# Stable moving patterns in the 1-D and 2-D Gray-Scott Reaction-Diffusion System





Robert Munafo Rutgers Mathematical Physics Seminar Series 2010 Dec 9, 2 PM - Hill 705

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# Contents (outline of this talk)

- Brief history, motivation and discovery
- Methods and testing
- New patterns and interactions (mostly video)
- Connections; Open questions
- Discussion

# **Brief History: Initial Motivation**

#### Xmorphia

Instructions: Click on the red squares for images, and on the yellow blobs for movies.



Morphogenesis from a Reaction-Diffusion System

Roy Williams Concurrent Supercomputing Facilities California Institute of Technology

Roy Williams "Xmorphia" web exhibit (Caltech, 1994)

$$\frac{\partial U}{\partial t} = D_{u} \nabla^{2} U - U V^{2} + F(1 - U)$$
$$\frac{\partial V}{\partial t} = D_{v} \nabla^{2} V + U V^{2} - (F + k) V$$

- 1994: Looking for a problem to run on new hardware
- Supercomputer research led to Williams exhibit at Caltech (shown, left)
- Literature was easy to find; problem was appealing
- Exploring parameter space more closely

Pearson "Complex patterns in a simple system" (*Science* **261** 1993) (illust. next slide)

Lee et al. "Experimental observation of self-replicating spots in a reaction-diffusion system" (*Nature* **369** 1994)

Laboratory experiment



Numerical simulation

Ferrocyanide–iodate–sulphite reaction in gel reactor

(  $K_4Fe(CN)_6^{\cdot}3H_2O$  ,  $NaIO_3$  ,  $Na_2SO_3$  ,  $H_2SO_4$  , NaOH , bromothymol blue )

$$\frac{\partial U}{\partial t} = D_{\rm U} \nabla^2 U - U V^2 + A(U_0 - U)$$
$$\frac{\partial V}{\partial t} = D_{\rm V} \nabla^2 V + U V^2 + B(V_0 - V)$$

### **Brief Intro: Parameter Space**



Parameter space and four pattern examples, from Pearson (ibid. 1993)

Coloring imitates bromothymol blue pH indicator as in Lee et al. "Pattern formation by interacting chemical fronts" (*Science* **261** 1993): blue = low *U*; yellow = intermediate; red = high *U* 

Parameter space visualizations for several reactiondiffusion models, from fig. 3, Miyazawa et al. "Blending of animal colour patterns by hybridization" (*Nature Comm.* **1(6)** 2010)

# Brief History: 2009 Website Project



• Denser coverage; explore more extreme parameter values

Pearson: 34 sites; 0.045<*k*<0.066; 0.003<*F*<0.061; all static

Williams: 45 sites; 0.032<*k*<0.066; 0.01<*F*<0.07; 4 video

Munafo: 150+ sites; 0.03<*k*<0.072; 0.004<*F*<0.098

Several types of starting patterns







published work

- Video for each (k,F) point
- Higher resolution and precision
- Coloring to show both U and  $\partial U/\partial t$
- Describe and catalog all phenomena

• Run each pattern "to completion" no matter how long that takes



Munafo (2009) www.mrob.com/pub/comp/xmorphia

Also found: mixed spots and stripes; variations in branching; etc.

# **Inherent Instability**



*k*=0.062, *F*=0.06

Periodic boundary conditions; size 3.35w x 2.33h

Each second is 1102 dtu

Initial pattern of low-level random noise (0.4559<*U*<0.4562; 0.2674<*V*<0.2676)

Final values: 0.35<*U*<0.90; 0.00<*V*<0.36 (approx.)

(Contrast-enhanced images; lighter = higher *U*)

Turing-F600-k620.mp4 -youtube.com/v/kXDTqqgrYCg





*t*=3900

• At many parameter values, patterns like this grow out of any inhomogeneity, no matter how small

• This is not a consequence of numerical approximation error: proven by mathematical analysis. Dominant wavelength (spot size) depends on reaction dynamics and diffusion rate. Turing "The chemical basis of morphogenesis" (*Phil. Trans. Royal Soc. London B* **237(641)** 1952)



### How can we trust these results?



Turing instability



Numerical instability



Euler integration



4th-order Runge-Kutta

- Arbitrarily low-level noise can generate strong patterns
- Instabilities can exist in the ideal (exact) system, and can be introduced by the numerical method
- Complex patterns are already proven to be real
- These new patterns are far more extraordinary
- Mathematical proof/disproof probably impossible
- How much precision is necessary? Is any finite precision sufficient for proof?
- Is the standard precision "too accurate" to be relevant? The real world has known levels of quantization and randomness: "finite precision"
- Goals:
  - Eliminate suspicion of numerical error
  - Quantify the sensitivity of these pattern phenomena to precision, randomness, reaction parameters and other environmental conditions

# **Verification Examples**

- Two stable moving phenomena
- One is clearly bogus, the other might be real



Two spots maintain the same distance while the pair rotates toward a 45° alignment



U-shaped pattern moves at about 1 **dlu** per 62,000 **dtu** (dimensionless units of length, time)

- Define something that is measurable
- Model the sources of error, e.g.:

measured value = true value + simulation error + measurement error

simulation error = *f*(stability, precision, grid spacing, ...)

CFL (Courant-Friedrichs-Lewy 1928) stability criterion (for the Laplacian term):

 $C \Delta x^2 / \Delta t$ 

(A higher value means greater stability. Constant C depends on e.g. k and F for the Gray-Scott system)

• Progressively improve the simulation and look for a trend

# **Verification Procedure**



- Progressively improve  $\Delta x$  by  $\sqrt{2}$
- Progressively improve CFL stability by √2
- Progressively improve ∆t by needed amount (2√2)

	$\Delta x$	$\Delta t$	$\Delta x^2 / \Delta t$	pixels(typ.)
"std"	0.00699	0.5	9.78e-5	128x128
"s1.4"	0.00495	0.177	1.38e-4	180x180
"s2"	0.00350	0.0625	1.96e-4	256x256
"s2.8"	0.00247	0.0221	2.77e-4	360x360
"s4"	0.00175	0.00781	3.91e-4	512x512

(amount of calculation increases by  $4\sqrt{2}$  each time: ratio of 1024 to 1 between "std" and "s4")

#### **Expected Results:**



Movement is 100% spurious: measurements should tend towards zero



If real, velocity should clearly converge on a nonzero value

### **Verification Examples - Results**

#### Suspect rotating 2-spot phenomenon

-	model	max dU/dt	cross-qtr. interval
Q	std s1.4	8.97e-7 4.57e-7	5.6e5 1.12e6
	s2	2.31e-7	2 <b>.</b> 18e6
	s2.8	1.158e-7	4.34e6
	S4	5.80e-8	8./00

#### Velocity of U-shaped pattern

model	dist	pixels	time	velocity (meas.err)
std	0.55418	79.2	35076	1/63294(45)
s1.4	0.59863	121.1	37342	1/62379(64)
s2	0.57042	163.1	35456	1/62159(27)
s2.8	0.56947	230.3	35258	1/61913(44)
s4	0.56553	323.5	35009	1/61905(12)
Same	tests us	ing 4th	order Ru	unge-Kutta
model	dist	pixels	time	velocity (meas.err)
std	0.57937	82.9	36559	1/63101

Limits on parameter *k* (when *F*=0.06) for stability of U-shaped pattern

relative velocity

> 1.0 0.50 0.26 0.129 0.064

model	minimum	maximum
std	0.0608833	0.0609829
s1.4	0.0608796	0.0609831
s2	0.0608777	0.0609831
s2.8	0.0608767	0.0609830
s4	0.0608762	did not test
me	easurement error	in all
Vá	alues is +-1 in	the last digit



- Two-spot pattern movement is bogus
- Moving U-shaped pattern is real; Runge-Kutta gives little if any benefit
- Asymptotic trends in values and in measurement errors, as expected



### Immunity to Noise



t=64680

t=88500

k=0.0609, F=0.06

Periodic boundary conditions; size 3.35w x 2.33h 1 second ≈ 1100 dtu

4 U-shaped patterns traveling "up"

Systematic noise perturbation applied once per 73.5 dtu

Amplitude of each noise event starts at 0.001 and doubles every 11,000 dtu (10 seconds in this movie)

At noise level 0.064, three patterns are destroyed; noise amplitude is then diminished to initial level

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(False-color: yellow = high U; pastel = positive \partial U/\partial t)
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U-noise-immunity.mp4 -- youtube.com/v/ sir7yMLvlo

- Pattern continues to move in the presence of noise, and generally ٠ behaves as expected of a real phenomenon
- Similar tests (e.g. more frequent noise events each of lower amplitude) • give similar results

# Symmetry-based Instability Tests



k=0.0609, F=0.06 — Periodic boundary conditions; size 2.36w x 1.65h — Manually constructed initial pattern based on parts of naturally-evolved systems — 1 second = 265 **dtu** 

Two sets of three noise events; noise event amplitudes are 10<sup>-5</sup>, 0.001 and 0.1; pattern allowed to recover after each event

Coloring (left image) same as before — Coloring (images below): white = positive  $\partial U/\partial t$ , black = negative  $\partial U/\partial t$ , shades of gray when magnitude of  $\partial U/\partial t$  is less than about  $5 \times 10^{-13}$ 



- Rotating and moving patterns have rotational or bilateral (resp.) symmetry which persists if the pattern is stable.
- Instability and/or a return to symmetry are easier to observe in the derivative
- Test static and linear-moving patterns at different angles to reveal influence by grid effects
- Other tests include shifting parts of a pattern, applying noise to only part of a pattern, etc.
- Such tests can reveal instability more quickly but do not prove stability.

# Logarithmic Timebase, Long Duration

- Some phenomena appear asymptotic to stability but actually keep moving forever
- Running a simulation for as long as possible (currently >10<sup>8</sup> time units) and viewing the results at an exponentially accelerating speed can reveal some of these phenomena
- Repulsion of solitons in 1-D (pictured, lower-right) has been studied mathematically for high ratios  $D_U/D_V$  (Doelman et al. "Slowly modulated two-pulse solutions...", *SIAM Jrl. on Appl. Math.* **61(3)** 2000) with the result: (speed of movement) =  $Ae^{-Bt}$  for positive constants *A*,*B*
- There are many other phenomena in Gray-Scott systems that slow at similar rates



*t*=78,125





*t*=2×10<sup>7</sup>



*t*=3.2×10<sup>8</sup>



Pair of solitons in 1-D system, k=0.0615, F=0.04

Eight solitons in a 2-D system, k=0.067, F=0.046

### **Discovery – Great Diversity**

![](_page_14_Figure_1.jpeg)

![](_page_14_Picture_2.jpeg)

![](_page_14_Figure_3.jpeg)

![](_page_14_Figure_4.jpeg)

(*k*=0.061, *F*=0.062)

*k*=0.061, *F*=0.062 Periodic boundary conditions; size 3.35w x 2.33h

1 second  $\approx$  1190 dtu

Initial pattern of a few randomly placed spots of relatively high *U* on a "blue" background (secondary homogeneous state, approx. *U*=0.420, *V*=0.293)

(False-color: yellow = high U; pastel = positive  $\partial U/\partial t$ )

Original-F620-k610-fr159.mp4 -- <u>youtube.com/v/wFtXwFfrwWk</u>

- Part of routine scan for website exhibit project
- "Negative solitons" (hereafter called "negatons") exhibit attraction and multi-spot binding
- Several types of patterns in one system
- The "target" pattern is not stable at these parameter values, but is stable at the nearby parameters k=0.0609, F=0.06

White curve = U; Black curve = V; dotted line shows cross-section taken

![](_page_14_Picture_16.jpeg)

"negative solitons" in Pearson (ibid. 1993)

"Pattern ι is time independent and was observed for only a single parameter value."

(parameters unpublished, probably *k*=0.06, *F*=0.05)

#### **Discovery – Moving U Pattern**

![](_page_15_Picture_1.jpeg)

![](_page_15_Picture_2.jpeg)

![](_page_15_Picture_3.jpeg)

 F=0.08  $\bullet$   $\bullet$ 

*k*=0.0609, *F*=0.062

Periodic boundary conditions; size 3.35w x 2.33h

1 second ≈ 3900 dtu

Initial pattern and coloring same as before

U-discovery-F620-k609-fr521.mp4 -youtube.com/v/xGMuuPYhLiQ

Original coloring -- youtube.com/v/ypYFUGiR51c

- Moving "U" visible to right of center, short-lived (hits two negatons)
- More unexpected negaton behavior: being "dragged" by other features

# Long Duration Test

Different Behaviors at Multiple Time Scales

![](_page_16_Figure_2.jpeg)

*k*=0.0609, *F*=0.062 Periodic boundary conditions; size 3.35w x 2.33h

Initial pattern of spots (randomly chosen U<1, V>0) on solid red (U=1, V=0) background; coloring same as before

Video uses accelerating time-lapse: simulation speed doubles every 6.7 seconds

Exponential-time-lapse.mp4 -- <u>youtube.com/v/-k98XOu7pC8</u>

- First 30,000 **dtu** (40 seconds): blue spots grow to fill the space (a very common Gray-Scott behavior)
- Up to 1.25 million **dtu** (75 seconds): complex behavior, double-spaced stripes, solitary negatons, etc. until all empty space is filled
- Up to 6 million **dtu** (90 seconds): chaotic oscillation of parallel stripes growing, shrinking and twisting; gradually producing more spots
- Sudden onset of stability: All chaotic motion ends (whole system drifts very slowly)

#### **Complex Interactions**

![](_page_17_Picture_1.jpeg)

*k*=0.0609, *F*=0.06

Periodic boundary conditions; size 3.35w x 2.33h

Each second is 10,000 dtu

Manually constructed initial pattern based on parts of naturally-evolved systems

Coloring same as before

complex-interactions-1.mp4 -- youtube.com/v/hgTBOf7gg8E

- U-shape can influence other objects and survive (although it generally does not)
- The clusters of negatons along the top move and rotate, very slowly

#### **Slow Movement, Rotation**

![](_page_18_Figure_1.jpeg)

youtube.com/v/PB3IPMhwlo0

Stability analysis of another slow-rotating pattern

609 F600 s0 %6 \$1 d4(Std

- There are many very slow patterns; a few of the more common are shown here
- The "target" (negaton with annulus) is a common product of spotlike initial patterns, and adjacent negatons typically make it move or rotate
- The 4 negatons left by the collision of two U
  patterns are in an unstable equilibrium

Stability testing of 4-negaton pattern; stable form shown at right

### A Gray-Scott Pattern Bestiary

![](_page_19_Picture_1.jpeg)

- Almost everything that keeps its shape moves indefinitely
- In general, a pattern will:
  - move in a straight line, if is has (only) bilateral symmetry
  - rotate, if it has (only) rotational symmetry
  - move on a curved path, if it has no symmetry at all
- Lone negatons are frequently "captured" and/or "pushed" by a moving pattern

k=0.0609, F=0.06 Contrast-enhanced grayscale, lighter = higher U

Most patterns were manually constructed from parts of naturally occurring forms

Note: Many of these are not yet thoroughly tested

# Relation to Other Work: "Negaton" Clusters and Targets

- Spots and "target" patterns very similar to the Gray-Scott "negatons" are seen in papers by Schenk, Purwins, et al.
- In a 1998 work, a 2-component R-D system is studied; the spots are stationary and are reported to "bind" into stable groupings with specific geometrical configurations (as shown). There are differences between this system and Gray-Scott, evident in which "molecules" are reported as stable.
- In a 1999 work (by Schenk alone) a 3component R-D system includes a "target" pattern with a very similar crosssection.

![](_page_20_Figure_4.jpeg)

From Schenk et al. "Interaction of self-organized quasiparticles..." (*Physical Review E* **57(6)** 1998), fig. 1 and 5 The pattern marked \* is stable in Gray-Scott at {k=0.0609, F=0.06}, the pattern marked is \* not.

![](_page_20_Picture_6.jpeg)

![](_page_20_Figure_7.jpeg)

Target pattern in Gray-Scott, k=0.0609, F=0.06, with U and V levels at cross-section through center

Target pattern from C. P. Schenk (PhD dissertation, WWU Münster, 1999) p. 116 fig. 4.37

# **Relation to Other Work: Halos**

- The light and dark "rings" or "halos" are seen in physical experiments and numerical simulations intended to model both physical and biological systems
- When spots appear in these systems, as in Gray-Scott, the spots tend to be seen at certain "quantized" distances
- Halo amplitudes, spot spacings and relative sizes differ; this also reflects changes seen in Gray-Scott as the *k* and/or *F* parameters are changed

![](_page_21_Picture_4.jpeg)

Negatons with halos (Gray-Scott system, *k*=0.0609, *F*=0.06, lighter = higher *U*; exaggerated contrast)

Spots with halos in numerical simulation by Barrio et al. "Modeling the skin patterns of fishes" (*Physical Review E* **79** 031908 2009) fig. 11

![](_page_21_Picture_7.jpeg)

![](_page_21_Picture_8.jpeg)

Spots with halos in gas-discharge experiment by Lars Stollenwerk ("Pattern formation in AC gas discharge systems", website of the Institute of Applied Physics, WWU Münster, 2008) fig. 3d

Halos also appear in models by Schenk, Purwins, et al (ibid., 1998 and 1999, shown elsewhere) in work related to gas discharge experiments

# **One-Dimensional Gray-Scott Model**

![](_page_22_Picture_1.jpeg)

2-D spirals and 1-D pulse at *k*=0.047, *F*=0.014

(470 F140 s0 %6 \$5 d3(Std-1.4)

![](_page_22_Picture_3.jpeg)

There are extensive results on the 1-D system based on rigorous mathematical analysis (most are for higher ratios  $D_U/D_V$  than in the systems presented here)

- The "spiral wavefront" observed at many parameter values in the 2-D system is also a viable selfsustaining stable moving pattern in the 1-D system at the same parameter values
- For many parameter values that support "negative stripes" in the 2-D system, certain asymmetrical clumps of "negatons" form stable moving patterns in the 1-D system
- Negatons in 1-D were reported (shown) as early as 1996

Single 1-D negaton inside a growing region of solid "blue state" at *k*=0.06, *F*=0.05, from Mazin et al. "Pattern formation in the bistable Gray-Scott model" (*Math. and Comp. in Simulation* **40** 1996) fig. 9

![](_page_22_Figure_9.jpeg)

(Note: Non-existence results of Doelman, Kaper and Zegeling (1997) and of Muratov and Osipov (2000) are not applicable because they concern models with a much higher ratio  $D_U/D_V$ )

## **Open Questions**

![](_page_23_Picture_1.jpeg)

Double-stripe and U

From Miyazawa (ibid. 2010)

![](_page_23_Picture_5.jpeg)

1-D moving pattern

- Why does the U-shaped pattern move and keep its shape?
  - As parameter k is increased, leading end of double-stripe (shown) moves faster, but trailing end moves slower and the object lengthens; in the other direction (decreasing k) the reverse is true
  - When these two speeds are closely matched, the U shape (shown) neither grows nor shrinks why?
- Do these patterns appear in other reaction-diffusion models?
  - Universal presence of other pattern types suggests this; parameter space maps should make it easy to find; nearby Turing effect is possibly relevant
- Can any of the special properties of these patterns be proven mathematically?
  - 1-D systems seem particularly well suited to this task
  - Shape of negaton "halos" is easy to solve
  - Most existing work applies conditions or limits that exclude the commonly studied  $D_U/D_V=2$  systems

![](_page_24_Figure_0.jpeg)