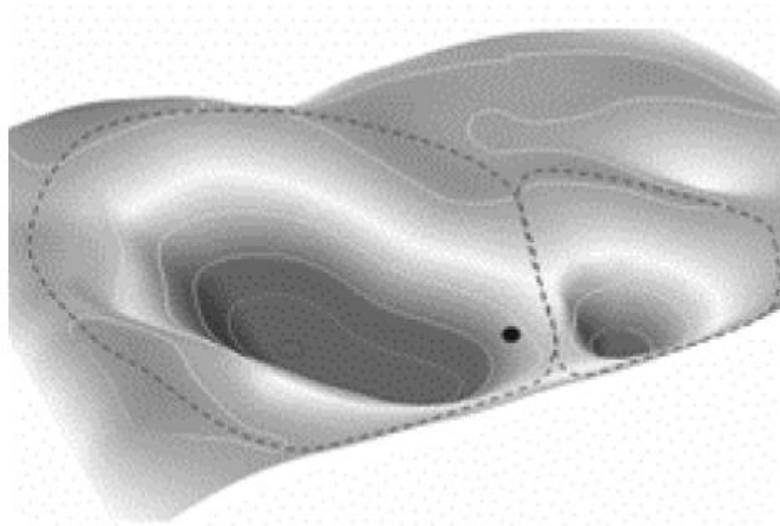


# Kicks and flows:

## A dynamical systems approach to modeling resilience



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September 23, 2014

# Collaborators

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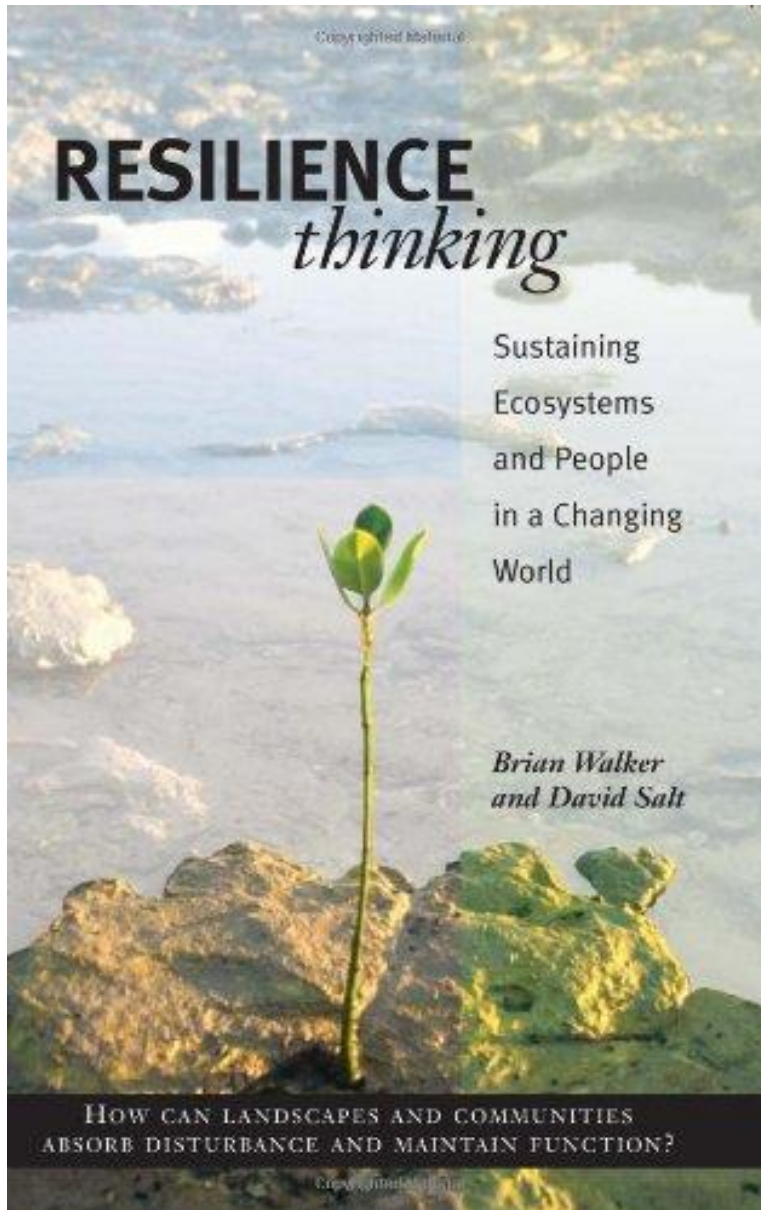
# Kicks and flows:

## A dynamical systems approach to modeling resilience

### Outline

1. The resilience paradigm
2. Defining resilience mathematically
3. A kick-flow system
  - a. Behavior in a linear system
  - b. Experiments in 2D nonlinear systems
4. Future Directions

# 1. The resilience paradigm



**Resilience ...**  
***the capacity of [a] system to absorb change and disturbances and still retain its basic structure and function”*** (p. 113)

# 1. The resilience paradigm



## Resilience ...

*the **capacity** of [a] system to **absorb change** and disturbances and still **retain its basic structure and function**”*

Mumby, Peter, et al. (2007) Thresholds and the resilience of Caribbean coral reefs. Nature 450: 98-101.

# 1. The resilience paradigm



**Resilience ...**  
***the capacity of [a] system to absorb change and disturbances and still retain its basic structure and function”***

Frelich, Lee E, and Peter Reich. (2009) Will environmental changes reinforce the impact of global warming on the prairie-forest border of central North America? *Front. Ecol. Environ.* 8: 371–378.

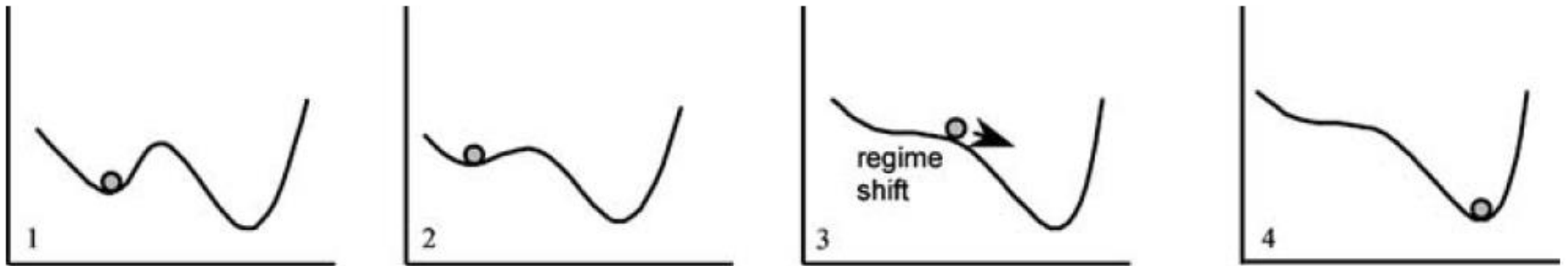
## 2. Defining resilience mathematically

resilience of **WHAT** to **WHAT** ?

the basin of attraction

perturbation of...

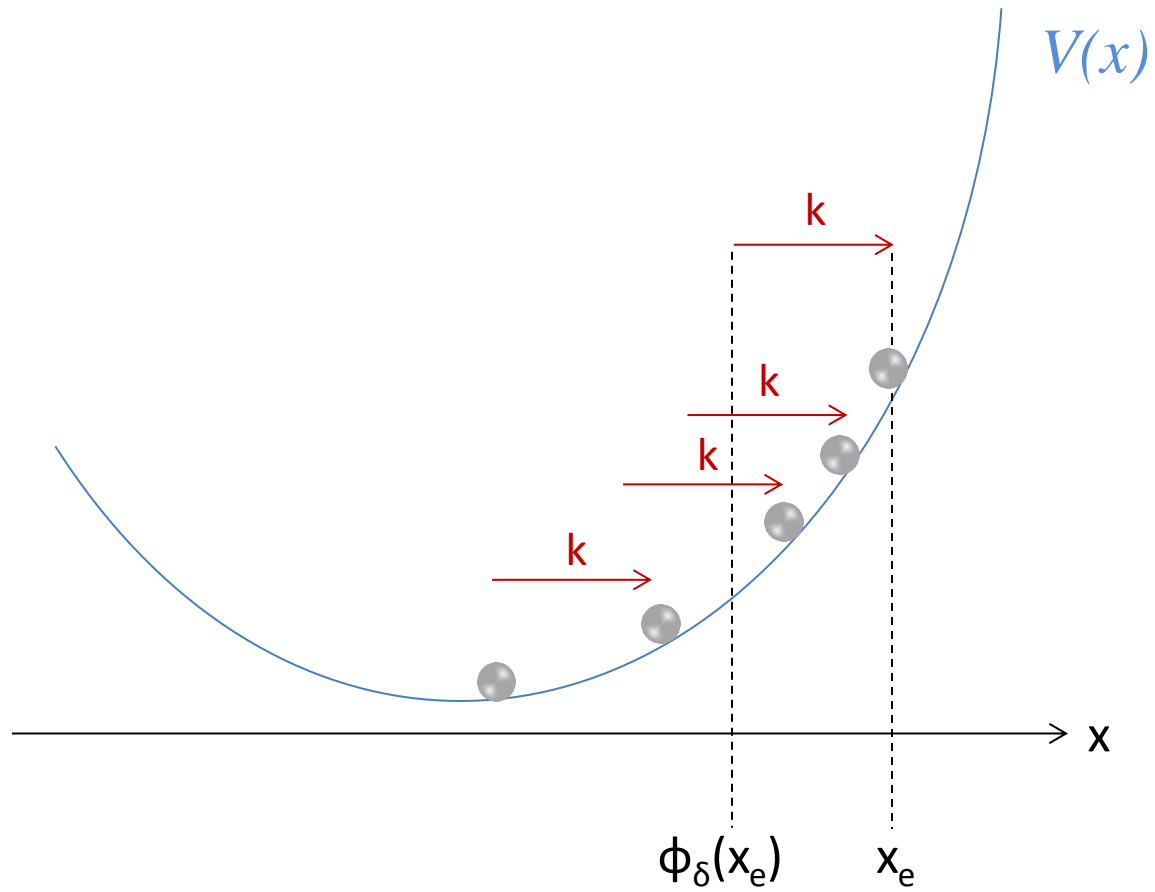
- state variables
- parameters



Folke et al. (2004) *Annu. Rev. Ecol. Evol. Syst.*



### 3. A kick-flow system



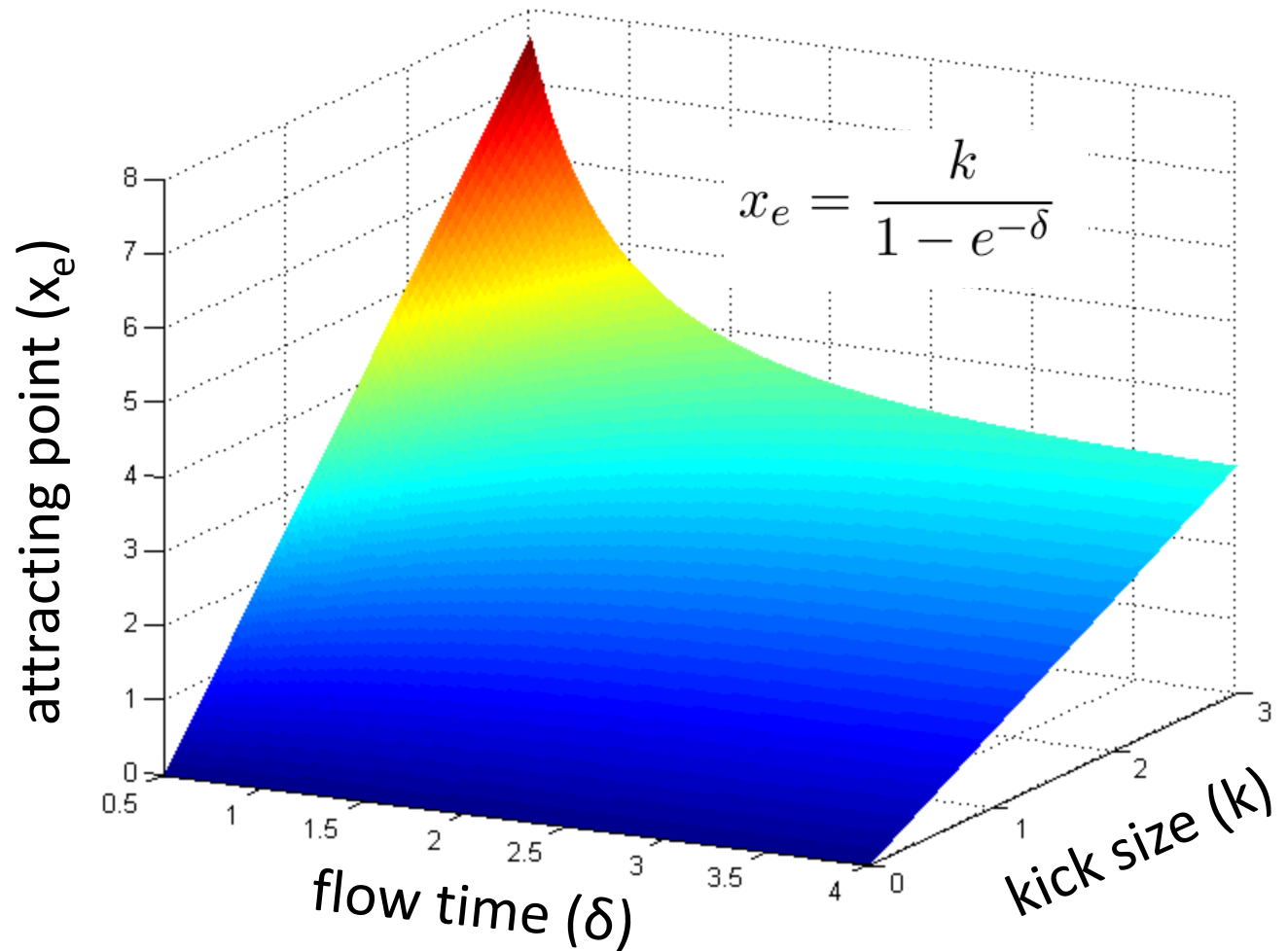
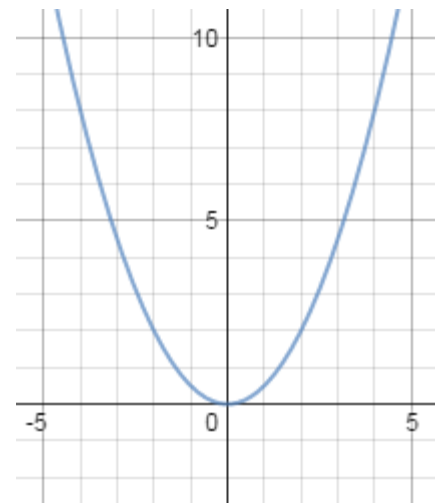


### 3. A kick-flow system

Linear 1D: Where is the attractor of this kick-flow system?

$$x'(t) = -x$$

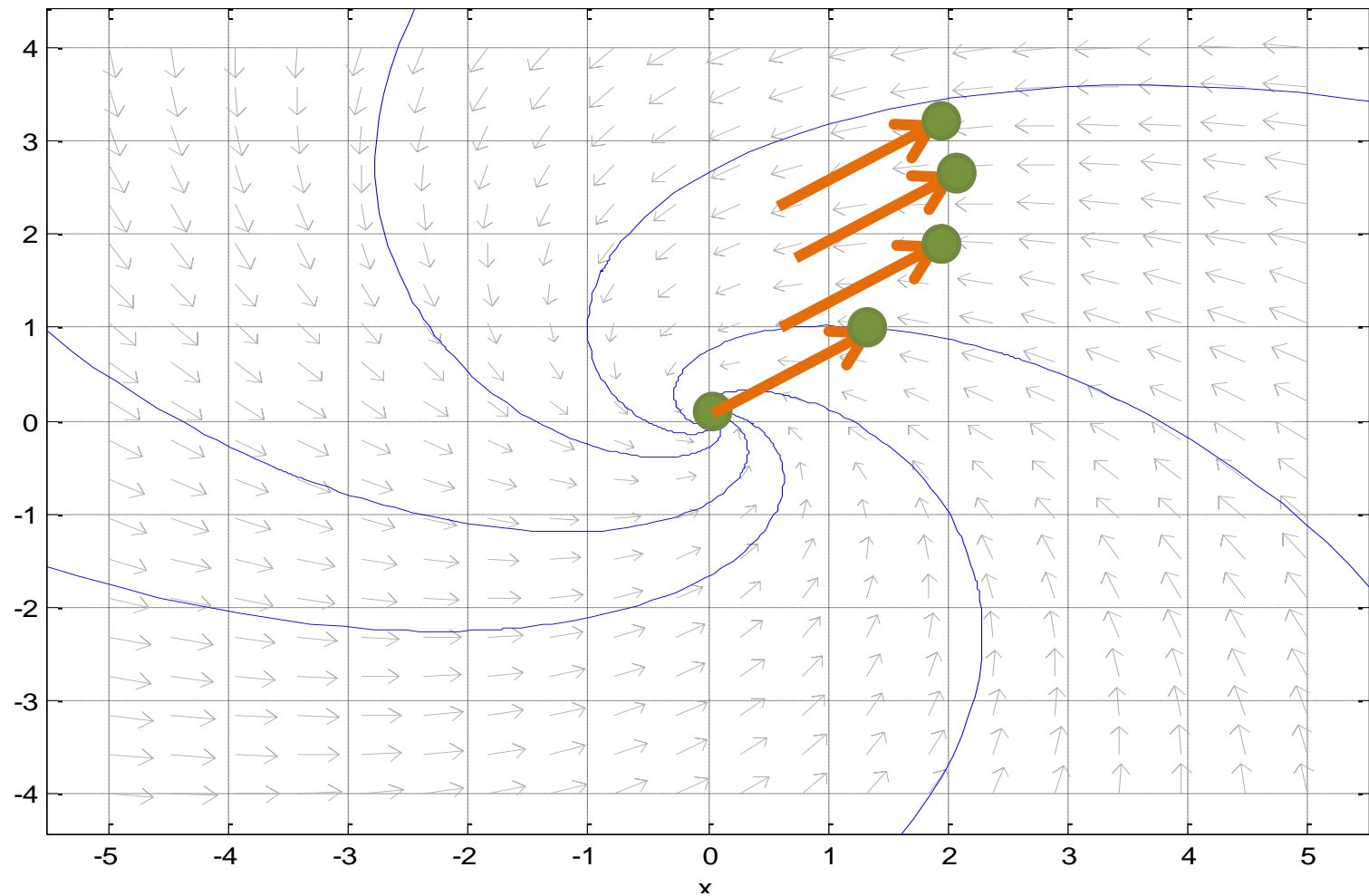
$$V(x) = \frac{1}{2}x^2$$



# 3. A kick-flow system

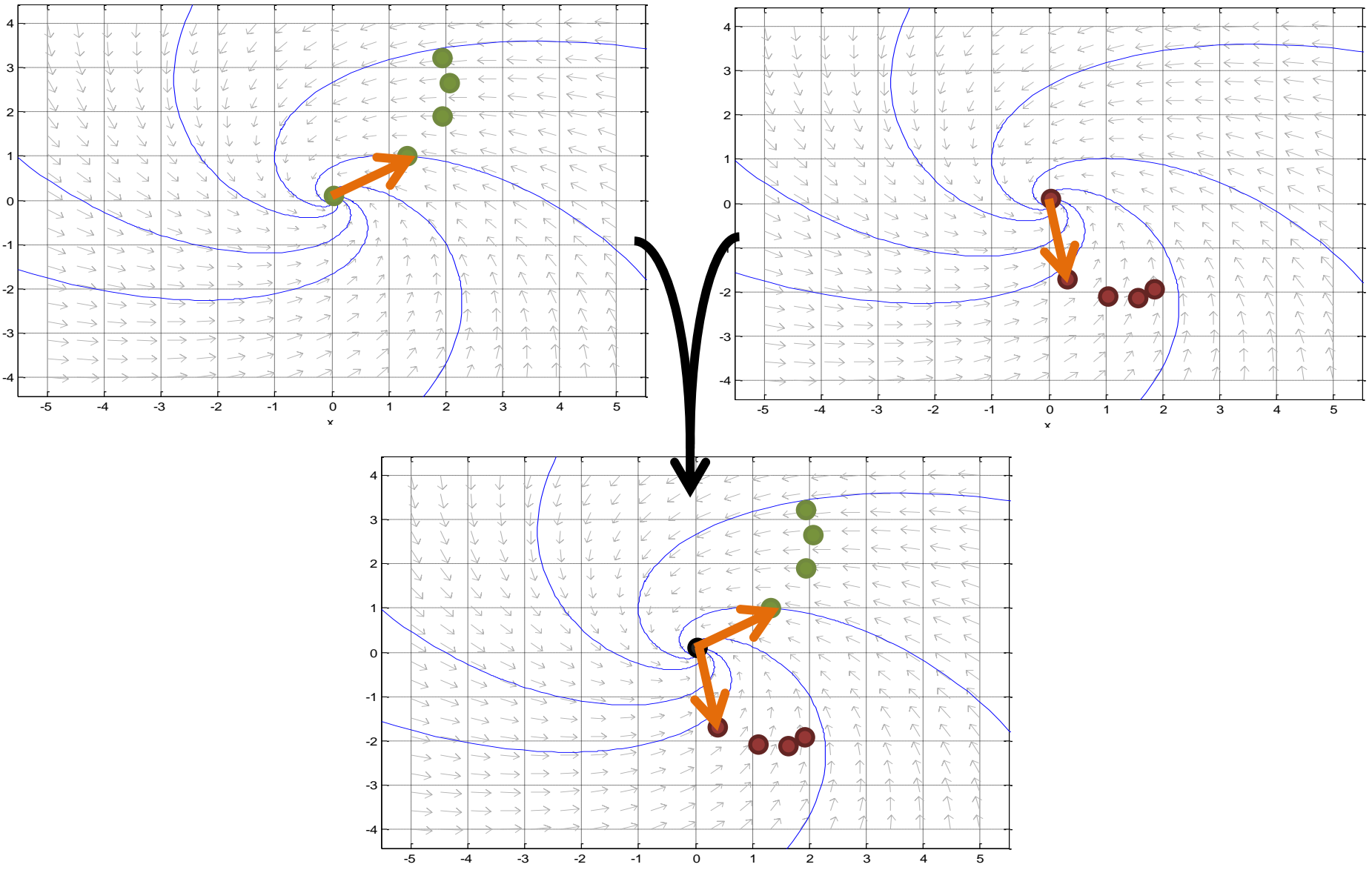
## Linear 2D

$$\mathbf{x}' = \begin{bmatrix} -7/4 & -7/4 \\ 5/4 & -5/4 \end{bmatrix} \mathbf{x}$$



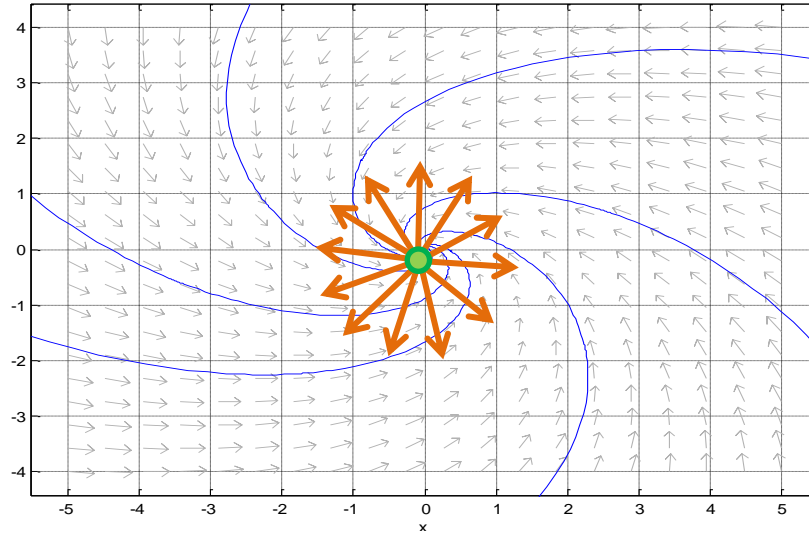
# 3. A kick-flow system

## Linear 2D

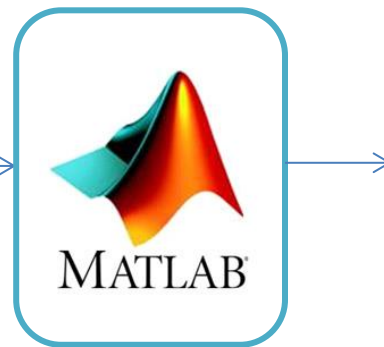


# 3. A kick-flow system

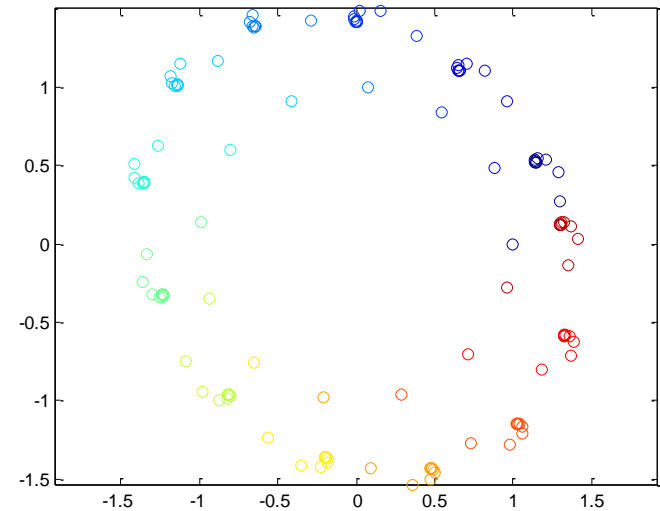
## Linear 2D



**ODEs**  
**initial position**  
**kick size, directions**  
**flow time**



Plot of discrete system

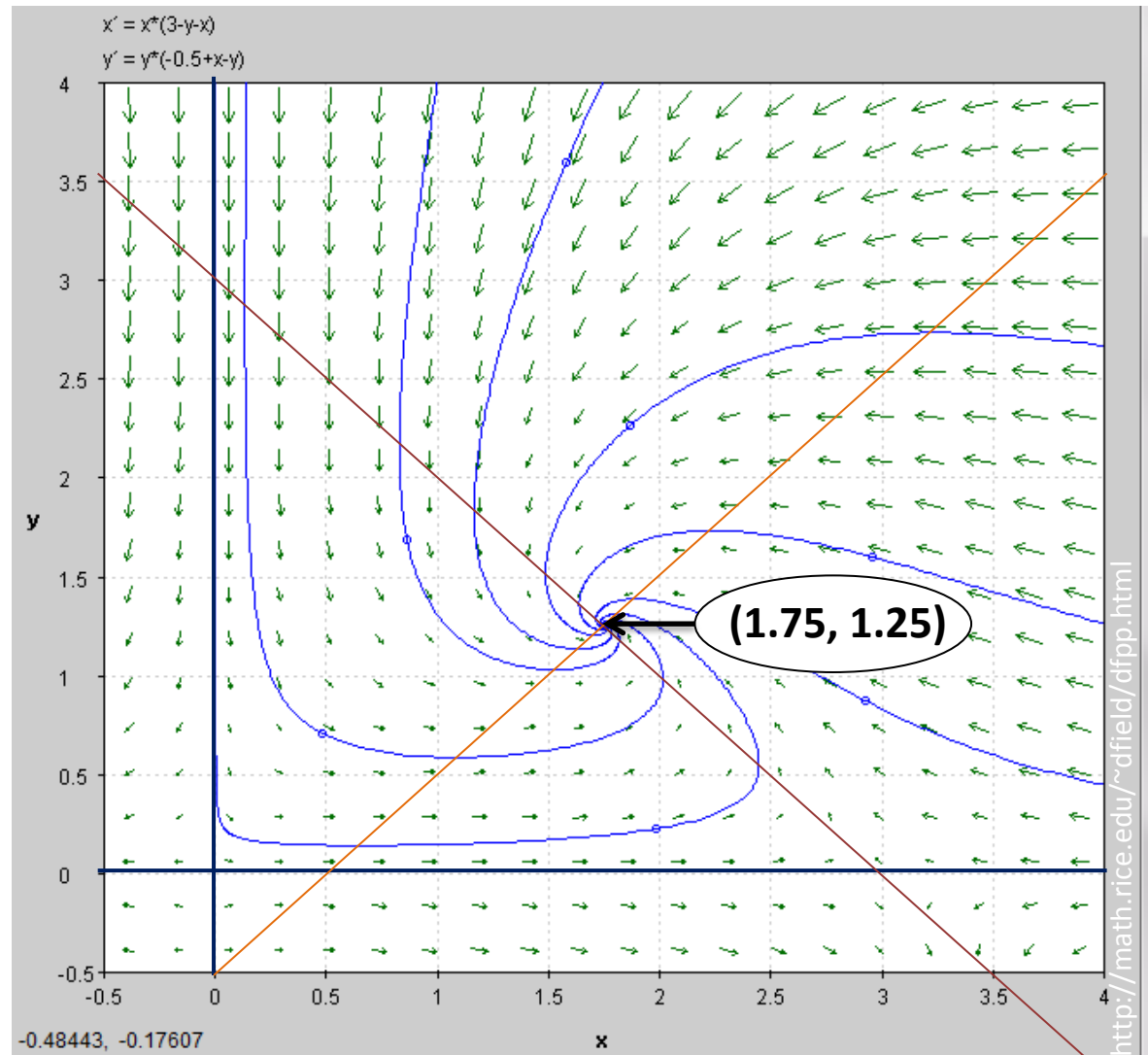


# 3. A kick-flow system

## Nonlinear 2D

## Predator-Prey model for species with limited growth

$$\begin{aligned}x'(t) &= x(3 - y - x) \\y'(t) &= y(-0.5 + x - y)\end{aligned}$$



# 3. A kick-flow system

**Nonlinear 2D**

**Predator-Prey model for species with limited growth**

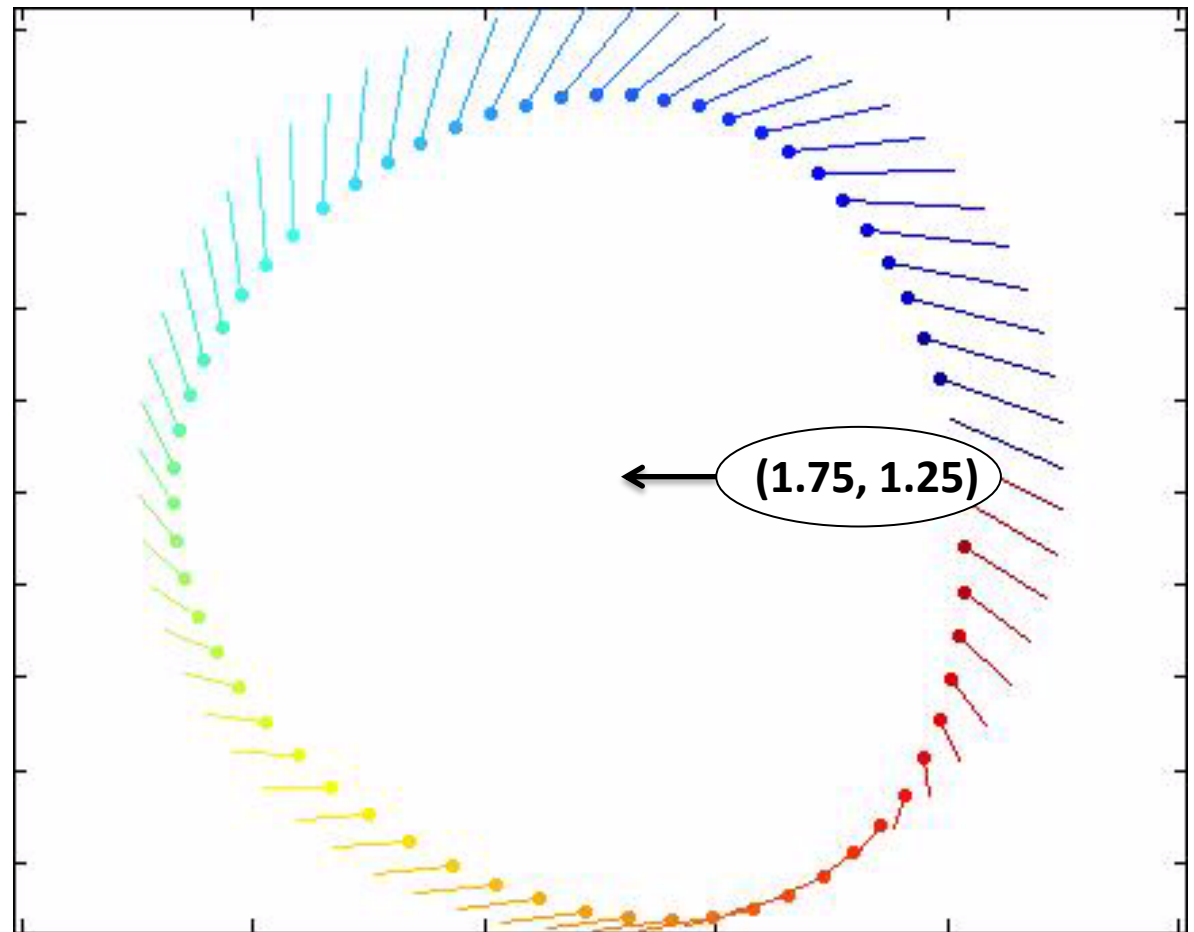
$$x'(t) = x(3 - y - x)$$

$$y'(t) = y(-0.5 + x - y)$$

**kick size = 0**

**flow time = 0.1**

**iterations = 20**



# 3. A kick-flow system

## Nonlinear 2D

Predator-Prey model for species with limited growth

$$x'(t) = x(3 - y - x)$$

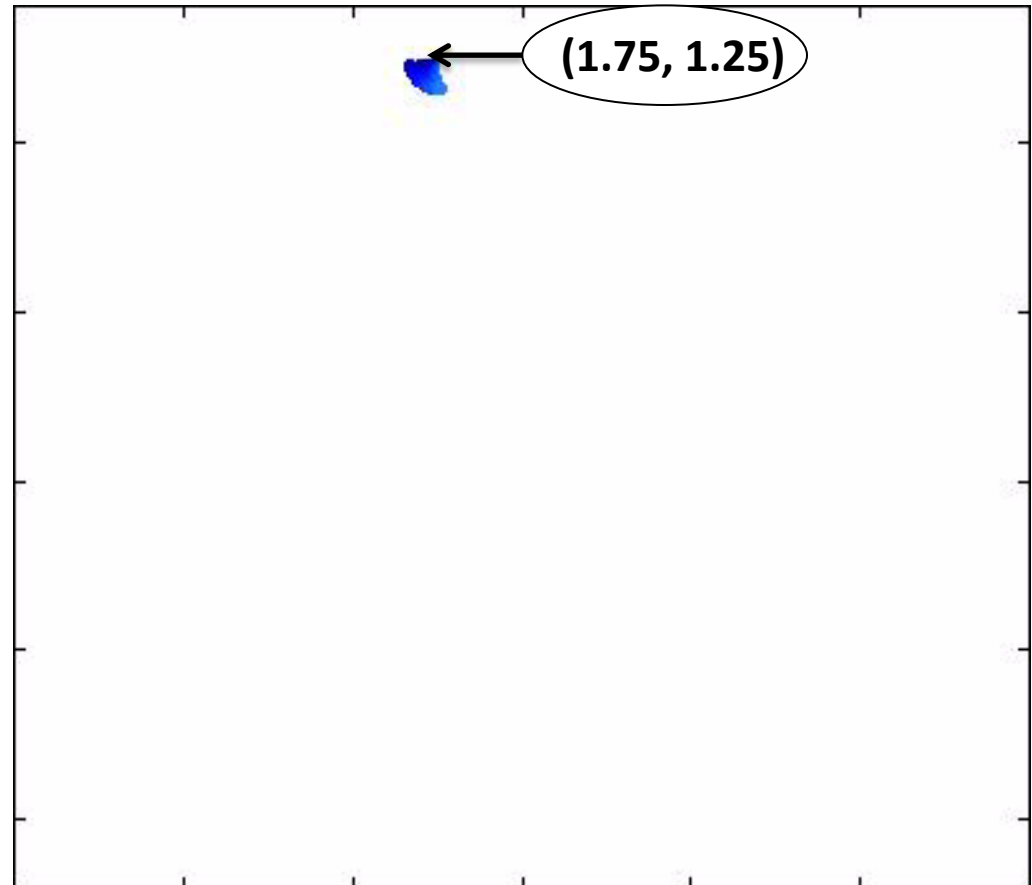
$$y'(t) = y(-0.5 + x - y)$$

**kick size** = 0.1

**kick directions** =  $\pi$  to  $3\pi/2$

**flow time** = 0.1

**iterations** = 80



# 3. A kick-flow system

## Nonlinear 2D

$$x'(t) = x(3 - y - x)$$

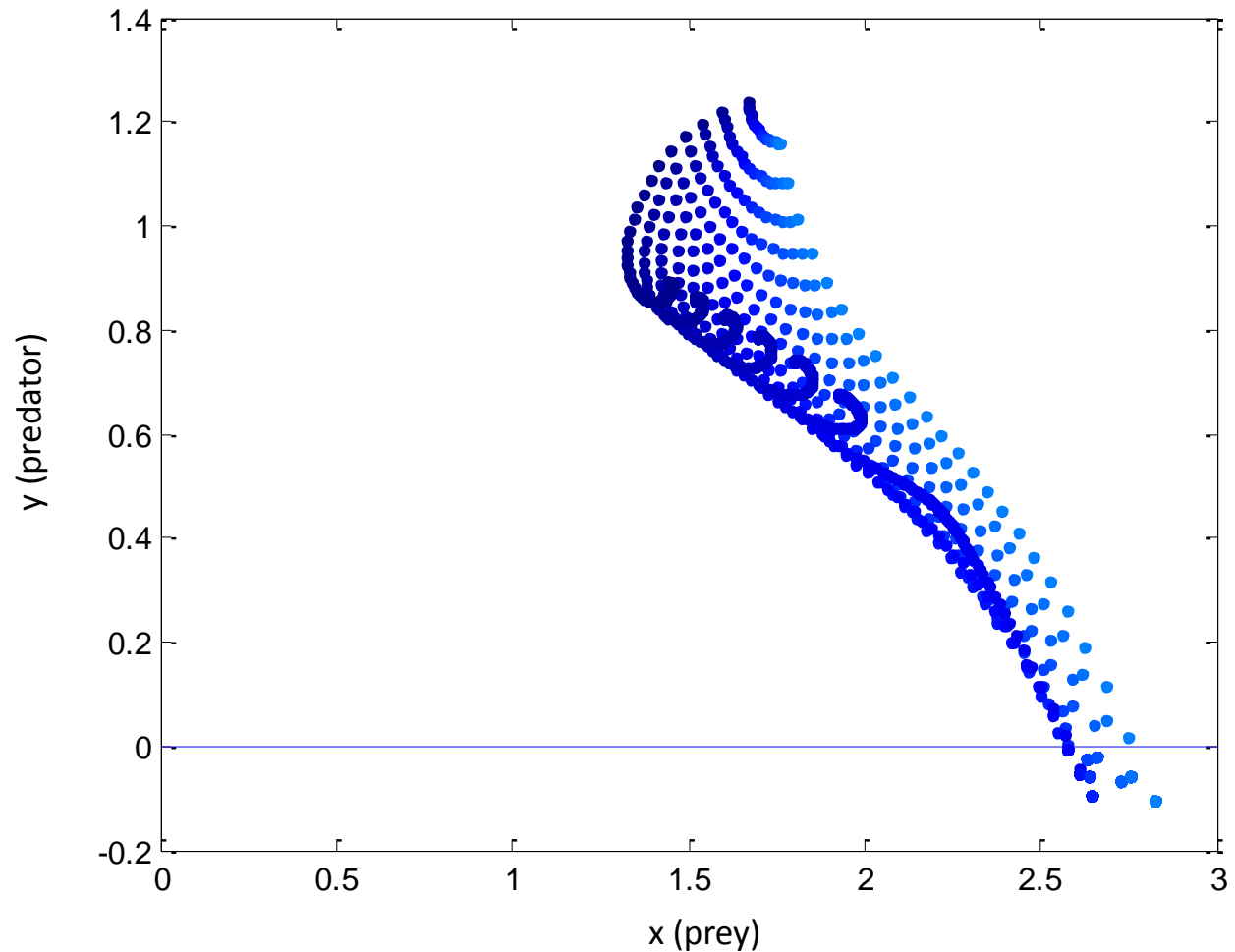
$$y'(t) = y(-0.5 + x - y)$$

**kick size** = 0.1

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**iterations** = 80



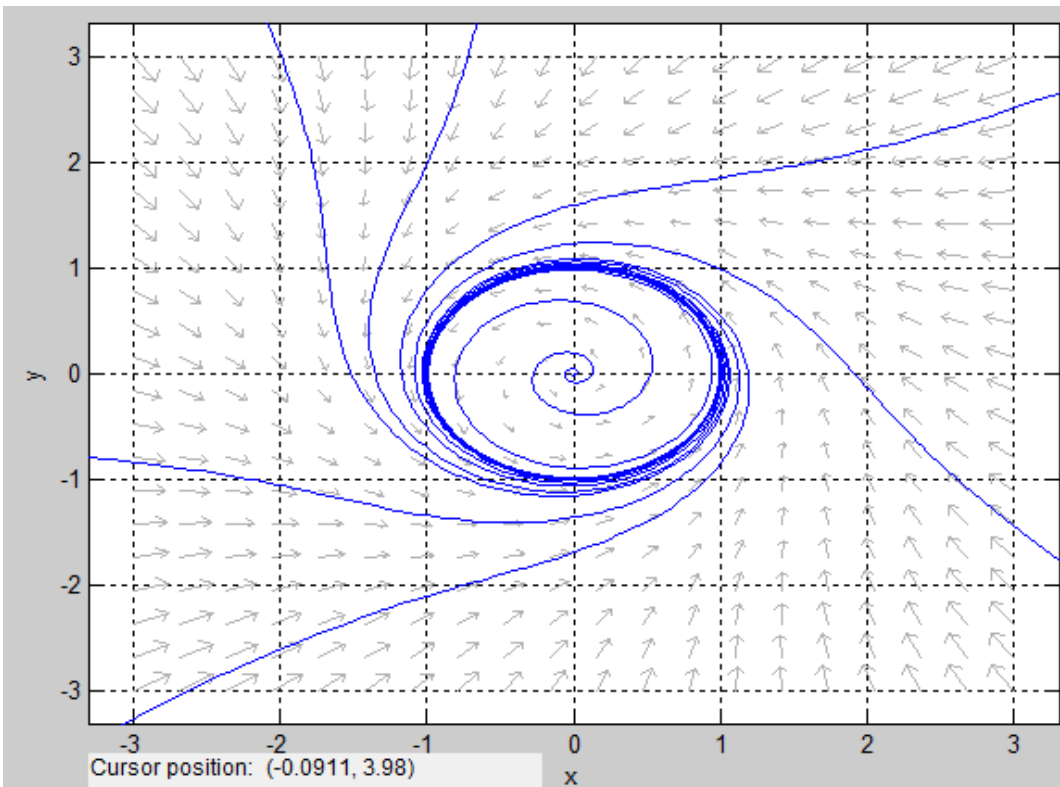


## 4. Future Directions

- Kick-flow in interesting 2D systems
  - attracting periodic orbit
  - excitable
  - unstable linear
- Modify kick-flow
  - change potential
  - multiple kick types
  - move towards stochastic kicks
- Your ideas?

## 4. Future Directions

Kick-flow in 2D system with attracting periodic orbit



Hopf bifurcation normal form

$$r' = r(1 - r^2)$$

$$\theta' = 1$$

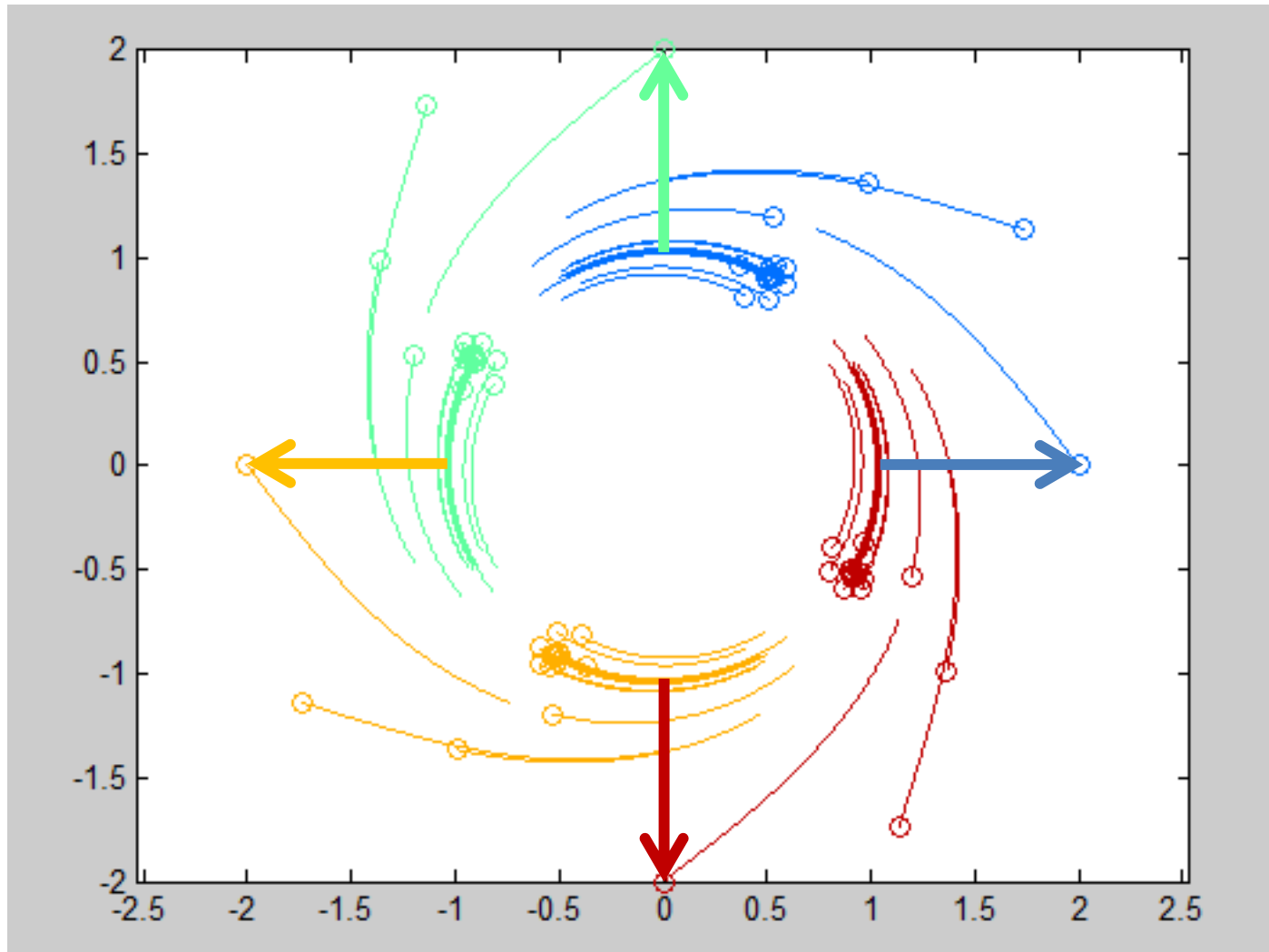
## 4. Future Directions

$$r' = r(1 - r^2)$$

$$\theta' = 1$$

kick size: 1

flow time: 1



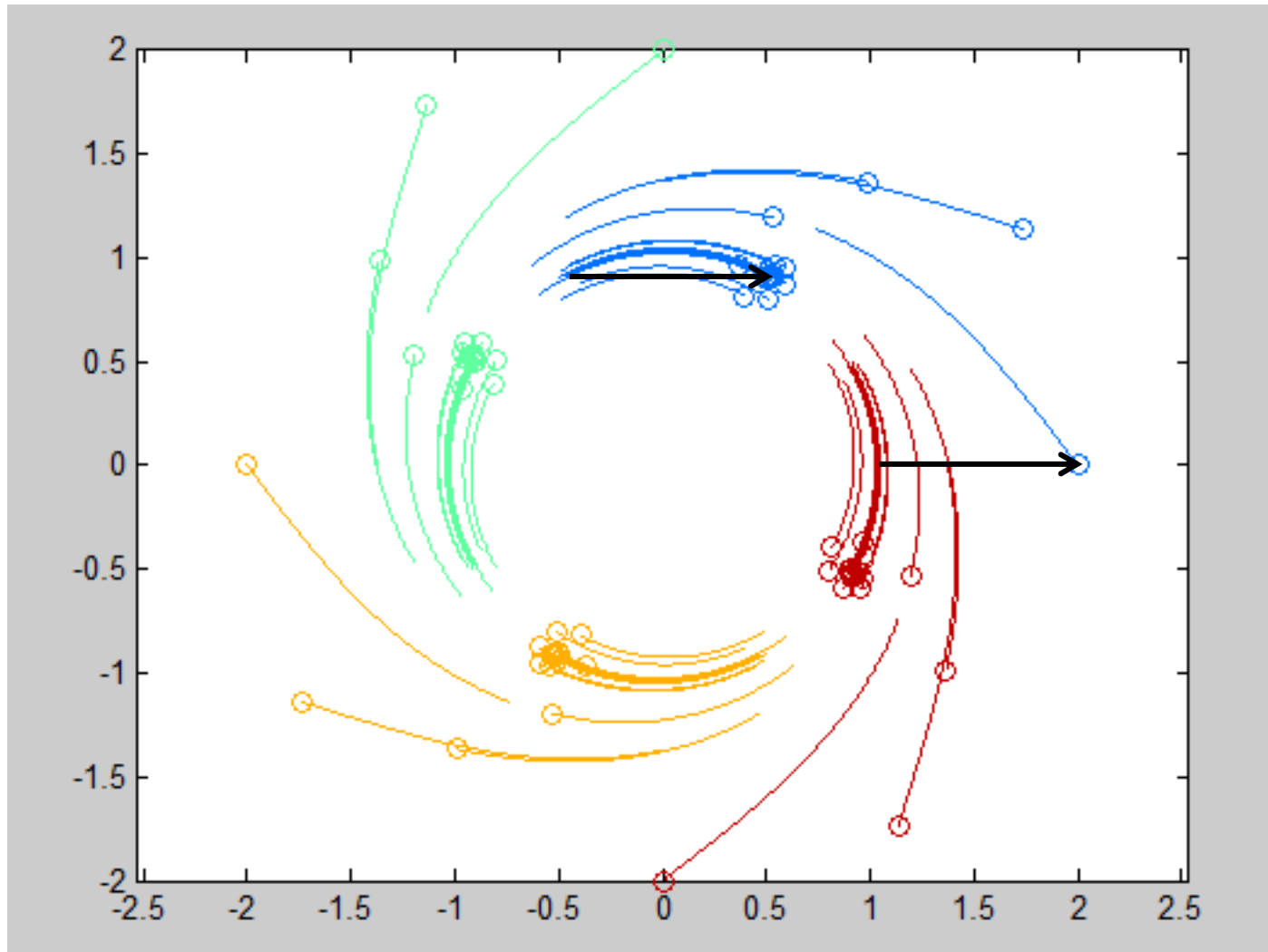
## 4. Future Directions

$$r' = r(1 - r^2)$$

$$\theta' = 1$$

kick size: 1

flow time: 1



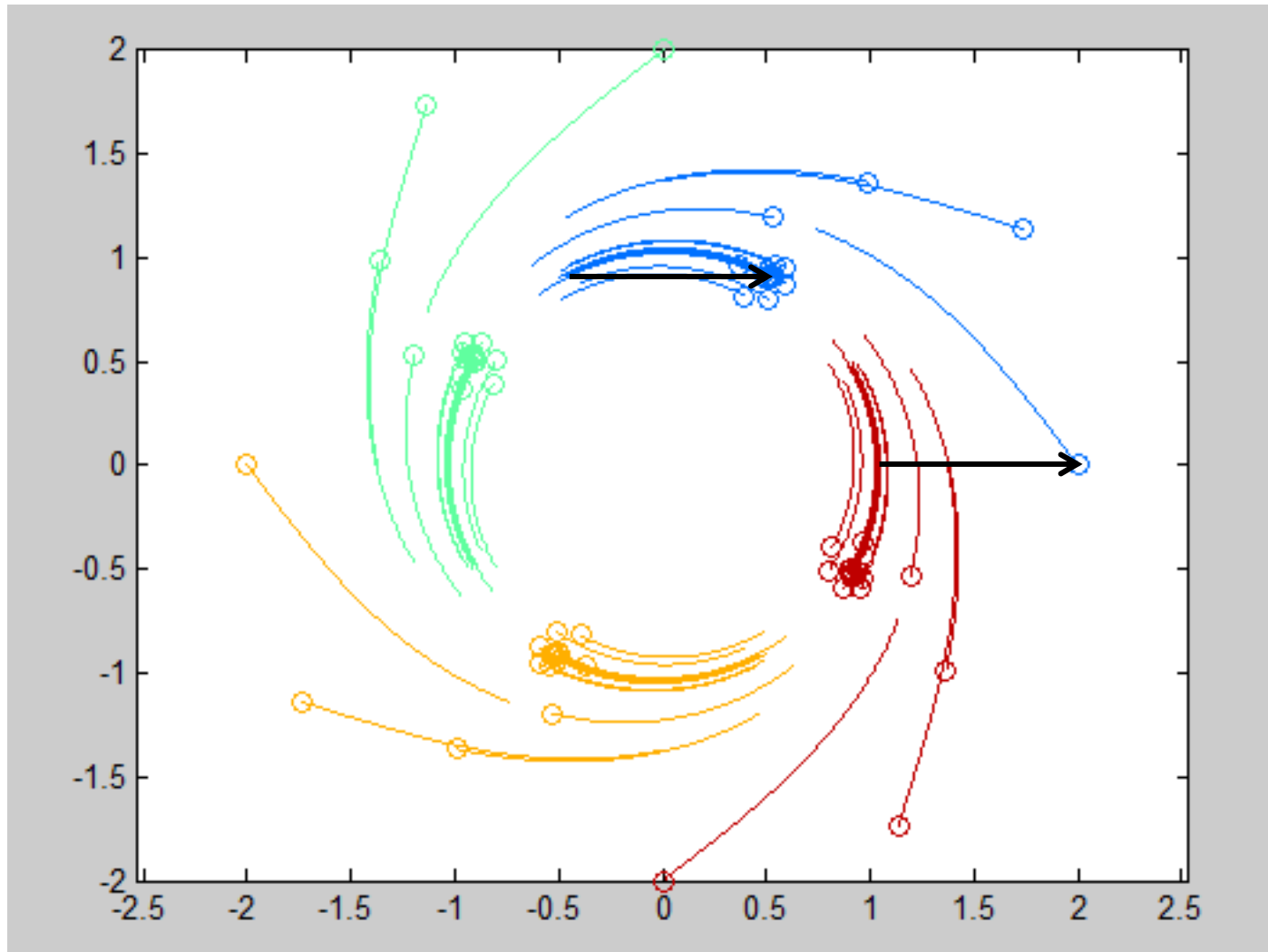
## 4. Future Directions

$$r' = r(1 - r^2)$$

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kick size: 1

flow time: 1



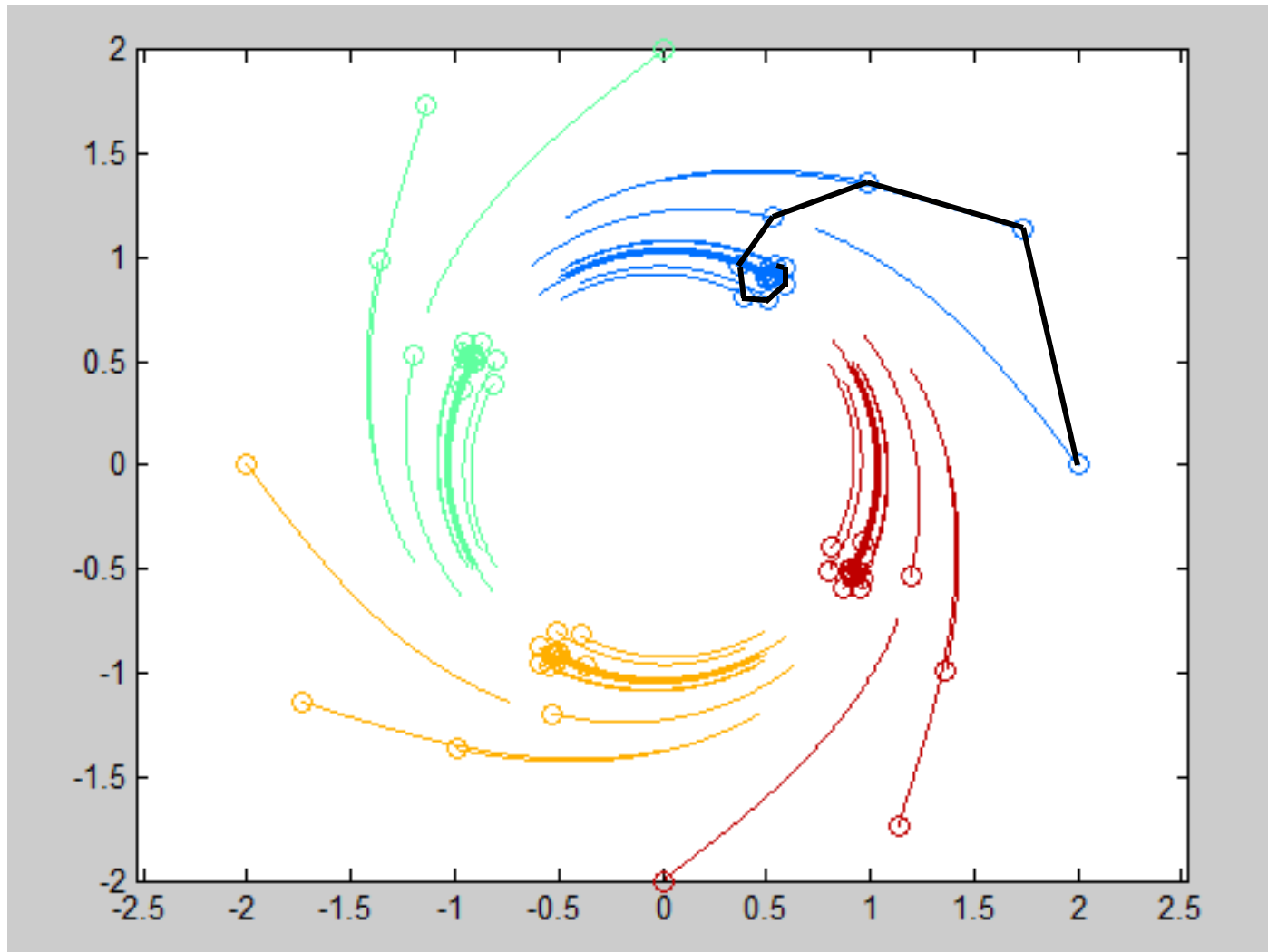
## 4. Future Directions

$$r' = r(1 - r^2)$$

$$\theta' = 1$$

kick size: 1

flow time: 1



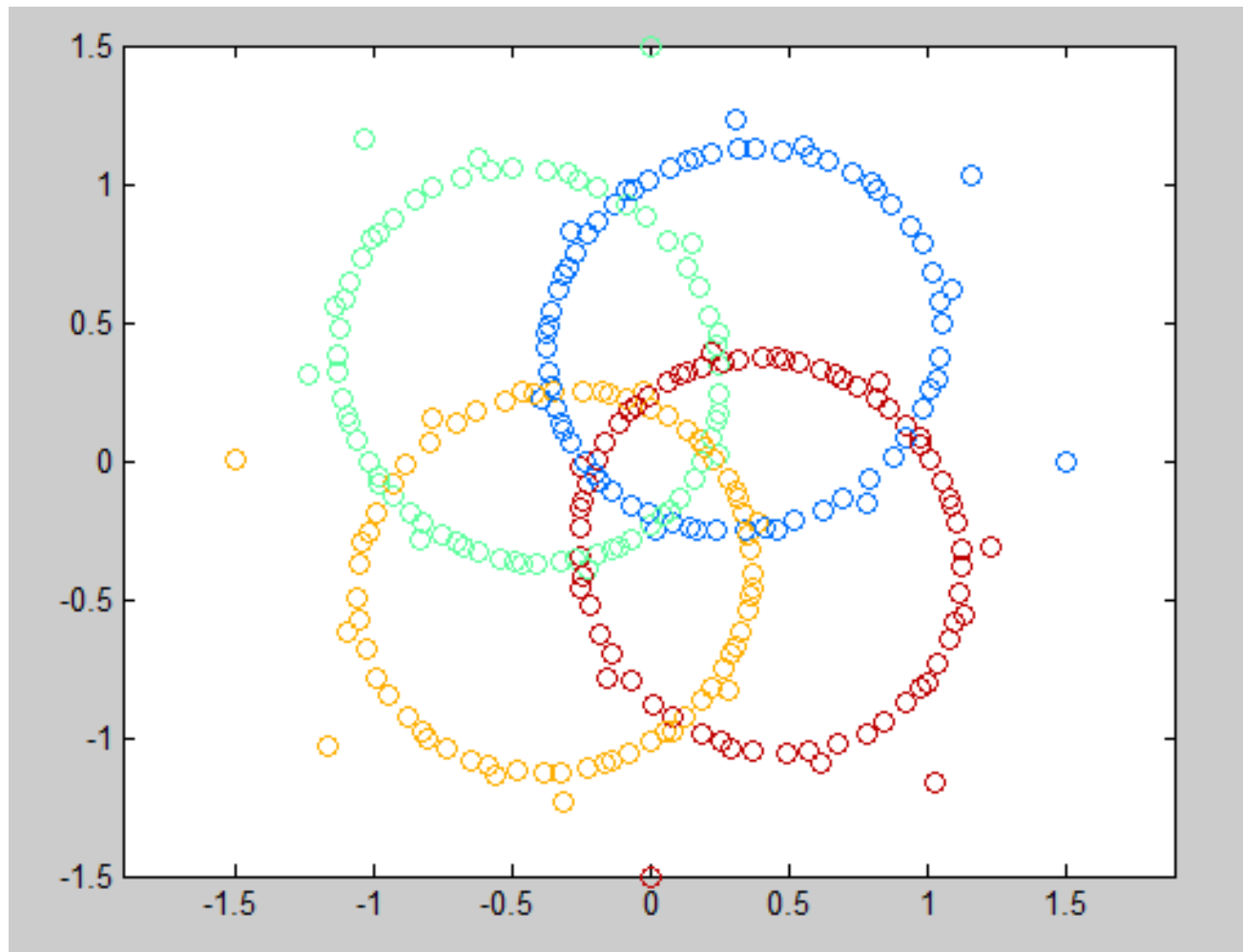
## 4. Future Directions

$$r' = r(1 - r^2)$$

$$\theta' = 1$$

**kick size: 0.5**

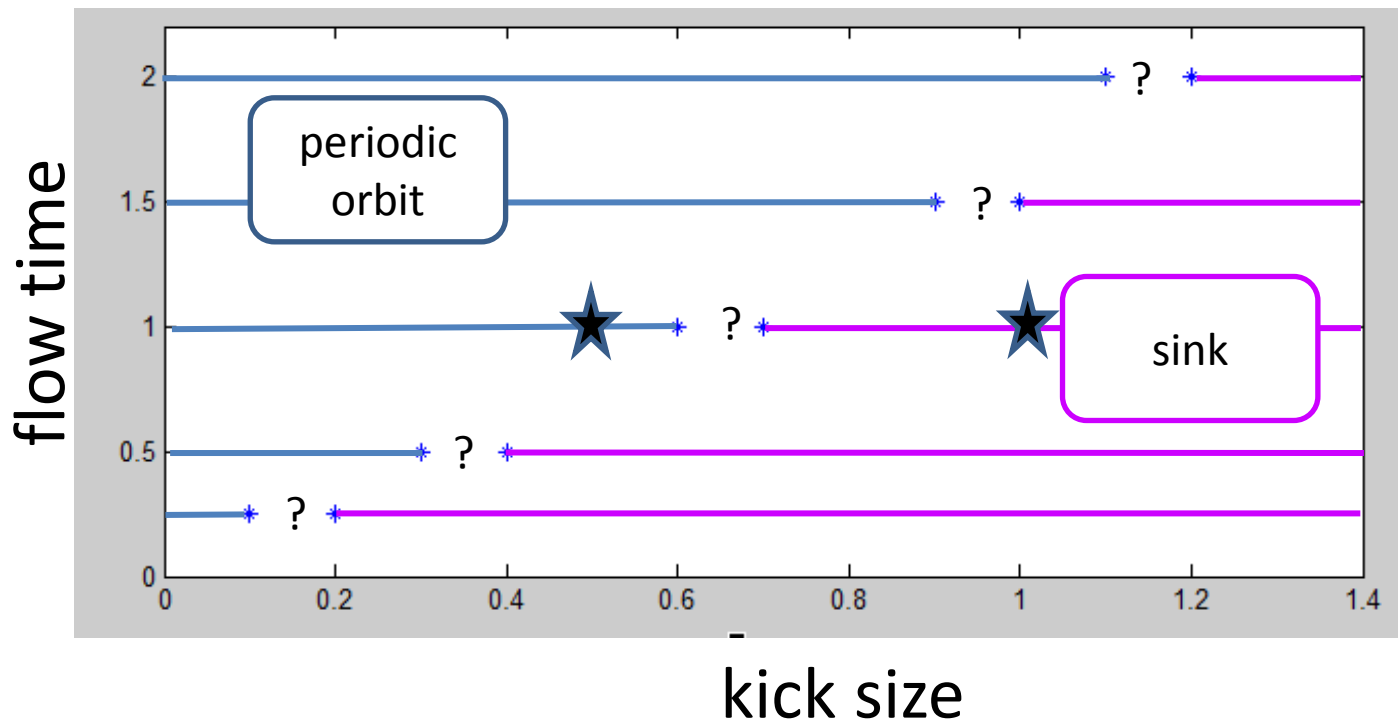
**flow time: 1**



## 4. Future Directions

$$r' = r(1 - r^2)$$

$$\theta' = 1$$





# References

Folke, Carl, et al. (2004) Regime shifts, resilience, and biodiversity in ecosystem management. *Annual Review of Ecology, Evolution, and Systematics* 35: 557-581.

Frelich, Lee, and Peter Reich. (2009) Will environmental changes reinforce the impact of global warming on the prairie-forest border of central North America? *Frontiers in Ecology and the Environment* 8: 371–378.

Mumby, Peter, et al. (2007) Thresholds and the resilience of Caribbean coral reefs. *Nature* 450: 98-101.

Walker, Brian and David Salt. (2006) *Resilience thinking: sustaining ecosystems and people in a changing world*. Washington DC: Island Press. Print.

Walker, Brian, et al. (2004) Resilience, adaptability and transformability in social-ecological systems. *Ecology and Society* 9:5.



# Details on kick-flow-equilibrium plot for 1d linear system

## Calculation of $x_e(\delta, k)$

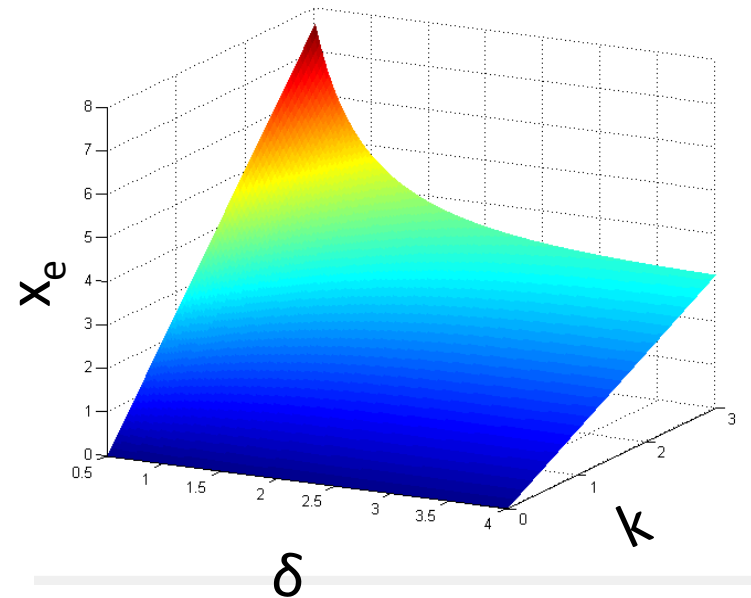
$$x' = -x$$

$$\phi_t(x) = xe^{-t}$$

want  $\phi_\delta(x_e) = x_e - k,$

so  $x_e e^{-\delta} = x_e - k$

$$\implies x_e = \frac{k}{1 - e^{-\delta}}$$



## MATLAB commands (a=1):

```
>> [D,K]=meshgrid(0.5 : 0.02 : 4, 0 : 0.02 : 3);
```

```
>> C=K./(1-exp(-D));
```

```
>> surf(D,K,C,'EdgeColor','none')
```