

Relaxation oscillations and hierarchy of feedbacks in MAPK signaling

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Supporting Information

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*Note: Executable model implementations are provided in separate Supplementary Data files 1–4.
Animation of COMSOL output is provided as a separate Video file.*

Supplementary Text S1. Molecular basis of feedbacks relevant to the model.

Positive feedbacks. SOS1, and presumably SOS2 as well, is a target of positive feedback from RAS [1–3]. Somewhat like a classical effector of RAS, such as RAF, SOS1 contains a binding site that preferentially recognizes GTP-loaded (vs. GDP-loaded) RAS. This site, which has been called the allosteric site, is a pocket formed partly by the Ras exchange motif (REM) domain in SOS [1]. It is distinct from the RAS binding site in SOS1's RasGEF domain, which is involved in promoting GDP/GTP exchange [4]. When the allosteric site is occupied by GTP-loaded RAS, SOS1's GEF activity is enhanced relative to the case where the allosteric site is empty or occupied by GDP-loaded RAS [5]. This allosteric enhancement of SOS1's GEF activity represents a positive feedback because GTP-loaded (active) RAS is the product of SOS1's GEF activity. Active RAS and SOS can also participate in a positive feedback mediated by PI3K which promotes membrane recruitment of GAB1, a scaffold for SOS1 and RAS [6]. Another positive feedback arises from the interplay between the CRAF isoform and its substrate MEK. A physical interaction with MEK has been reported to allosterically enhance the kinase activity of CRAF [7]. Furthermore, MEK can increase RAF catalytic activity by contributing to phosphorylation of the N-terminal acidic region of CRAF enabling it to function as an activator in RAF dimers [8]. RAF dimerization may also represent a positive feedback mechanism when RAF dimers stabilize RAS dimers, higher-order oligomers, or RAS nanoclusters [9]. Importantly, all positive feedbacks are of short range: each involves only two proteins, which likely interact with each other at the plasma membrane. Of note, in the ERK/MEK module, a "hidden" positive feedback may arise in the double phosphorylation/dephosphorylation cycle due to distributive phosphorylation and saturability in the dephosphorylation reaction [10].

The vast majority of negative feedbacks in the MAPK/ERK cascade emanate from activated ERK [11], which may be important for ensuring that signals reach ERK before becoming inhibited. These negative feedback loops can be grouped into two categories depending on their position with respect to the positive feedback loops discussed above.

Negative feedback loops downstream of positive feedback loops. There are two well-characterized negative feedback loops that involve ERK-mediated inhibition of MEK and RAF. ERK-mediated phosphorylation of the MEK1 isoform of MEK leads to inhibition of the kinase activities of both MEK1 and MEK2, provided that MEK2 is in complex with MEK1 [18]. As far as RAF is concerned, all its isoforms are hyperphosphorylated by ERK, which has the effect of inhibiting RAF dimerization and disrupting its interaction with RAS, which is an important step in RAF inactivation [19,20].

Negative feedbacks encompassing positive feedbacks. There are two, largely overlapping, feedback loops that involve inhibitory phosphorylation of SOS, mediated either directly by ERK or indirectly by ERK-activated kinase RSK [12]. Phosphorylation of SOS in a C-terminal proline-rich region containing one or more binding sites for Src homology 3 (SH3) domains prevents SOS from interacting with SH3 domain-containing adaptor

proteins, such as GRB2, a binding partner of EGFR [13]. GRB2 also interacts with phosphorylated SHC1 [14], another binding partner of EGFR, and thus GRB2 associates with EGFR both directly and indirectly. Disruption of SOS–GRB2 interaction prevents recruitment of SOS to EGFR via direct and indirect interaction of GRB2 with EGFR. SOS1 contains at least four residues phosphorylated by ERK [15], whereas SOS2 contains only one [16]. This difference suggests that the two isoforms may have different sensitivities to ERK-mediated negative feedbacks. The specificities of ERK and RSK with respect to SOS overlap. Thus, negative feedback to SOS is mediated by a network motif of a feed-forward loop (FFL), a coherent type 3 FFL in the classification scheme of Mangan and Alon [17]. Based on their analysis [17], this FFL can be expected to generate a delay in relief of SOS inhibition upon deactivation of ERK.

Supplementary Text S1 References

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Supplementary Text S2. Non-dimensional model equations

Model equations can be non-dimensionalized by expressing reaction rates in units in which dephosphorylation rate of inhibitory phosphosites in SOS, q , equals 1. There are two general types of equations in the model:

- *Association–dissociation processes:*

$$\frac{d}{dt}XY = b \times X \times Y - u \times XY$$

where b is binding rate, u is unbinding rate, and multiplication is denoted by cross (\times). Let \bar{X} be a total number of X molecules per cell. We can convert amounts X , Y , XY to, respectively, $x = X/\bar{X}$, $y = Y/\bar{X}$, $xy = XY/\bar{X}$ and rates b and u to, respectively, $\beta = b \times \bar{X}/q$ and $v = u/q$. If the above equation for $(d/dt)XY$ is satisfied, then the following equation is satisfied as well:

$$\frac{d}{dt}xy = \beta \times x \times y - v \times xy$$

- *Activation–deactivation processes:*

$$\frac{d}{dt}S_{\text{act}} = a \times R \times S_{\text{inact}} - d \times S_{\text{act}}$$

Let \bar{R} and \bar{S} be total numbers of R (“activator”) and S molecules per cell, respectively. We convert molecule numbers $r = R/\bar{R}$, $s_{\text{act}} = S_{\text{act}}/\bar{S}$, $s_{\text{inact}} = S_{\text{inact}}/\bar{S}$, and rates $\alpha = a \times \bar{R}/q$, $\delta = d/q$ to obtain a non-dimensionalized equation:

$$\frac{d}{dt}s_{\text{act}} = \alpha \times r \times s_{\text{inact}} - \delta \times s_{\text{act}}$$

Therefore, our chemical equations are converted into non-dimensional ones by dividing all reaction rate coefficients by q and by introducing new variables:

- $\text{erk}_x = \text{ERK}_x/\text{ERK}_{\text{tot}}$ where ERK_x stands for any ERK specie,
- $\text{mek}_x = \text{MEK}_x/\text{MEK}_{\text{tot}}$ where MEK_x stands for any MEK specie,
- $\text{raf}_x = \text{RAF}_x/\text{RAF}_{\text{tot}}$ where RAF_x stands for any RAF specie,
- $\text{var} = \text{VAR}/\text{SOS}_{\text{tot}}$ where VAR stands for any other variable (i.e., EGFR, RAS, SOS, RasGAP, and their phosphoforms and complexes); molecules represented by these variables can form complexes and therefore should be rescaled by a common factor, SOS_{tot} .

Supplementary Table S2 contains numerical values of rescaled molecule numbers and rate parameters.

- $A \cdot B$ denotes the amount of complex of A and B (multiplication is written using \times).
- Parameters named $f_{A \rightarrow B}$ denote the strength of a feedback from A to B.

Equations:

$$\begin{aligned} \frac{d}{dt} egfr_a = & \alpha_1 \times EGF \times (egfr_{tot} - (egfr_a + egfr_i \cdot sos_u + egfr_a \cdot sos_u + egfr_i \cdot sos_u \cdot rasGTP \\ & + egfr_i \cdot sos_u \cdot rasGDP + egfr_a \cdot sos_u \cdot rasGTP + egfr_a \cdot sos_u \cdot rasGDP)) - \delta_1 \times egfr_a \\ & - \beta_1 \times egfr_a \times (sos_{tot} - (sos_p + sos_{pp} + sos_{ppp} + sos_{pppp} + egfr_i \cdot sos_u \\ & + egfr_a \cdot sos_u + egfr_i \cdot sos_u \cdot rasGDP + egfr_i \cdot sos_u \cdot rasGTP + egfr_a \cdot sos_u \cdot rasGDP \\ & + egfr_a \cdot sos_u \cdot rasGTP)) + \nu_{1A} \times egfr_a \cdot sos_u \end{aligned}$$

$$\begin{aligned} \frac{d}{dt} sos_p = & -3 \times \rho_3 \times f_{ERK_{pp} \rightarrow SOS1} \times erk_{pp} \times sos_p + 4 \times \rho_3 \times f_{ERK_{pp} \rightarrow SOS1} \times erk_{pp} \times (sos_{tot} \\ & - (sos_p + sos_{pp} + sos_{ppp} + sos_{pppp} + egfr_i \cdot sos_u + egfr_a \cdot sos_u + egfr_i \cdot sos_u \cdot rasGDP \\ & + egfr_i \cdot sos_u \cdot rasGTP + egfr_a \cdot sos_u \cdot rasGDP + egfr_a \cdot sos_u \cdot rasGTP)) - sos_p + 2 \times sos_{pp} \end{aligned}$$

$$\begin{aligned} \frac{d}{dt} sos_{pp} = & 3 \times \rho_3 \times f_{ERK_{pp} \rightarrow SOS1} \times erk_{pp} \times sos_p + 3 \times sos_{ppp} - 2 \times sos_{pp} \\ & - 2 \times \rho_3 \times f_{ERK_{pp} \rightarrow SOS1} \times erk_{pp} \times sos_{pp} \end{aligned}$$

$$\begin{aligned} \frac{d}{dt} sos_{ppp} = & 2 \times \rho_3 \times f_{ERK_{pp} \rightarrow SOS1} \times erk_{pp} \times sos_{pp} + 4 \times sos_{pppp} - 3 \times sos_{ppp} \\ & - \rho_3 \times f_{ERK_{pp} \rightarrow SOS1} \times erk_{pp} \times sos_{ppp} \end{aligned}$$

$$\frac{d}{dt} sos_{pppp} = \rho_3 \times f_{ERK_{pp} \rightarrow SOS1} \times erk_{pp} \times sos_{ppp} - 4 \times sos_{pppp}$$

$$\begin{aligned} \frac{d}{dt} egfr_i \cdot sos_u = & \nu_{2B} \times egfr_i \cdot sos_u \cdot rasGDP - \alpha_1 \times EGF \times egfr_i \cdot sos_u - \nu_{1B} \times egfr_i \cdot sos_u \\ & + \delta_1 \times egfr_a \cdot sos_u - \beta_{2B} \times egfr_i \cdot sos_u \times (ras_{tot} - (rasGTP + rasGTP \cdot rasgap \\ & + rasGDP \cdot rasfap + egfr_i \cdot sos_u \cdot rasGDP + egfr_i \cdot sos_u \cdot rasGTP + egfr_a \cdot sos_u \cdot rasGDP \\ & + egfr_a \cdot sos_u \cdot rasGTP)) + \nu_{2A} \times egfr_i \cdot sos_u \cdot rasGTP - \beta_{2A} \times egfr_i \cdot sos_u \times rasGTP \end{aligned}$$

$$\begin{aligned} \frac{d}{dt} egfr_a \cdot sos_u = & \beta_1 \times egfr_a \times (sos_{tot} - (sos_p + sos_{pp} + sos_{ppp} + sos_{pppp} \\ & + egfr_i \cdot sos_u + egfr_a \cdot sos_u + egfr_i \cdot sos_u \cdot rasGDP \\ & + egfr_i \cdot sos_u \cdot rasGTP + egfr_a \cdot sos_u \cdot rasGDP + egfr_a \cdot sos_u \cdot rasGTP)) \\ & - \beta_{2B} \times egfr_a \cdot sos_u \times (ras_{tot} - (rasGTP + rasGTP \cdot rassgap + rasGDP \cdot rasgap \\ & + egfr_i \cdot sos_u \cdot rasGDP + egfr_i \cdot sos_u \cdot rasGTP + egfr_a \cdot sos_u \cdot rasGDP \\ & + egfr_a \cdot sos_u \cdot rasGTP)) - \nu_{1A} \times egfr_a \cdot sos_u + \nu_{2A} \times egfr_a \cdot sos_u \cdot rasGTP \\ & + \nu_{2B} \times egfr_a \cdot sos_u \cdot rasGDP + \alpha_1 \times EGF \times egfr_i \cdot sos_u \\ & - \beta_{2A} \times egfr_a \cdot sos_u \times rasGTP - \delta_1 \times egfr_a \cdot sos_u \end{aligned}$$

$$\begin{aligned}
 \frac{d}{dt}ras_{GTP} = & \kappa_{2B} \times egfr_i \cdot sos_u \cdot ras_{GDP} \times (ras_{tot} - (ras_{GTP} + ras_{GTP} \cdot ras_{gap} + ras_{GDP} \cdot ras_{gap} \\
 & + egfr_i \cdot sos_u \cdot ras_{GDP} + egfr_i \cdot sos_u \cdot ras_{GTP} + egfr_a \cdot sos_u \cdot ras_{GDP} \\
 & + egfr_a \cdot sos_u \cdot ras_{GTP})) + \nu_{2A} \times egfr_i \cdot sos_u \cdot ras_{GTP} - \beta_{2A} \times egfr_a \cdot sos_u \times ras_{GTP} \\
 & + \kappa_{2B} \times egfr_a \cdot sos_u \cdot ras_{GDP} \times (ras_{tot} - (ras_{GTP} + ras_{GTP} \cdot ras_{gap} + ras_{GDP} \cdot ras_{gap} \\
 & + egfr_i \cdot sos_u \cdot ras_{GDP} + egfr_i \cdot sos_u \cdot ras_{GTP} + egfr_a \cdot sos_u \cdot ras_{GDP} \\
 & + egfr_a \cdot sos_u \cdot ras_{GTP})) + \kappa_{2A} \times egfr_i \cdot sos_u \cdot ras_{GTP} \times (ras_{tot} - (ras_{GTP} \\
 & + ras_{GTP} \cdot ras_{gap} + ras_{GDP} \cdot ras_{gap} + egfr_i \cdot sos_u \cdot ras_{GDP} + egfr_i \cdot sos_u \cdot ras_{GTP} \\
 & + egfr_a \cdot sos_u \cdot ras_{GDP} + egfr_a \cdot sos_u \cdot ras_{GTP})) + \nu_{2A} \times egfr_a \cdot sos_u \cdot ras_{GTP} \\
 & - \beta_{2A} \times egfr_i \cdot sos_u \times ras_{GTP} + \kappa_{2A} \times egfr_a \cdot sos_u \cdot ras_{GTP} \times (ras_{tot} - (ras_{GTP} \\
 & + ras_{GTP} \cdot ras_{gap} + ras_{GDP} \cdot ras_{gap} + egfr_i \cdot sos_u \cdot ras_{GDP} + egfr_i \cdot sos_u \cdot ras_{GTP} \\
 & + egfr_a \cdot sos_u \cdot ras_{GDP} + egfr_a \cdot sos_u \cdot ras_{GTP})) - \beta_3 \times (ras_{gap_{tot}} - (ras_{GTP} \cdot ras_{gap} \\
 & + ras_{GDP} \cdot ras_{gap})) \times ras_{GTP}
 \end{aligned}$$

$$\begin{aligned}
 \frac{d}{dt}egfr_i \cdot sos_u \cdot ras_{GDP} = & -\nu_{2B} \times egfr_i \cdot sos_u \cdot ras_{GDP} + \delta_1 \times egfr_a \cdot sos_u \cdot ras_{GDP} \\
 & -\alpha_1 \times EGF \times egfr_i \cdot sos_u \cdot ras_{GDP} + \beta_{2B} \times egfr_i \cdot sos_u \\
 & \times (ras_{tot} - (ras_{GTP} + ras_{GTP} \cdot ras_{gap} + ras_{GDP} \cdot ras_{gap} + egfr_i \cdot sos_u \cdot ras_{GDP} \\
 & + egfr_i \cdot sos_u \cdot ras_{GTP} + egfr_a \cdot sos_u \cdot ras_{GDP} + egfr_a \cdot sos_u \cdot ras_{GTP}))
 \end{aligned}$$

$$\begin{aligned}
 \frac{d}{dt}egfr_i \cdot sos_u \cdot ras_{GTP} = & \beta_{2A} \times egfr_i \cdot sos_u \times ras_{GTP} - \alpha_1 \times EGF \times egfr_i \cdot sos_u \cdot ras_{GTP} \\
 & -\nu_{2A} \times egfr_i \cdot sos_u \cdot ras_{GTP} + \delta_1 \times egfr_a \cdot sos_u \cdot ras_{GTP}
 \end{aligned}$$

$$\begin{aligned}
 \frac{d}{dt}egfr_a \cdot sos_u \cdot ras_{GDP} = & \beta_{2B} \times egfr_a \cdot sos_u \times (ras_{tot} - (ras_{GTP} + ras_{GTP} \cdot ras_{gap} + ras_{GDP} \cdot ras_{gap} \\
 & + egfr_i \cdot sos_u \cdot ras_{GDP} + egfr_i \cdot sos_u \cdot ras_{GTP} + egfr_a \cdot sos_u \cdot ras_{GDP} \\
 & + egfr_a \cdot sos_u \cdot ras_{GTP})) - \delta_1 \times egfr_a \cdot sos_u \cdot ras_{GDP} \\
 & + \alpha_1 \times EGF \times egfr_i \cdot sos_u \cdot ras_{GDP} - \nu_{2B} \times egfr_a \cdot sos_u \cdot ras_{GDP}
 \end{aligned}$$

$$\begin{aligned}
 \frac{d}{dt}egfr_a \cdot sos_u \cdot ras_{GTP} = & \alpha_1 \times EGF \times egfr_i \cdot sos_u \cdot ras_{GTP} + \beta_{2A} \times egfr_a \cdot sos_u \times ras_{GTP} \\
 & -\nu_{2A} \times egfr_a \cdot sos_u \cdot ras_{GTP} - \delta_1 \times egfr_a \cdot sos_u \times ras_{GTP}
 \end{aligned}$$

$$\frac{d}{dt}ras_{GDP} \cdot ras_{gap} = -\nu_3 \times ras_{GDP} \cdot ras_{gap} + \kappa_3 \times ras_{GTP} \cdot ras_{gap}$$

$$\frac{d}{dt}ras_{GTP} \cdot ras_{gap} = -\kappa_3 \times ras_{GTP} \cdot ras_{gap} + \beta_3 \times (ras_{gap_{tot}} - (ras_{GTP} \cdot ras_{gap} + ras_{GDP} \cdot ras_{gap})) \times ras_{GTP}$$

$$\frac{d}{dt} raf_a = -\rho_6 \times f_{ERK_{pp} \mapsto RAF} \times erk_{pp} \times raf_a - \delta_2 \times raf_a + \alpha_2 \times ras_{GTP} \times (raf_{tot} - (raf_a + raf_p))$$

$$\frac{d}{dt} raf_p = \rho_6 \times f_{ERK_{pp} \mapsto RAF} \times erk_{pp} \times raf_a + \rho_6 \times f_{ERK_{pp} \mapsto RAF} \times erk_{pp} \times (raf_{tot} - (raf_a + raf_p)) - raf_p$$

$$\begin{aligned} \frac{d}{dt} mek_{u,T292p} &= -mek_{u,T292p} + \rho_4 \times f_{ERK_{pp} \mapsto MEK1} \times erk_{pp} \times (mek_{tot} - (mek_{u,T292p} + mek_{p,T292u} \\ &\quad + mek_{p,T292p} + mek_{pp,T292u} + mek_{pp,T292p})) + \sigma_1 \times mek_{p,T292p} + \sigma_5 \times mek_{p,T292p} \\ &\quad - 2 \times \rho_1 \times mek_{p,T292p} \times raf_a \end{aligned}$$

$$\begin{aligned} \frac{d}{dt} mek_{p,T292u} &= mek_{p,T292p} - \sigma_1 \times mek_{p,T292u} + 2 \times q_1 \times mek_{pp,T292u} - \sigma_1 \times mek_{p,T292u} \times raf_a \\ &\quad + 2 \times \rho_1 \times (mek_{tot} - (mek_{u,T292p} + mek_{p,T292u} + mek_{p,T292p} + mek_{pp,T292u} \\ &\quad + mek_{pp,T292p})) \times raf_a - \rho_4 \times f_{ERK_{pp} \mapsto MEK1} \times erk_{pp} \times mek_{p,T292u} \end{aligned}$$

$$\begin{aligned} \frac{d}{dt} mek_{p,T292p} &= \rho_4 \times f_{ERK_{pp} \mapsto MEK1} \times erk_{pp} \times mek_{p,T292u} - \sigma_1 \times mek_{p,T292p} - \rho_1 \times mek_{p,T292p} \times raf_a \\ &\quad - mek_{p,T292p} - \sigma_5 \times mek_{p,T292p} + 2 \times \sigma_5 \times mek_{pp,T292p} + 2 \times \sigma_1 \times mek_{pp,T292p} \\ &\quad + 2 \times \rho_1 \times mek_{u,T292p} \times raf_a \end{aligned}$$

$$\begin{aligned} \frac{d}{dt} mek_{pp,T292u} &= -\rho_4 \times f_{ERK_{pp} \mapsto MEK1} \times erk_{pp} \times mek_{pp,T292u} - 2 \times \sigma_1 \times mek_{pp,T292u} + \rho_1 \times mek_{p,T292u} \times raf_a \\ &\quad + mek_{pp,T292p} \end{aligned}$$

$$\begin{aligned} \frac{d}{dt} mek_{pp,T292p} &= \rho_1 \times mek_{p,T292p} \times raf_a + \rho_4 \times f_{ERK_{pp} \mapsto MEK1} \times erk_{pp} \times mek_{pp,T292u} - mek_{pp,T292p} \\ &\quad - 2 \times \sigma_1 \times mek_{pp,T292p} - 2 \times \sigma_5 \times mek_{pp,T292p} \end{aligned}$$

$$\begin{aligned} \frac{d}{dt} erk_p &= 2 \times \sigma_2 \times erk_{pp} + 2 \times \rho_2 \times mek_{pp,T292u} \times (erk_{tot} - (erk_p + erk_{pp})) - \sigma_2 \times erk_p \\ &\quad - \rho_2 \times mek_{pp,T292u} \times erk_p + 2 \times \rho_2 \times mek_{pp,T292p} \times (erk_{tot} - (erk_p + erk_{pp})) \\ &\quad - \rho_2 \times mek_{pp,T292p} \times erk_p \end{aligned}$$

$$\frac{d}{dt} erk_{pp} = \rho_2 \times mek_{pp,T292p} \times erk_p - 2 \times \sigma_2 \times erk_{pp} + \rho_2 \times mek_{pp,T292u} \times erk_p$$

Supplementary Tables

Supplementary Table S1. Parameter values.

Parameter	Description (see also Fig. 2 in the main text)
<i>Concentrations</i> (protein copy number per cell)	
$EGFR_{tot} = 3 \times 10^5$	Total number of EGFR molecules (as reported for MCF10A cells [21,22])
$RAS_{tot} = 6 \times 10^4$	Total number of RAS molecules
$SOS_{tot} = 10^5$	Total number of SOS molecules
$RasGAP_{tot} = 6 \times 10^3$	Total number of RasGAP molecules
$RAF_{tot} = 5 \times 10^5$	Total number of RAF molecules
$MEK_{tot} = 2 \times 10^5$	Total number of MEK molecules
$ERK_{tot} = 3 \times 10^6$	Total number of ERK molecules
<i>Rate constant for fast processes</i> (s^{-1})	
$k_{fast} = 100$	As a simplification, three (pseudo) first-order processes considered in the model are assumed to be fast.
<i>Rate constants for activation processes</i> [(molecules/cell) $^{-1} s^{-1}$ except (pg/ml) $^{-1} s^{-1}$ for a_1]	
$a_1 = 5 \times 10^{-5}$	EGF-mediated activation of EGFR
$a_2 = 10^{-7}$	Activation of RAF by RAS-GTP
$b_1 = 10^{-5}$	Binding of EGF-activated EGFR and dephosphorylated SOS
$p_1 = 10^{-7}$	Phosphorylation of MEK's activation sites by RAF
$p_2 = 3 \times 10^{-6}$	Phosphorylation of ERK's activation sites by MEK
<i>Rate constants for deactivation processes</i> (s^{-1})	
$d_1 = d = 0.01$	Deactivation of EGFR
$d_2 = d$	Deactivation of RAF (spontaneous)
$u_{1A} = d$	Dissociation of active EGFR–SOS complex

$q_1 = d$	Dephosphorylation of MEK's activation sites
$q_2 = d$	Dephosphorylation of ERK's activation sites
<i>Rate constants for SOS association reactions [(molecules/cell)⁻¹ s⁻¹] and dissociation reactions (s⁻¹)</i>	
$b_{2A} = 10^{-6}$	Association of SOS and RAS-GTP
$b_{2B} = 0.1 \times b_{2A}$	Association of SOS and RAS-GDP
$u_{1B} = k_{\text{fast}}$	Dissociation of inactive EGFR–SOS complex
$u_{2A} = u_{2B} = 1$	Dissociation of SOS–RAS-GTP complex and SOS–RAS-GDP complex
<i>Rate constants associated with SOS-to-RAS positive feedback [(molecules/cell)⁻¹ s⁻¹ except s⁻¹ for k_3 and u_3]</i>	
$k_{2A} = 10^{-4}$	SOS's nucleotide-exchange activity when RAS-GTP is bound to its REM domain
$k_{2B} = 0.1 \times k_{2A}$	SOS's nucleotide-exchange activity when RAS-GDP is bound to its REM domain
$k_{2C} = 0$	SOS's nucleotide-exchange activity when no RAS is bound to its REM domain
$b_3 = 10^{-5}$	Association of RasGAP and RAS-GTP
$k_3 = k_{\text{fast}}$	RasGAP-facilitated RAS-GTP→RAS-GDP hydrolysis
$u_3 = 0.01$	Dissociation of RasGAP from RAS-GDP after hydrolysis of GTP
<i>Rate constants associated with ERK-mediated negative feedbacks [(molecules/cell)⁻¹ s⁻¹]</i>	
$p_3 = 3 \times 10^{-9}$	Phosphorylation of unbound SOS by active ERK
$p_4 = p_6 = p = 6 \times 10^{-10}$	Phosphorylation of MEK (T292 in MEK1) and RAF by active ERK
<i>Rate constants for (spontaneous) dephosphorylation reactions (s⁻¹)</i>	
$q_3 = q_4 = q_6 = q = 3 \times 10^{-4}$	Dephosphorylation of inhibitory phosphosites in SOS, MEK (T292 in MEK1), RAF
$q_5 = k_{\text{fast}}$	Dephosphorylation of MEK's activation sites when T292 (in MEK1) is phosphorylated

<i>ERK activity reporters – concentrations (protein copy number per cell)</i>	
$EKAR3_{tot} = ERKTR_{tot} = 10^6$	Total number of EKAR3 and ERKTR molecules
<i>ERK activity reporters – rate constants for activation reactions [(molecules/cell)⁻¹ s⁻¹]</i>	
$a_{EKAR3} = 3 \times 10^{-9}$	EKAR3 activation rate by active ERK
$a_{ERKTR} = 10^{-9}$	ERKTR activation rate by active ERK
<i>ERK activity reporters – rate constants for deactivation reactions (s⁻¹)</i>	
$d_{EKAR3} = 10^{-3}$	EKAR3 deactivation rate
$d_{ERKTR} = 2 \times 10^{-3}$	ERKTR deactivation rate

Supplementary Table S2. Non-dimensional parameter values.

Non-dimensional parameter	Description
<i>Concentrations</i>	
$egfr_{tot} = 3$	Total number of EGFR molecules
$ras_{tot} = 0.6$	Total number of RAS molecules
$sos_{tot} = 1$	Total number of SOS molecules
$rasgap_{tot} = 0.06$	Total number of RasGAP molecules
$raf_{tot} = 1$	Total number of RAF molecules
$mek_{tot} = 1$	Total number of MEK molecules
$erk_{tot} = 1$	Total number of ERK molecules
<i>Rate constant for fast processes</i>	
$\kappa_{fast} = \frac{1}{3} \times 10^6$	As a simplification, three (pseudo) first-order processes considered in the model are assumed to be fast.
<i>Rate constants for activation processes</i>	
$\alpha_1 = \frac{1}{6}$	EGF-mediated activation of EGFR
$\alpha_2 = \frac{1}{3} \times 10^2$	Activation of RAF by RAS-GTP
$\beta_1 = \frac{1}{3} \times 10^4$	Binding of EGF-activated EGFR and dephosphorylated SOS
$\rho_1 = 166 \frac{2}{3}$	Phosphorylation of MEK's activation sites by RAF
$\rho_2 = 2 \times 10^3$	Phosphorylation of ERK's activation sites by MEK
<i>Rate constants for deactivation processes</i>	
$\delta_1 = \delta = \frac{1}{3} \times 10^2$	Deactivation of EGFR
$\delta_2 = \delta$	Deactivation of RAF (spontaneous)
$v_{1A} = \delta$	Dissociation of active EGFR–SOS complex

$\sigma_1 = \delta$	Dephosphorylation of MEK's activation sites
$\sigma_2 = \delta$	Dephosphorylation of ERK's activation sites
<i>Rate constants for SOS association reactions</i>	
$\beta_{2A} = \frac{1}{3} \times 10^3$	Association of SOS and RAS-GTP
$\beta_{2B} = 0.1 \times \beta_{2A}$	Association of SOS and RAS-GDP
$v_{1B} = \kappa_{\text{fast}}$	Dissociation of inactive EGFR–SOS complex
$v_{2A} = v_{2B} = \frac{1}{3} \times 10^4$	Dissociation of SOS–RAS-GTP complex and SOS–RAS-GDP complex
<i>Rate constants associated with SOS-to-RAS positive feedback</i>	
$\kappa_{2A} = \frac{1}{3} \times 10^5$	SOS's nucleotide-exchange activity when RAS-GTP is bound to its REM domain
$\kappa_{2B} = 0.1 \times \kappa_{2A}$	SOS's nucleotide-exchange activity when RAS-GDP is bound to its REM domain
$\kappa_{2C} = 0$	SOS's nucleotide-exchange activity when no RAS is bound to its REM domain
$\beta_3 = \frac{1}{3} \times 10^4$	Association of RasGAP and RAS-GTP
$\kappa_3 = \kappa_{\text{fast}}$	RasGAP-facilitated RAS-GTP→RAS-GDP hydrolysis
$v_3 = \frac{1}{3} \times 10^2$	Dissociation of RasGAP from RAS-GDP after hydrolysis of GTP
<i>Rate constants associated with ERK-mediated negative feedbacks</i>	
$\rho_3 = 30$	Phosphorylation of unbound SOS by active ERK
$\rho_4 = \rho_6 = \rho = 6$	Phosphorylation of MEK (T292 in MEK1) and RAF by active ERK
<i>Rate constants for (spontaneous) dephosphorylation reactions</i>	
1 (time scale)	Dephosphorylation of inhibitory phosphosites in SOS, MEK (T292 in MEK1), RAF
$\sigma_5 = \kappa_{\text{fast}}$	Dephosphorylation of MEK's activation sites when T292 (in MEK1) is phosphorylated

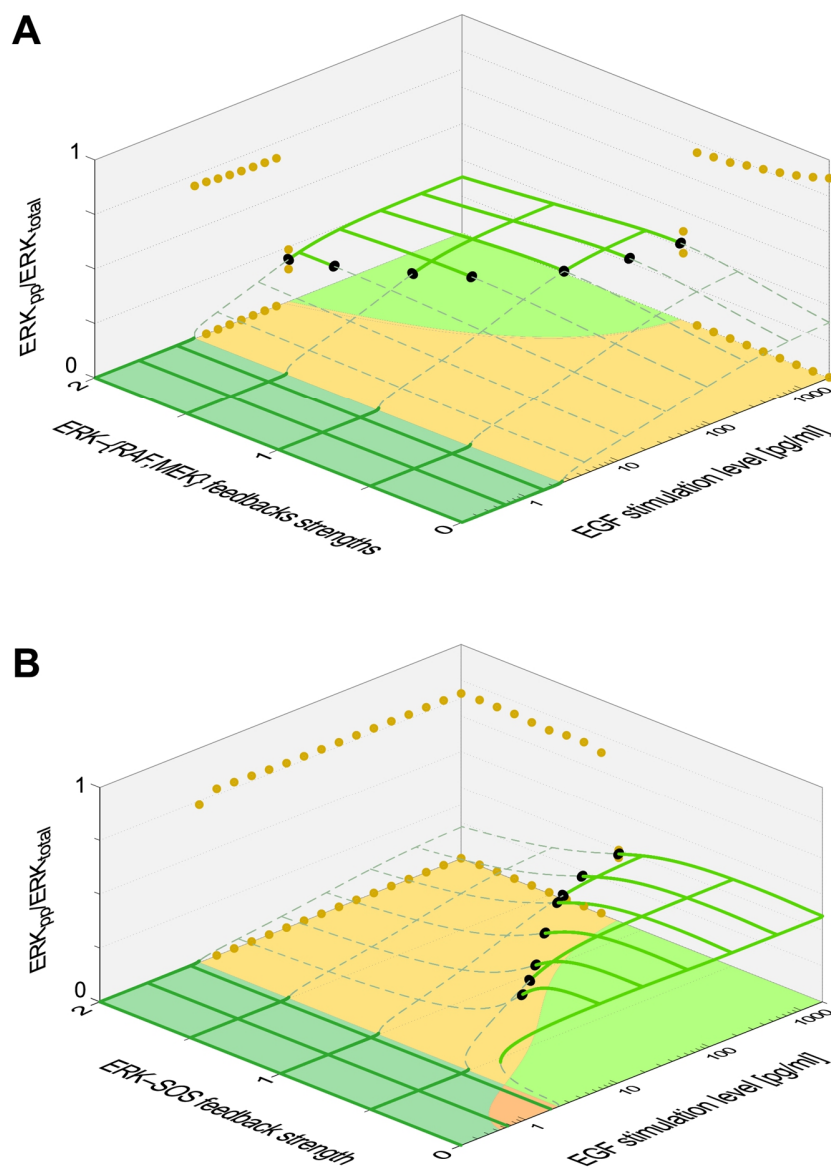
Supplementary Table S3. Parameters of the stochastic model accounting for cell-to-cell variability in EGFR expression dynamics. These parameters, together with parameters in Supplementary Table S1, were used to perform simulations shown in Fig. 8 in the main text.

Parameter	Description
$\mu_{\text{EGFR}} = -0.03125$, $\sigma_{\text{EGFR}} = 0.25$ $A_{\text{burst}} = 60 \text{ s}^{-1}$	Intensity of EGFR production within each burst in a cell is computed as $A_{\text{burst}} \times \alpha_{\text{cell}}$, where α_{cell} has the log-normal distribution $\ln\mathcal{N}(\mu_{\text{EGFR}}, \sigma_{\text{EGFR}})$ with mean of 1.0 and variance of about 0.0645.
$\lambda_{\text{interburst}} = 1/6 \text{ h}^{-1}$	Waiting times between EGFR bursts are distributed exponentially with a mean waiting time of $\lambda_{\text{interburst}}^{-1}$.
$\lambda_{\text{burst}} = 1 \text{ h}^{-1}$	Durations of EGFR bursts are distributed exponentially with mean burst duration of $\lambda_{\text{burst}}^{-1}$.
$\tau_{\text{EGFR}} = 12 \text{ h}$	EGFR half-life.

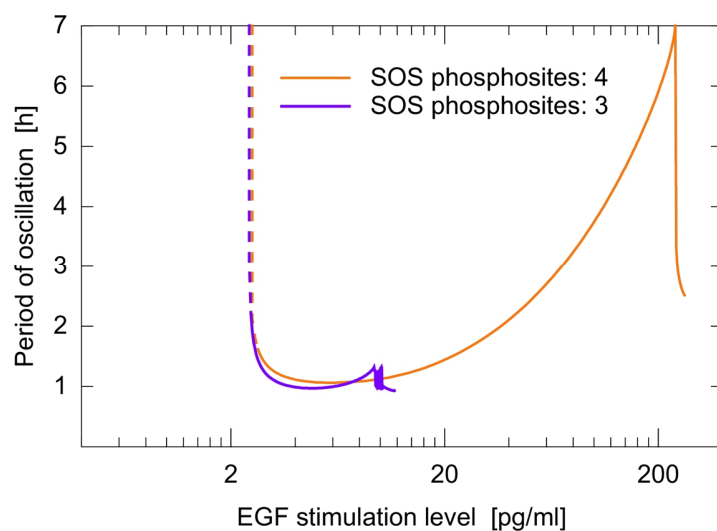
Supplementary Table S4. Parameters of the spatial model accounting for extracellular, localized stochastic releases of EGF. These parameters, together with parameters in Supplementary Table S1, were used to perform simulations shown in Fig. 10 and Supplementary Video 1.

Parameter	Description
$V_{\text{cell}} = 2000 \mu\text{m}^3$	Volume and radius of the (spherical) cell
$R_{\text{cell}} \approx 7.8 \mu\text{m}$	
$D_{\text{mem}} = 10^{-2} \mu\text{m}^2/\text{s}$	Diffusion coefficient of membrane proteins: EGFR, SOS, RAS, and RasGAP, and their complexes
$D_{\text{cyt}} = 10 \times D_{\text{mem}} = 10^{-1} \mu\text{m}^2/\text{s}$	Diffusion coefficient of cytosolic proteins: RAF, MEK, ERK
$R_{\text{EGF_shell_in}} = R_{\text{cell}} \approx 7.8 \mu\text{m}$	Inner and outer radii: point sources of EGF randomly appear uniformly within a concentric shell around a cell
$R_{\text{EGF_shell_out}} = 10 \times R_{\text{cell}} \approx 78 \mu\text{m}$	
$\mu_{\text{EGF}} = -1.25, \sigma_{\text{EGF}} = 0.5$	EGF source intensity, A_{EGF} , is drawn from a log-normal distribution $\ln\mathcal{N}(\mu_{\text{EGF}}, \sigma_{\text{EGF}})$ with mean 3.25×10^{-1} and variance 2.99×10^{-2}
$D_{\text{EGF}} = 10 \times D_{\text{cyt}} = 1 \mu\text{m}^2/\text{s}$	Diffusion coefficient of EGF
$\gamma_{\text{EGF}} = 8.33 \times 10^{-4} \text{s}^{-1}$	EGF degradation rate constant
$\lambda_{\text{EGF_source}} = 8.33 \times 10^{-4} \text{s}^{-1}$	EGF-releasing point source durations are drawn from an exponential distribution with mean $\lambda_{\text{EGF_source}}^{-1} = 20 \text{min}$
$f_{\text{EGF_sources}} = 1.11 \times 10^{-3} \text{s}^{-1}$	EGF sources appear at random time points during the simulation, on average every 15 min

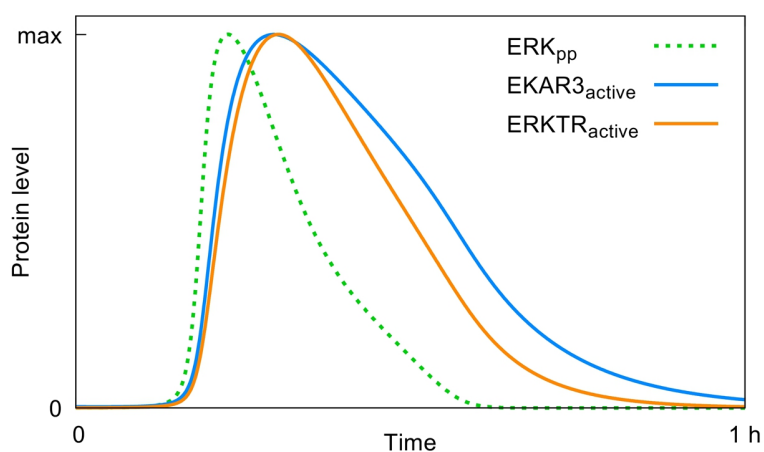
Supplementary Figures



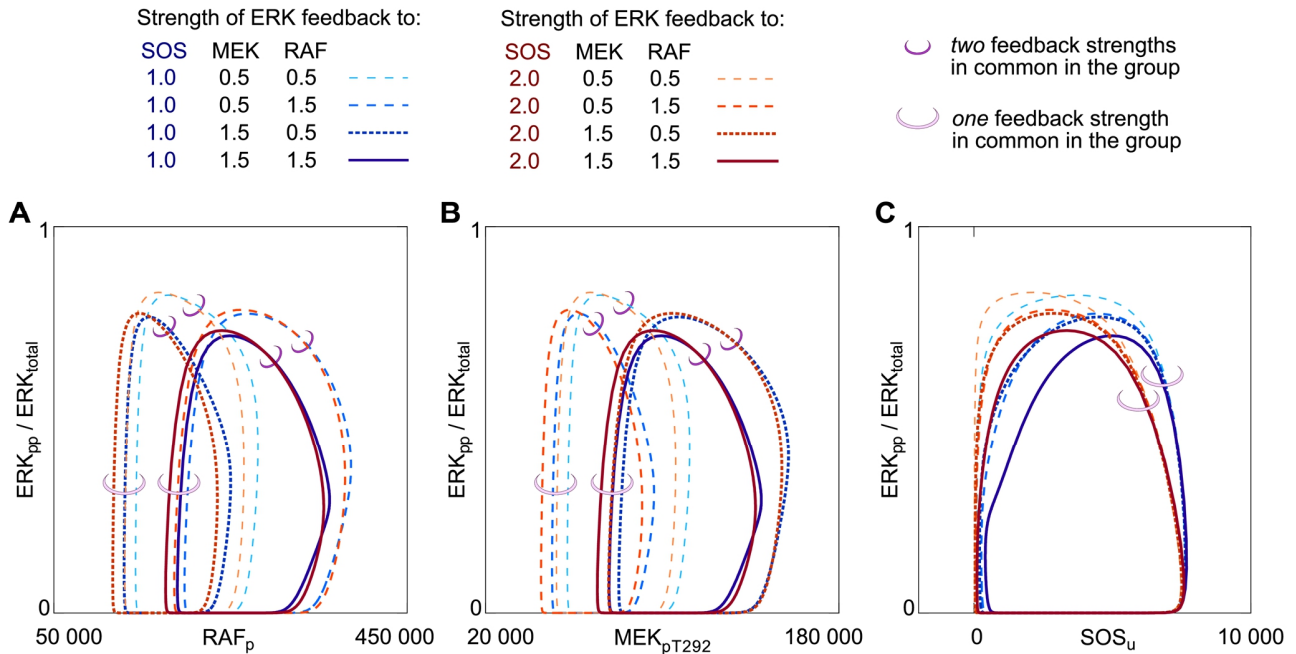
Supplementary Figure S1. Two-dimensional bifurcation diagrams. These diagrams complement Figs. 3A (A) and 3B (B) in the main text. In each panel, the x - and y -axes indicate the values of bifurcation parameters, as in Figs. 3A and 3B. The z -axis indicates the values of recurrent solutions (i.e., steady states and limit cycles) for activated ERK. Yellow dots mark the envelopes (i.e., the upper and lower bounds) of limit cycles. As in Fig. 5, black dots indicate supercritical Hopf bifurcation points.



Supplementary Figure S2. Effect of multi-site phosphorylation of SOS on oscillatory behavior. Ablation of a single ERK substrate in SOS decreases the range of EGF stimulation for which oscillations in ERK activity are observed. When SOS contains only one or two ERK substrates, the oscillatory regime vanishes.

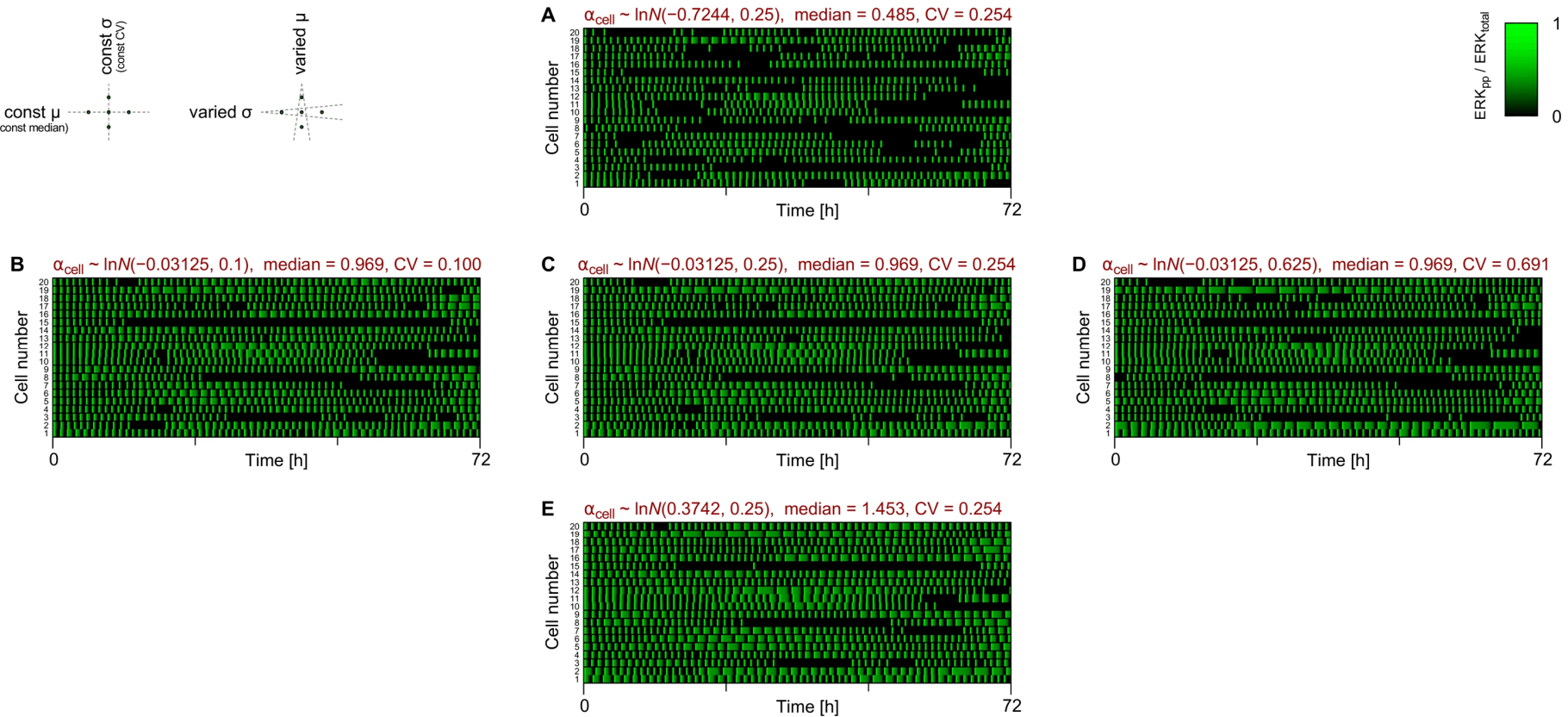
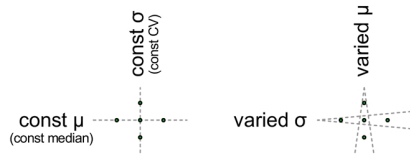


Supplementary Figure S3. Time profiles of active ERK (ERK_{pp}) and its two reporters, EKAR3 and ERKTR. Trajectories were obtained for an EGF dose of 5 pg/ml. Activation and deactivation rates of both reporters are given in Table 1 in the main text.

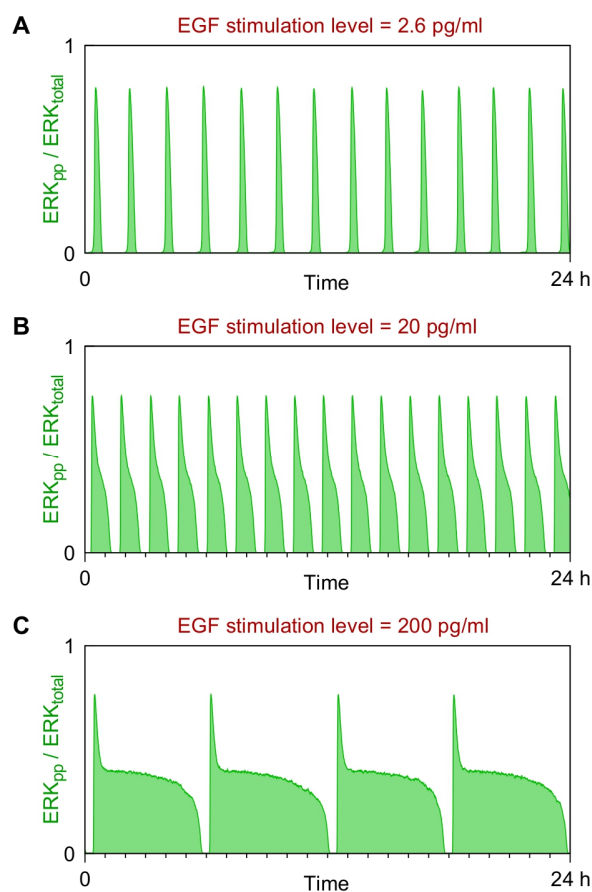


Supplementary Figure S4. Phase space analysis of sensitivity of oscillatory behavior to negative feedback strengths. Each diagram illustrates eight limit cycles in a different planar projection of phase space. As indicated in the legend at top by line style, each trajectory is associated with a unique set of strengths for the ERK-to-SOS, ERK-to-MEK, and ERK-to-RAF feedbacks. Blue curves indicate trajectories corresponding to the default strength of negative feedback from ERK to SOS; red curves indicate trajectories corresponding to a 2-fold higher strength. **(A)** Trajectories in the ERK_{pp}/ERK_{total} – RAF_p projection plane. **(B)** Trajectories in the ERK_{pp}/ERK_{total} – MEK_{pT292} projection plane. **(C)** Trajectories in the ERK_{pp}/ERK_{total} – SOS_u projection plane. These parametric plots indicate that trajectories cluster together depending on their associated feedback strengths. Tight clusters (involving trajectories having two feedback strengths in common) are decorated with small rings. Looser clusters (involving trajectories having a single feedback strength in common) are decorated with large rings. Importantly, clustering depends on projection plane.

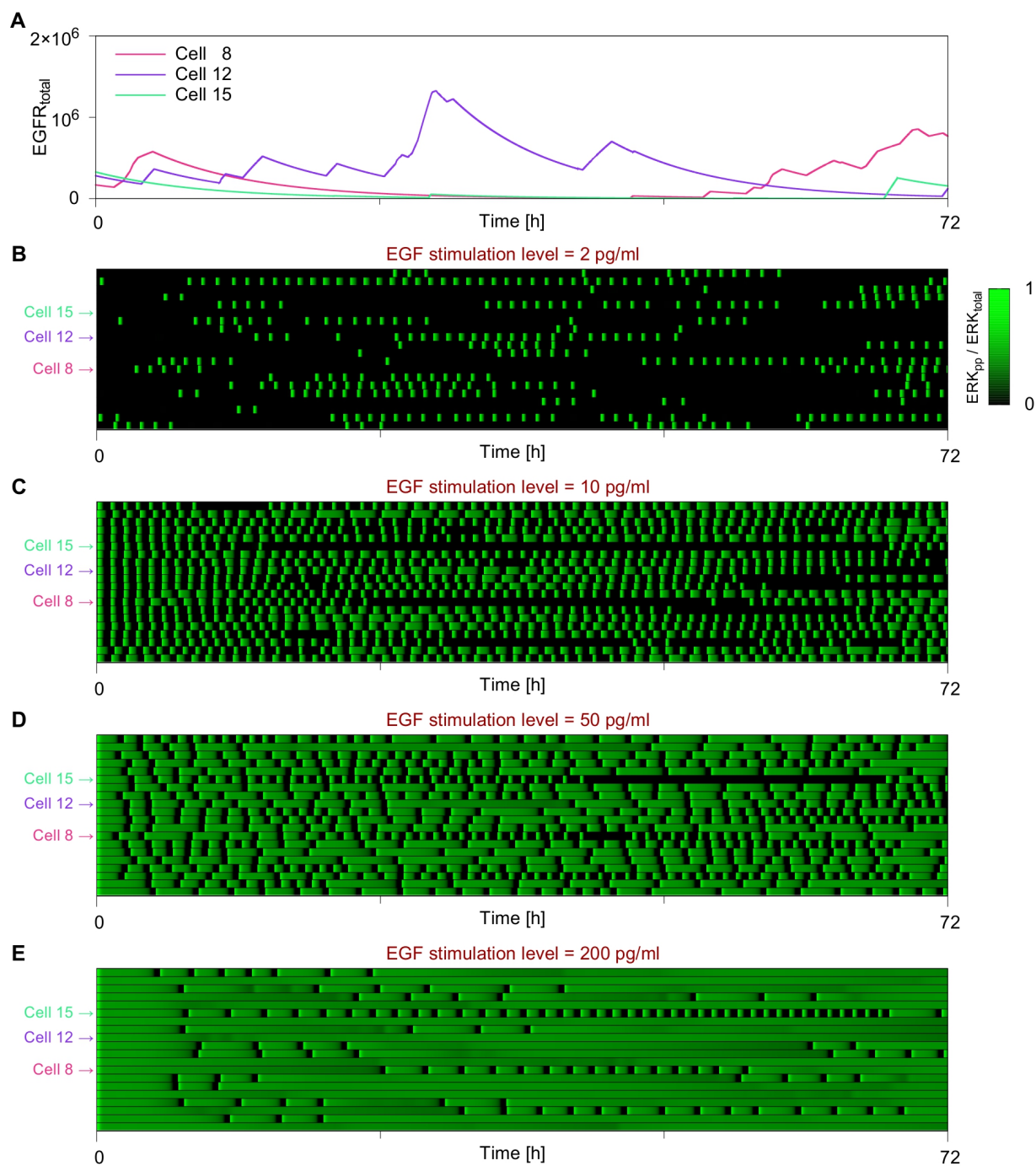
Analysis of log-normal distribution parameters μ , σ :



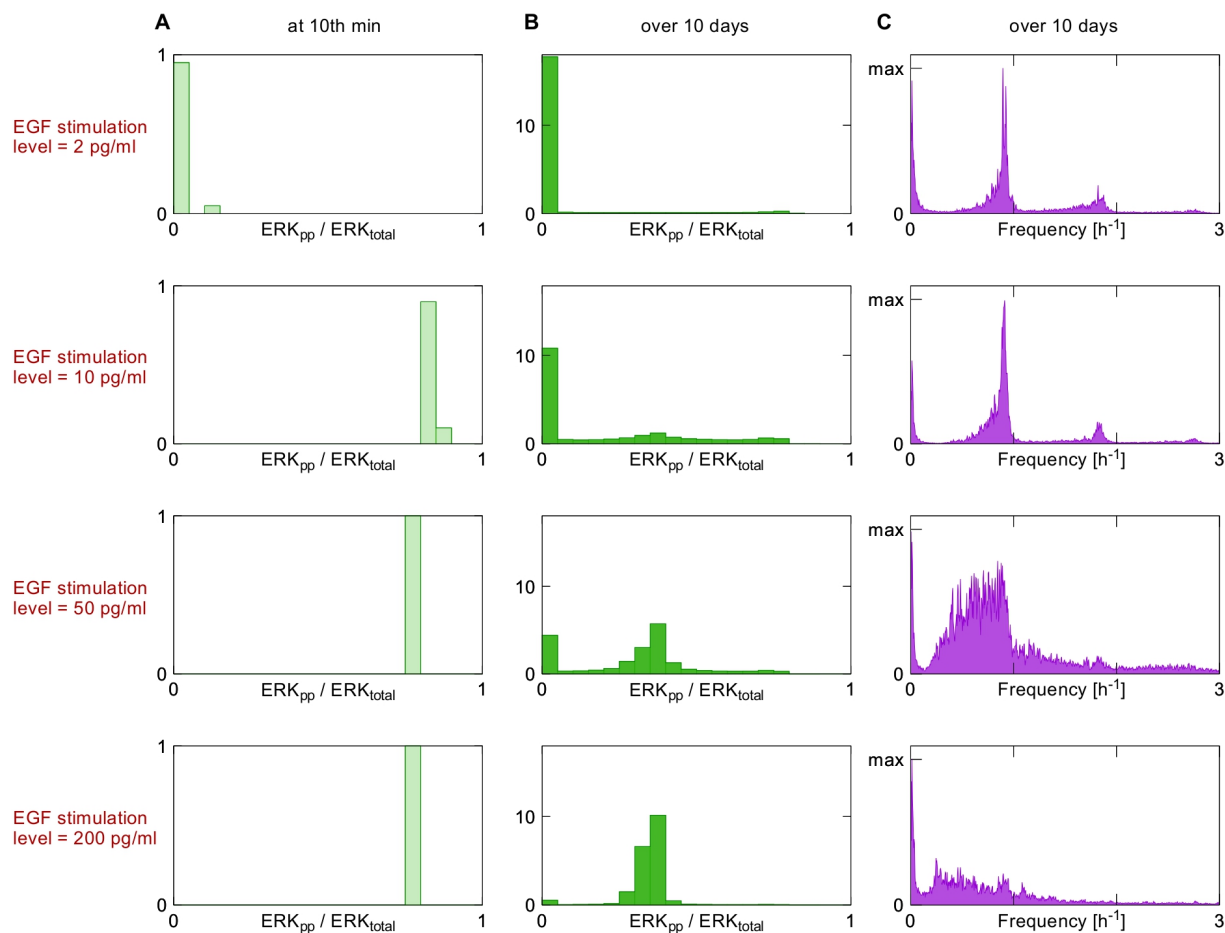
Supplementary Figure S5. Influence of extrinsic noise features on the oscillatory behavior. Each panel shows the results of 20 stochastic simulations of single-cell behavior for different values of two extrinsic noise parameters, which control the median and coefficient of variation (CV) of the EGFR surface expression burst size. Frequency of ERK activity pulses varies with the level of EGFR. In all simulations, oscillatory behavior is induced by an EGF dose of 10 pg/ml. Note that the central panel is for the same parameters as Fig. 8C (in the main text).



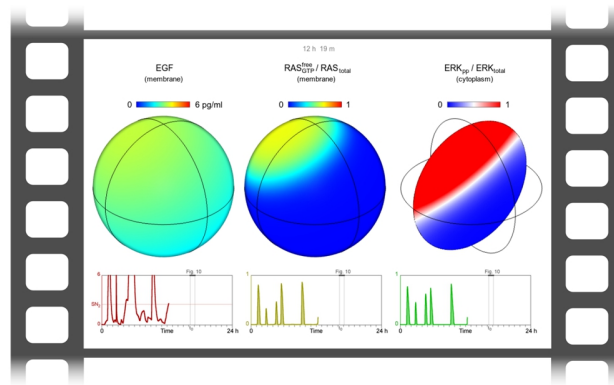
Supplementary Figure S6. Effect of intrinsic noise on system trajectories. At the assumed protein copy numbers per cell, the influence of intrinsic noise on system behavior is very weak; in panel C it can be visible as fine ripples. The simulations were performed using the Gillespie algorithm for default system parameters (Supplementary Table S1). This figure corresponds to Fig. 4 in the main text.



Supplementary Figure S7. Effect of extrinsic noise on system trajectories. The trajectories were obtained by piece-wise ODE integration. As can be seen by comparing this figure with Fig. 8 in the main text, the visible variability in cellular trajectories is predominantly due to the extrinsic noise.



Supplementary Figure S8. Distributions of active ERK and its frequency spectrum. (A) Histograms of active ERK fractions at 10th min of EGF stimulation in simulations of 20 cells shown in panels of Fig. 8 in the main text. (B) Distributions of active ERK fractions over 10-day-long simulations of 20 cells. (C) Frequency spectrum of active ERK calculated from 10-day-long simulations of 20 cells.



Video. Animation of COMSOL output. This video is provided as a separate MOV file. Activation of EGF receptors and RAS on the membrane, and activation of ERK in the cytoplasm (a cross-section is shown) in response to extracellular EGF bursts in the spatially extended, PDE-based model variant. Corresponding model source files are contained within Supplementary Dataset 4