

The Stability and Dynamics of Localized Spot Patterns in the 2-D Gray-Scott Model

Michael J. Ward (UBC)

Croucher Foundation Conference: Hong Kong, March 2011

Joint With: W. Chen (UBC, Postdoc, Oxford); T. Kolokolnikov (Dalhousie); J. Wei
(Chinese U. Hong Kong)

Outline of the Lecture

Overview: Localized Particle-Like Spot Solutions to RD systems in 2-D

1. **Brief History:** Self-Replicating Spots (Lab and Numerical Evidence)
2. **Phenomena and Terminology:** Competition Instabilities, Oscillatory Profile Instabilities, Spot Self-Replication Instabilities, [Dynamically Triggered Instabilities](#).
3. Theoretical Approaches in 1-D and 2-D.

A Specific RD System in 2-D (Detailed Case Study)

1. **GS System:** Self-Replication, Oscillatory, and Competition Instabilities, of Spots in 2-D Planar Domains. Phase Diagrams for These Instabilities for Simple Spot Patterns. [Ph.D work of Wan Chen \(UBC, Postdoc Oxford\)](#).
2. **Some Open Issues:** A few interesting problems.

Singularly Perturbed RD Models: Localization

Spatially localized solutions can occur for singularly perturbed RD models

$$v_t = \varepsilon^2 \Delta v + g(u, v); \quad \tau u_t = D \Delta u + f(u, v), \quad \partial_n u = \partial_n v = 0, \quad x \in \partial\Omega.$$

Since $\varepsilon \ll 1$, v can be **localized** in space as a **spot**, i.e. concentration at a discrete set of points in $\Omega \in \mathbb{R}^2$.

Semi-Strong Interaction Regime: $D = O(1)$ so that u is global. **We will focus on the this regime.**

Weak Interaction Regime: $D = O(\varepsilon^2)$ so that u is also localized. **Pioneering studies of Nishiura and Ueyama (1999,2001) are for this regime.**

Some Simple Kinetics: (There is No Variational Structure)

● **GS Model:** (Pearson, 1993; scaling of Muratov-Osipov)

$$g(u, v) = -v + Auv^2, \quad f(u, v) = (1 - u) - uv^2.$$

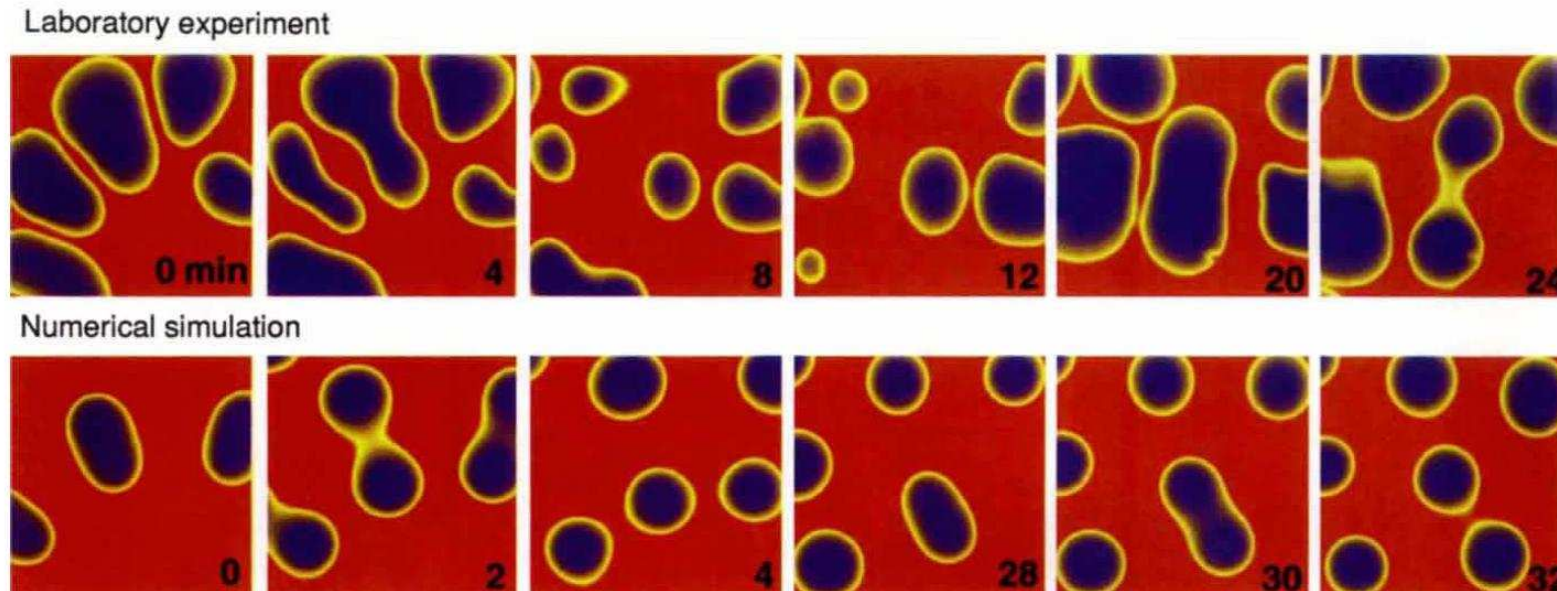
● **Schnakenburg Model:** $g(u, v) = -v + uv^2$ and $f(u, v) = a - uv^2$.

● **GM Model:** $g(u, v) = -v + v^2/u$ and $f(u, v) = -u + v^2$.

Self-Replicating Spots: Overview I

Experimental evidence of spot-splitting

- The Ferrocyanide-iodate-sulphite reaction. (Swinney et al., Nature, V. 369, (1994), pp. 215-218). The numerical simulations are for GS model by Pearson (Science, 1993).

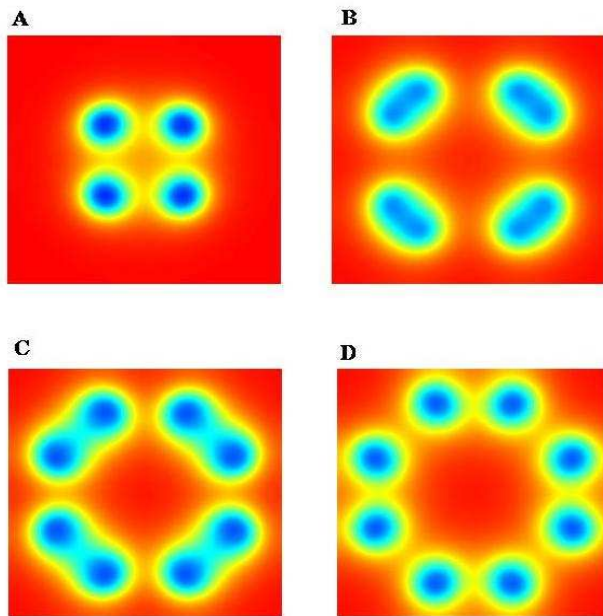


- A planar gas discharge system. (Astrov & Purwins, Phys. Lett. A, V. 283, (2001), pp. 349-354. Such systems often modeled by 3-component RD systems.

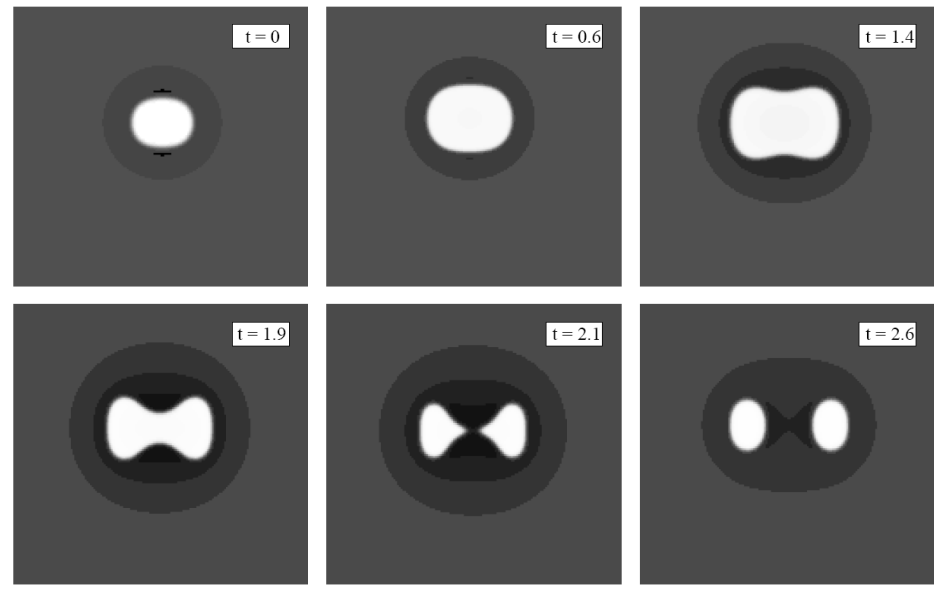
Self-Replicating Spots: Overview II

Numerical evidence of spot-splitting

- Pearson, *Complex Patterns in a Simple System*, Science, 216.
- Nishiura & Ueyama, *Spatial-Temporal Chaos in the Gray-Scott model*, Physica D, 150, (2001), p. 137; *Skeleton Structure of Self-Replicating Dynamics*, Physica D, 130, (1999), p. 73.
- Muratov & Osipov, *Scenarios of Domain Pattern Formation in Reaction-Diffusion Systems*, Phys. Rev. E, 54, (1996), pp. 4860–4879.



Left: Pearson (1993).



Right: Muratov and Osipov (1996).

Self-Replicating Spots: Overview III

(More Recent) Numerical evidence of spot-splitting

- **Schnakenburg Model:**

- J. Zhu et al., *Application of Discontinuous Galerkin Methods for RD Systems in Developmental Biology*, J. Sci. Comput., (2010)
- A. Madvamuse, P. Maini, *Velocity-Induced Numerical Solutions of RD Systems on Continuously Growing Domains*, JCP, **225**, (2007), p. 100.
- **Growing Domains:** numerics showing spot-splitting for the Schnakenburg model on a slowly growing planar domain (Madvamuse, Maini, 2006)
- Golovin, Matkowsky, Volpert, *Turing Patterns for the Brusselator with Superdiffusion*, SIAP, **68**, (2008), p. 251.
- K. Glasner, *Spatially Localized Structures in Diblock Copolymer Mixtures*, SIAP, (2010). (Self-replication of worm-like patterns in 2-D).

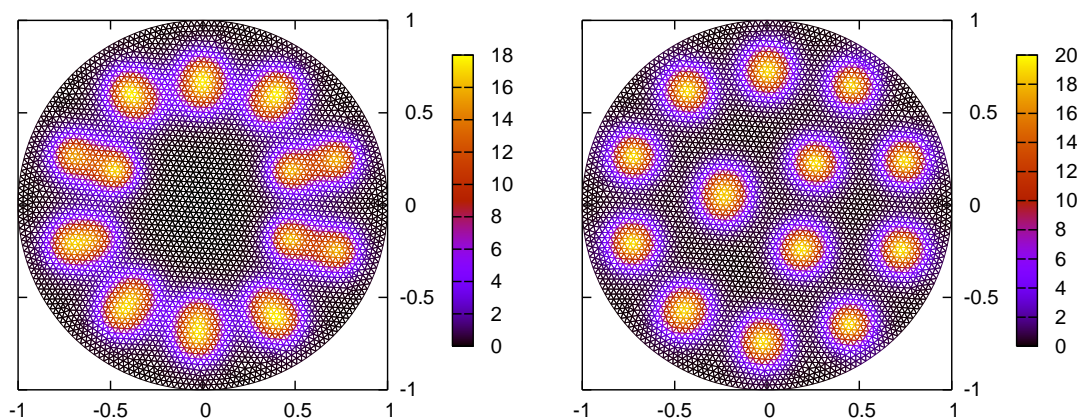
Self-Replicating Spots: Overview IV

Spot patterns arise from generic initial conditions, or from the **breakup of a stripe** to varicose instabilities: Spot-replication appears here as a secondary instability.

2-D GS Model: Semi-Strong Regime.

$$v_t = \varepsilon^2 \Delta v - v + Auv^2, \quad \tau u_t = D \Delta u + (1 - u) - uv^2.$$

Parameters: $A = 3.87$, $D = 1$, $\varepsilon = 0.04$, $\tau = 1$: ([Movie](#))



Ref: KWW, *Zigzag and Breakup Instabilities of Stripes and Rings....* Stud. Appl. Math., **116**, (2006), pp. 35–95.

Three Types of Instabilities

Dynamically triggered instability is an $\mathcal{O}(1)$ time-scale instability that is triggered at some later time by the slow dynamics of a collection of spots as they evolve towards their equilibrium locations. **Bifurcations induced by intrinsic motion, not by externally varying control parameter.**

Competition Instability: An instability due to a positive real eigenvalue with sign-fluctuating eigenfunction that triggers monotonic collapse of spots. [\(Movie\)](#)

Oscillatory Instability: An instability due to a Hopf bifurcation with (in certain cases) in-phase eigenfunction that triggers oscillatory collapse of spots (subcritical?) [\(Movie\)](#)

Self-Replication Instability: An instability of the shape of the spot profile to locally angular perturbations. This linear instability triggers a spot splitting event. [\(Movie 1\)](#) [\(Movie 2\)](#) [\(Movie 3\)](#)

Questions: **Classify instability types and determine instability thresholds in a phase diagram in parameter space for certain equilibrium and quasi-equilibrium spot patterns. Determine the slow dynamics of quasi-equilibria before/after fast instabilities.**

Theoretical Approaches

- 1) **Turing Stability Analysis:** linearize RD around a **spatially homogeneous steady state**. Look for diffusion-driven Turing instabilities.
- 2) **Weakly Nonlinear Theory:** capture nonlinear terms in multi-scale perturbative way and derive **normal form** amplitude equations.
 - With regards to the intricate patterns computed by him for the GS model (Science 1993), Pearson (Los Alamos) remarks: *Most work in this field has focused on pattern formation from a spatially uniform state that is near the transition from linear stability to linear instability. With this restriction, standard bifurcation-theoretic tools such as amplitude equations have been used with considerable success (ref: Cross and Hohenburg (Rev. Mod. Physics 1993)). It is unclear whether the patterns presented here will yield to these standard technologies.*
- 3) **Stability of Localized Pulse-Type Structures:** Study the existence, stability, and dynamics of localized spike (1-D) and spot patterns (2-D).
 - Different approaches in 1-D: geometric singular perturbation theory, Lyapunov-Schmidt, NLEP analysis, matched asymptotics, renormalization group theory. **What about 2-D?**

Theoretical Approaches: Brief History I

● Brief History of 1-D Theory: Spike Solutions to RD System

- Early formal 1-D studies of self-replication of spikes for GS; Petrov, Scott, Schowalter (1994), Reynolds, Ponce-Dawson, et al. (1998).
- Pulse-splitting “qualitative” mechanism for the GS model in the **weak interaction regime** $D = O(\varepsilon^2)$ based on global bifurcation scenario (Nishiura, Ei, Ueyama, (1999–)).
- Dynamics and stability of **exponentially weakly interacting** pulses (Ei, Nishiura, Sandstede...)
- Stability and dynamics of pulses for the GM and GS models in the **semi-strong regime** (Doelman, Gardner, Kaper, Promislow, Muratov, Osipov, Iron, MJW, Kolokolnikov, Chen, Wei) dating from 1997–.
Notable here is the NLEP stability analysis of pulses, the SLEP method for spikes, and the study of self-replication of pulses for GS model in 1-D.
- Rigorous framework in 1-D for 2-spike dynamics for GM model in **semi-strong regime** based on **renormalization group** methods (Doelman, Kaper, Promislow, 2007).

Theoretical Approaches: Brief History II

Brief History of 2-D Theory: Spot Solutions to RD Systems

- Pioneering work of Ni and Takagi for scalar elliptic steady-state concentration problems (late 1980's –)
- Repulsive spot dynamics in **weak interaction regime** (Ei, Mimura, Ohta)
- **Scatters etc.; Strong Interactions; Nishiura, Teramoto, et al.**
- NLEP stability theory of equilibrium spot patterns for GM and GS in **semi-strong interaction regime** (Wei-Winter, (2001–)). **NLEP problems arise from leading-order terms in infinite logarithmic expansion in ε .**
- One-Spot dynamics for GM (X. Chen, Kowalczyk, Kolokolnikov, MJW, (2001–)).

Remarks:

- For spot patterns in arbitrary 2-D domains, **a PDE-based approach based on the Green function is needed**, as the ODE-based tools of geometric singular perturbation theory for 1-D are of more limited use.
- **Largely Open: Give an analytical theory for self-replication of spots, dynamics of spots, and other instabilities (oscillatory and competition) in arbitrary 2-D planar domains. Focus on semi-strong regime.**

GS Model: Detailed Case Study

GS Model: in a 2-D domain Ω consider the GS model

$$\begin{aligned}v_t &= \varepsilon^2 \Delta v - v + Auv^2, & \partial_n v &= 0, & x &\in \partial\Omega \\ \tau u_t &= D\Delta u + (1 - u) - uv^2, & \partial_n u &= 0, & x &\in \partial\Omega.\end{aligned}$$

- Consider semi-strong limit $\varepsilon \rightarrow 0$ with $D = O(1)$.
- There are three key parameters $D > 0, \tau > 0, A > 0$.
- Three main instabilities: self-replication (large A), oscillatory instability (large τ), competition or overcrowding instability (large D).
- Obtain a phase diagram classification for various “symmetric” arrangements of spots. Determine parameter ranges for dynamically triggered instabilities.
- W. Chen, M. J. Ward, *The Stability and Dynamics of Localized Spot Patterns in the Two-Dimensional Gray-Scott Model*, to appear, SIAM J. Appl. Dyn. Sys. (2011), (71 pages).
- T. Kolokolnikov, M.J. Ward, J. Wei, *Spot Self-Replication and Dynamics for the Schnakenburg Model...* J. Nonl. Sci., 19, (2009), pp. 1–56.

Our Theoretical Framework: 2-D Spot Patterns

- **Quasi-Equilibrium Pattern:** Use singular perturbation methodology to construct quasi-steady pattern consisting of localized spots in arbitrary 2-D planar domains. Key issue: derive a quasi-equilibrium pattern that is **accurate to all orders in $-1/\log \varepsilon$, i.e. “sum the log expansion”**.
- **Dynamics:** Derive dynamics of spots in terms of **collective** coordinates characterizing the pattern. **The dynamics is slow wrt ϵ .**
- **Stability:** For $O(1)$ time-scale instabilities, derive and study singularly perturbed eigenvalue problems in semi-strong interaction regime.
 1. **Self-replication** instability is largely a **local** instability near a spot.
 2. **Competition and Oscillatory** instabilities are studied through certain **globally** coupled eigenvalue problems. To leading-order in $-1/\log \varepsilon$, the global eigenvalue problem reduces to the scalar Nonlocal Eigenvalue Problems (NLEP's) of Wei-Winter (2001–).

Remarks: This approach is widely applicable and

- Various Green functions play a central role.
- “Similar” to studying vortex dynamics (GL model of superconductivity).
- **Difficulty:** **Need a more rigorous understanding.**

GS Model: Quasi-Equilibrium I

Key: Matched asymptotic expansion approach **tailored to problems with logarithmic gauge functions.**

For spots located at x_j for $j = 1, \dots, K$, in the j^{th} inner region we define y , U_j , V_j , by

$$y = \varepsilon^{-1}(x - x_j), \quad \rho = |y|, \quad u = \frac{\varepsilon}{A\sqrt{D}}U_j, \quad v = \frac{\sqrt{D}}{\varepsilon}V_j.$$

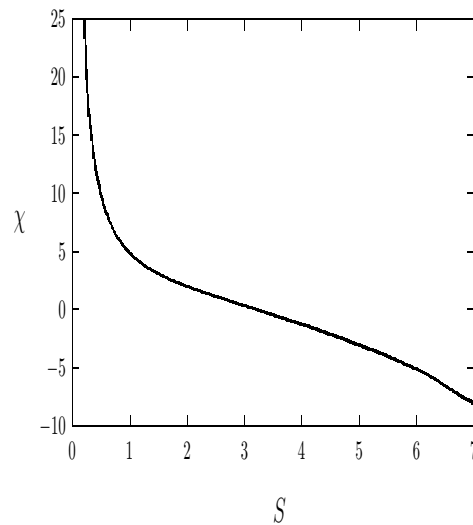
The spots are found to drift slowly with speed $\mathcal{O}(\varepsilon^2)$, and so we “**freeze**” their locations in the asymptotic construction of the quasi equilibrium.

To within $\mathcal{O}(\varepsilon)$ terms, U_j and V_j satisfy the radially symmetric **core problem** on $\rho \geq 0$:

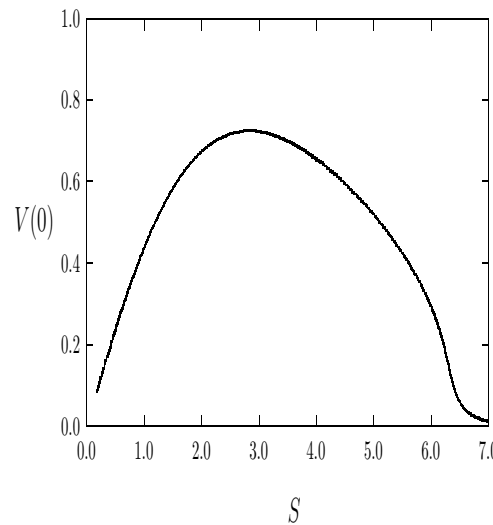
$$\begin{aligned} V_{j\rho\rho} + \frac{1}{\rho}V_{j\rho} - V_j + U_jV_j^2 &= 0, & U_{j\rho\rho} + \frac{1}{\rho}U_{j\rho} - U_jV_j^2 &= 0, \\ V_j &\rightarrow 0, & U_j &\sim S_j \log \rho + \chi(S_j) + o(1), \quad \text{as } \rho \rightarrow \infty. \end{aligned}$$

Here $S_j = \int_0^\infty \rho U_j V_j^2 d\rho > 0$ is termed the “**source strength**” (to be found by matching to an outer solution). Solutions to the core problem and the nonlinear function $\chi(S_j)$ are obtained numerically.

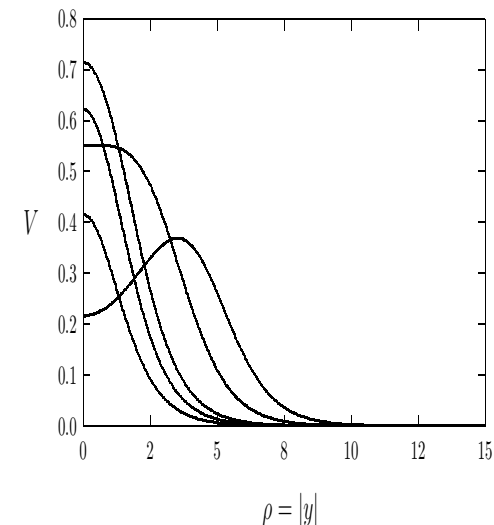
GS Model: Quasi-Equilibrium II



Left: $\chi(S_j)$;



Middle: $V_j(0)$ vs. S_j ;



Right: $V_j(\rho)$ for a few S_j .

- Numerically; there is a unique solution to core problem on $0 < S_j < 7$.
- $V_j(\rho)$ has a volcano shape when $S_j > S_v \approx 4.78$.
- The function $\chi(S_j)$ is central to constructing quasi-equilibria.
- Thus, the “ground-state problem” is a coupled set of BVP in contrast to the scalar BVP $w_{\rho\rho} + \rho^{-1}w_\rho - w + w^2 = 0$ of NLEP theory.
- For $S_j \ll 1$, V_j is well-approximated by the scalar ground-state w .
- **Difficulty:** No rigorous existence theory for solutions to the coupled core problem.

GS Model: Quasi-Equilibrium III

- In the outer region $v \ll 1$, each spot is a “source” for u in that

$$uv^2 \sim \frac{2\pi\epsilon\sqrt{D}}{A} \sum_{j=1}^K \left(\int_0^\infty \rho U_j V_j^2 d\rho \right) \delta(x-x_j) \sim \frac{2\pi\epsilon\sqrt{D}}{A} \sum_{j=1}^K S_j \delta(x-x_j).$$

- The matching condition is that the local and global representations of u must agree as $x \rightarrow x_j$ and $|y| \rightarrow \infty$.

In this way, the outer or **global** u satisfies

$$D\Delta u + (1 - u) = \frac{2\pi\sqrt{D}\epsilon}{A} \sum_{j=1}^K S_j \delta(x - x_j), \quad \text{in } \Omega; \quad \partial_n u = 0, \quad \text{on } \partial\Omega,$$

$$u \sim \frac{\epsilon}{A\sqrt{D}} \left(S_j \ln |x - x_j| - S_j \ln \epsilon + \chi(S_j) \right), \quad \text{as } x \rightarrow x_j, \quad j = 1, \dots, K.$$

Matching has provided K singularity structures where the strength of each singularity and the regular part of each singularity is prescribed.

GS Model: Quasi-Equilibrium IV

This problem indicates that we should define ν and \mathcal{A} by

$$\nu = -1/\ln \varepsilon, \quad \mathcal{A} = \nu A \sqrt{D}/\varepsilon.$$

Then, the **global** u satisfies

$$\Delta u + \frac{(1-u)}{\mathcal{D}} = \frac{2\pi\nu}{\mathcal{A}} \sum_{j=1}^K S_j \delta(x - x_j), \quad \text{in } \Omega; \quad \partial_n u = 0, \quad \text{on } \partial\Omega,$$

$$u \sim \frac{1}{\mathcal{A}} (S_j \nu \ln |x - x_j| + S_j + \nu \chi(S_j)), \quad \text{as } x \rightarrow x_j, \quad j = 1, \dots, K.$$

Key Point: A nonlinear algebraic system for S_j will be obtained since the form of the **regular (or non-singular) part** as $x \rightarrow x_j$ is **pre-specified**. More specifically, in solving

$$\Delta u - u = 2\pi \sum_{j=1}^k A_j \delta(x - x_j) \quad \text{in } \Omega; \quad \partial_n u = 0 \quad \text{on } \partial\Omega,$$

$$u \sim A_i \ln |x - x_i| + B_i, \quad \text{as } x \rightarrow x_i, \quad i = 1, \dots, K,$$

there is a relationship between the A_i and B_i for a solution to exist.

GS Model: Quasi-Equilibrium V

We represent u as

$$u = 1 - \frac{2\pi\nu}{\mathcal{A}} \sum_{j=1}^K S_j G(x; x_j),$$

where $G(x; x_j)$ is the reduced-wave G-function with regular part R_{jj} :

$$\Delta G - \frac{1}{D} G = -\delta(x - x_j), \quad \text{in } \Omega; \quad \partial_n G = 0, \quad x \in \partial\Omega,$$

$$G(x; x_j) \sim -\frac{1}{2\pi} \log |x - x_j| + R_{jj} + o(1), \quad \text{as } x \rightarrow x_j.$$

From the **regular part of the singularity structures**, we obtain that the S_j for $j = 1, \dots, k$ satisfy the **nonlinear algebraic system**:

$$\mathcal{A} = S_j + 2\pi\nu \left(S_j R_{j,j} + \sum_{\substack{i=1 \\ i \neq j}}^K S_i G_{j,i} \right) + \nu \chi(S_j), \quad j = 1, \dots, K,$$
$$\nu = -1/\ln \varepsilon, \quad \mathcal{A} = \nu A \sqrt{D}/\varepsilon = A \sqrt{D}/\varepsilon (-\ln \varepsilon).$$

Upon determining the S_j , we know the core solution near each spot.

GS Model: Quasi-Equilibrium VI

- For G and its regular part R , simple formulae for a disk and a rectangle (Ewald summation needed). Fast-multipole methods can be used for arbitrary Ω (Greengard et al.).
- Construction yields a **quasi-equilibrium solution** for any “frozen” configuration $x_j, j = 1, \dots, K$ of spots. The error is smaller than any power of $\nu = -1/\log \varepsilon$; i.e. **we have “summed” all logarithmic terms.**
- **Related log expansion problems:** eigenvalue of the Laplacian in a domain with localized traps (Ozawa 1982–), Bratu’s equation with cooling rod, etc.. The novelty here with the GS model is that **the inner problem is nonlinear**. Typically, for Laplacian eigenvalue problems in a 2-D domain with small hole Ω_ε , the **inner core problem is**

$$\begin{aligned}\Delta_y U &= 0, \quad y \notin \Omega_1 = \varepsilon^{-1} \Omega_\varepsilon; \quad U = 0, \quad y \in \partial \Omega_1, \\ U &\sim \log |y| - \log d + o(1), \quad |y| \rightarrow \infty,\end{aligned}$$

where d is the logarithmic capacitance. Our inner nonlinear core problem for one spot yields $U \sim S \log |y| + \chi(S) + o(1)$ as $|y| \rightarrow \infty$.

- **Survey of strong localized perturbation theory:** Online notes for Fourth Winter School Applied Math (City U. Hong Kong, Dec. 2010).

GS Model: Dynamics of Spots I

Key Point: The **collective slow coordinates** for the dynamics are S_j and x_j , for $j = 1, \dots, k$.

Principal Result: (DAE System): Let $\mathcal{A} = \varepsilon A / (\nu \sqrt{D})$ and $\nu = -1 / \log \varepsilon$.

Provided that there are no $\mathcal{O}(1)$ time-scale instabilities of the quasi-equilibrium profile, the DAE system for the time evolution of the source strengths S_j and spot locations x_j is

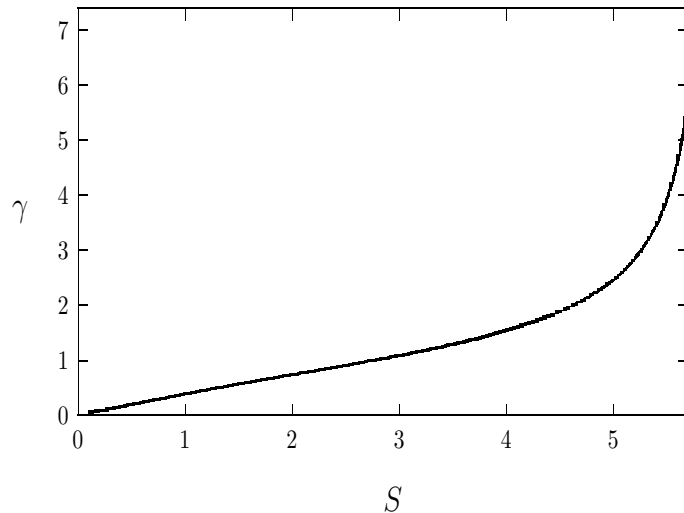
$$\begin{aligned} \mathcal{A} &= S_j + 2\pi\nu \left(S_j R_{j,j} + \sum_{\substack{i=1 \\ i \neq j}}^K S_i G_{j,i} \right) + \nu \chi(S_j), \quad j = 1, \dots, K \\ x'_j &\sim -2\pi\varepsilon^2 \gamma(S_j) \left(S_j \nabla R(x_j; x_j) + \sum_{\substack{i=1 \\ i \neq j}}^K S_i \nabla G(x_j; x_i) \right), \quad j = 1, \dots, K. \end{aligned}$$

Here $G_{j,i} \equiv G(x_j; x_i)$ and $R_{j,j} \equiv R(x_j; x_j)$, where $G(x; x_j)$ is the Reduced Wave Green function with regular part $R(x_j; x_j)$, which depend on D .

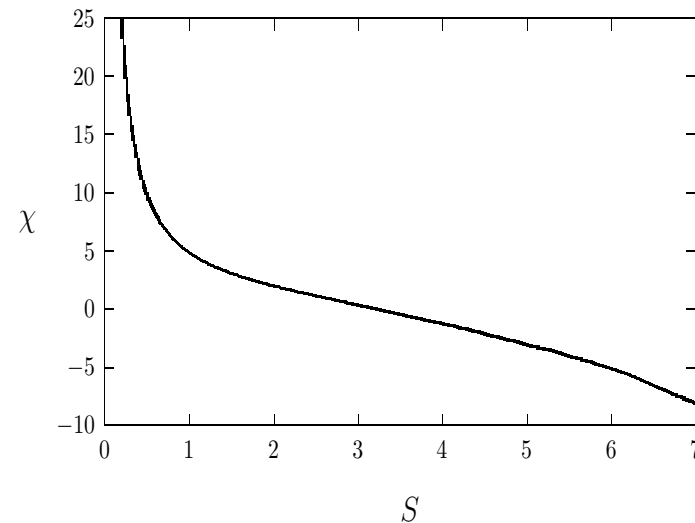
Note: The speed of the spots is $\mathcal{O}(\varepsilon^2)$.

GS Model: Dynamics of Spots: II

- The DAE system depends on **two functions** $\gamma(S_j)$ and $\chi(S_j)$ associated with the **coupled core problem** near each spot.



Left: γ vs. S_j



Right: χ vs. S_j

- The **Green function terms** G_{ij} and R_{jj} , which mediate spot interactions, **depend on** D and the **shape of** Ω .
- **Universality:** Changing the nonlinearities, while maintaining that the “outer” solution is $D\Delta u - u = \sum_j \beta_j \delta(x - x_j)$ will change only $\gamma(S_j)$ and $\chi(S_j)$.

GS Model: Dynamics of Spots: III

Sketch of Derivation: In the inner region, we expand to higher order

$$u = \frac{\varepsilon}{A\sqrt{D}} (U_{0j}(\rho) + \varepsilon U_{1j}(\mathbf{y}) + \dots) , \quad v = \frac{\sqrt{D}}{\varepsilon} (V_{0j}(\rho) + \varepsilon V_{1j}(\mathbf{y}) + \dots) .$$

where $y = \varepsilon^{-1}(x - x_j)$ with $x_j = x_j(\varepsilon^2 t)$.

Define $w_j \equiv (V_{1j}, U_{1j})^T$. The GS model yields

$$\Delta_{\mathbf{y}} w_j + \mathcal{M}_j w_j = g_j , \quad y \in \mathbb{R}^2 ,$$

where

$$\mathcal{M}_j \equiv \begin{pmatrix} -1 + 2U_0 V_0 & V_0^2 \\ -2U_0 V_0 & -V_0^2 \end{pmatrix} , \quad g_j \equiv \begin{pmatrix} -V_0' x_j' \cdot y/|y| \\ 0 \end{pmatrix} .$$

The matching condition for the algebraic in ε terms is:

$$w_j \rightarrow \begin{pmatrix} 0 \\ -f_j \cdot y \end{pmatrix} \text{ as } y \rightarrow \infty ; \quad f_j \equiv 2\pi \left(S_j \nabla R(\mathbf{x}_j; \mathbf{x}_j) + \sum_{i \neq j}^K S_i \nabla G(\mathbf{x}_j; \mathbf{x}_i) \right)$$

GS Model: Dynamics of Spots: IV

Lemma: *A necessary condition for the existence of a solution for w_j is that*

$$x'_j = \gamma(S_j) f_j, \quad \gamma \equiv \gamma(S_j) = \frac{-2}{\int_0^\infty \rho V'_0(\rho) \hat{\Phi}^*(\rho) d\rho}.$$

Here $\hat{\Phi}^(\rho)$ is the first component of the radially symmetric adjoint solution $\hat{P}^*(\rho) \equiv \left(\hat{\Phi}^*(\rho), \hat{\Psi}^*(\rho) \right)^t$ satisfying*

$$\partial_{\rho\rho} \hat{P}^* + \rho^{-1} \partial_\rho \hat{P}^* - \rho^{-2} \hat{P}^* + \mathcal{M}_0^t \hat{P}^* = \mathbf{0}, \quad 0 < \rho < \infty,$$

subject to $\hat{\Phi}^ \rightarrow 0$ exponentially and $\hat{\Psi}^* \sim 1/\rho$ as $\rho \rightarrow \infty$.*

Derivation: standard solvability condition type argument.

GS Model: The Stability of Quasi-Equilibria

We seek fast $\mathcal{O}(1)$ time-scale instabilities relative to slow dynamics of x_j .

We assume $\tau \ll \mathcal{O}(\varepsilon^{-2})$. Let $u = u_e + e^{\lambda t} \eta$ and $v = v_e + e^{\lambda t} \phi$. In each inner region we introduce the local angular mode $m = 0, 2, 3, \dots$ by

$$\eta = \frac{\varepsilon}{A\sqrt{D}} e^{im\theta} N_j(\rho), \quad \phi = \frac{\sqrt{D}}{\varepsilon} e^{im\theta} \Phi_j(\rho), \quad \rho = |y|, \quad y = \varepsilon^{-1}(x - x_j).$$

Then, on $0 < \rho < \infty$, we get the two-component eigenvalue problem

$$\mathcal{L}_m \Phi_j - \Phi_j + 2U_j V_j \Phi_j + V_j^2 N_j = \lambda \Phi_j, \quad \mathcal{L}_m N_j - 2U_j V_j \Phi_j - V_j^2 N_j = 0,$$

with operator \mathcal{L}_m defined by

$$\mathcal{L}_m \Phi_j \equiv \partial_{\rho\rho} \Phi_j + \rho^{-1} \partial_{\rho} \Phi_j - m^2 \rho^{-2} \Phi_j.$$

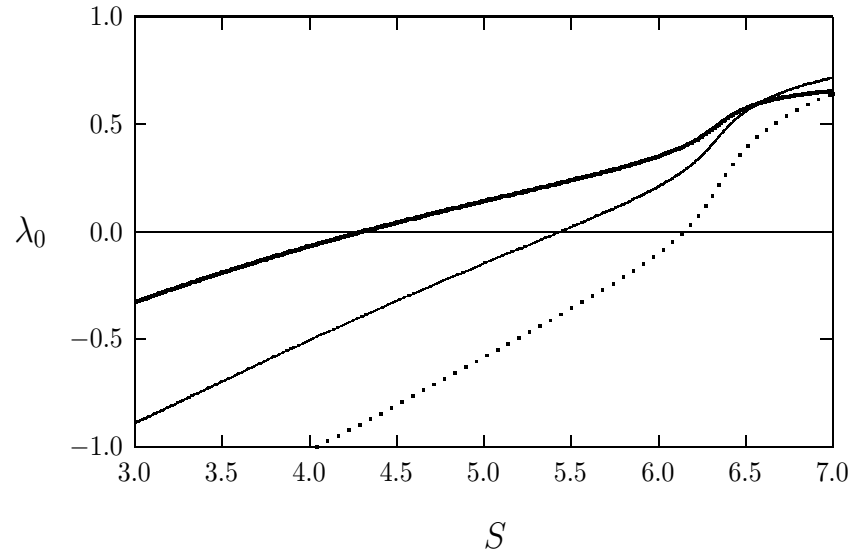
- U_j and V_j are computed from the core problem and depend on S_j . The S_j for $j = 1, \dots, K$ satisfy the nonlinear algebraic system involving G .
- **Key Point:** This is a two-component eigenvalue problem, in contrast to the scalar problem of NLEP theory. Hence, with no maximum principle there is no ordering principle for eigenvalues wrt number of nodal lines of eigenfunctions.

GS Model: Self-Replication Instability I

Definition of Thresholds: Let $\lambda_0(S_j, m)$ denote the eigenvalue with the largest real part, with Σ_m denoting the S_j s.t. $\text{Re}\lambda_0(\Sigma_m, m) = 0$.

The Modes $m \geq 2$: We must impose $N_j \sim \rho^{-2} \rightarrow 0$ as $\rho \rightarrow \infty$. Thus, the local eigenvalue problems are uncoupled, except through the determination of S_j . We compute

$$\Sigma_2 = 4.303, \quad \Sigma_3 = 5.439, \quad \Sigma_4 = 6.143.$$



Key point: The peanut-splitting instability $m = 2$ is dominant.

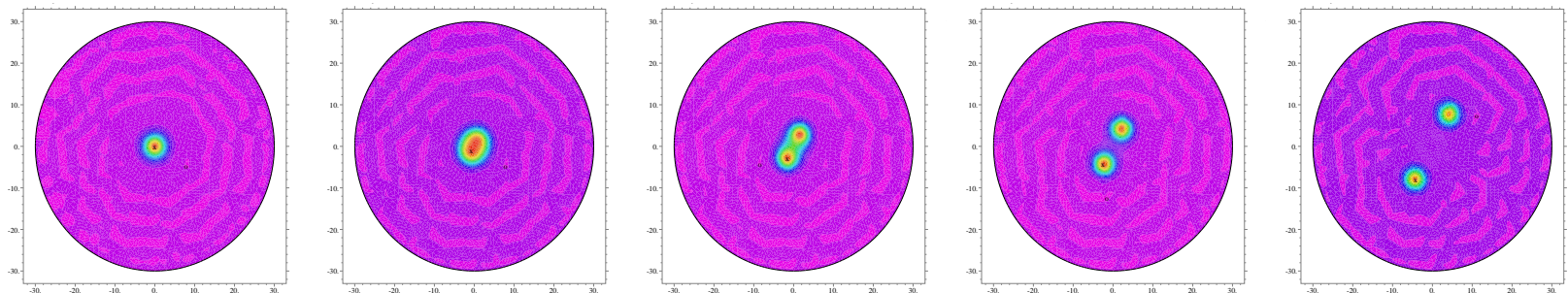
GS Model: Self-Replication Instability II

Principal Result: Consider the GS model with $\varepsilon \ll 1$, $\tau \ll \mathcal{O}(\varepsilon^{-2})$,

$\mathcal{A} = \varepsilon A / (\nu \sqrt{D})$ so that $A = \mathcal{O}(-\varepsilon \ln \varepsilon)$. Then, if $S_j < \Sigma_2 \approx 4.31$, the j^{th} spot is linearly stable to a spot deformation instability for modes $m \geq 2$. Alternatively, **for $S_j > \Sigma_2$, it is linearly unstable to the peanut-splitting mode $m = 2$.**

Numerically: This instability triggers a **nonlinear self-replication event for the time-dependent elliptic-parabolic nonlinear core problem**

$$V_t = \Delta_y V - V + UV^2, \quad \Delta_y U - UV^2 = 0, \quad y \in \mathbb{R}^2, \\ V \rightarrow 0, \quad U \rightarrow S \ln |y|, \quad \text{as } |y| \rightarrow \infty.$$

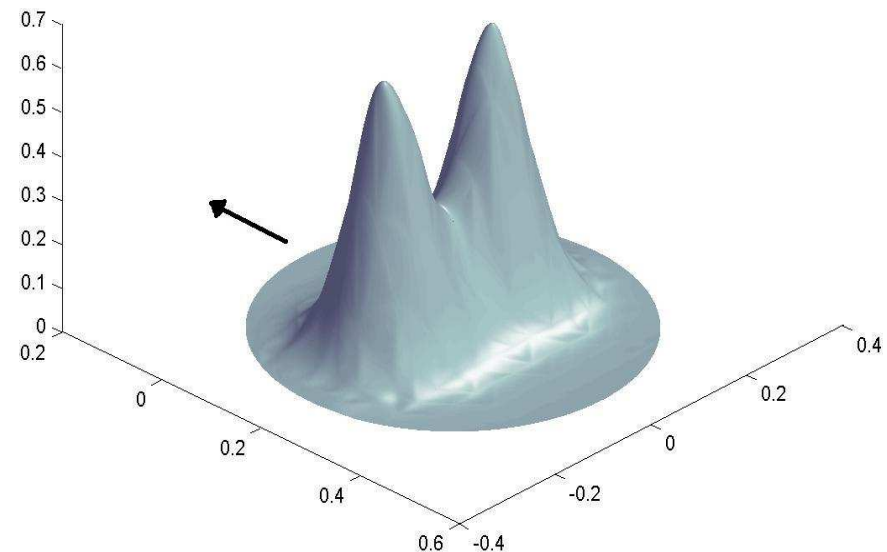
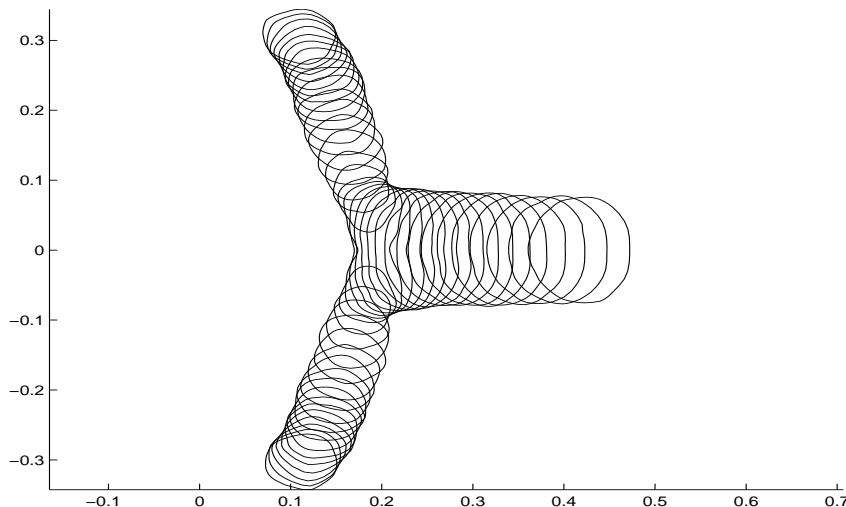


Plots at $t = 0, 100, 130, 140, 170$ for disk of radius 30 when $S = 4.5$.

GS Model: Self-Replication Instability III

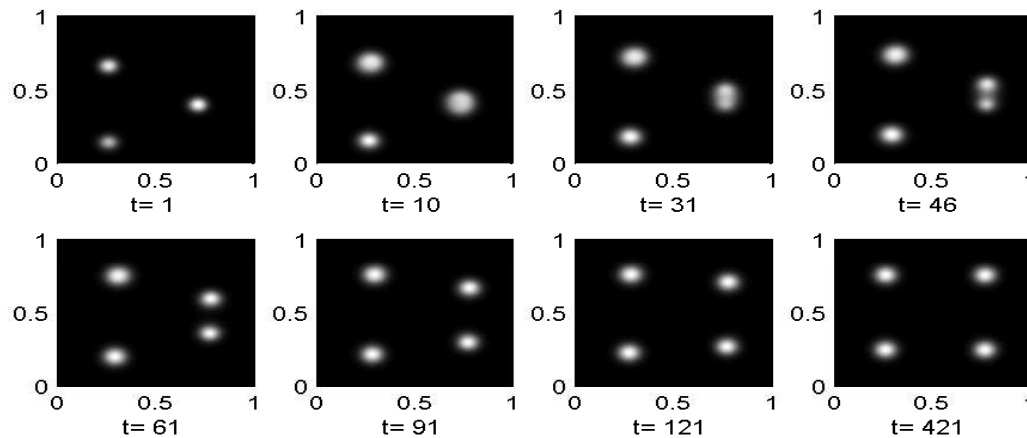
- For $S_j \approx \Sigma_2$, the linearization of the core problem has an approximate **four-dimensional null-space** (two translation and splitting modes).
- By a projection onto this four-dimensional nullspace (center manifold-type reduction), it can be shown that **splitting occurs in a direction perpendicular to the motion when $\varepsilon \ll 1$** . Ref: Kolokolnikov, MJW, Wei, J. Nonlin. Sci. (2009).

Spot-Splitting in the Unit Disk: $x_0(0) = (0.5, 0.0)$, $\varepsilon = 0.03$, **Left:** Trace of the contour $v = 0.5$ from $t = 15$ to $t = 175$ with increments $\Delta t = 5$. **Right:** spatial profile of v at $t = 105$ during the splitting.
(Movie for unit square with $S = 5.0 > \Sigma_2$)

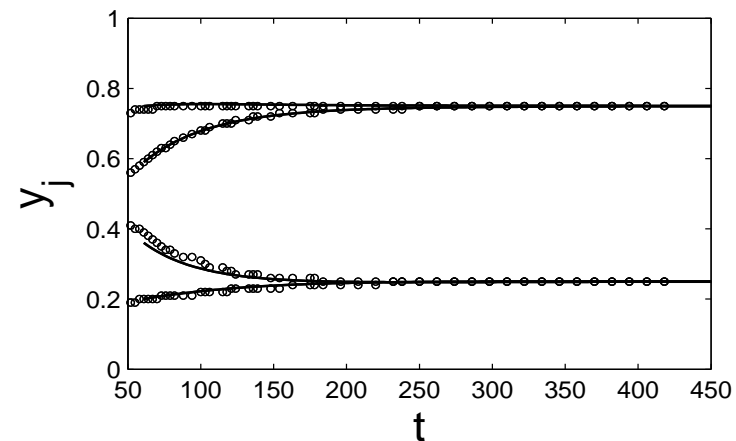
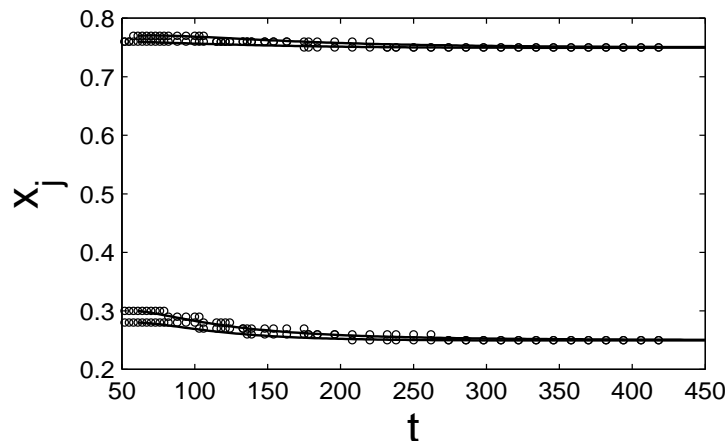


GS Model: Self-Replication Instability IV

Example: Fix $\mathcal{A} = 20$, $D = 1$, $\varepsilon = 0.02$. Put $K = 3$ spots on a ring of radius $r = 0.3$ centered at $(0.4, 0.4)$ in the unit square at $t = 0$. **We compute** $S_1 = 4.05$, $S_2 = 2.37$, $S_3 = 4.79$. **Predict: One spot splits beginning at $t = 0$** (Movie)



DAE Dynamics accurately tracks spots after splitting event



Competition and Oscillatory Instabilities I

Key Point: These are instabilities associated with locally radially symmetric perturbations near a spot, i.e. $m = 0$.

When $m = 0$, the local eigenvalue problem for $N_j = N_j(\rho)$ and $\Phi_j = \Phi_j(\rho)$, with $\rho = |\mathbf{y}|$, near the j^{th} spot is

$$\Phi_j'' + \frac{1}{\rho}\Phi_j' - \Phi_j + 2U_jV_j\Phi_j + V_j^2N_j = \lambda\Phi_j, \quad \rho \geq 0; \quad \Phi_j'(0) = 0,$$

$$N_j'' + \frac{1}{\rho}N_j' - V_j^2N_j - 2U_jV_j\Phi_j = 0, \quad \rho \geq 0; \quad N_j'(0) = 0,$$

$$\Phi_j(\rho) \rightarrow 0, \quad N_j(\rho) \rightarrow C_j \ln \rho + C_j \hat{B}_j + o(1), \quad \text{as } \rho \rightarrow \infty.$$

- For $\rho \gg 1$ the operator for N_j reduces to $N_j'' + \rho^{-1}N_j' \approx 0$ for $\rho \gg 1$, and so we cannot impose that $N_j \rightarrow 0$ as $\rho \rightarrow \infty$. **Instead, we must allow for logarithmic growth at infinity, which allows us to match to the outer solution.**
- The constant \hat{B}_j is a function of λ and S_j .

Competition and Oscillatory Instabilities II

In the outer region each spot is a “source” for the outer eigenfunction η .

Recall that $\eta = \varepsilon / (A\sqrt{D})N_j(\rho)$. Matching condition: LHS and RHS agree as $x \rightarrow x_j$ and $\rho \rightarrow \infty$.

In this way, the outer eigenfunction with $\partial_n \eta = 0$ on $\partial\Omega$ satisfies

$$\Delta\eta - \frac{(1 + \tau\lambda)}{D}\eta = \frac{2\pi\varepsilon}{A\sqrt{D}} \sum_{j=1}^k C_j \delta(x - x_j), \quad \text{in } x \in \Omega$$

$$\eta \sim \frac{\varepsilon}{A\sqrt{D}} \left[C_j \ln |x - x_j| + \frac{C_j}{\nu} + C_j \hat{B}_j + o(1) \right], \quad \text{as } x \rightarrow x_j, \quad j = 1, \dots, K.$$

Key: We have K singularity structures where both the singular and regular parts are specified. We write η as

$$\eta = -\frac{2\pi\varepsilon}{A\sqrt{D}} \sum_{j=1}^K C_j G_\lambda(x; x_j),$$

where the λ -dependent Green function satisfies

Competition and Oscillatory Instabilities III

$$\Delta G_\lambda - \frac{(1 + \tau\lambda)}{D} G_\lambda = -\delta(x - x_j), \quad x \in \Omega; \quad \partial_n G_\lambda = 0, \quad x \in \partial\Omega,$$

$$G_\lambda(x; x_j) \sim -\frac{1}{2\pi} \ln |x - x_j| + R_{\lambda j,j} + o(1) \quad \text{as } x \rightarrow x_j.$$

Note: $R_{\lambda j,j}$ depends on x_j , D , and $\tau\lambda$. The **regular parts of the singularity structures** yield a homogeneous linear system for C_j :

$$C_j (1 + 2\pi\nu R_{\lambda j,j}) + \nu C_j \hat{B}_j + 2\pi\nu \sum_{i \neq j}^K C_i G_{\lambda i,j} = 0, \quad j = 1, \dots, K.$$

By writing as a matrix problem $\mathcal{M}c = 0$, then $\det(M) = 0$ determines λ .

- **Global Coupling is in Two Ways:** Recall that S_j are also coupled globally (and that $\hat{B}_j = \hat{B}_j(S_j, \lambda)$). **Formulation is an extended-NLEP problem accounting for all logarithmic correction terms ν .**
- Certainly similar to the asymptotic approach for determining the eigenvalue of the Laplacian in 2-D in a domain with K small holes (Keller, MJW, (1993)).

Competition and Oscillatory Instabilities IV

In matrix form, the globally coupled extended-NLEP problem is

$$\mathcal{M} \mathbf{c} = \mathbf{0}, \quad \mathcal{M} \equiv I + \nu \mathcal{B} + 2\pi\nu \mathcal{G}_\lambda,$$

where $\mathbf{c} \equiv (C_1, \dots, C_k)^T$, and the matrices \mathcal{G}_λ and \mathcal{B} are

$$\mathcal{G}_{\lambda j,j} = R_{\lambda jj}, \quad \mathcal{G}_{\lambda i,j} = \mathcal{G}_{\lambda j,i} = G_\lambda(x_i; x_j), \quad i \neq j; \quad \mathcal{B} = \text{Diag}(\hat{B}_j)$$

Note: \mathcal{G}_λ is symmetric matrix, but is not Hermitian when λ is complex.

Also, the nonlinear algebraic system for the S_j can be written as:

$$\mathcal{A} \mathbf{e} = \mathbf{s} + 2\pi\nu \mathcal{G}_0 \mathbf{s} + \nu \mathcal{X},$$

where $\mathbf{e} = (1, \dots, 1)^t$, $\mathbf{s} = (S_1, \dots, S_k)^T$, and $\mathcal{X} = \text{Diag}(\chi(S_j))$.

Principal Result: For $A = \mathcal{O}(-\varepsilon \ln \varepsilon)$, and $\tau\lambda \ll \mathcal{O}(\varepsilon^{-2})$, the stability of a K -spot pattern to locally radially symmetric perturbations near each spot is determined by $\det(\mathcal{M}) = 0$. If the principal eigenvalue λ_0 satisfies $\text{Re}(\lambda_0) < 0$, then the K -spot quasi-equilibrium solution is linearly stable to such perturbations near each spot, otherwise it is linearly unstable.

Competition and Oscillatory Instabilities V

- **Oscillatory:** For $k \geq 1$, as τ is increased a c.c eigenvalue pair can cross into $\text{Re}(\lambda_0) > 0$ (Hopf bifurcation). In certain cases, one can predict $\mathbf{c} = (1, \dots, 1)^T$ (i.e. **a synchronous oscillatory instability**). Numerically: it initiates an oscillatory death in the amplitude of spots. Subcritical?
- **Note:** There is **no such instability generated by the core problem alone**; i.e. imposing N_j bounded at infinity, then no Hopf bifurcation occurs. **Oscillation results from the global coupling.**
- **Competition:** For $k \geq 2$, as D is increased, a real eigenvalue λ_0 can enter unstable right half-plane along the real axis $\text{Im}(\lambda_0) = 0$. In certain cases, one can predict $\mathbf{c} = (1, -1, 1, -1, \dots)^T$ (i.e. **a sign fluctuating instability**). Numerically: it initiates a spot competition process leading to annihilation of some spots.
- **Hybrid Asymptotic-Numerical Formulation:** **If \mathcal{G}_λ is analytically available, only simple numerics is needed: solving BVP's, root-finders, etc.**
- **Key Feature in 2-D:** The three instabilities **occur in the same parameter regime $\mathcal{A} = \mathcal{O}(1)$, $D = \mathcal{O}(1)$** when we do not make the leading-order $\nu \ll 1$ approximation. Thus, compute **phase diagrams for instabilities**. **Not true for GS in 1-D.**

Competition and Oscillatory Instabilities VI

Phase Diagrams: for “Symmetric” spot configurations. Assume that $\mathbf{x}_1, \dots, \mathbf{x}_k$ is such that \mathcal{G}_λ is a **circulant** matrix.

This occurs for two-spots in \mathbb{R}^2 ; for K spots equally spaced on a ring concentric with unit disk; for two spots in a arbitrary Ω when $R_{\lambda 1,1} = R_{\lambda 2,2}$ holds, etc... (“equivalent” to equally-spaced spike patterns in \mathbb{R}^1).

Lemma: For the $k \times k$ symmetric and circulant Green matrix \mathcal{G}_λ whose first row vector is $\mathbf{a} = (a_1, \dots, a_k)$, the spectrum $\mathcal{G}_\lambda v = \omega_\lambda v$ is

$$\begin{cases} \omega_{\lambda 1} &= \sum_{m=1}^k a_m, & v_1^T = (1, \dots, 1), \\ \omega_{\lambda j} &= \sum_{m=0}^{k-1} \cos\left(\frac{2\pi(j-1)m}{k}\right) a_{m+1}, & \text{multiplicity 2,} \\ \mathbf{v}_j^T &= \left(1, \cos\left(\frac{2\pi(j-1)}{k}\right), \dots, \cos\left(\frac{2\pi(j-1)(k-1)}{k}\right)\right), \\ \mathbf{v}_{k+2-j}^T &= \left(0, \sin\left(\frac{2\pi(j-1)}{k}\right), \dots, \sin\left(\frac{2\pi(j-1)(k-1)}{k}\right)\right), & j = 2, \dots, \lceil k/2 \rceil + 1. \end{cases}$$

Note: $\lceil m \rceil$ is smallest integer not less than m . Note: If k is even, then a simple eigenvector is $(1, -1, \dots, 1, -1)^T$.

Competition and Oscillatory Instabilities VII

Simplifications Owing to Circulant Matrix Condition

- (Quasi-Equilibria) There are solutions with a common source strength S_c , where S_c satisfies

$$\mathcal{A} = S_c + 2\pi\nu\theta S_c + \nu\chi(S_c),$$

where $\mathcal{G}_0\mathbf{e} = \theta\mathbf{e}$, $\mathbf{e} = (1, \dots, 1)^T$.

- (Extended-NLEP Problem) The global eigenvalues are the roots of K transcendental equations for λ :

$$f_j \equiv 1 + \nu\hat{B}_c + 2\pi\nu\omega_{\lambda j}(\tau\lambda) = 0,$$

where $\omega_{\lambda j}(\tau\lambda)$ for $j = 1, \dots, K$ is any eigenvalue of \mathcal{G}_λ , and $\mathbf{c}_j = \mathbf{v}_j$.

Note that $\hat{B}_c = \hat{B}_c(S, \lambda)$ is independent of j (need one core problem)

- (Threshold for $\lambda = 0$) obtained by solving the coupled problem

$$1 + \nu\chi'(S_c) + 2\pi\nu\omega_{0j}(0) = 0, \quad \mathcal{A} = S_c + 2\pi\nu\theta S_c + \nu\chi(S_c),$$

where $\omega_{0j}(0)$ is any of the eigenvalues of \mathcal{G}_0 . Key: $\hat{B}_c(0, S_c) = \chi'(S_c)$.

Two-Spot Pattern in \mathbb{R}^2 : I

Put two spots at $x_1 = (-\alpha, 0)$ and $x_2 = (\alpha, 0)$. Set $D = 1$ and $\varepsilon = 0.02$.

With $S_1 = S_2 \equiv S_c$, the common source strength S_c satisfies

$$A = \frac{\varepsilon}{\nu} \mathcal{F}(S_c); \quad \mathcal{F}(S_c) \equiv S_c [1 + \nu(\ln 2 - \gamma_e) + \nu K_0(2\alpha)] + \nu \chi(S_c).$$

The existence and splitting thresholds are simply

$$A_{\text{exist}} = \frac{\varepsilon}{\nu} \min_{S_c} (\mathcal{F}(S_c)); \quad A_{\text{split}} = \frac{\varepsilon}{\nu} \mathcal{F}(\Sigma_2), \quad \Sigma_2 = 4.31 \dots$$

(Repulsive) slow DAE dynamics for α : $d\alpha/d\xi = -\gamma(S_c)S_c K'_0(2\alpha) > 0$ and $A = \varepsilon \nu^{-1} \mathcal{F}(S_c)$.

Extended-NLEP Problem: The eigenpair $v_{\pm}, \omega_{\lambda j}(\tau\lambda)$ of \mathcal{G}_{λ} are

$$\omega_{\lambda \pm} = \frac{1}{2\pi} \left[(\ln 2 - \gamma_e - \log \sqrt{1 + \tau\lambda}) \pm K_0(2\alpha \sqrt{1 + \tau\lambda}) \right], \quad \mathbf{v}_{\pm} \equiv (1, \pm 1)^T.$$

With $\hat{B}_c = \hat{B}_c(\lambda, S_c)$, we must determine the roots of

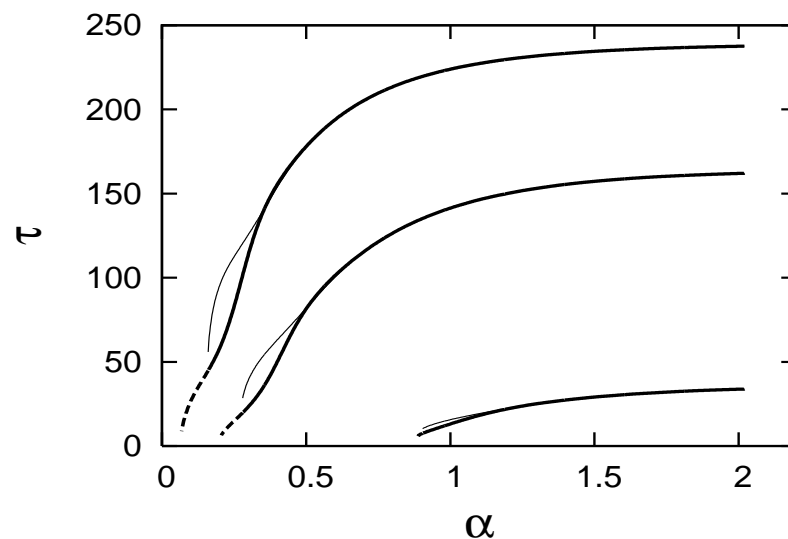
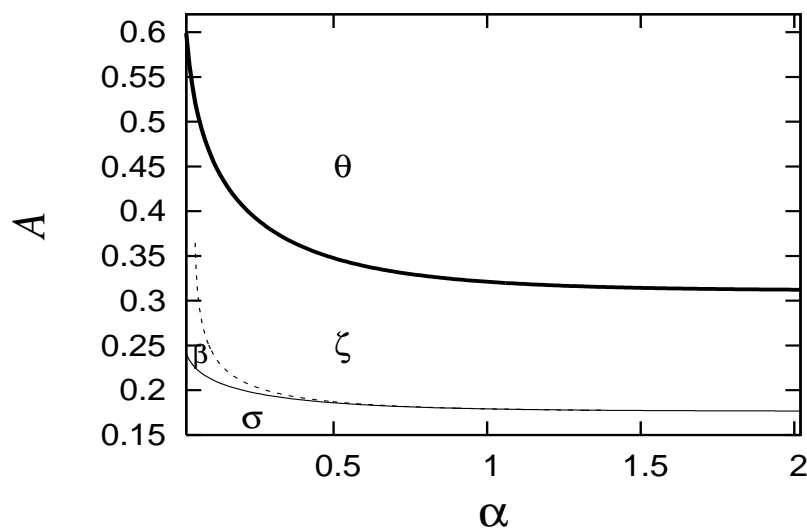
$$\nu^{-1} + \hat{B}_c + 2\pi \omega_{\lambda \pm}(\tau\lambda) = 0.$$

Two-Spot Pattern in \mathbb{R}^2 : II

Competition Instability is set by v_- . To compute threshold $A = A_{\text{comp}}(\alpha)$, set $\lambda = 0$, $\hat{B}_c(0, S_c) = \chi'(S_c)$, and eliminate S_c between

$$\chi'(S_c) + \ln 2 - \gamma_e - K_0(2\alpha) = -\nu^{-1}, \quad A = \frac{\varepsilon}{\nu} \mathcal{F}(S_c).$$

Oscillatory Instability: We compute $\tau_+(\alpha)$ and $\tau_-(\alpha)$, and obtain $\tau_+ < \tau_-$ (**synchronous oscillatory instability**).



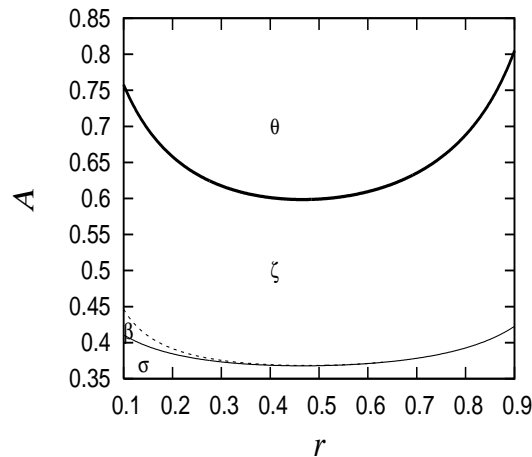
Left: Phase Diagram

Right: τ_{\pm} vs. α for $A = 0.18, 0.20, 0.22$.

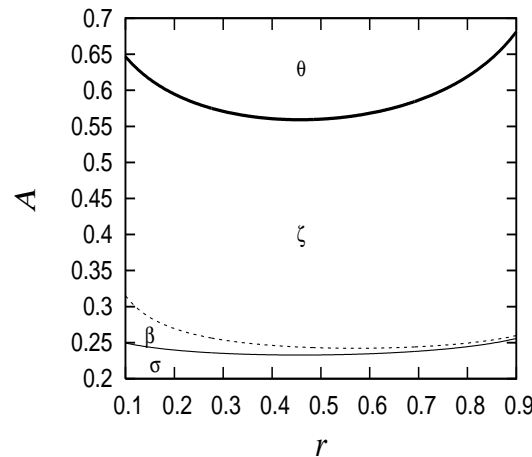
Key: A **dynamically triggered spot self-replication instability is possible** for α large enough (i.e. under-crowding instability).

K -Spot Patterns on a Ring in Unit Disk: I

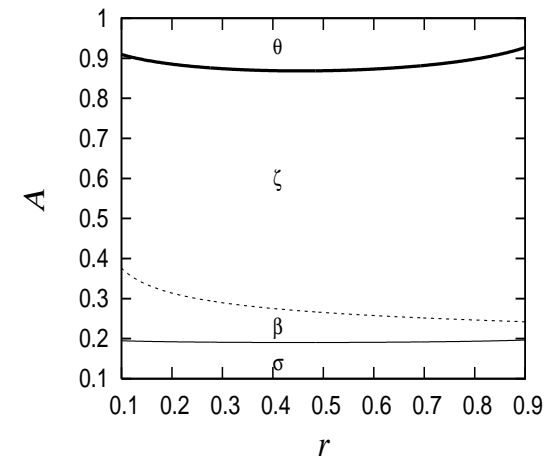
Put spots at $x_j = r \exp(2\pi i j / K)$ for $j = 1, \dots, K$, with $0 < r < 1$ in the unit disk. Fix $\varepsilon = 0.02$. Phase Diagrams of A vs. Ring Radius r



(c) $D = 0.2, K = 2$



(d) $D = 1.0, K = 2$

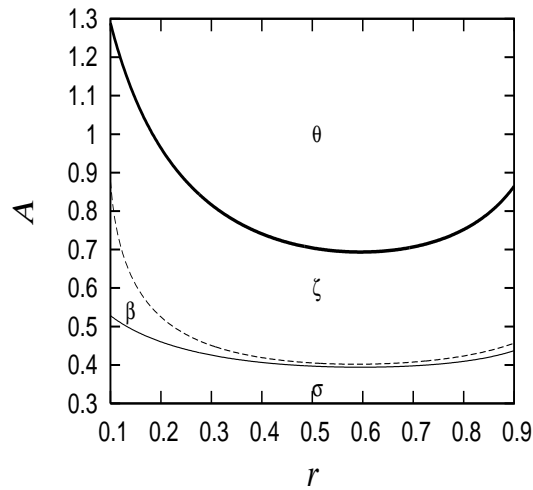


(e) $D = 5.0, K = 2$

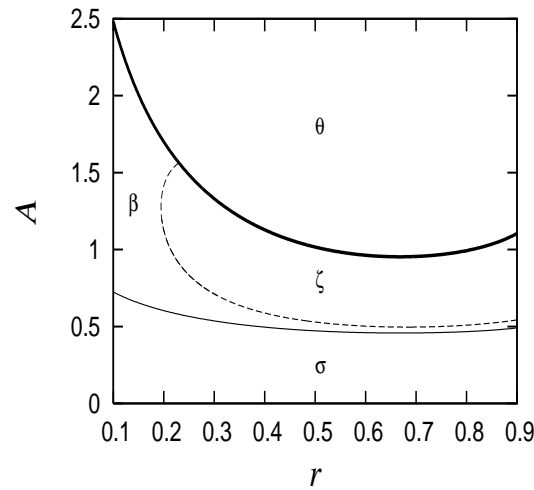
Note: Regime σ : no existence. β : unstable to competition. ζ : unstable to an oscillation if $\tau > \tau_H(r, A)$ (synchronous). θ : unstable to replication.

- **DAE Dynamics:** Equally-spaced spots on a ring, remain on a ring of slowly evolving radius, i.e. $r = r(\varepsilon^2 t)$.
- **Equilibrium:** Equilibrium ring radius coincides with minimum of $A_{\text{split}}(r)$ (upper curve).
- **Dynamically Triggered** spot self-replication and competition instabilities are clearly possible.

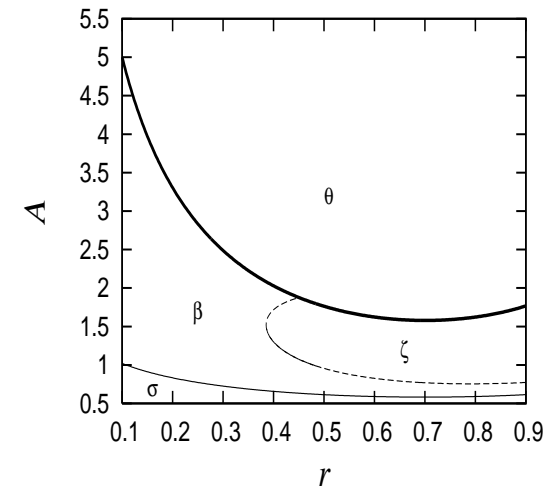
K -Spot Patterns on a Ring in Unit Disk: II



(f) $K = 4, D = 0.2$

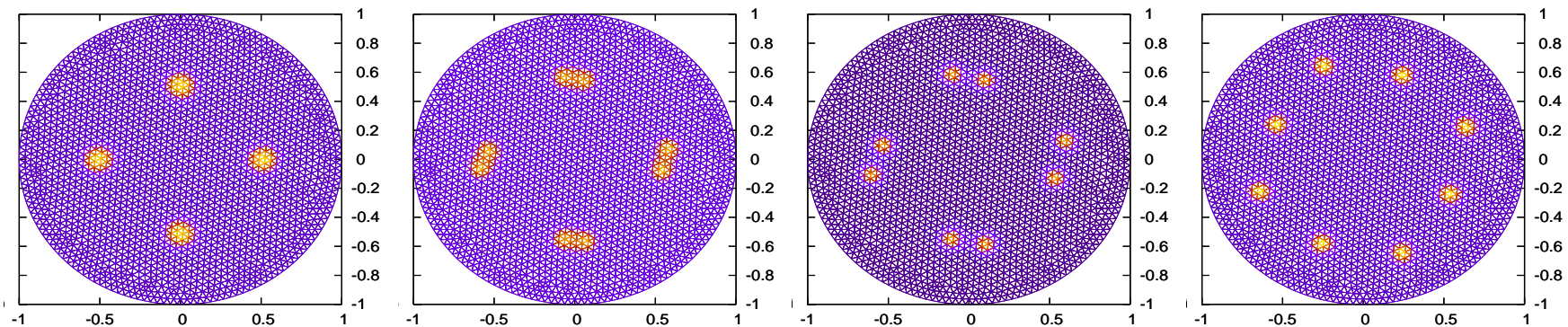


(g) $K = 8, D = 0.2$



(h) $K = 16, D = 0.2$

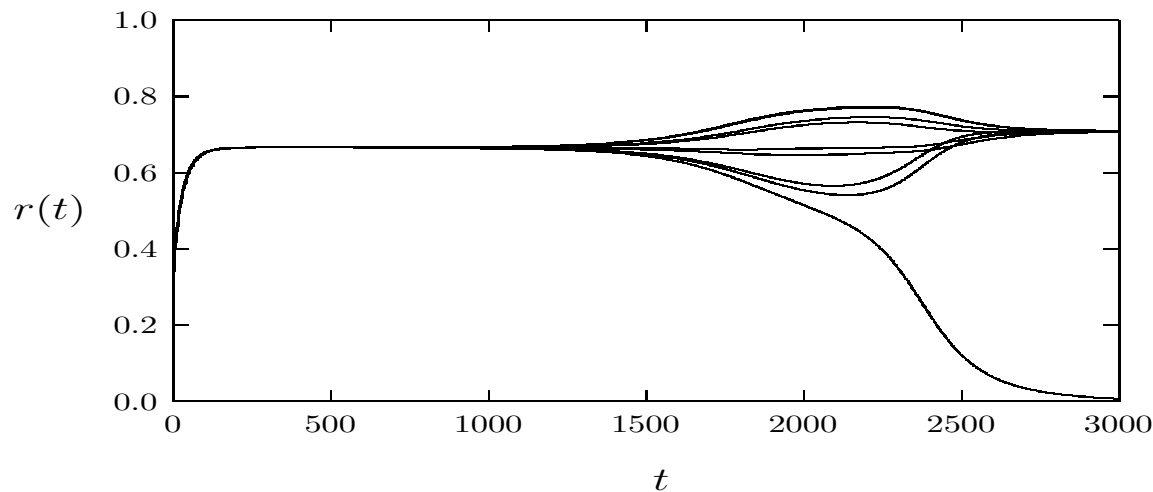
Ex: $K = 4, r(0) = 0.42, A = 0.7$. Predict: **dynam. triggered instability.**



K -Spot Patterns on a Ring in Unit Disk: III

Although the radial ODE for the ring radius has a stable equilibrium, **the full DAE system has a weak instability if too many spots are on one ring.**

Experiment (Small Eigenvalue Instability): $\varepsilon = 0.02$, $D = 0.2$, $K = 9$, and $A = 0.75$. Initially nine spots are on a slowly expanding ring. As the equilibrium ring radius is approached, one spot is pushed off the ring. The equilibrium pattern has eight spots on a ring with a center-spot.



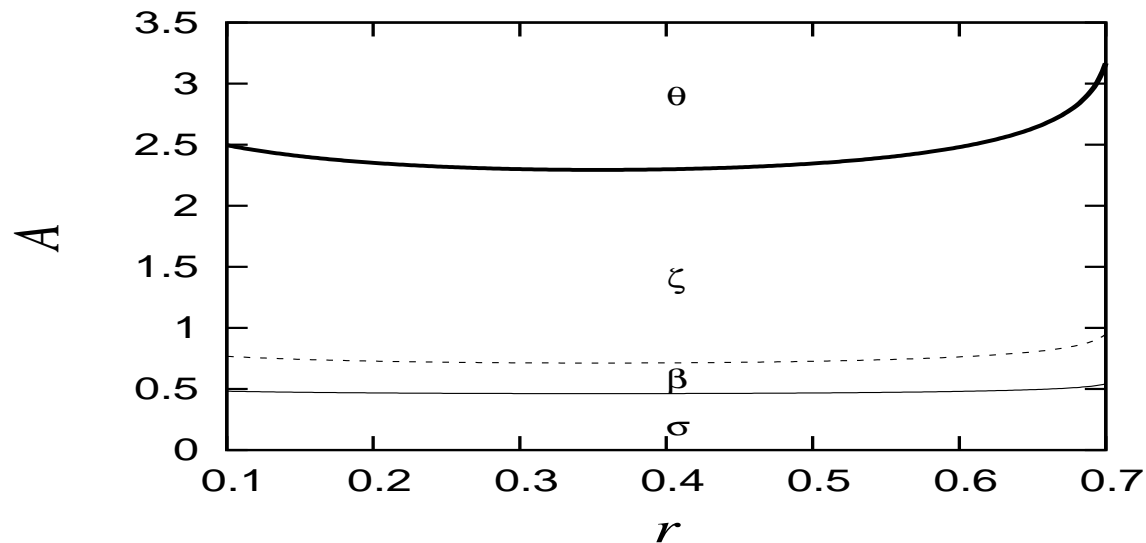
Conjecture that instability **results from indefinite Hessian of the DAE dynamics** if $K > K_c$ (similar to Eulerian point vortices on a ring or on equator of a sphere (S. Boatto, Physica D, 2002)).

Four Spots in the Unit Square: I

Let $\Omega = [0, 1] \times [0, 1]$, $D = 1$, with $\varepsilon = 0.02$ fixed. Put four spots along diagonals of the unit square at distance r from the center. **For this pattern the Green matrix is circulant symmetric**, and in terms of the reduced-wave G-function, the common source strength S_c satisfies

$$A = \frac{\varepsilon}{nu\sqrt{D}} \mathcal{F}(S_c), \quad \mathcal{F}(S_c) \equiv S_c + 2\pi\nu\theta S_c + \nu\chi(S_c), \quad \theta \equiv R_{1,1} + \sum_{j=2}^4 G_{1,j}.$$

The **phase-diagram of A versus r showing four regions** is:



Four Spots in the Unit Square: II

- Regime σ : the four-spot quasi-equilibrium solution does not exist.
- Regime β : the quasi-equilibrium solution exists but is unstable to a competition instability.
- Regime ζ : the solution is unstable to an oscillatory profile instability when $\tau > \tau_H(A, r)$.
- Regime θ : the quasi-equilibrium solution is unstable to spot self-replication.

The **existence and spot-replication thresholds** are simply

$$A_{\text{exist}} = \frac{\varepsilon}{\nu\sqrt{D}} \min_{S_c} (\mathcal{F}(S_c)) ; \quad A_{\text{split}} = \frac{\varepsilon}{\nu\sqrt{D}} \mathcal{F}(\Sigma_2), \quad \Sigma_2 = 4.31 \dots$$

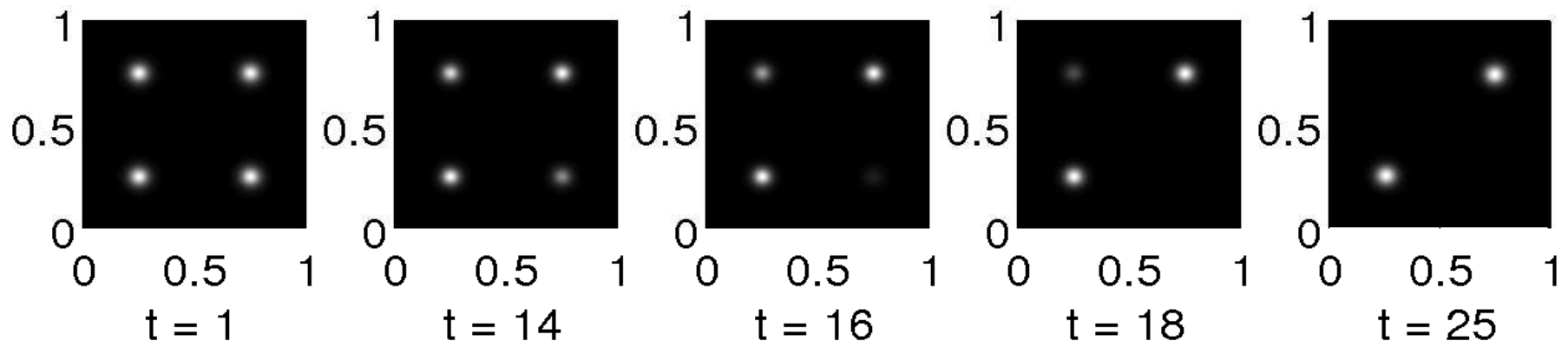
Four Spots in the Unit Square: III

The **competition instability** threshold of A versus r is obtained by eliminating S_c between:

$$\chi'(S_c) + 2\pi \sum_{m=1}^4 (-1)^{m-1} a_m = -\nu^{-1}; \quad a_1 = R_{1,1}; \quad a_j = G_{1,j}, \quad j = 2, 3, 4,$$

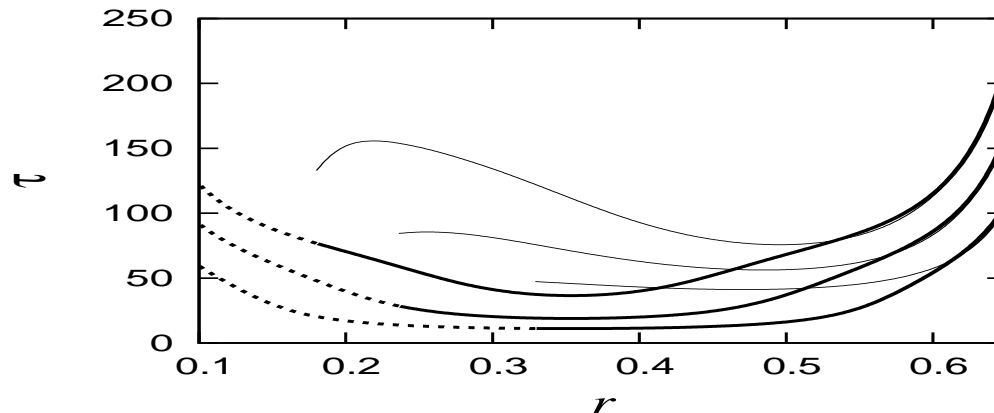
$$A = \frac{\varepsilon}{\nu\sqrt{D}} \mathcal{F}(S_c) \equiv S_c + 2\pi\nu\theta S_c + \nu\chi(S_c), \quad \theta \equiv R_{1,1} + \sum_{j=2}^4 G_{1,j}.$$

Example: $\varepsilon = 0.02$, $D = 1$, $A = 0.6$ and $\tau = 1.0$. Initially we have $r = 1/2\sqrt{2}$, so that we are in **Regime β of phase diagram**. The **competition instability** is set by the sign-fluctuating eigenvector of the Green matrix.



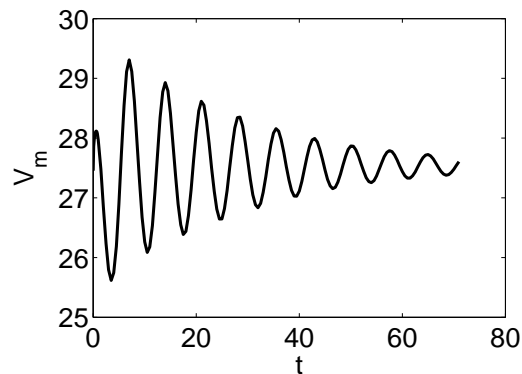
Four Spots in the Unit Square: IV

Example: Fix $D = 1$, $\varepsilon = 0.02$. Plot $\tau_H(r)$ for **synchronous oscillation** (heavy solid) and alternating-phase (light curves) for $A = 0.8$, $A = 0.9$, $A = 1.0$. **Synchronous gives smallest τ_H . Note: Equilibrium at minimum value of $\tau_H(r)$. Hence, dynamically triggered oscillations are possible.**

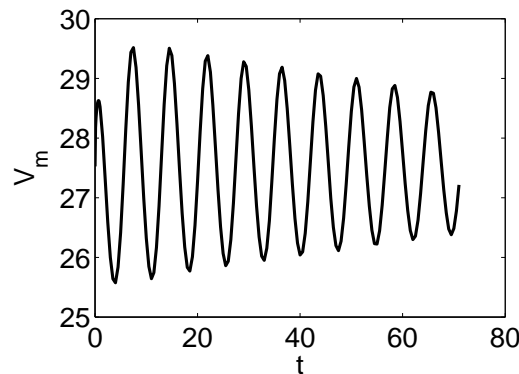


Example: Fix $r(0) = 0.35$, $A = 0.8$. **Predict $\tau_H \approx 11.0$.**

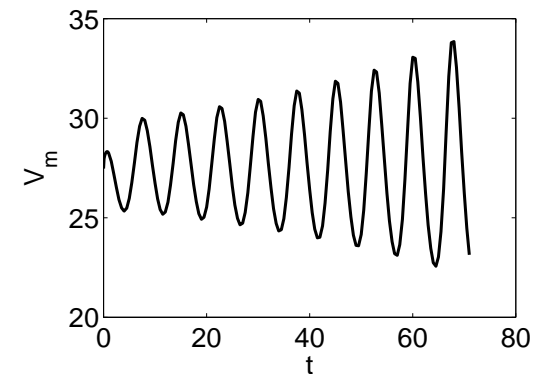
Left: $\tau = 10$



Middle: $\tau = 11$



Right: $\tau = 12$.

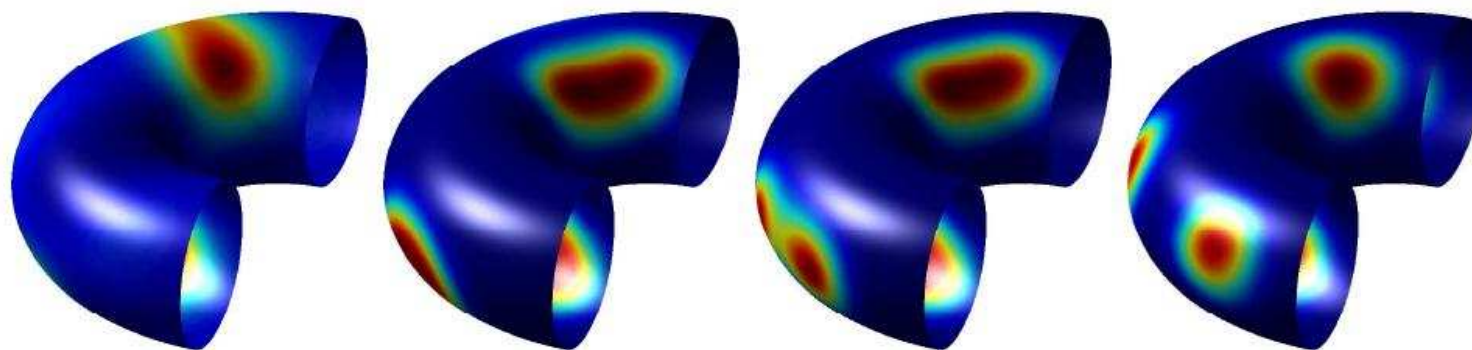


Open Issues and Further Directions: I

- **Rigor:** clearly a need for it
- **Universality:** Apply framework to (generic) RD systems to derive general principles for dynamics, stability, replication. (W. Chen, MJW)
- **Growing Domains:** Study delayed bifurcation effects and self-replication of spots on growing planar domains and on surface of a sphere (Ph.D thesis of Ignacio Rozada (UBC); ongoing).
- **Annihilation-Creation Attractor:** construct a “chaotic” attractor or “loop” for GS model composed of spot-replication events, leading to spot creation, followed by an over-crowding instability (spot-annihilation). (W. Chen, MJW).
- **Stability of Periodic Lattice Patterns in \mathbb{R}^2 for GS:** Need periodic G function for stability (Bloch representation); continuous spectrum etc..(Iron, Rumsey, MJW).
- **Cell Signalling:** Can localized compartments with ODE kinetics that are coupled together through a (slow) time-dependent (passive) diffusion process, trigger temporal oscillations in the compartments when no oscillations would otherwise be present? This is the mechanism of spot oscillations for GS model. (D. Coombs and Y. Nec (UBC)).

Open Issues and Further Directions: II

- **Patterns on Manifolds:** Pattern formation on manifolds, where the geometry of the manifold influences localization; equilibrium stripes on geodesics? dynamics of spots induced by Gaussian curvature? Spot replication on slowly evolving manifolds etc.. **Require properties of Green functions on manifolds. (Large D limit for a one-spot solution to a GM model (Tse, Winter, Wei, (2010).))**



Schnakenburg model on a Manifold: S. Ruuth (JCP, 2008)

Key: New PDE numerical approaches “Closest Point Algorithms to Compute PDE’s on Surfaces”, by S. Ruuth (SFU) , C. McDonald (Oxford), allow for “routine” full numerical simulations to test any asymptotic theories.