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Supplementary material for this article is available online

#### **Abstract**

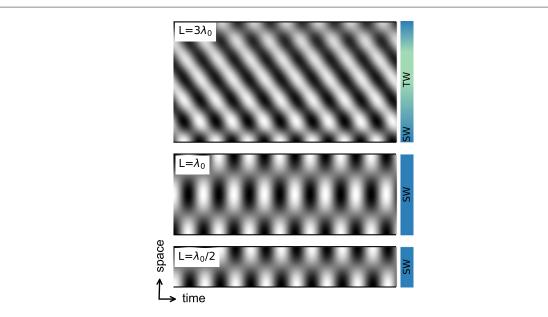
Pattern formation and selection are fundamental, omnipresent principles in nature—from small cells up to geological scales. In *E. coli* bacteria, for example, self-organized pole-to-pole oscillations of Min proteins—resembling a short standing wave—ensure correct positioning of the cell division site. The same biochemical reaction leads to traveling protein waves on extended membranes in *in vitro* experiments. Are these seemingly contradictory observations of system-spanning importance? We show that a transition of nonlinear traveling wave patterns to reflection-induced standing waves in short systems is a generic and robust phenomenon. It results from a competition between two basic phenomena in pattern formation theory. We confirm the generic findings for the cell-biological Min reaction and for a chemical reaction—diffusion system. These standing waves show bistability and adapt to varying system lengths similar as pole-to-pole oscillations in growing *E. coli*. Our generic results highlight key functions of universal principles for pattern formation in nature.

#### 1. Introduction

A variety of fascinating patterns emerges spontaneously in a wealth of living or inanimate driven systems [1–13]. The esthetic appeal of these patterns is immediately apparent to all observers [1]. But universal principles of patterns and their importance in nature also attract researchers from many disciplines. They explore, for instance, the important functions patterns fulfill: self-organized patterns in biology guide size sensing [6], positioning of protein clusters [7], self-driven morphogenesis [8] and communication between species [10]. They furthermore enhance heat transport in fluid systems [3, 11] and are the basis of successful survival strategies for vegetation in water-limited systems [12–14].

Patterns include both stationary spatial structures such as stripes or hexagons, and dynamic structures like traveling waves [1–4]. Traveling waves occur in such different and prominent systems as thermally driven fluid convection [3, 15–18], electroconvection in nematic liquid crystals [19, 20] or the biochemical Min protein reaction on extended membranes [21, 22]. As these examples show, patterns emerge in diverse systems and are driven by very different mechanisms. Nevertheless, once stripes, hexagons or traveling waves have evolved, they often have certain universal properties described by pattern formation theory [2–4, 12].

In nature, patterns often evolve in the presence of domain boundaries—be it the walls of a convection cell, the finite size of a petri dish or the membrane enclosing the cytosol of a biological cell. These boundaries have a strong influence on the process of pattern formation. Stripe patterns, e.g., respond to system boundaries by adjusting their stripe orientation or selecting specific wavelengths [3, 23–25]. System boundaries in general break symmetries. Spatially varying parameters break them, too, and thus have similar effects [26–28]. The response of stationary periodic patterns to such symmetry breaking effects is broadly similiar in different systems, i.e. independent of system details [3, 23, 25]. Traveling waves near boundaries show similar fascinating spatio-temporal behavior [15, 16, 29, 30]. However, the effects of strong confinement on nonlinear wave patterns have not yet been thoroughly examined.



**Figure 1.** Strong confinement leads to significantly different wave solutions depending on the system length. (Top) Modulated traveling wave (TW) for  $L = 3\lambda_0$ , (Middle) two-node standing wave (SW) for  $L = \lambda_0$ , (Bottom) one-node standing wave for  $L = \lambda_0/2$ . Simulations of equation (1) with no-flux boundaries, represented in space-time plots. Shown is the real part of the complex field u(x, t) for the parameters  $\varepsilon = 0.5$ , a = -0.8,  $\xi_0 = 1$ , b = 0,  $q_0 = 1$ , f = 0.5,  $\gamma = 1$ , c = 0.5.

In this work, we show that nonlinear traveling waves inevitably change into reflection-induced standing waves in sufficiently short, confined systems. Since this generic phenomenon relies on basic universal principles of pattern formation, we explore it at first within a minimal model for nonlinear traveling waves. The resulting system-spanning properties can then be transferred to related phenomena in nature: in the Min system, e.g., traveling waves form by coordinated attachment and detachment of Min proteins from the membrane. This protein system originates from *E. coli* bacteria where it plays an important role in the cell division process [31–33]: inside the rod-shaped *E. coli* bacteria, oscillating proteins shuttle between the two cell poles. Thereby, they ensure the positioning of the cell division site at the cell center. In *in vitro* experiments on the other hand, the same biochemical reaction leads to traveling waves on large extended membranes [21, 22]. A deeper understanding of generic properties of nonlinear waves in confinement will help to reconcile these seemingly contradictory observations.

# 2. Transition to reflection-induced standing waves in short systems

We first analyze the transition from nonlinear traveling waves in extended systems to reflection-induced standing waves in strongly confined systems using a generic model. 'Strong confinement' refers to short system lengths in the order of the preferred wavelength of the traveling wave. The model we use is the complex Swift–Hohenberg (CSH) model [4, 34–36],

$$\partial_t u(x, t) = (\varepsilon + ia)u - \xi_0^2 (1 + ib)(q_0^2 + \partial_x^2)^2 u + if \partial_x^2 u - \gamma (1 + ic)|u|^2 u, \tag{1}$$

for the complex scalar field u(x,t) in one spatial dimension. In extended systems and for  $\varepsilon>0$ , this model shows traveling waves with a preferred wavelength  $\lambda_0=2\pi/q_0$  over a wide range of parameters. We measure the system length L in units of  $\lambda_0$  since it represents an intrinsic length scale of the problem.

Simulations of equation (1) with no-flux boundary conditions (see appendix A for details) for three different system lengths lead to the results shown in figure 1: depending on the system length, we get three significantly different wave solutions.

In moderately short systems ( $L=3\lambda_0$ , top), we find a traveling wave pattern in the center (bulk) of the system. This resembles the traveling wave patterns that occur for the CSH model in large, quasi-unconfined systems. Two traveling wave directions, described by  $u_R(x-\omega t)$  (traveling to the right) and  $u_L(x+\omega t)$  (traveling to the left), are equally likely in extended pattern forming systems. In contrast to, e.g., light or sound waves, however, traveling waves in pattern forming systems are nonlinear. While light or sound waves are thus superimposable, two counter-propagating nonlinear waves compete with each other: one of the traveling wave directions is spontaneously selected, while the other is suppressed [3, 29]. But their confinement in finite systems introduces an additional effect: traveling waves are reflected at the boundaries of a finite system. The boundary conditions apply to the whole field u(x,t) in equation (1), i.e. the incoming and reflected waves together.



Therefore, the sum  $u_R + u_L$ , has to match them at the system borders. This boundary coupling forces the incoming and reflected waves into coexistence in a finite neighborhood of the boundary. The resulting superposition of both wave directions leads to standing wave patterns. Further away in the bulk the nonlinear competition between both wave directions dominates and the reflected wave is damped by the predominant incoming traveling wave. The largest system in figure 1 (top) shows the interplay between both bulk and boundary effects. Reflection effects dominate very close to the top and bottom boundaries of the system. There, the incoming and reflected wave form a local standing wave. The extent of this standing wave depends on the distance  $\varepsilon$  from threshold and increases by decreasing  $\varepsilon$ . In the bulk region, however, wave competition prevails —the pattern resembles a traveling wave. By decreasing the system length L, the boundaries move closer together, i.e. the fraction of the system with significant superposition of incoming and reflected waves increases. Therefore, the boundary-induced reflection becomes more and more important. For sufficiently short systems —shorter than a critical length  $L_c$ —the reflection effect predominates the nonlinear competition in the whole system. As a result, standing waves become inevitable. Note that these standing waves are reflection-induced. In principle, standing wave solutions can be inherently stable. However, this is not the case here: in the CSH model, standing waves in extended systems are always unstable. Thus, the standing waves we find here are a direct consequence of the confinement. While this novel, reflection-induced transition from traveling to standing waves is generic, the critical length  $L_c$  depends on the chosen parameters and is specific to each system. The middle and bottom panel in figure 1 show simulations for  $L = \lambda_0$  and  $L = \lambda_0/2$ , respectively. Both system lengths are below  $L_c$  leading to standing wave patterns. In the standing wave regime, the system length influences the number of standing wave nodes. For  $L=\lambda_0$  (figure 1, middle) and similar lengths, we find a two-node standing wave. If only about half of the preferred wavelength fits into the system (e.g.  $L = \lambda_0/2$ , figure 1 bottom), the standing wave has a single node in the system center.

## 3. Length adaptability and bistability of nonlinear standing waves

The discovered reflection-induced standing waves in strongly confined systems are further characterized by exploring their linear stability. For stationary stripe patterns it is well known that they are stable for different wavenumbers in a finite band width. The basis of this multistability is the so-called Eckhaus stability band [37, 38]. Both fluid experiments [39, 40] and numerical analysis of different systems [27, 41] confirmed multistability for stationary patterns (e.g. stripes) in extended systems. The Eckhaus stability band also exists for traveling waves in unconfined systems [4, 17, 42, 43]. Do the standing waves we find in strongly confined systems also show multistable behavior? Does the confinement influence the stability band compared to spatially extended systems?

An analytical approximation of a standing wave solution of equation (1) is given by

$$u(x, t) = Fe^{-i\Omega t}[e^{iqx} + e^{-iqx}] = 2Fe^{-i\Omega t}\cos(qx), \tag{2}$$

with amplitude F and frequency  $\Omega$ ,

$$F^{2} = \frac{1}{3\gamma} \left[ \varepsilon - \xi_{0}^{2} (q_{0}^{2} - q^{2})^{2} \right], \tag{3}$$

$$\Omega = \frac{1}{\tau_0} [-a + \xi_0^2 b (q_0^2 - q^2)^2 + f q^2 + 3\gamma c F^2]. \tag{4}$$

Due to the no-flux boundaries, the wavenumber q is connected to the system length L via  $q = n\pi/L$ , where n=1,2,3... is the number of nodes. This standing wave solution in equation (2) theoretically exists for  $F^2>0$ , i.e. for  $\varepsilon > \xi_0^2 (q_0^2 - q^2)^2$ . In nature, e.g. in (bio)chemical reactions, the control parameter value, corresponding to  $\varepsilon$  in our model, is often fixed above the threshold of pattern formation. Then, standing waves only fulfill the aforementioned existence condition within a finite range of system lengths. Therefore standing waves with nnodes only exist in a certain length regime (existence band), located around  $L = n\lambda_0/2$ . In addition, existence ranges of standing waves with different numbers of nodes may overlap. Thus, for certain system lengths, multiple standing wave solutions (with different numbers of nodes) exist simultaneously. However, parameter ranges where patterns theoretically exist are not equivalent to the parameter ranges where they are stable. In fact, patterns are usually not stable throughout their whole existence range [3, 17, 27, 39-42]. By also analyzing the stability of standing waves, we thus identify the range in which to expect these solutions, especially in experiments (see SM is available online at stacks.iop.org/NJP/20/072001/mmedia for more details on the linear stability analysis).

Figure 2(a) shows the stability regions of standing wave solutions as a function of both system length L and the control parameter  $\varepsilon$ . For a given system length, standing waves with n nodes only exist for sufficiently large  $\varepsilon > \xi_0^2 (q_0^2 - (n\pi/L)^2)^2$ . Below this threshold (black line in figure 2(a)), the homogeneous solution u = 0 is stable and no pattern occurs. The stability range of standing waves with n nodes is located around  $L = n\lambda_0/2$  at

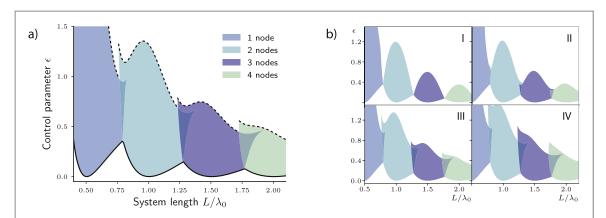


Figure 2. Stability and length adaptability of standing waves. (a) Stability regions of standing waves as a function of system length L and control parameter  $\varepsilon$ . Shaded regions indicate stable standing waves with n=1,2,3,4 nodes. Homogeneous solution is stable below solid black line and traveling wave patterns in the bulk above dashed lines. Parameters in equation (1):  $a=0,\xi_0=1,b=0,q_0=1,$   $f=0.5,\gamma=1,c=0.5$ . (b) Influence of the group velocity parameter f on the stability of standing waves solution in the CSH system. Parameters: f=0.0 (I), 0.2 (II), 0.5 (III), 0.7 (IV), other parameters as in (a).

moderate values of  $\varepsilon$ . For  $L = n\lambda_0/2$ , the wavelength of the standing wave corresponds to the preferred wavelength  $\lambda_0$  of the CSH model. For these 'optimal' system lengths, standing waves are stable over a large range of control parameter values. Nevertheless, we can deviate from these optimal lengths while still maintaining stable standing waves. This creates regions of stability in the  $\varepsilon$ -L-plane. These stability regions constitute the Eckhaus stability band for different number of nodes. We can now compare the width of the Eckhaus band to the width of the existence band for the standing waves. In extended systems, the waves are only stable in a subrange of their existence band. In contrast, in our confined systems close to the onset of pattern formation, the Eckhaus band spans the whole existence range (see figure 1 in SI). Additionally, adjacent stability regions may be large enough to overlap. In these cases, standing waves with both n and n+1 nodes are stable. These overlapping stability regions therefore constitute areas of multistability. For large values of  $\varepsilon$  (above the dashed line in figure 2(a)), standing waves eventually lose stability. Simulations then show a transition to traveling wave patterns such as in figure 1 (top). The details of the stability regions also depend on the other parameters of the CSH model. Parameter f, e.g., which is connected to the group velocity of the waves, qualitatively changes the exact shape of the stability regions (figure 2(b)). As a result, the overlap between adjacent stability regions increases with increasing f. Other system parameters such as b or c only marginally change the stability of standing waves (figures S2 and S3) in confined systems. Importantly, however, the generic principle of a transition from traveling to standing waves in short systems remains qualitatively independent from system

Note that due to the shape of the stability regions, different scenarios are possible upon observing systems with increasing length: if we choose  $\varepsilon$  such that stability regions overlap, we expect direct transitions between standing waves with an increasing number of nodes (as seen in figure 1). Inside the overlap, there is bistability of standing waves with different numbers of nodes. Therefore, both types of standing waves are possible and the resulting pattern depends on initial conditions (see figure 3(a)). Notably, this provides the possibility for hysteresis. The transition from one to two nodes in a growing system, e.g., takes place at a different system length than the reverse transition in a shrinking system. For other values of  $\varepsilon$ , the different standing wave solutions are intersected by either the homogeneous solution (for small  $\varepsilon$ ) or by traveling wave patterns (for larger  $\varepsilon$ , figures 3(b), (A)–(C)). In all cases, standing waves eventually lose stability for sufficiently large systems (after crossing the dashed line in figure 2(a)). For a fixed system length L, standing waves also loose their stability for sufficiently large  $\varepsilon$  (figures 3(b), (D)–(E)). These transitions to modulated traveling waves—both as a function of L and  $\varepsilon$ —take place in the form of supercritical (continuous) bifurcations (figure 3(c), see SM for details on how this was calculated).

# 4. Reflection-induced standing waves in models for a chemical reaction and the Min protein system

Minimal models such as the CSH model we study here for traveling waves are powerful tools to study system-spanning properties of self-organized patterns. System-specific models describing traveling waves are usually more complex than the CSH model. They are, e.g., often composed of several coupled nonlinear equations and/or include higher order nonlinearities (see e.g. [3, 21, 22, 44–49]). Moreover, traveling waves can occur far from the onset of pattern formation. Possible intricacies in these cases include secondary instabilities or anharmonic

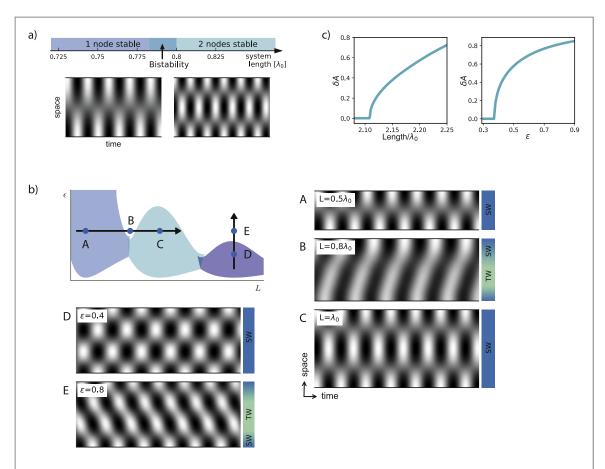


Figure 3. Scenarios for transitions between standing and traveling wave patterns. (a) Bistability of standing waves with 1 and 2 nodes due to overlapping stability regions. Depending on initial conditions, both a standing wave with one node (left) or two nodes (right) is possible for  $L=0.79\lambda_0$  and  $\varepsilon=0.55$ . (b) Different scenarios are possible upon changing system parameters. For fixed  $\varepsilon=0.8$ , we get 3 different solutions upon increasing the system length L: from a standing wave with one node  $(A, L=0.5\lambda_0)$  to modulated traveling waves  $(B, L=0.8\lambda_0)$  to 2-node standing wave  $(C, L=\lambda_0)$ . For a fixed system length  $L=1.5\lambda_0$ , there is a transition from a 3-node standing wave  $(D, \varepsilon=0.4)$  to a modulated traveling wave  $(E, \varepsilon=0.8)$ . (c) Transitions from standing waves to modulated traveling waves are supercritical bifurcations as both a function of the system length L (left) and the control parameter  $\varepsilon$ : the amplitude of traveling waves increases continuously above the critical length  $L_c$  or the critical control parameter  $\varepsilon_0$  respectively (see SM for more details). Additional system parameters for all simulations in this panel: f=0.2, rest as given in figure 1.

wave profiles. Such effects can potentially overshadow the generic behavior of traveling waves under constraints discussed so far. Apart from these exceptions, however, even more complex scenarios often qualitatively follow generic principles extracted from minimal models. Thus, our results obtained from the generic CSH model help us to understand wave patterns in more complex systems.

We support this view by investigating the behavior of nonlinear traveling waves under confinement in two specific systems far from equilibrium. The first model describes the aforementioned Min protein oscillations in *E. coli* bacteria [21]. The second example is an extended Brusselator—a chemical reaction—diffusion model that forms traveling waves [49] (see appendices B and C for details on both models). As figures 4(a) and (b) show, the qualitative behavior of nonlinear waves in both of these models is very similar to the generic CSH model: in sufficiently strong confinement, traveling wave patterns inevitably change into reflection-induced standing waves. Depending on the system length, we also find standing wave patterns with different numbers of nodes. Note that both sets of simulations take place far beyond threshold. In this highly nonlinear regime the spatial dependence of the waves cannot be described by a single harmonic as in equation (2). Instead, they include higher harmonics—as seen in the Fourier spectra in figures 4(c) and (d).

Both models have a similar growth dispersion relation for perturbations of the homogeneous basic state as the CSH model—with a maximum at a finite wavenumber, while other modes are damped. Furthermore, the extended Brusselator shows a continuous bifurcation from the homogeneous state to traveling wave patterns—again, similar to the CSH model. On the basis of these common properties, the similar behavior of nonlinear waves in strong confinement were to be expected. Traveling waves in the Min model in figure 4(b) are even further from threshold and thus in the strongly nonlinear regime. Nevertheless, we find the same scenarios for the Min reaction as for the CSH model and the Brusselator. This further supports the generic nature of our predictions on reflection-induced standing waves.

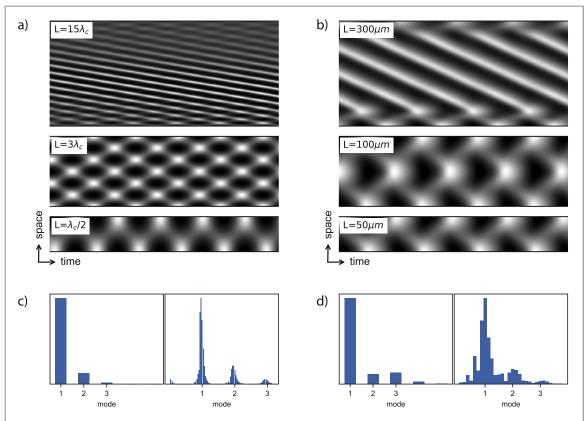


Figure 4. Waves in confinement in a Brusselator and Min model. (a) Effects of strong confinement on wave patterns in an extended Brusselator model, equations (2.1a)–(2.1c): (Top) modulated traveling wave for  $L=15\lambda_c$  (Middle) six-node standing wave for  $L=3\lambda_c$  (Bottom) one-node standing wave for  $L=\lambda_c/2$ . (Shown are space-time plots of the concentration field u(x,t).) (b) Effects of strong confinement on wave patterns in simulations of the Min model, equations (3.1a)–(3.1d): (Top) Modulated traveling wave for  $L=300~\mu\text{m}$ , (Middle) two-node standing wave for  $L=100~\mu\text{m}$ , (Bottom) one-node standing wave for  $L=50~\mu\text{m}$ . (Shown are space-time plots of the total MinD concentration.) (c) Power spectra for the simulations of the Brusselator model shown in (a) for  $L=\lambda_c/2$  (left) and  $L=15\lambda_c$  (right). The mode n=1 corresponds to the dominant mode in the Fourier spectrum, n=2, 3 to multiples of the dominant mode. (d) Power spectra for the simulations of the Min model shown in (b) for  $L=50~\mu\text{m}$  (left) and  $L=300~\mu\text{m}$  (right).

Furthermore, our findings are not limited to no-flux boundary conditions. The reflection-induced transition to standing waves prevails for different boundary conditions such as fixed boundaries  $(u_{|x=0} = u_{|x=L} = 0)$ . The only qualitative difference is the position of the standing wave nodes: they are shifted to the boundaries due to the vanishing fields at these points (see figure S4).

Nonlinear traveling waves in extended systems may be convectively unstable directly beyond threshold. This is also known as Benjamin–Feir instability [3, 4]. For the CSH model, this is the case in the parameter range  $(b+f/4\xi_0^2q_0^2)c>-1$ . In this Benjamin–Feir unstable regime, spatio-temporally chaotic solutions are possible (above the transition to absolute instability). System size matters for spatio-temporal chaos as well: strong confinement and the related boundary-induced reflection can reestablish ordered standing waves (see figure S5).

#### 5. Discussion

In our work we identified generic properties of nonlinear waves in very short systems, i.e. under strong spatial confinement. We found a universal and robust reflection-induced transition from traveling wave patterns in extended systems to standing waves in sufficiently short systems. Stability analysis shows that these standing waves can adapt to different system lengths. This corresponds to stability within a finite wavenumber band—a feature they share with stationary spatially periodic patterns or traveling waves [3, 17, 38–42]. They can also react to larger length variations by changing their number of nodes. We also find multistability of standing waves with different numbers of nodes in a system of the same length.

Our results obtained in terms of basic pattern formation theory show striking similarities to oscillating Min protein patterns. We hypothesize that basic generic properties of nonlinear wave patterns have a key function in the Min system. They may provide the missing link between pole-to-pole Min oscillations in short systems [31, 50–52] and traveling protein waves on extended membranes [21, 22]: the pole-to-pole oscillations in *E. coli* behave like standing waves originating from traveling waves confined to short systems. We also suggest that generic features of the reflection-induced standing waves such as length adaptability further contribute to the



regulation of cell division. This view is supported by experimental observations in the Min system: depending on bacteria length, the Min proteins also form standing waves with multiple nodes [31, 47, 53] or even traveling waves [47]. More importantly though, not only do living bacteria slightly differ in length, they also actively grow. To maintain accurate cell division at the cell center, the pole-to-pole oscillations must be robust over a range of cell sizes. The generic length adaptability of reflection-induced standing waves enables pole-to-pole oscillations in the Min system to adapt to the growing cell. In fact, E. coli maintain robust pole-to-pole oscillations even as they almost double in length prior to cell division. Continued cell growth to filamentous bacteria also allows for transitions between standing waves with different numbers of nodes or to traveling waves [33, 47, 53]. Even multistability of different wave patterns has recently been found in living E. coli [51].

Due to their generic nature, we expect our findings to be independent of system details. Our simulations of a Min protein model and an extended Brusselator substantiate this claim. While we analyzed one-dimensional systems in this work, we believe the basic principles also apply to two or three spatial dimensions: in sufficiently small multidimensional systems the boundary reflection of traveling waves along the long axis will likely overrule the bulk competition between counter-propagating traveling waves. Thus, system borders force them into reflection-induced standing waves—with slight system-specific modifications. Fluid experiments [17, 30] or oscillating chemical reactions guided by recent models as in [48, 49] are further suitable candidates to verify our results. Pattern formation theory applied to stationary 2d patterns recently provided important insights into pattern orientation with respect to spatial inhomogeneities or confinement [28, 54]. A combination of these approaches with our analysis of nonlinear traveling waves in confined systems is very promising. It may reveal further generic properties of nonlinear traveling waves and, e.g., provide additional guidance for experiments in 2d Min systems [50, 52]. This is particularly interesting for designing bottom-up approaches in synthetic biology to reconstitute cells [52]. In this context, our robust rules about nonlinear (protein) waves may present another puzzle piece to understand how nature controls crucial steps of life.

# Acknowledgments

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## Appendix A. Simulation methods

We solve the CSH model as well as the models for the Min oscillations and the chemical reactions below numerically by using a pseudo-spectral method with a semi-implicit time step (implicit Euler for the linear part of the equation, explicit Euler for the nonlinearities) (66). We calculate all spatial derivatives by transformation to a suitable function space depending on the boundary conditions. We use Fourier representations of the fields for periodic boundaries (i.e. in case of the CSH model  $u|_{x=0} = u|_{x=L}$ ), a cosine transform for no-flux boundaries  $(\partial_x u|_{x=0,L}=0)$  and a sine transform for vanishing fields at the boundary  $(u|_{x=0,L}=0)$ , where L is the system length.

# Appendix B. Oscillating chemical reaction

As a model for a pattern forming chemical reaction, we use an extended Brusselator model as proposed by Yang et al [49]. The Brusselator is a well-known prototype for reaction—diffusion systems. Typically, this system is a two-component activator-inhibitor model with a bifurcation to Turing patterns or homogenous Hopf oscillations. The model by Yang et al extends the Brusselator by a third component. The dynamics of the three concentration fields u, v and w are given by:

$$\partial_t u = D_u \partial_x^2 u + a - (b+1)u + u^2 v - cu + dw, \tag{2.1a}$$

$$\partial_t v = D_v \partial_x^2 v + bu - u^2 v, \tag{2.1b}$$

$$\partial_t w = D_w \partial_x^2 w + cu - dw. (2.1c)$$

We choose  $a=0.8, c=2, d=1, D_u=0.01, D_v=0$  and  $D_w=1$ . We consider b the control parameter of the system. The homogeneous solution ( $u_h = a$ ,  $v_h = b/a$ ,  $w_h = ac/d$ ) becomes unstable towards traveling waves at the critical value  $b_c = 3.076$ . The intrinsic wavelength of the traveling wave pattern above threshold is  $\lambda_c \approx 9.5$ . We perform our simulations close to pattern onset, for  $b=b_c(1+\varepsilon)$  where  $\varepsilon=0.005$ . The onset of the Turing instability (i.e. of stationary periodic patterns) tends to infinity for  $D_{\nu} \to 0$ . By choosing  $D_{\nu} = 0$ , we thereby eliminate any competition between traveling waves and Turing structures.



# Appendix C. Min oscillation model

As a representative model for the Min oscillations shown in figure 4, we consider the model given by equations (3.1a)–(3.1d) as proposed by Loose *et al* [22] (see also equations [1]–[4] in their supplementary information). This model describes the dynamics of both MinD and MinE in the cytosol ( $c_D$  and  $c_E$ , respectively), the MinD concentration on the membrane  $c_d$  and the concentration of MinD/MinE complexes on the membrane  $c_{de}$ :

$$\partial_t c_D = D_D \partial_x^2 c_D + \omega_{de} c_{de} - c_D (\omega_D + \omega_{dD} c_d), \tag{3.1a}$$

$$\partial_t c_E = D_E \partial_x^2 c_E + \omega_{de} c_{de} - c_E c_d (\omega_E + \omega_{eE} c_{de}^2), \tag{3.1b}$$

$$\partial_t c_d = D_d \partial_x^2 c_d + c_D(\omega_D + \omega_{dD} c_d) - c_E c_d(\omega_E + \omega_{eE} c_{de}^2), \tag{3.1c}$$

$$\partial_t c_{de} = D_{de} \partial_x^2 c_{de} + c_E c_d (\omega_E + \omega_{eE} c_{de}^2) - \omega_{de} c_{de}. \tag{3.1d}$$

For the simulation shown in figure 4 we choose the parameters as suggested in [22]:  $D_D = D_E = 60~\mu\text{m}^2~\text{s}^{-1}$ ,  $D_d = 1.2~\mu\text{m}^2~\text{s}^{-1}$ ,  $D_{de} = 0.4~\mu\text{m}^2~\text{s}^{-1}$ ,  $\omega_{de} = 0.029~\text{s}^{-1}$ ,  $\omega_D = 2.9 \cdot 10^{-4}\text{s}^{-1}$ ,  $\omega_{dD} = 4.8 \cdot 10^{-8}\mu\text{m}^2~\text{s}^{-1}$ ,  $\omega_E = 1.9 \cdot 10^{-9}\mu\text{m}^2~\text{s}^{-1}$ ,  $\omega_{eE} = 2.1 \cdot 10^{-20}\mu\text{m}^6~\text{s}^{-1}$ . We choose a total MinD concentration of  $c_{D,\text{tot}} = c_D + c_d + c_{de} = 3.6 \cdot 10^6\mu\text{m}^{-2}$ , and a total MinE concentration of  $c_{E,\text{tot}} = c_E + c_e + c_{de} = 5.8 \cdot 10^6\mu\text{m}^{-2}$ . In large, quasi-unconfined systems this leads to traveling waves with a typical wavelength  $\lambda_{\text{min}} \approx 71~\mu\text{m}$ .

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