical phase-space diagram (figure 2a) shows that the circuit can have three coexisting stable states (three green solid circles). These states are (i) high LIN28 with low let-7—(1, 0) or up (U) state, (ii) low LIN28 with high let-7—(0, 1) or down (D) state, and (iii) medium LIN28 with medium let-7—(1/2, 1/2) or down/up (D/U) state. This result is consistent with experiments that identify not only the cells with (high LIN28, low let-7) and (low LIN28, high let-7) expression, but also the cells with concomitant expression of both LIN28 and let-7—medium LIN28, medium let-7 [30,31]. Therefore, the LIN28/let-7 circuit can operate as a three-way switch.

The EMT regulatory circuit miR-200/ZEB can also operate as a three-way switch between epithelial (E), mesenchymal (M) and hybrid E/M phenotypes [4]. These phenotypes correspond to (high miR-200, low ZEB), (low miR-200, high ZEB) and (medium miR-200, medium ZEB) states, respectively [4]. Because miR-200 directly inhibits LIN28, we expect to discover a correspondence between (E, E/M, M), and the three states of the LIN28/let-7 circuit. To test the expectation, we have analysed the range of existence of the three possible states of LIN28/let-7 for miR-200 ranging from pure epithelial levels to pure mesenchymal levels (figure 2b). As seen in figure 2b, at very high levels of miR-200 corresponding to the E phenotype, only the D—(0, 1) state exists. Oppositely, at very low levels of miR-200 corresponding to the M phenotype, only the U—(1, 0) state exists. Conversely, at intermediate levels of miR-200 corresponding to the hybrid E/M phenotype (approx. 5000–15 000 molecules...
that correspond to M phenotype leads to a transition from the D/U state into the U state. Starting from U state and increasing miR-200 levels, the circuit directly

existence of the D/U state can increase from 4000 to 12 000 miR-200 molecules. Starting from the E phenotype, at bottom right part of the blue curve, and

with typical levels of miR-200 corresponding to the E/M phenotype (5000 – 15 000 molecules [4]). As is shown later, in the presence of NF-

c-MYC, and at higher c-MYC values, only the U state exists

that for the parameters used in this figure (c-MYC

to inhibition by miR-200. It illustrates the possible coexistence of three states between epithelial (high miR-200 levels) and mesenchymal (low miR-200 levels). Note

that the parameters used in this figure (c-MYC = 0 and NF-κB = 0), D/U state exists for miR-200 levels from 3000 to 7000 molecules, levels that are consistent

with typical levels of miR-200 corresponding to the E/M phenotype (5000–15 000 molecules [4]). As is shown later, in the presence of NF-κB, the range of

existence of the D/U state can increase from 4000 to 12 000 miR-200 molecules. Starting from the E phenotype, at bottom right part of the blue curve, and
decreasing miR-200 levels, the circuit undergoes a transition from the D—(0, 1) state into the D/U—(1/2, 1/2) state. Further decrease in miR-200 to levels that

correspond to M phenotype leads to a transition from the D/U state into the U state. Starting from U state and increasing miR-200 levels, the circuit directly

undergoes a transition into the D state at miR-200 level that corresponds to the E phenotype.

[4]), the D/U—(1/2, 1/2) state can coexist with the U and D states. In addition, for some range of intermediate miR-200 levels, the U and D states coexist. The bifurcation diagrams also explain the asymmetry between EMT (reducing miR-200 levels) and MET (increasing miR-200 levels) as observed in some experimental studies where the hybrid E/M phenotype was attained during EMT [34], but not during MET [35]. Concurrently, the bifurcation diagram shows that cells have a significantly lower likelihood to enter the D/U—(1/2, 1/2) state during METs.

The results are consistent with experimental observations that epithelial cells typically have low LIN28 levels with high let-7 levels; and mesenchymal cells typically have high LIN28 levels with low let-7 levels [15,36]. Therefore, we propose that cells belonging to the hybrid E/M phenotype are likely to be in the (medium LIN28, medium let-7) or D/U—(1/2, 1/2) state. To indicate this, we added the cartoon of the hybrid E/M cells near the D/U—(1/2, 1/2) state (for completeness, we added the cartoon of the mesenchymal cells near the U—(1, 0) state and that of the epithelial cells near the D—(0, 1) state). More specifically, we expect this to be the case when the miR-200 levels of the cells in the D/U state fall within the range of miR-200 levels that correspond to the hybrid E/M phenotype, i.e. 5000–15 000 molecules of miR-200 [4].

3.2. The effect of c-MYC

As is illustrated in figure 1b, c-MYC activates LIN28 and inhibits let-7. The effect of c-MYC at different levels of miR-200 is shown in figure 3. As can be seen, when miR-200 levels are set to be 7000 molecules, a typical level for the E/M phenotype, the D/U—(1/2, 1/2) state exists for finite range of c-MYC, and at higher c-MYC values, only the U state exists and the circuit becomes monostable (figure 3a). However, when the levels of miR-200 do not correspond to the E/M phenotype, the range of existence of the D/U state decreases significantly and the circuit becomes bistable or even monostable (electronic supplementary material, §4).

Notably, even at intermediate levels of miR-200 (the blue region highlighted in figure 3b), the D/U state can be maintained only at low levels of c-MYC. As c-MYC increases, the miR-200 levels required to maintain the D/U state increase significantly (figure 3b). These required levels of miR-200 at high values of c-MYC, as suggested by the model, are much larger than the levels of miR-200 that define the E/M phenotype, i.e. 5000–15 000 molecules [4], and rather correspond to the epithelial phenotype. Therefore, at c-MYC levels higher than typical levels (approx. 30 000 molecules [37], vertical dotted brown line in figure 3b), D/U state corresponds to the epithelial phenotype and not to the hybrid E/M phenotype, i.e. high levels of c-MYC drive the cell into the U state. These results are consistent with experiments showing that overexpression of c-MYC impairs wound healing [38], a typical example of transition to E/M phenotype and then re-epithelialization.

3.3. The effect of NF-κB

As is illustrated in figure 1, NF-κB activates both LIN28 and let-7. The effect of NF-κB at different levels of miR-200 is shown in figure 4.

For intermediate levels of miR-200, the D/U—(1/2, 1/2) state exists for a significant range of NF-κB levels as can be seen from the bifurcation diagram of the dependence of the LIN28 levels on NF-κB (figure 4a). Complementarily, for intermediate levels of NF-κB, a bifurcation diagram of the dependence of LIN28 levels on miR-200 points out that
D/U state exists for a significant range of miR-200 levels (4000–12 000 molecules; figure 4b). This bifurcation diagram also indicates an asymmetry between EMT (reducing the level of miR-200) and MET (increasing the level of miR-200), an asymmetry which has also been observed in previous experimental and theoretical analysis [4,34,35].
higher, up to 50 000 molecules, in cancer cells [39]).

minimum NF-

phases recapitulate the plasticity of cell phenotypes as driven

state exists for an increasing range of NF-

be seen, for higher levels of miR-200, the D/U—(1/2, 1/2)

D/U state exists, at different fixed levels of miR-200. As can

example of cells moving collectively in the E/M phenotype.

maintains D/U state, promotes wound healing [40], an

coexist—

phenotype—

More specifically, the possible states are (i) phases with only one

phase corresponds to the coexistence of one or more phenotypes.

state, and promote the correspondence between the D/U

that high levels of NF-

almost entirely overlaps with the range of miR-200 levels

3.4. The association between the hybrid E/M phenotype

and stemness

to illustrate the concept. We find high stemness likelihood in

material, §3). Therefore, we propose that cells in the hybrid D/

(b) Mapped regions for likelihood of stemness, as defined by a range of intermediate OCT4 levels (relative levels = 0.25–0.65). Cells in D/U state in the entire {D, U, D/U} phase and part of the {D/U, U} phase (as marked with black dotted lines, and bound by black solid lines in yellow region, and black solid lines at the boundary of pink and light green region) have high likelihood of stemness. In addition, cells in the U state are likely to be stem-like in a part of the {D, U} region (as marked with red dotted lines and bound by red solid lines in light green region, and red solid lines at the boundary of light green and blue region). Cells in both U and D/U states are both likely to be stem-like in the small area at the bottom (bounded with red and black lines) in the {D, U, D/U} phase.

Figure 4c shows that with increasing NF-kB, the D/U state exists for an increasing range of miR-200 levels. Importantly, for larger NF-kB values, this range of miR-200 levels almost entirely overlaps with the range of miR-200 levels that defines the hybrid E/M phenotype [4], thereby implying that high levels of NF-kB tend to maintain cells in the D/U state, and promote the correspondence between the D/U state and the E/M phenotype. This result is consistent with experiments showing that overexpression of NF-kB, which maintains D/U state, promotes wound healing [40], an example of cells moving collectively in the E/M phenotype.

Figure 4d shows the range of NF-kB values for which the D/U state exists, at different fixed levels of miR-200. As can be seen, for higher levels of miR-200, the D/U—(1/2, 1/2) state exists for an increasing range of NF-kB levels. However, at very high miR-200 levels that are associated with the epithelial phenotype (more than 15 000 molecules [4]), the minimum NF-kB levels required to enable the existence of the D/U state are close to the maximum experimentally observed levels of NF-kB (35 000 molecules in normal cells and probably higher, up to 50 000 molecules, in cancer cells [39]).

The diverse phases recapitulate the plasticity of cell phenotypes as driven differently by miR-200 and NF-kB. The phases containing the D/U state—{D, D/U, U} and {D/U, U}—exist for intermediate values of miR-200, and become more prominent with increasing levels of NF-kB, thus showing again that increasing values of NF-kB stabilize the D/U state for intermediate levels of miR-200 that correspond to the hybrid E/M phenotype.

It has been suggested that stemness is associated with intermediate levels of OCT4—both too high and too low levels of OCT4 lead the cell to different differentiation paths, thereby depriving the cell of pluripotency [18–20]. Motivated by these observations, we proceed to compute the dependence of the levels of the pluripotency (stemness) marker OCT4 on its activator LIN28. OCT4 levels were calculated as a Hill’s function of OCT4 lead the cell to different differentiation paths, thereby depriving the cell of pluripotency [18–20]. Motivated by these observations, we proceed to compute the dependence of the levels of the pluripotency (stemness) marker OCT4 on its activator LIN28. OCT4 levels were calculated as a Hill’s function of OCT4 levels (see electronic supplementary material, §2). We chose a representative range of relative OCT4 levels that correspond to high likelihood for stemness (0.25–0.65 relative to the saturation level of OCT4 when it is activated by the maximum level of LIN28) and mapped regions of likelihood for stemness defined this way in the phase diagram. Note that the range of OCT4 levels is expected to be cancer and even patient specific. The results here for the specific ‘guessed range’ are presented to illustrate the concept. We find high stemness likelihood in the entire region of the {D, D/U, U} phase, in part of the region of the {D/U, U} phase and in part of the region of the {D, U} phase (figure 5b). Notably, the area associated with stemness when cells are in the D/U state (area marked by black dotted lines in figure 5b) is significantly larger than that when cells are in the U state (area marked by red dotted lines in figure 5b), especially when let-7 levels are not too low (see the sensitivity analysis in the electronic supplementary material, §3). Therefore, we propose that cells in the hybrid D/ U state are also likely to adopt stemness and not only cells in the U state. In addition, with increasing NF-kB, the area associated with stemness decreases for the U state, but not for the
D/U state (figure 5b), thereby implying that NF-κB can facilitate the association of the D/U state and/or the E/M phenotype with stemness.

In the light of the above, we predict that for some cancer types, cells in the hybrid E/M phenotype might even be more likely to adopt stemness when compared with cells in the mesenchymal phenotype. This prediction is consistent with some non-cancer cases: recent studies found that adult stem cells such as epithelial stem cells (those that give rise to all three layers of the skin), hepatic stellate cells (epithelial progenitors in adult mouse livers) and trophoblast stem cells (precursors of differentiated cells of the placenta) co-express both epithelial and mesenchymal markers, and define the ‘metastable’ hybrid E/M phenotype with stemness characteristics [41–43].

3.5. Association between dynamics of epithelial-to-mesenchymal transition and stemness

We proceed to investigate the dynamics of LIN28/let-7 circuit in response to external signal miR-200 that decreases in time representing EMT (figure 6). The circuit starts in the D state, and exhibits a transition from this state into the D/U state as the levels of miR-200 decrease from levels corresponding to epithelial phenotype (more than 15 000 molecules) to levels corresponding to the E/M hybrid phenotype (5000–15 000 molecules). It stays at the D/U state for 4.25–6 days and then goes through another transition into the U state as the levels of miR-200 continue to decrease towards levels that correspond to the mesenchymal phenotype (figure 6c). More specifically, the miR-200 levels continue to decrease until \( t = 7 \) days (which is consistent with the typical time for EMT [12]); therefore, we see that LIN28 levels saturate only at \( t = 7 \) days, and that they continue to increase even after the cell enters the mesenchymal phenotype at \( t = 6 \) days. A similar treatment of the circuit with miR-200 at lower values of NF-κB significantly shortens the duration of stay in the hybrid state before transitioning into the mesenchymal state (figure 6d). This behaviour is explained by our previous observation that high levels of NF-κB maintain cells in the hybrid or the D/U—(1/2, 1/2) state.

We also plot the relative levels of OCT4 during EMT. Some cells in the E/M phenotype are likely to be in the D/U state and thus have intermediate levels of OCT4 that represent likeness for stemness (pluripotency). On the other hand, cells in the mesenchymal phenotype are likely to be in the U state with quite high levels of OCT4 and hence might have lower likeness for stemness (figure 6b,d). Because the exact levels of LIN28 (and hence OCT4) depend on the level of NF-κB, the latter determines the likelihood of cells in the hybrid E/M and mesenchymal phenotypes to adopt stemness. However, it is less probable that cells in the mesenchymal phenotype will retain pluripotency (stemness), at least for the ‘guessed range’ of OCT4 levels used here and along the specific path of circuit dynamics as taken during these dynamic simulations.

4. Discussion

The LIN28/let-7 mutually inhibitory circuit is a key player in connecting EMT and stemness. Although its recognized importance has led to intense experimental efforts [14–16], it has been given limited theoretical attention to date. We have constructed a theoretical framework to study the LIN28/let-7 circuit as a stand-alone module, including its response to other players connecting EMT and stemness: c-MYC and NF-κB.
We find that the LIN28/let-7 circuit can act as a three-way switch giving rise to three possible states—D, U and D/U that we typically associate with the epithelial, mesenchymal and hybrid E/M phenotypes, respectively. Experiments validate our association of epithelial and mesenchymal cells with D and U states, respectively [15,36]; however, direct measurements of both LIN28 and let-7 are needed to validate our proposed association of the D/U state with the E/M phenotype.

We also show that while c-MYC drives the cells towards a U state, NF-κB can help to maintain the cells in a D/U state, which corresponds to the hybrid E/M phenotype for high NF-κB levels. Further, NF-κB also activates both miR-200 [44] and ZEB [45], two sides of the EMT decision-making circuit, thereby possibly stabilizing the E/M phenotype. Therefore, we predict that NF-κB might facilitate the migration of CTCs as a cluster of hybrid E/M cells. Our predictions are consistent with the fact that triple negative breast cancer that has a constitutively higher expression of NF-κB among different breast cancer subtypes [46] has the highest percentage of hybrid E/M cells in the CTCs [5].

Based on intermediate OCT4 levels as the readout for pluripotency, we predict that cells belonging to the hybrid E/M phenotype or equivalently those in the D/U—(1/2, 1/2) state have relatively high likelihood to adopt stemness. Moreover, for some cancers, the cells in the hybrid E/M phenotype might even show higher stemness likelihood than cells of mesenchymal phenotype. Indeed, adult epithelial, trophoblast and hepatic stem/progenitor cells, as well as neoplastic stem cells, co-express epithelial and mesenchymal markers [41–43,47] in agreement with our model prediction. In addition, our predictions are consistent with experiments showing that clusters of CTCs (hybrid E/M phenotype) have higher metastatic potential than the individual CTCs (mesenchymal phenotype) [48] and the recent ‘EMT gradient model’ proposing that cells undergoing pEMT, but not necessarily those undergoing complete EMT, lie in the ‘stemness window’ [49].

Our proposed association of E/M phenotype with stemness likelihood is also consistent with the fact that: during metazoan development (type I EMT), glomerular epithelial cells in the kidney undergo pEMT to attain traits of bipotent kidney progenitors [50]; during tissue repair (type II EMT), hybrid E/M cells function as bipotent adult hepatic progenitors and repopulate the rat liver upon injury [51]; and during metastases in ovarian and breast cancer (type III EMT), some cells in hybrid E/M phenotype acquire stem-cell features and can drive in vivo tumour growth, but mesenchymal cells lose these properties significantly [52,53]. Furthermore, recent studies show that the bipotent CSCs in breast and squamous cell carcinoma often co-express both epithelial and mesenchymal markers [54,55] (see detailed discussion in the electronic supplementary material, §5). These results support our prediction that hybrid E/M cells can gain stemness.

Yet, to avoid possible confusion, it is important to clarify that our results, showing significant likelihood of the hybrid cells to adopt stemness, do not imply that epithelial phenotype cannot adopt stemness. More specifically, we show that for high c-MYC levels, the D/U state is associated with the epithelial phenotype, and not with the hybrid E/M one. Given the association of the D/U state with stemness, this result implies that epithelial cells are also likely to possess stemness, especially when c-MYC is overexpressed. Indeed, c-MYC is known to be overexpressed in cases where stemness is associated with the epithelial phenotype—embryonic stem cells [56] and induced pluripotent stem cells [35].

Our results indicate that tristability in LIN28/let-7 circuit affords higher plasticity to the cells in both their epithelial–hybrid—mesenchymal transitions as well as modulating their stemness. Because EMT is no longer considered to be a binary process [6,57,58], and stemness is being understood as a reversible trait of cells rather than their fixed state [59], such multistability, as also observed during transitions between amoeboid and mesenchymal phenotypes [60], might be used by cancer cells to adapt to their changing microenvironments.

Future theoretical studies of the circuits studying EMT and stemness should consider the effect of activation of OCT4 by miR-200 [17], inhibition of EMT by let-7 through HMG2A [36] and mutual inhibition between ZEB1/2 and MET-inducing transcription factor OVOL1/2 [61], all of which can introduce feedback loops in the regulatory circuit we analysed and affect its dynamics.

To conclude, we present the first step towards computational modelling of the important interconnections between EMT and stemness. More external signals from the tumour microenvironment such as TGF-β and HIF-1α, along with cell–cell communication through Notch signalling pathway, can also be incorporated into our theoretical framework to elucidate their effect on this interconnection. A better understanding of these interconnections holds promise for improved therapeutic strategies to target therapy-resistant CSCs as well as CTCs [2].

Acknowledgements. We have benefitted from discussions with Profs Kenneth Pienta, Donald Coffey, José N. Onuchic and Cindy M. Farach-Carson. M.K.J. also thanks Drs Baotong Zhang and Sumaiyah K. Rehman for useful discussions.

Funding statement. H.L. and E.B.-J. were supported by NSF Center for Theoretical Biological Physics (NSF grant no. PHY-1308264) and by the Cancer Prevention and Research Institute of Texas (CPRIT) at Rice University. E.B.-J. was supported by a grant from the Tauber Family Funds and the Maguy-Glass Chair in Physics of Complex Systems at Tel Aviv University. S.A.M. was supported by a grant from the National Institutes of Health (SRO1CA155243) at MD Anderson.

Conflict of interests. The authors declare no conflict of interest.

References

5. Huang RY-J et al. 2013 An EMT spectrum defines an anoikis-resistant and spheroidogenic intermediate mesenchymal state that is sensitive to e-cadherin restoration by a src-kinase inhibitor, saracatinib


