

1 **How to build a robust intracellular concentration gradient**

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6 **Abstract:** Concentration gradients of morphogens are critical regulators of patterning in
7 developmental biology. Increasingly, intracellular concentration gradients have also been
8 found to orchestrate spatial organization, but inside single cells, where they regulate
9 processes such as cell division, polarity and mitotic spindle dynamics. Here, we discuss
10 recent progress on understanding how such intracellular gradients can be built robustly. We
11 focus particularly on the Pom1p gradient in fission yeast, elucidating how a variety of
12 buffering mechanisms operate to ensure precise gradient formation. In this case, a systems-
13 level understanding of the entire mechanism of precise gradient construction is now within
14 reach, with important implications for gradients in both intracellular and developmental
15 contexts.

16 **Keywords:** intracellular, gradients, morphogens, fluctuations, robustness, precision

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1 **Gradients on multiple scales**

2 The concept of a concentration gradient has been pivotal in explaining how development in
3 biology is spatially regulated[1-6]. Typically, a spatially varying concentration of a
4 morphogen protein drives spatially differentiated gene expression through a concentration
5 thresholding mechanism, whereby morphogen concentrations above a particular threshold
6 can, for example, activate the expression of a specific gene. In this way a continuously
7 varying concentration in space can be converted into a discrete pattern of gene expression
8 territories.

9 Classical morphogens often act over relatively long distances; the intensively studied Bicoid
10 morphogen, important for anterior cell fate specification in the early *Drosophila* embryo,
11 extends for hundreds of microns away from its anterior source[7]. At slightly shorter length
12 scales, the morphogen Decapentaplegic (Dpp) extends tens of microns away from the
13 anterior-posterior compartment border in the center of the *Drosophila* wing imaginal disc[8,
14 9]. In both cases, the gradients span many cells (or nuclei for Bicoid in the syncytial
15 blastoderm) generating long-range patterning potential. The mechanism of formation of
16 these gradients is thought to be due to localized protein production, followed by effective
17 diffusion away from the source, and then eventual degradation (Box 1). The Bicoid system
18 largely upholds this mechanism; although an underlying spatial *bicoid* mRNA gradient does
19 contribute to the Bicoid protein gradient, protein movement is also required[10, 11]. For
20 Dpp, although the system is governed by effective diffusive transport on longer length
21 scales, the mechanism of morphogen movement on shorter scales is still controversial[12].
22 Over the past ten years or so, studies have shown that concentration gradients are not the
23 exclusive preserve of developmental biology, but can also have a crucial role in spatial

1 organization inside single cells[13-17]. Brown and Kholodenko showed theoretically that
2 concentration gradients could exist inside an individual cell with biophysically relevant
3 parameters[13]. Hence, an individual cell was not so small that homogeneous
4 concentrations were inevitable (Box 1). Since then, a host of different gradients have
5 emerged, ranging from cell division regulators[18, 19] and cell fate determinants[20, 21] to
6 mitotic spindle organizers[22-24]. Even some of the smallest of bacterial cells contain
7 gradients with spatial extents of only around a micron[25, 26]. An important difference
8 exists between intracellular gradients and their developmental cousins, however: the role of
9 degradation. In developmental systems, the morphogen protein is typically degraded[27,
10 28] and this, together with diffusion, is believed to be responsible for the decrease in
11 morphogen concentration as a function of distance away from the source. In intracellular
12 systems, the lifetimes required for this mechanism to generate a meaningful gradient are
13 too short to be realistic (Box 1). Instead, it is typically a modification of the protein (for
14 example, its phosphorylation status) that is modulated as part of a gradient. In this way, a
15 typical protein with a lifetime of hours or more, can potentially participate in (phospho-)
16 gradient formation many times over before being degraded (Box 1).

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18 **Making development precise**

19 The study of developmental morphogen gradients has recently been reinvigorated by a
20 novel focus on noise and precision[15, 29-32]. All biological systems inevitably contain
21 sources of noise, which can potentially corrupt the ability of the system to generate reliable
22 outcomes. Noise can broadly be separated into two classes: extrinsic and intrinsic. Here,
23 extrinsic noise refers to fluctuations from one gradient to another in two different cells or

1 embryos (Figure 1a). This might arise, for example, from different amounts of mRNA laid
2 down from one embryo to another, leading to differing gradient profiles. Intrinsic noise
3 refers to fluctuations inherent even within a single copy of the gradient (Figure 1b). In the
4 latter case, such noise arises from the inevitable biochemical fluctuations inherent in
5 processes such as diffusion that are needed to make a gradient (Box 2), and which will be
6 particularly prevalent at low molecular copy numbers. Fluctuations, both extrinsic and
7 intrinsic, will degrade the precision of the positional information provided by a gradient
8 (Figure 1).

9 A variety of mechanisms are available to potentially buffer these sources of noise, thereby
10 increasing the precision of the resulting positional information. Time-averaging will clearly
11 reduce positional error introduced by intrinsic fluctuations[15, 31] (Box 2), as can spatially
12 averaging the gradient read-out provided by neighboring cells or nuclei in a developmental
13 biology context[31, 33]. Time-averaging is performed by a downstream signal-processing
14 network, with time scales determined by the transcript and/or protein lifetimes of the
15 target gene (e.g. for Bicoid, this would be the lifetimes of the products of its target gene
16 *hunchback*). Extrinsic noise can be reduced by changing the degradation process involved in
17 the removal of the morphogen protein, thereby altering the gradient shape (see also [34]
18 and [29] for alternative methods). For example, it was demonstrated that morphogens with
19 self-enhanced degradation exhibit, at large distances, profiles that decay as power laws (Box
20 1)[32]. Theoretical analysis has shown that such profiles can potentially better buffer
21 extrinsic noise in morphogen production rates, as compared to profiles with standard (i.e.
22 linear) morphogen degradation, which generates exponentially decaying profiles. More
23 generally, if both extrinsic fluctuations in morphogen production rates as well as intrinsic

1 fluctuations need to be buffered then the gradient shape that maximizes precision depends
2 on which source of noise is most important[35]. Power law profiles are potentially best for
3 systems dominated by extrinsic noise in morphogen production (as expected from [32]),
4 straight line profiles for intrinsic noise, and exponential profiles for systems where both
5 types of noise were important[35, 36].

6 So far this type of analysis has been mostly applied to developmental morphogen systems.
7 Here, we review how similar ideas concerning robustness and precision are being
8 introduced into the field of intracellular concentration gradients.

9 **The intracellular Pom1p gradient in fission yeast**

10 One of the best studied intracellular gradients is that of the Dual-specificity tyrosine
11 phosphorylation-regulated kinase (DYRK) Pom1p inside the fission yeast
12 *Schizosaccharomyces pombe*[37]. Pom1p forms a cortical gradient, with highest
13 concentrations at the cell tips reducing towards the cell center[18] (Figure 2a). Interestingly,
14 detailed imagery has demonstrated that Pom1p profiles exhibit large dynamical fluctuations
15 (Figure 2b). The Pom1p gradient is believed to have multiple important roles, regulating cell
16 polarity, cell length control[38-40] and positioning of the cell division plane[18, 19, 37, 41].
17 In particular, Pom1p is believed to negatively regulate the mitotic activator Cdr2p, which is
18 cortically located at the center of the cell. As the cell grows, the concentration of Pom1p at
19 the cell center is proposed to drop, thereby activating Cdr2p and enabling the cell to couple
20 cell size with the cell cycle[38, 39]. Furthermore, the midcell localization of the cytokinesis
21 factor Mid1p, responsible for division site positioning, is also believed to be regulated by
22 Pom1p[18, 19]. These biological functions have been intensively studied in recent years and
23 are the subject of several recent reviews[42-44]. Below, we will therefore focus on a slightly

1 different question, namely the mechanisms of gradient construction themselves. In
2 particular, we will examine how these mechanisms can buffer fluctuations, so that the
3 relevant downstream biological processes are supplied with precise positional
4 information[15, 45].

5 At heart, the cortical Pom1p gradient is generated by localized binding of Pom1p at cell tips,
6 followed by spreading out on the membrane by diffusion, followed by membrane
7 unbinding. A cycle of Pom1p phosphorylation underlies these events, consistent with the
8 considerations of Box 1[46]. When Pom1p is targeted to the cell tips it is dephosphorylated,
9 a process that enhances its affinity for the cell membrane. Once bound to the membrane,
10 Pom1p is thought to undergo autophosphorylation. Such a process lowers the protein's
11 membrane affinity, eventually leading to unbinding from the membrane. Pom1p can then
12 diffuse in the cytoplasm before potentially being recycled into the cortical gradient by
13 rebinding to cell tip regions, where it is again dephosphorylated. Consistent with this overall
14 picture, a kinase-dead version of Pom1p localizes much more broadly over the cell
15 periphery[46, 47], with a role for autophosphorylation favoured by the inability of wild-type
16 Pom1p to restore the localization of inactive Pom1p[46].

17 We next examine how the Pom1p gradient can be made robust, focusing on three key
18 elements: (i) precise polar binding followed by (ii) robust spreading away from these
19 regions, followed by (iii) reliable gradient interpretation by downstream elements.

20 **Precise polar binding through self-focusing**

21 Polar targeting of Pom1p is dictated in part by the dynamic properties of microtubules, as
22 well as by the overall rod-shaped geometry of the fission yeast cell. Incipient microtubules

1 initially tend to grow in a random direction before contacting the edges of the cell, sliding
2 along them, and eventually orienting along the long axis of the cell[48]. The protein Tea1p is
3 then delivered to cell tips through a microtubule-based delivery system; Tea1p rides on
4 growing microtubule plus ends and is released when microtubule ends reach the cell tip[49,
5 50]. Tea4p localizes in a similar manner, but is dependent on Tea1p[51, 52]. Proper Pom1p
6 membrane targeting is believed to depend on the cell-tip localization of both Tea1p and
7 Tea4p. In *tea4Δ* cells, Pom1p fails to localize to the cortex and in *tea1Δ* cells, Tea4p does not
8 localize to the cortex and Pom1p exhibits a weakly uniform cortical localization pattern[18].
9 Furthermore, Tea4p both directly interacts with Pom1p (in two-hybrid assays) and recruits
10 the phosphatase Dis2p to cell tips[46, 53]. Dis2p can dephosphorylate Pom1p, thereby
11 aiding in Pom1p membrane binding, as described above[46]. In this way, the
12 microtubule/Tea1p/Tea4p/Dis2p program predominantly targets Pom1p to cell tips (see
13 Figure 3a).

14 Occasionally, however, microtubules (particularly shorter ones) will still contact the
15 membrane in non-polar regions (Figure 3a). This could trigger inappropriate localization of
16 Tea1p/Tea4p/Dis2p and misplaced Pom1p binding. Therefore, an additional targeting
17 mechanism exists to guard against this possibility, involving both Tea1p and another tip
18 regulator, called Mod5p[54-56]. Anchoring of Tea1p at cell tips is dependent on Mod5p, and
19 vice-versa. Hence, one possible hypothesis is that Tea1p/Mod5p function in a positive
20 feedback loop to focus the precise localization of Tea1p at cell ends. Further support for this
21 idea has recently been provided [54]. A simple potential model for this loop is that Mod5p
22 acts as a molecular 'glue' to retain Tea1p at cell tips, with the Tea1p–Mod5p complex being
23 relatively immobile. In this model, Tea1p and Mod5p should have identical diffusion

1 constants as part of such a complex. However, Fluorescent Recovery After Photobleach
2 (FRAP) measurements made by bleaching half a cell tip indicated that Tea1p and Mod5p
3 have distinctly different dynamics, with Tea1p barely recovering after 5 min in contrast to
4 approximately 50% recovery for Mod5p. This result makes a simple ligand-receptor
5 tethering mechanism unlikely. Instead, it was suggested that Tea1p forms a polymeric
6 network at cell tips, with insertion of extra Tea1p mediated by Mod5p and autocatalytically
7 promoted by existing polymeric Tea1p (Figure 3b)[54]. Because Mod5p is assumed to
8 associate and disassociate from the Tea1p polymeric network on a fast timescale, this
9 model can explain the rapid half-tip FRAP dynamics of Mod5p as compared to Tea1p, with
10 Tea1p diffusing only very slowly when polymerized.

11 Although many of the microscopic properties of the above model could not be directly
12 tested, several indirect predictions were examined[54]. In order to form a network over a
13 two-dimensional area, Tea1p must have a local connectivity of three or higher. Consistent
14 with this reasoning, mutating a region of Tea1p that is predicted to form a trimeric coiled-
15 coil caused mutant Tea1p to fail to accumulate at cell tips, despite being delivered
16 accurately by microtubules and interacting with Mod5p.

17 Also important is the model's self-focusing property; the model predicts that the steady-
18 state distribution of Tea1p at cell tips should be much narrower than the spatial distribution
19 of Tea1p microtubule deposition sites, due to autocatalytic amplification. This indeed
20 turned out to be the case. The amplification was predicted to build up the Tea1p
21 concentration close to the extreme cell tips, until such peaks were balanced by an outward
22 diffusive flux of polymeric Tea1p along the membrane and eventual Tea1p unbinding. This
23 mechanism provides a simple way to correct for any potential non-polar Tea1p deposition.

1 In such cases the local Tea1p concentration will be too low to trigger autocatalytic growth;
2 instead, Tea1p will be rapidly recycled back to the cytoplasm where it can be re-targeted to
3 cell tips. Hence, the self-focusing mechanism allows Tea1p membrane binding to be much
4 more tightly localized to cell tips. Because Tea4p precisely colocalizes with Tea1p[51], this
5 guarantees a narrow spatial window for Pom1p membrane binding, and thus a much more
6 precise downstream Pom1p gradient (Figure 3b). Tea1p is, however, often distributed at cell
7 tips as multiple discrete dots rather than as a single polymeric structure. It is currently
8 unclear how this observation might affect the self-focusing model.

9 **How spreading can buffer noise**

10 Once present on the membrane, a simple mechanism for gradient formation would involve
11 diffusive motion of cortical Pom1p, with autophosphorylation of Pom1p eventually leading
12 to unbinding[46]. FRAP experiments on half a cell tip provide evidence for transport from
13 one half-tip to the other at the same end of a cell[46, 57]. Moreover, gradient formation
14 appears to be substantially unaffected by cytoskeletal or endocytic disruption[57]. These
15 results are entirely consistent with diffusion as the dominant transport mechanism of
16 cortical Pom1p, which spreads out on the membrane beyond the region occupied by its
17 upstream recruiters Tea1p/Tea4p[46, 57]. These and other FRAP results indicate that the
18 mean Pom1p diffusion constant is around $0.1 \mu\text{m}^2\text{s}^{-1}$ with a membrane lifetime of around 30
19 s[57]. Using the considerations in Box 1, these parameters can clearly generate a functional
20 intracellular gradient inside single fission yeast cells (which are typically around 9-14 μm
21 long).

22 However, confocal imaging of a cortical slice through fission yeast cells revealed an
23 unexpected level of complexity for the Pom1p membrane dynamics[57]. Intriguingly, in

1 time-lapse imagery Pom1p was found in clusters that appeared to stochastically grow and
2 shrink on timescales of a few seconds, much more rapidly than the overall membrane dwell
3 time of around 30 s. Moreover, tracking of the clusters (as well as Fluorescent Correlation
4 Spectroscopy measurements) yielded a cluster diffusion constant much smaller than that
5 suggested by half-tip FRAP. These results motivated a two-state model for Pom1p dynamics,
6 with Pom1p either existing as a more rapidly diffusing, potentially monomeric state, or as
7 slow-diffusing massive clusters (see Figure 4a)[57]. The slow-diffusing clusters can absorb
8 fast-diffusing Pom1p through collisions, but are at the same time unstable and liable to
9 disintegration. Mathematical modelling of these processes (with nonlinear cluster
10 aggregation) then made an unexpected prediction; namely, that the peak cortical Pom1p
11 concentration and the decay length of the gradient should be anti-correlated. This
12 conclusion followed from higher levels of Pom1p leading to more clusters and, therefore,
13 overall slower diffusion, thereby decreasing the decay length, whereas lower levels of
14 Pom1p led to fewer clusters and overall faster diffusion, increasing the decay length. The
15 anti-correlation persisted even though the clustered Pom1p cannot unbind from the
16 membrane, thereby effectively decreasing the Pom1p membrane unbinding rate. Assuming
17 extrinsic variation in all model parameters, such an anti-correlation does not typically arise
18 in simple linear one-state models, in contrast to the two state model. Measurements of *in*
19 *vivo* concentrations and decay lengths uncovered a clear anti-correlation, conforming well
20 to the two-state model prediction.

21 As schematically illustrated in Figure 4b, the above mechanism has noise-buffering
22 properties in mitigating against the effects of variation in Pom1p tip concentration levels.
23 Indeed, measurements showed that the anti-correlation could reduce extrinsic fluctuations

1 by up to 40%[57]. How the intricate cortical Pom1p dynamics fit with its phosphorylation
2 state is currently unclear, however, as cluster formation appeared to be independent of
3 Pom1p kinase activity[57]. Moreover, the assumption of a two-state model is rather crude.
4 Although it does contain the essential idea and provides verifiable predictions, the reality is
5 likely to be more complex, with Pom1p clusters of many different sizes (rather than just
6 two) and varying biophysical properties.

7 **Quantifying and reducing intrinsic noise**

8 Intracellular concentration gradients will clearly be subject to intrinsic noise arising from the
9 inherent stochasticity of the biochemical processes that make the gradient. In particular, in
10 order to measure the gradient concentration at a detector, gradient molecules must first
11 arrive by diffusion. This arrival process is highly stochastic [58, 59] and therefore sets
12 physical limits on the precision of positional information[15, 31] (Box 2). However, these
13 fluctuations can be reduced by time-averaging the signal measured at such a detector. In
14 this way, intrinsic (though not extrinsic) fluctuations can be reduced (Box 2). In the case of
15 Bicoid, the effects of intrinsic noise have been carefully analyzed, and, theoretically, time
16 (and spatial) averaging could reduce relative intrinsic noise in the gradient to the 10% level
17 within minutes (considerably less than the time period of a single nuclear cycle)[31]. For the
18 Bicoid system, precision is limited by the rare, stochastic arrival of Bicoid molecules at its
19 detector: the promoter of its downstream target, the *hunchback* gene.

20 For the case of Pom1p, the precision with which the gradient can be read is again
21 determined by the noisy arrival of Pom1p molecules at downstream 'detectors'. These
22 detectors could include, for instance, molecules of the protein kinase Cdr2p, an activator of
23 mitotic entry that is negatively regulated by Pom1p. Although the impact of these

1 fluctuations on intracellular gradient precision had been considered theoretically[15, 45],
2 until recently there was no direct experimental measurement of the size of intrinsic noise,
3 and the extent to which time-averaging could reduce it in an intracellular gradient system.
4 Such measurements were carried out recently for Pom1p (which is present in copy numbers
5 of around 5000 per cell) and showed that intrinsic noise could be significant, particularly
6 away from the tips[57]. However, time-averaging over 30 s reduced intrinsic noise in the
7 Pom1p gradient to significantly lower levels (lower in all locations than the cell-to-cell
8 variation). Interestingly, the potential downstream targets of Pom1p, particularly Cdr2p,
9 have relatively long membrane dwell times (of about 90 s or more), and could therefore
10 integrate Pom1p levels over that time, thereby significantly reducing intrinsic noise[57].

11 In general, intrinsic fluctuations set physical limits to the precision of any signal transduction
12 process[58], a consideration that is highly relevant to the precision of gradient-based
13 systems. A quantitative analysis is thus vital to determine whether the signaling system in
14 question can produce reliable outcomes within experimentally relevant timescales[15, 31,
15 45].

16 **Lessons from a robust intracellular gradient**

17 As we have seen, multiple mechanisms are employed to ensure that the Pom1p gradient
18 can provide reliable positional information. A multidisciplinary approach involving both cell
19 biology and mathematical modeling has enabled these mechanisms to be dissected in
20 considerable detail, with a fairly complete systems-level understanding of the entire
21 gradient-forming mechanism now available[18, 46, 48, 54, 57]. A number of lessons can be
22 learned from such an approach. Perhaps most important is that the dynamics of biological
23 gradients can be considerably more complex than often envisioned. For example, Pom1p

1 gradient dynamics involve not only localized binding, diffusion and then disassociation, but
2 also intricate and novel self-focusing and clustering dynamics. Furthermore, these novel
3 mechanisms could be widely relevant to developmental systems. For example, there is
4 nothing in the dynamic clustering mechanism that is necessarily specific to the Pom1p
5 system. Indeed, the output of the clustering mechanism -- an anti-correlation between the
6 peak concentration of the gradient and its decay length -- has also been observed in the
7 Bicoid system, although its origin there is currently unexplained[36, 60]. It will be interesting
8 to see whether other intracellular gradients also employ noise-reduction mechanisms, or
9 whether Pom1p is an outlier in this regard. Currently, it is probably fair to say that other
10 intracellular gradients have not been investigated in sufficient depth to be able to answer
11 this question. A particularly interesting example in which to study this issue might be the
12 intracellular gradient of the cell fate determinant MEX-5 in the one-cell *C. elegans*
13 embryo[20, 21]. This gradient also manifests complex behaviour, in that overall gradient
14 formation depends on phosphorylation of MEX-5 altering its effective diffusion constant[14,
15 21]. Finally, the gradient-forming and noise-buffering mechanisms we have discussed in this
16 review would be very interesting to reconstitute *in vitro*, as has already been achieved for
17 the dynamics of the bacterial Min proteins that regulate cell division positioning in *E.*
18 *coli*[61-63]. With *in vitro* reconstitution as a first step, control mechanisms used in the
19 Pom1p system could eventually form a useful toolkit for precise positioning in synthetic
20 biology contexts.

21 **Acknowledgements**

22 I would like to thank Fred Chang and Timothy Saunders for a critical reading of the
23 manuscript. I also acknowledge financial support from core BBSRC funds.

1 Boxes

2 **Box 1: Making a simple concentration gradient.** Morphogen gradients in a developmental
3 biology context often rely on local protein production, followed by diffusion and eventual
4 degradation. The symmetry breaking necessary for gradient formation therefore relies on a
5 localized source, which can be provided by previous localization of morphogen mRNA.
6 Provided each morphogen protein is degraded independently at a constant rate, a simple
7 mathematical analysis reveals a concentration profile that decays exponentially with
8 distance from the (planar) source. The decay length of the gradient (the distance over which
9 it decays to $1/e$ of its highest value) has also been precisely measured in several cases (and
10 is $\approx 100 \mu m$ for Bicoid and $\approx 20 \mu m$ for Dpp). Modulating the decay process can produce
11 qualitatively different gradient shapes: for example, if a dimerization reaction is required for
12 decay (an example of self-enhanced degradation) then a power law decay results at large
13 distances. In this case, at large distances from a planar source, the concentration decays
14 with distance as $1/(distance)^\alpha$, where α is equal to two for the dimerization reaction.

15 In an intracellular context, the question arises as to whether a cell is big enough to support
16 an intracellular gradient, or whether internal concentrations are necessarily homogeneous.
17 If we consider a molecule with a diffusion constant D and a lifetime τ , then it will typically
18 move a distance on the order of the decay length $d \propto \sqrt{D\tau}$ before being degraded. For a
19 diffusion constant on the order of $D \sim 1 \mu m^2 s^{-1}$, and a protein lifetime of hours, the
20 characteristic decay length d will be far larger than typical cellular dimensions. However, the
21 distinguishing feature of a gradient protein could be a modification of the protein, for
22 example, phosphorylation. In that case the effective lifetime of the protein with the
23 appropriate modification could be far shorter. For example, the protein could be

1 dephosphorylated at the same time as being localized at a specific site within the cell (as is
2 the case for Pom1p in fission yeast). The protein could then diffuse away while being
3 continuously subject to attempted phosphorylation. If the latter process occurred on a
4 timescale of approximately a second, then with $D \sim 1 \mu m^2 s^{-1}$, a gradient with a typical decay
5 length of around $d \sim 1 \mu m$ would emerge, significantly smaller than typical eukaryotic cell
6 sizes, and comparable with the size of bacteria. Hence, intracellular gradients are not only
7 possible, but can be expected to be fairly ubiquitous. Once phosphorylated, the gradient
8 protein itself could then be recycled for reuse in the gradient, a much more energy-efficient
9 mechanism for gradient maintenance than rapid degradation combined with protein
10 resynthesis.

11 **Box 2: Intrinsic fluctuations in gradient formation.** Intrinsic fluctuations inevitably reduce
12 the precision of positional information provided by a gradient. When the gradient
13 concentration is measured in a detector volume, the number of gradient molecules present
14 will fluctuate. Indeed, at a particular instant there could be no gradient molecules at all
15 within the target volume. The detector will then have to wait for the noisy arrival of
16 gradient molecules by diffusion before reliable measurement becomes possible. This effect
17 is largest at low concentrations, but can be large even for surprisingly high concentrations of
18 gradient molecules if the measuring volume is small. Small effective measuring volumes are
19 likely to be common for morphogens that act as transcription factors (even if the
20 morphogen transcription factor attempts to increase the effective target size by diffusing in
21 one dimension along the DNA[64]). Morphogens that bind to receptors covering an entire
22 cell surface, on the other hand, will have much larger measuring volumes, meaning that
23 intrinsic noise is likely to be small. In order to determine the quantitative importance of

1 intrinsic noise for precision, a theoretical analysis is essential. If the dominant source of
2 fluctuations is diffusion, then the variance in the number of molecules in the detector
3 volume will simply be equal to the mean. However, time averaging will reduce these
4 fluctuations by an amount that depends on the length of the time-averaging period.
5 Essentially, after time averaging for a period, τ , the noise will be reduced by an amount
6 proportional to $\sqrt{\tau/\tau_0}$, with a characteristic timescale, τ_0 , set by the magnitude of the
7 gradient molecule diffusion constant and the physical size of the detector. Reduction by the
8 square root of the time-averaging period follows for the same statistical reasoning that the
9 error of the mean in any series of measurements decreases essentially according to the
10 square root of the number of independent measurements.

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9

10 **Figure legends**

11 **Figure 1: Extrinsic and intrinsic noise both affect precision of positional information**

12 **provided by concentration gradients. (a)** Extrinsic noise in morphogen production rate
13 leads to varying profile from one gradient to another. Through variation in the position
14 where the gradient concentration drops through a critical level (ρ_T), this leads to imprecision
15 in specification of position x_T . **(b)** Similarly, intrinsic noise within a single gradient also leads
16 to imprecise positional information.

17 **Figure 2: Pom1p forms a noisy cortical gradient. (a)** Confocal image of wild type fission

18 yeast cells expressing pom1-tomato in medial focal plane (scale bar, $2 \mu m$). **(b)** Four
19 separately normalized pom1p cortical intensity profiles from $0.5 s$ exposures taken $15 s$
20 apart in same cell. d is distance measured along the membrane from a cell tip. Image and
21 data reproduced from [57].

22 **Figure 3: Tea1p/Mod5p/microtubule module ensuring precise binding of Pom1p at cell**

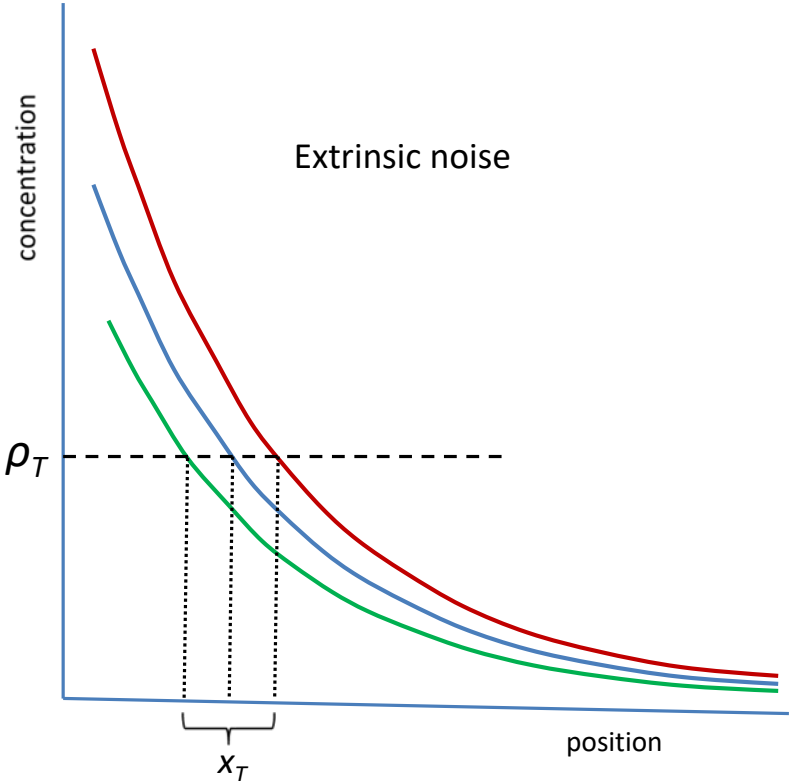
23 **tips. (a)** Rod-shaped cell ensures most microtubule tips grow until close to cell ends, where
24 Tea1p is deposited. Occasional contact between short microtubules and non-polar
25 membranes will, however, inevitably occur which could, without additional measures, lead
26 to inappropriate Tea1p localization. **(b)** Schematic, illustrating the autocatalytic self-focusing
27 mechanism for Tea1p, which ensures a more precise Tea1p polar localization than specified

1 by its membrane input distribution. Solid blue line represents autocatalytic amplification of
2 Tea1p mediated by Mod5p; dotted green line represents spreading of Tea1p by diffusion
3 followed by membrane unbinding.

4 **Figure 4: Pom1p exhibits dynamical clustering. (a)** Schematic illustration of Pom1p
5 clustering dynamics, showing average Pom1p cortical gradient close to a cell tip, as well as
6 detailed Pom1p cluster aggregation/disintegration dynamics. Note that the fast-diffusing
7 species need not necessarily be monomeric. All arrows represent fast diffusive motion, but
8 only the green/red arrows correspond additionally to cluster aggregation/disintegration
9 dynamics. **(b)** Diagram showing how an anti-correlation between peak Pom1p cortical
10 concentration and decay length can reduce extrinsic fluctuations in Pom1p concentration
11 levels.

Figure 1

(a)



(b)

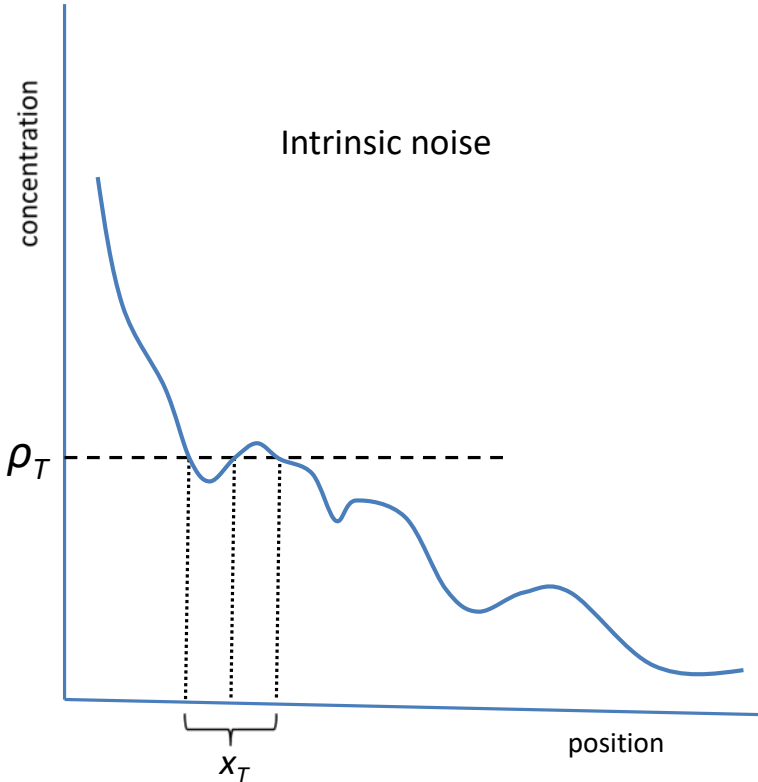
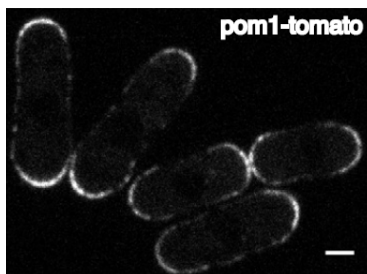


Figure 2

(a)



(b)

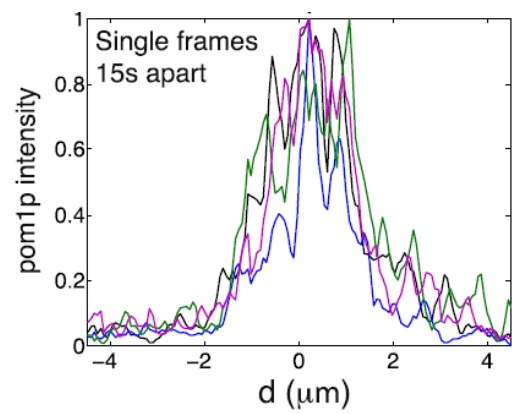


Figure 3

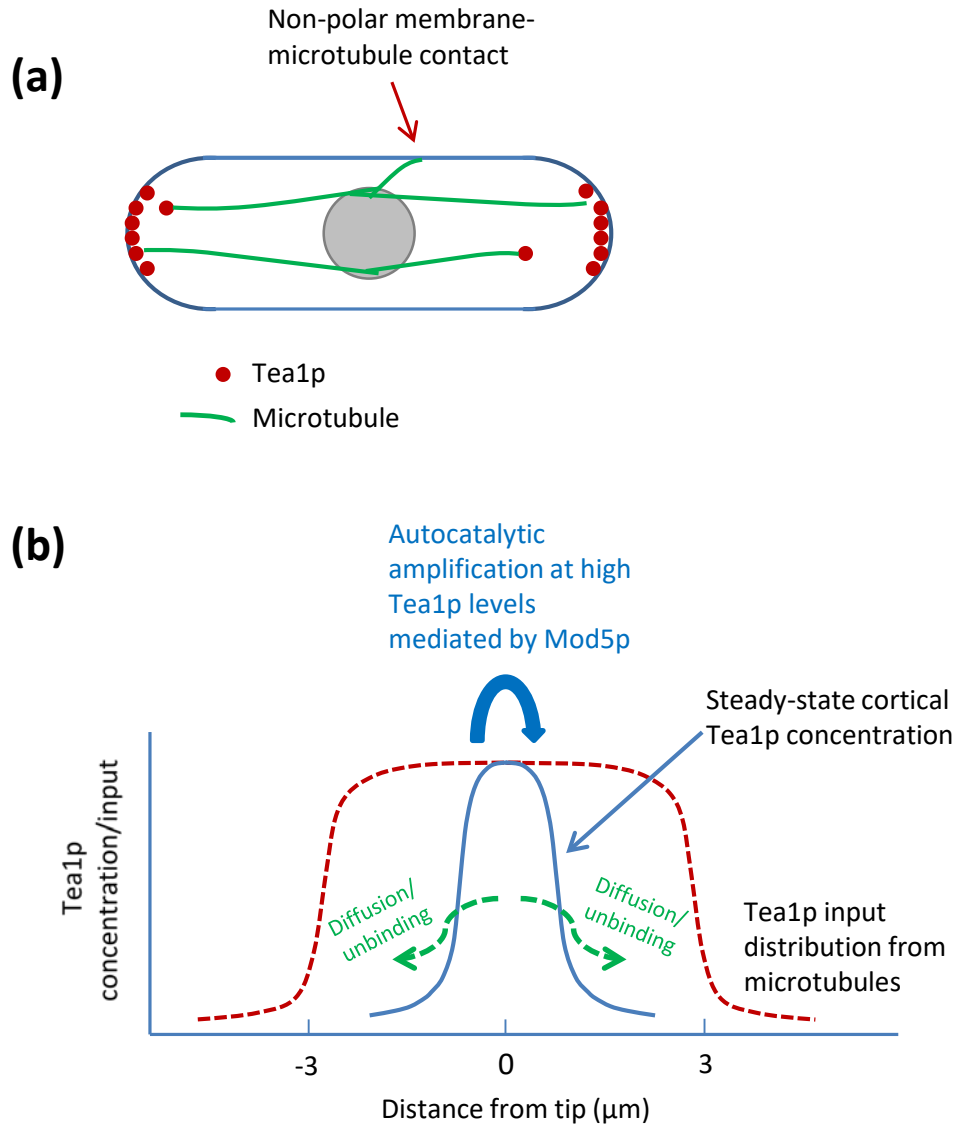
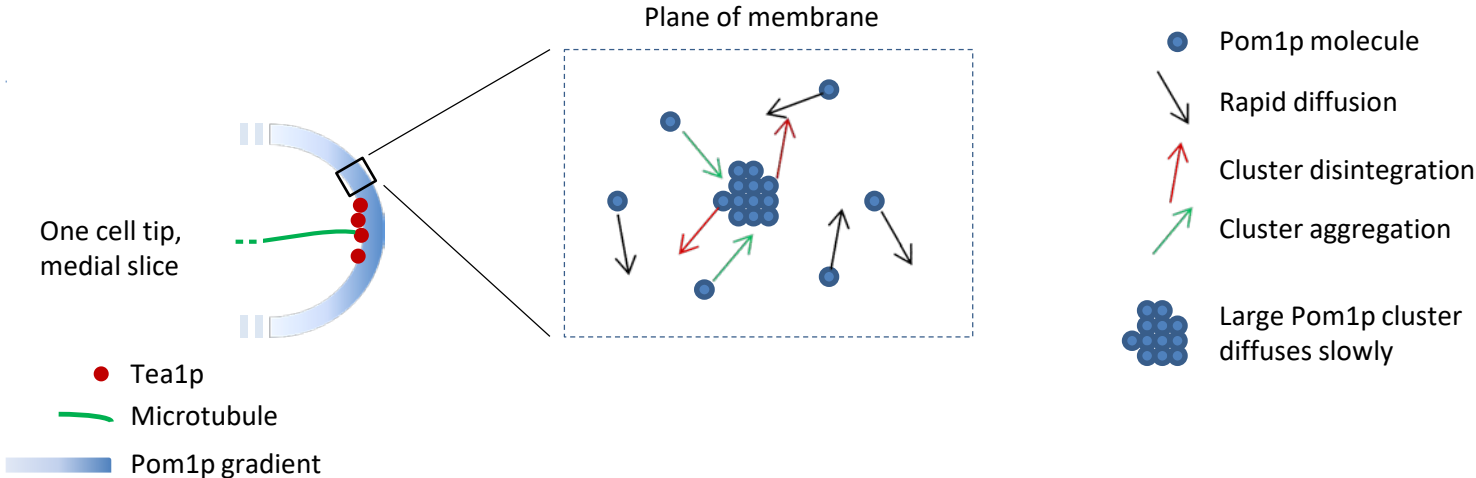


Figure 4

(a)



(b)

