

# Dynamical Systems

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Lecture 2 of 5

# Terminology recap

- Variable or state
- Differential equation
- Initial condition
- Trajectory
- Parameter
- Steady state
- Transient behaviour
- Perturbation
- Ordinary differential equations (ODE)
- 3 dimensional ODE

# Population dynamics

$$dR/dt = k * R$$

R: Rabbit population

k: ?

# Population dynamics

$$dR/dt = k * R * (1-a)$$

a=0?

a=1?

0<a<1?

a>1?



# Neural population model

E -> fractional firing of excitatory neural population

I -> fractional firing of inhibitory neural population

$$dE/dt = -E + S(a * E - b * I + P)$$

$$dI/dt = -I + S(c * E - d * I + Q)$$

Also known as  
Wilson-Cowan  
equations

a,b,c,d: connectivity weights

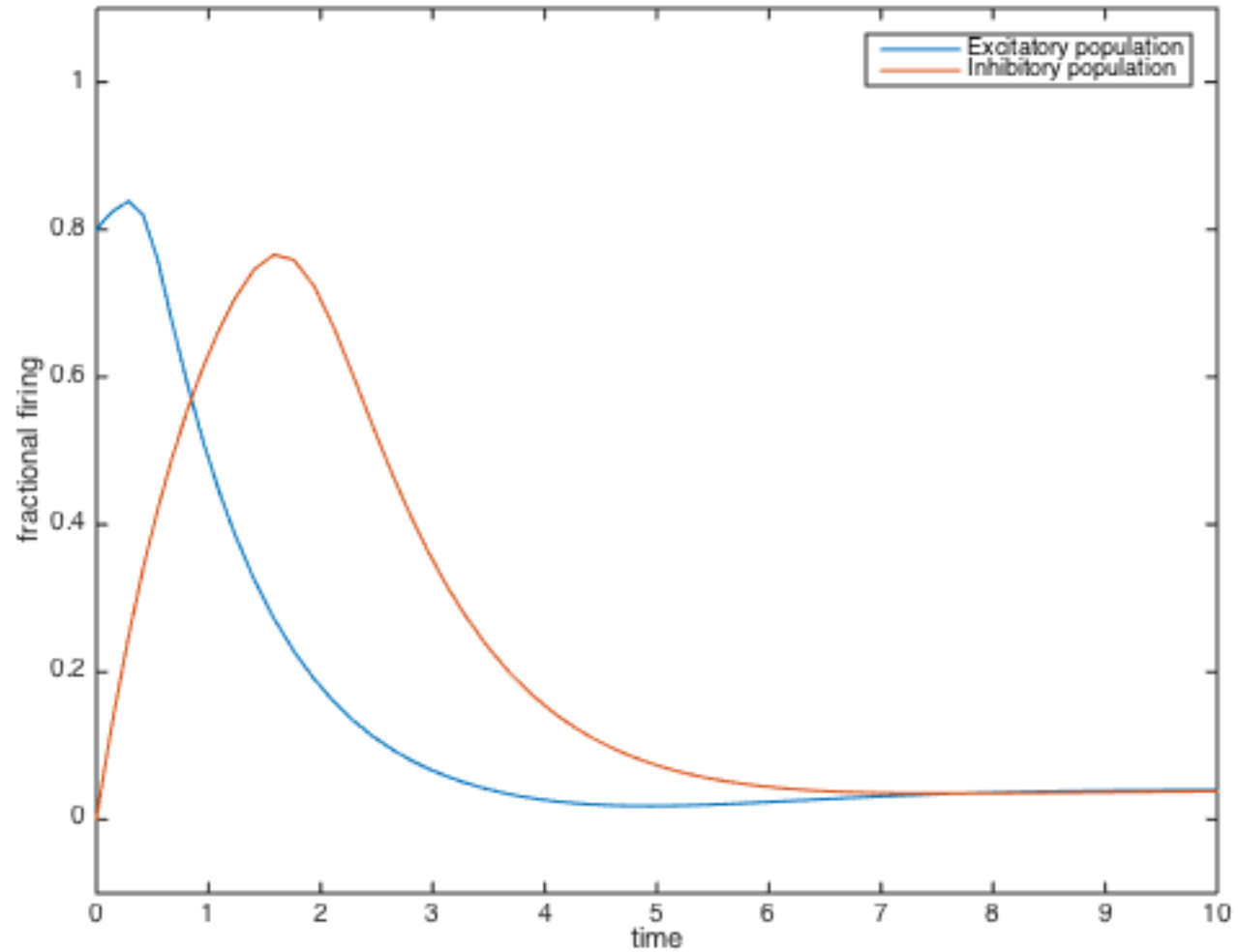
P,Q: baseline input to the populations

S: sigmoid function

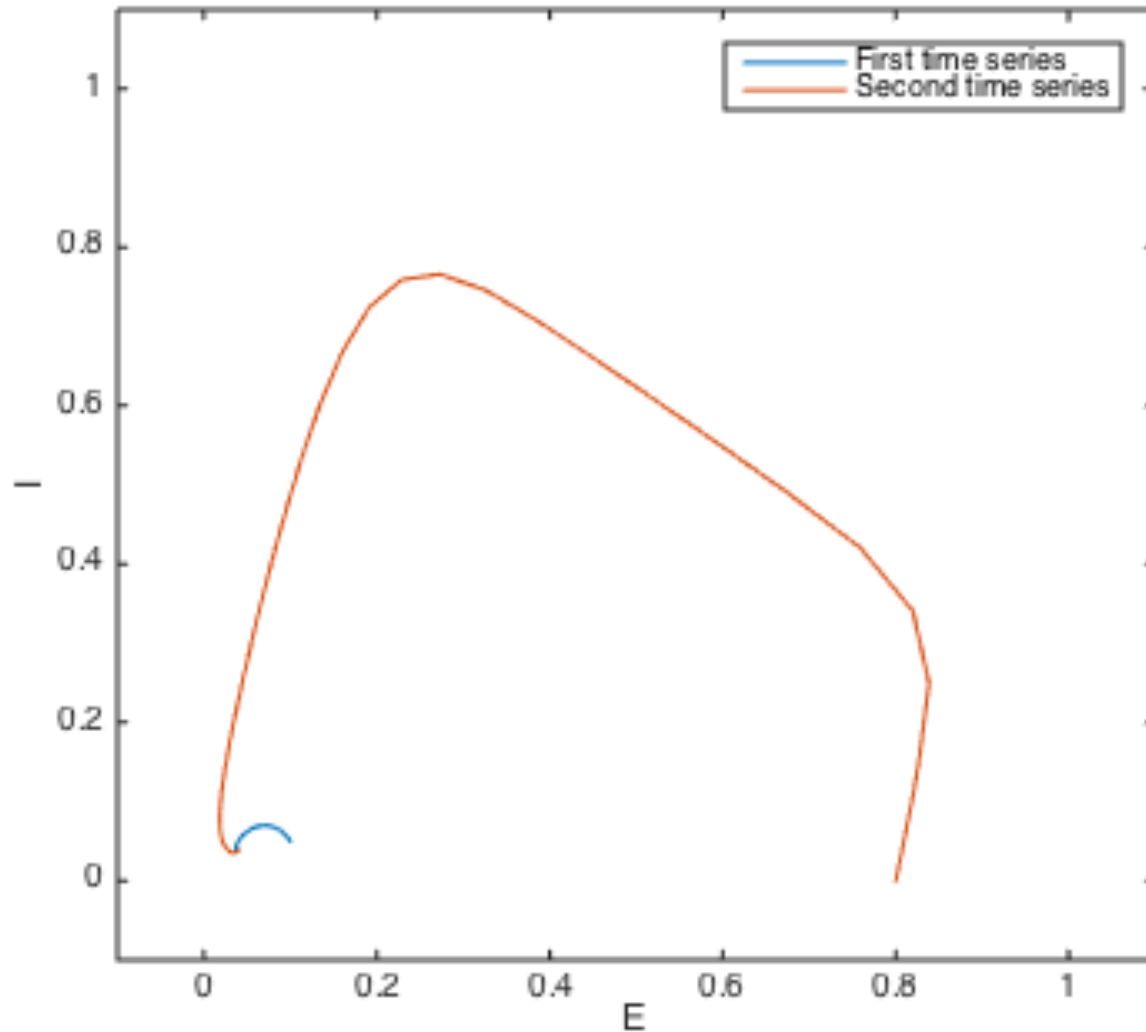
# Overview

- What are dynamical systems?
- How to interpret a differential equation
- **How to analyse differential equation systems**
- How to solve differential equation systems
- Stability analysis, multistability
- Oscillatory solutions
- Parameter variations, bifurcations
- Choice of cool stuff: Chaos, turbulence, spatio-temporal systems, slow-fast systems, transients, and more.

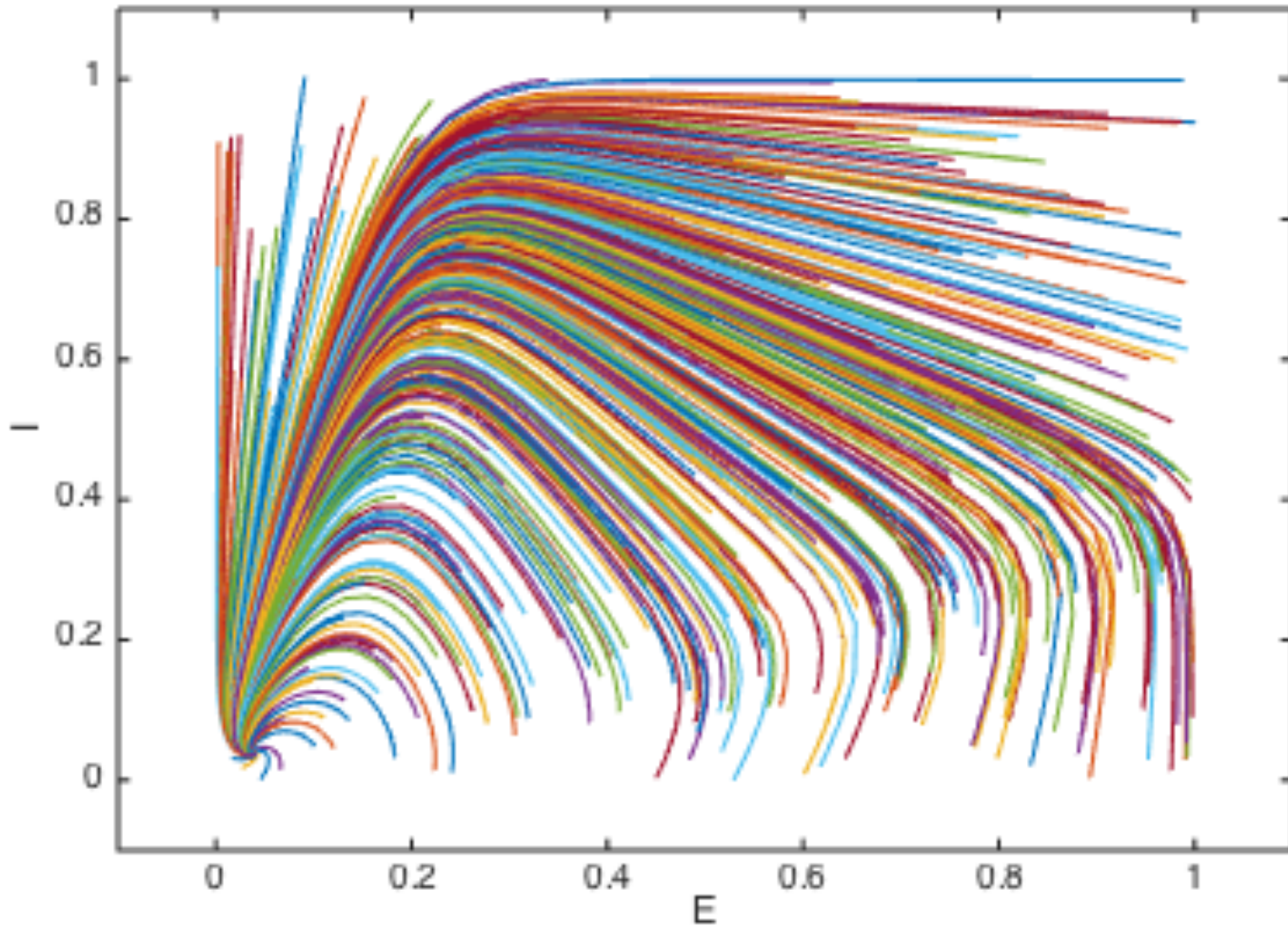
# Time series 2



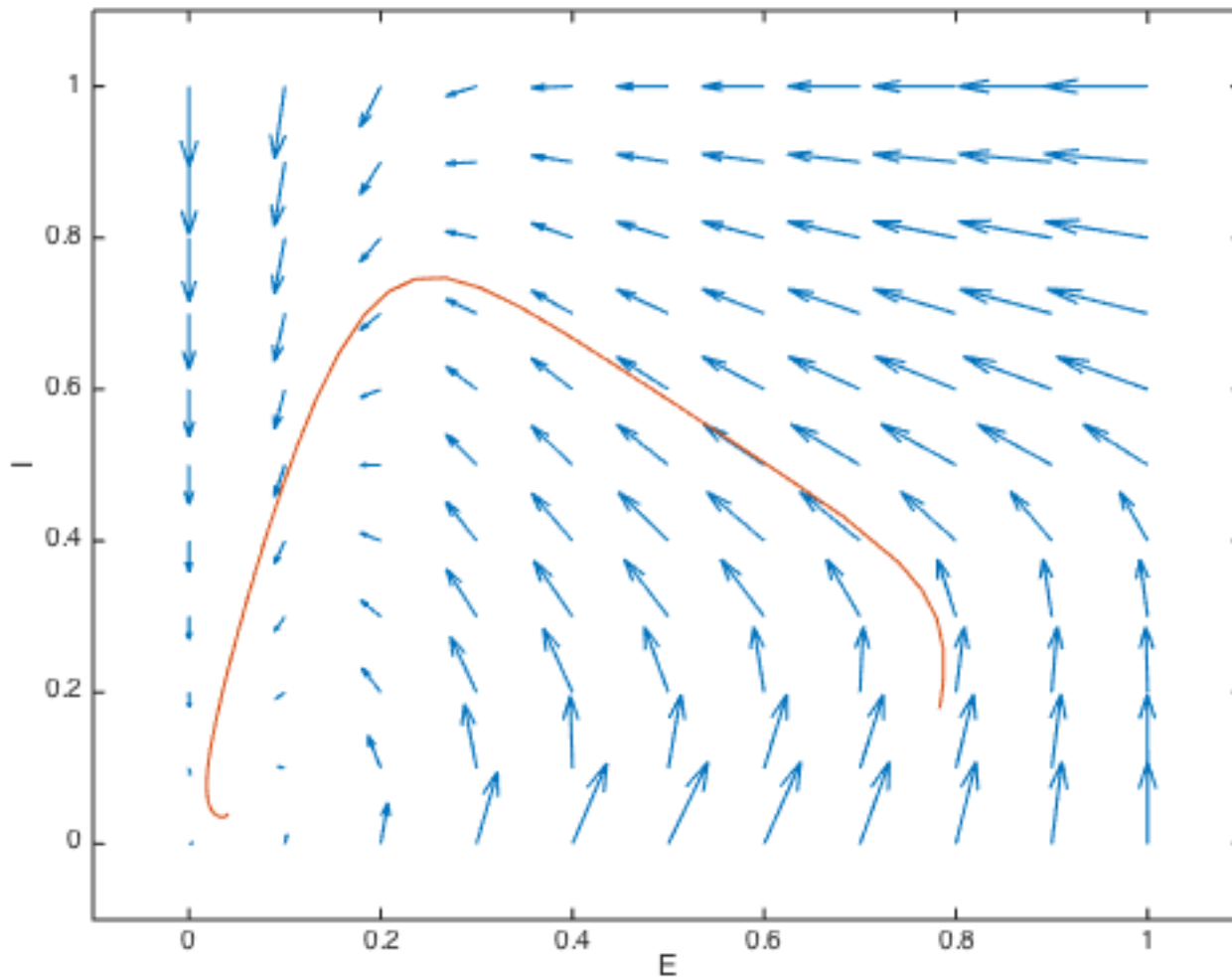
# An alternative view: Phase space



# Phase space with more initial conditions



# Phase space with vector field



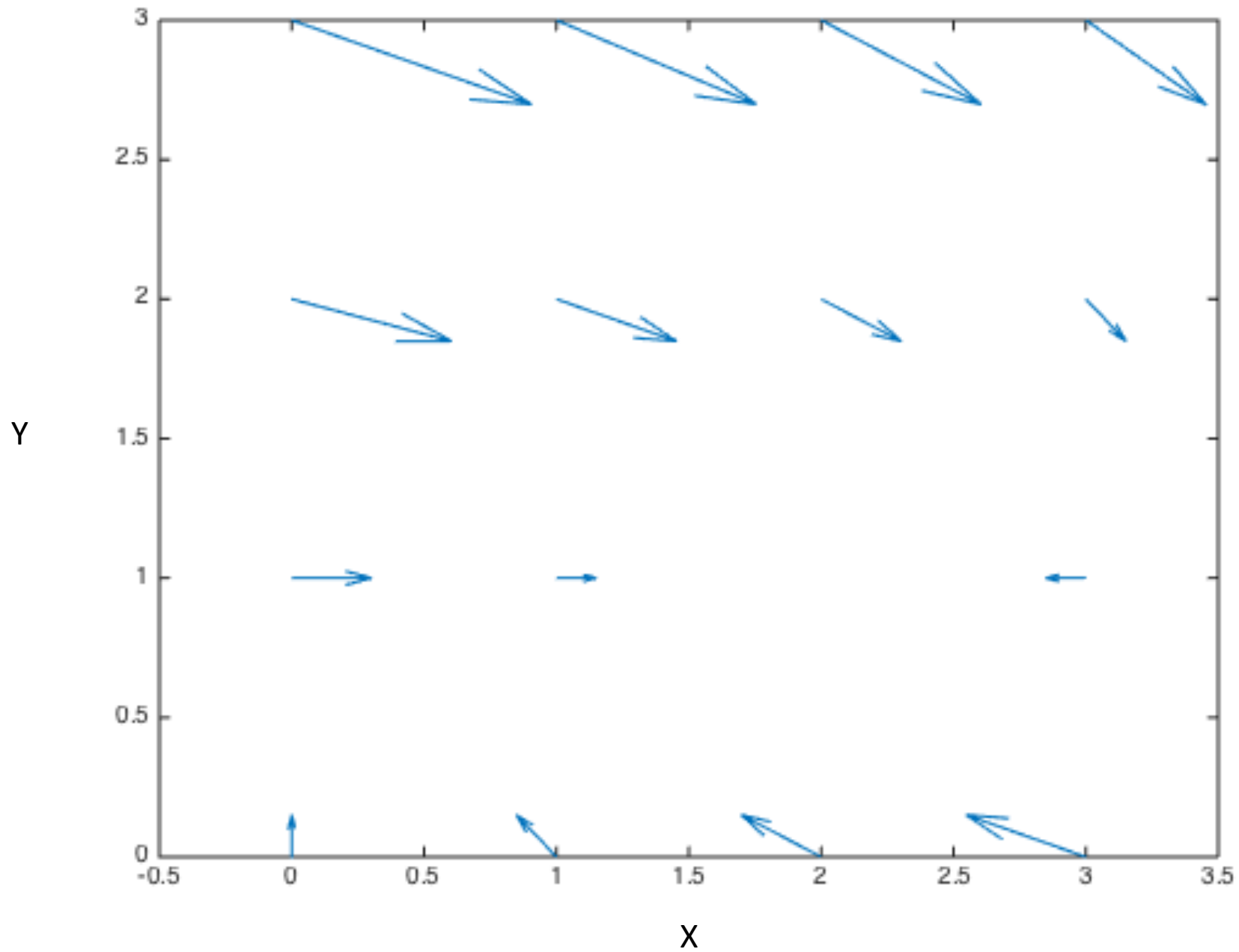
# Vectorfield 101

$$dX/dt=2*Y-X$$

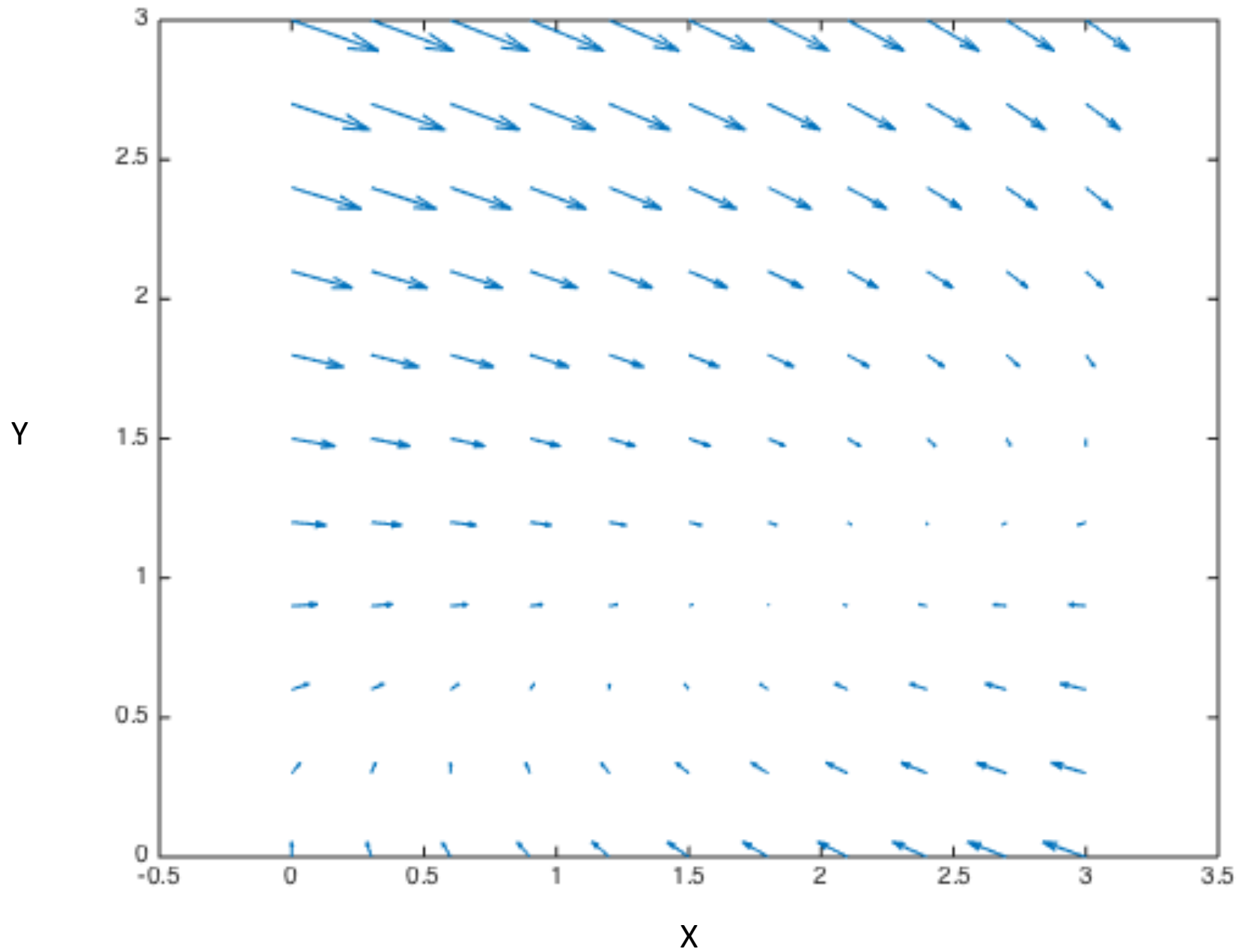
$$dY/dt=-Y+1$$

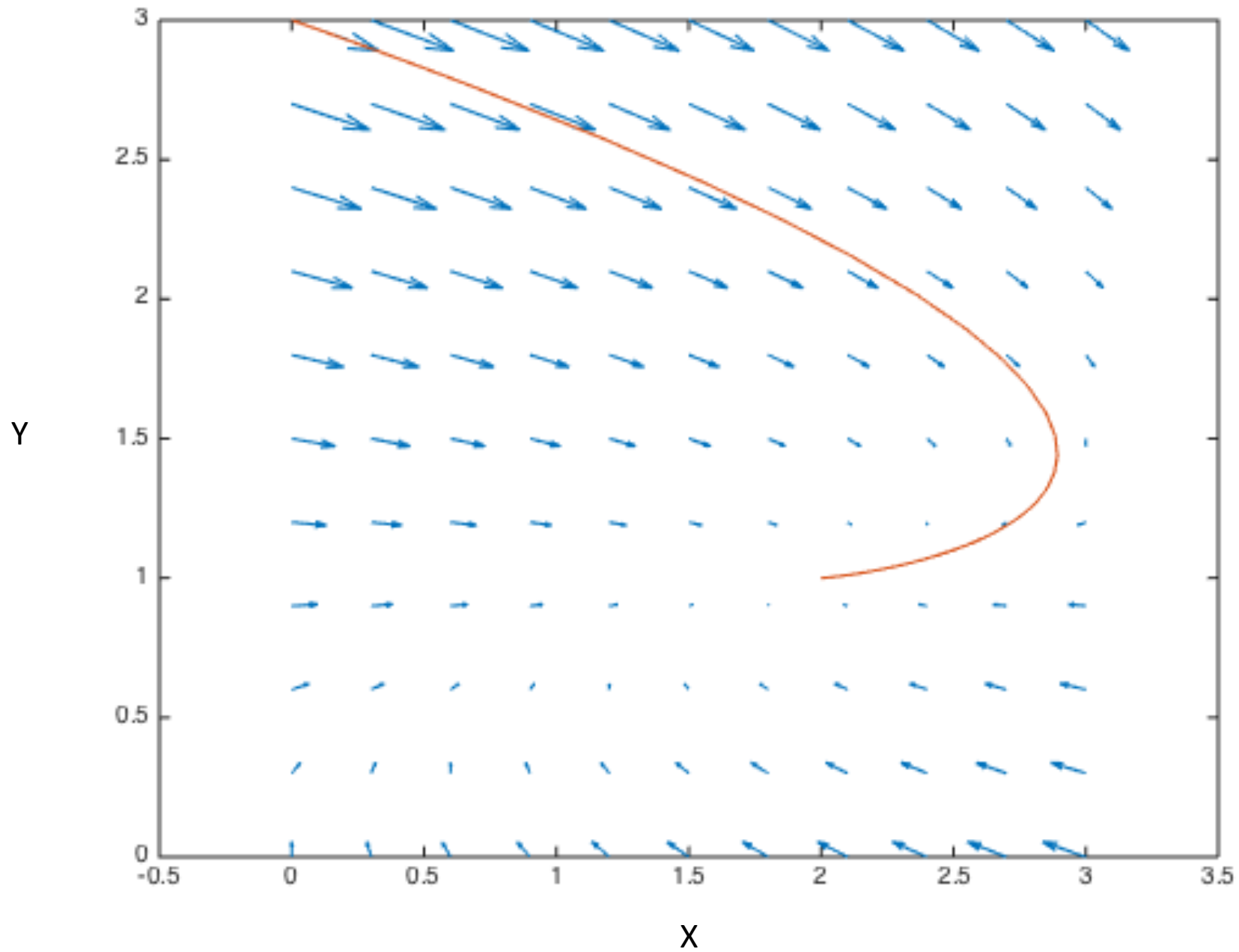
Draw phase space and vectorfield between

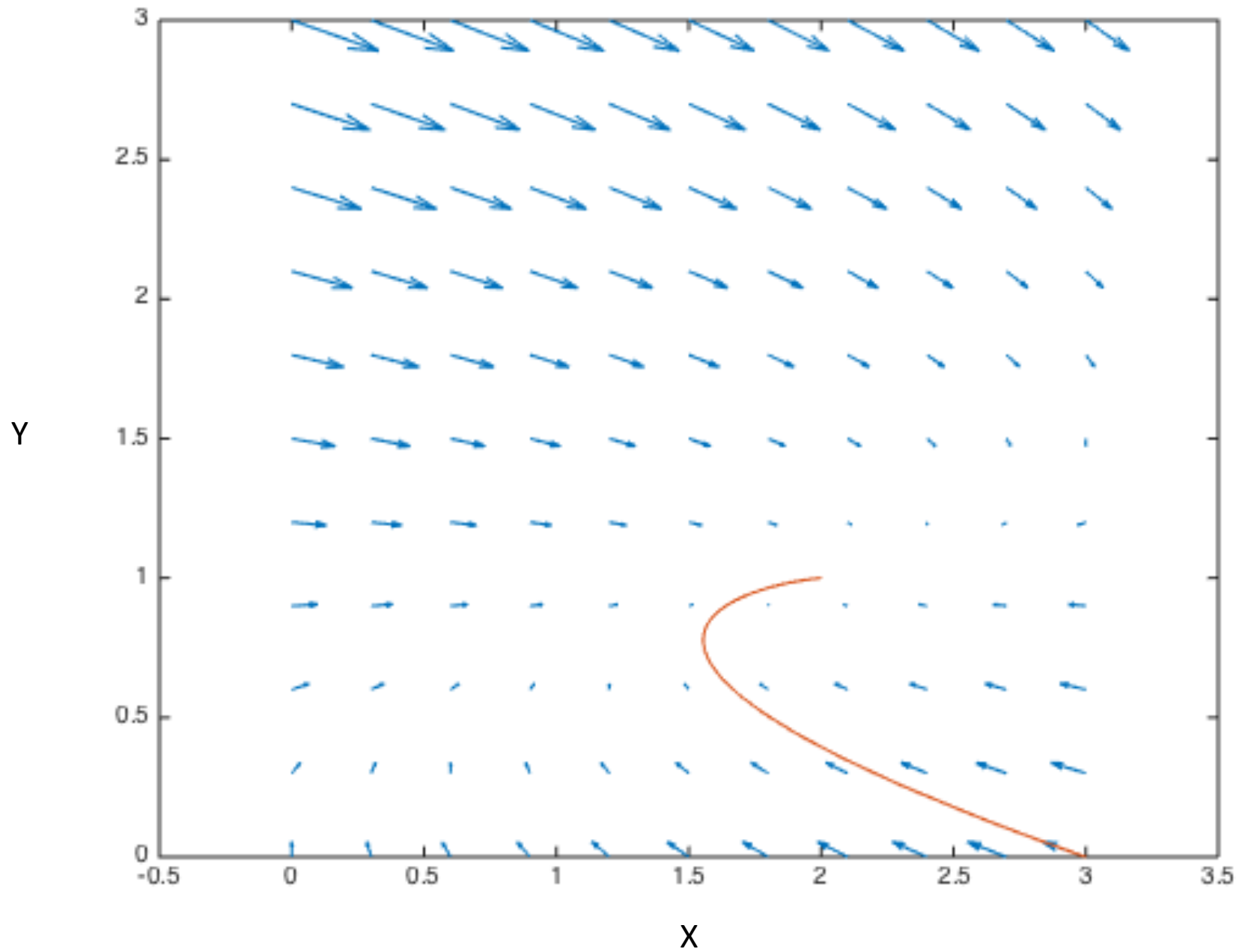
$$X=[0:3], Y=[0:3]$$





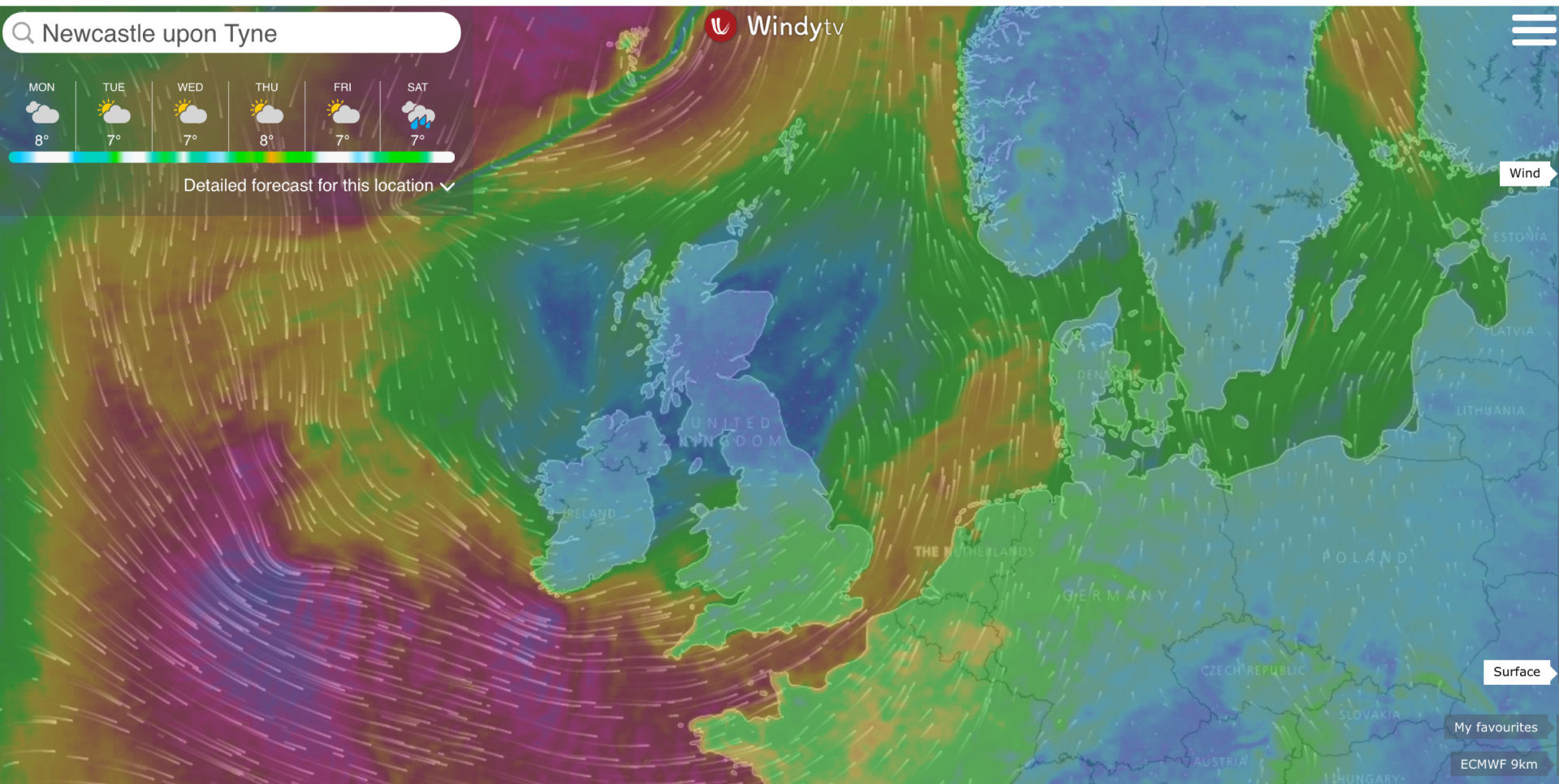






# Example of vector field and trajectory

<https://www.windytv.com/?54.988,-1.619,5>



# Neural population model

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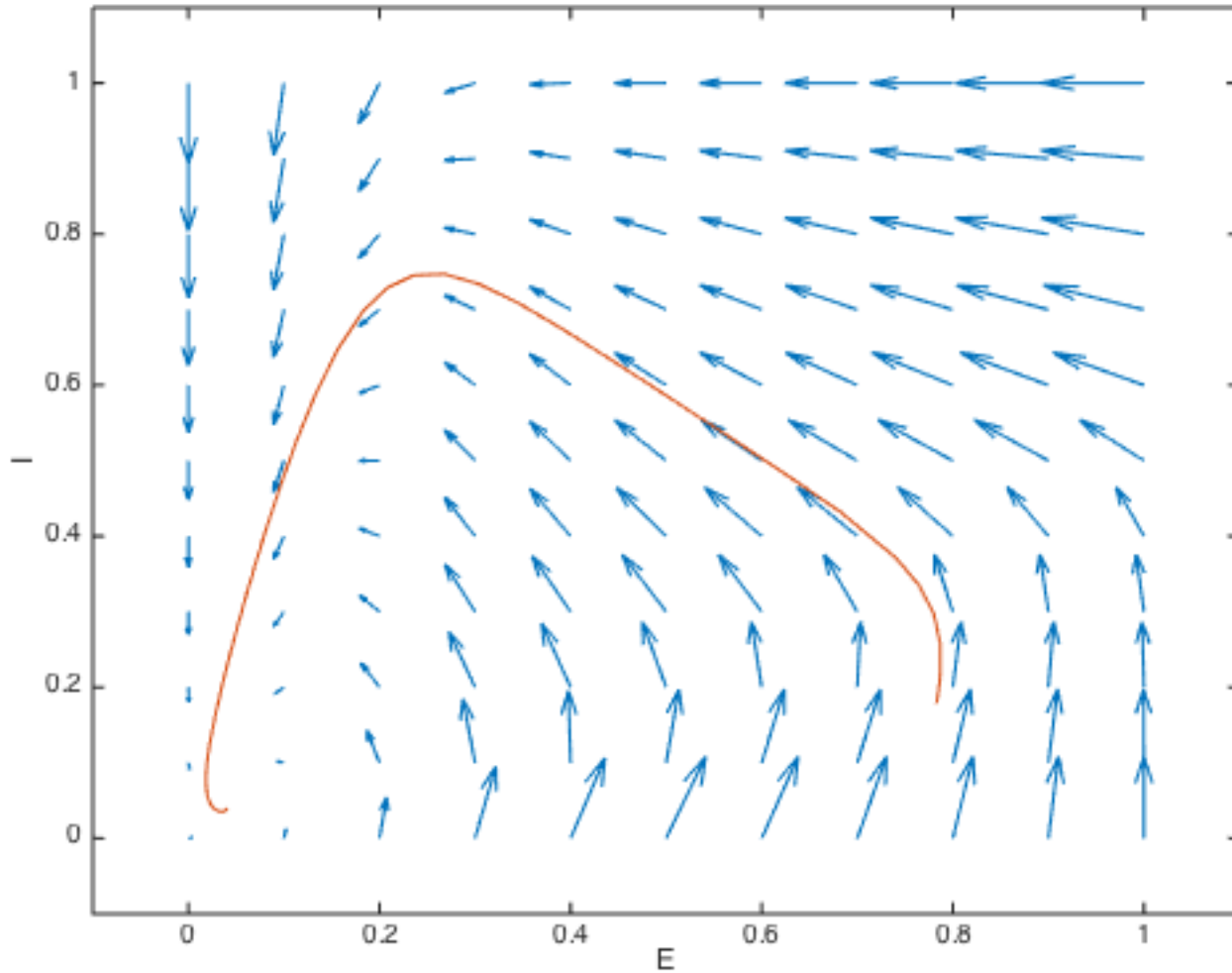
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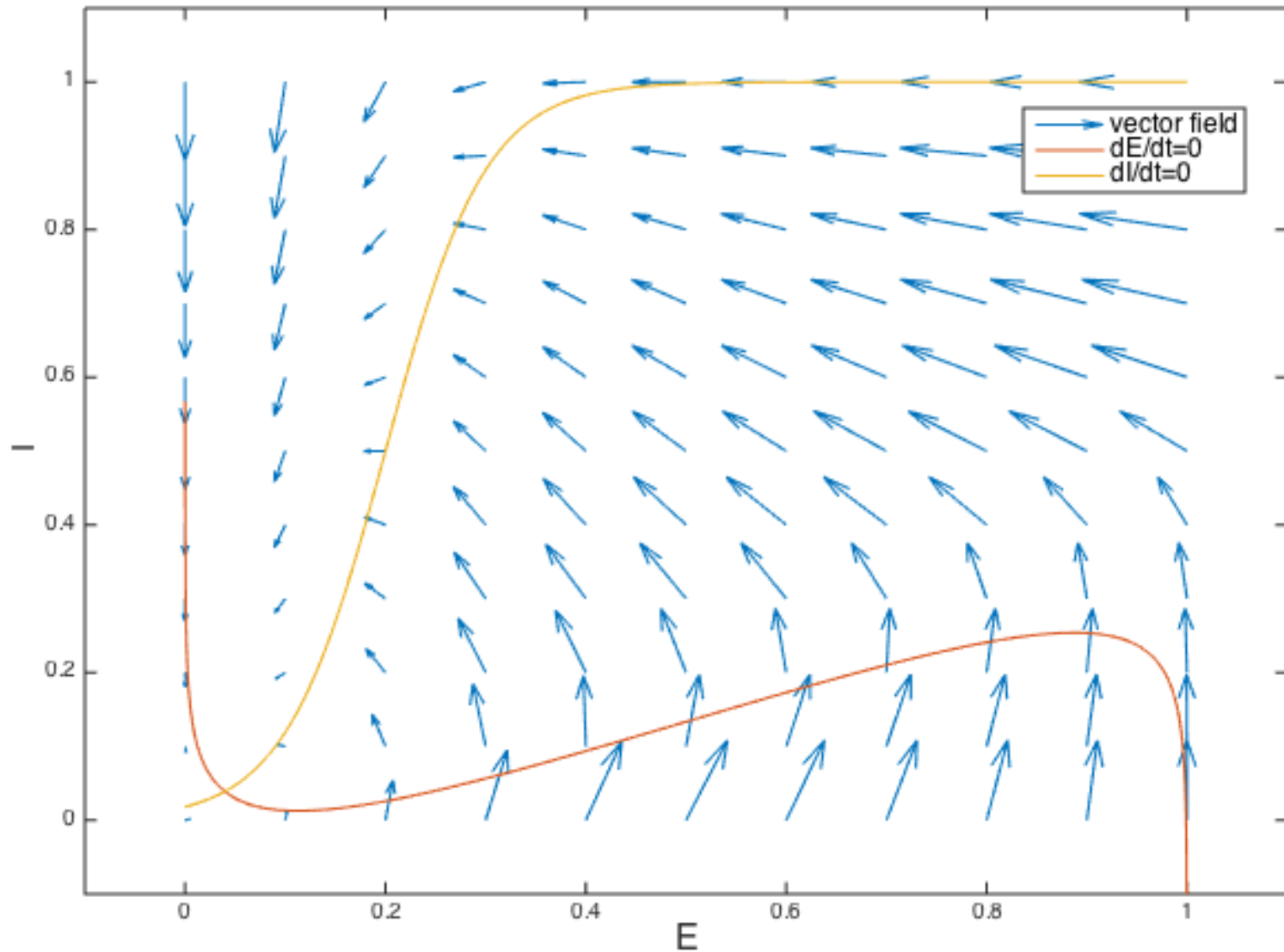
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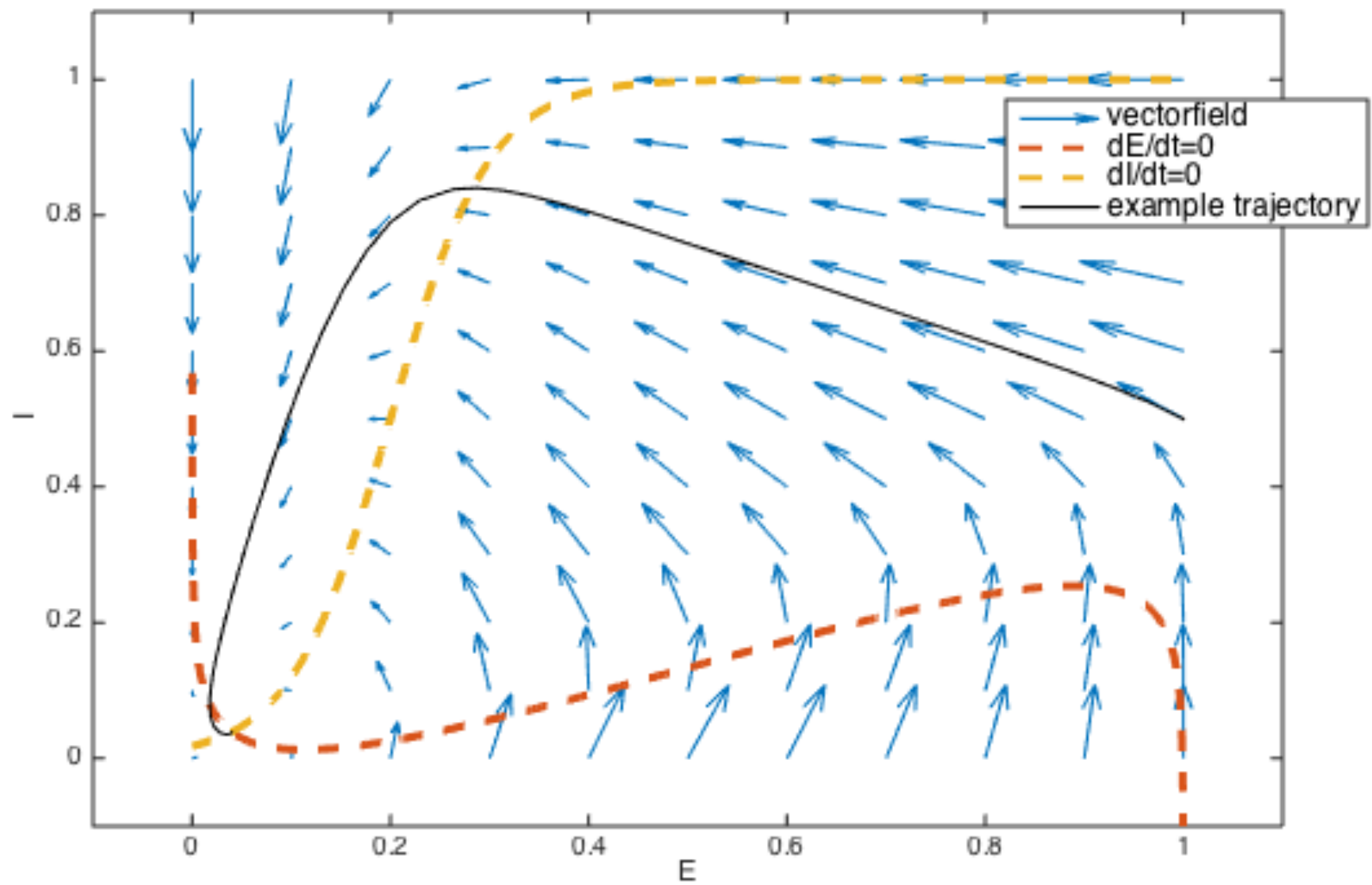
S: sigmoid function

# Phase space with vector field



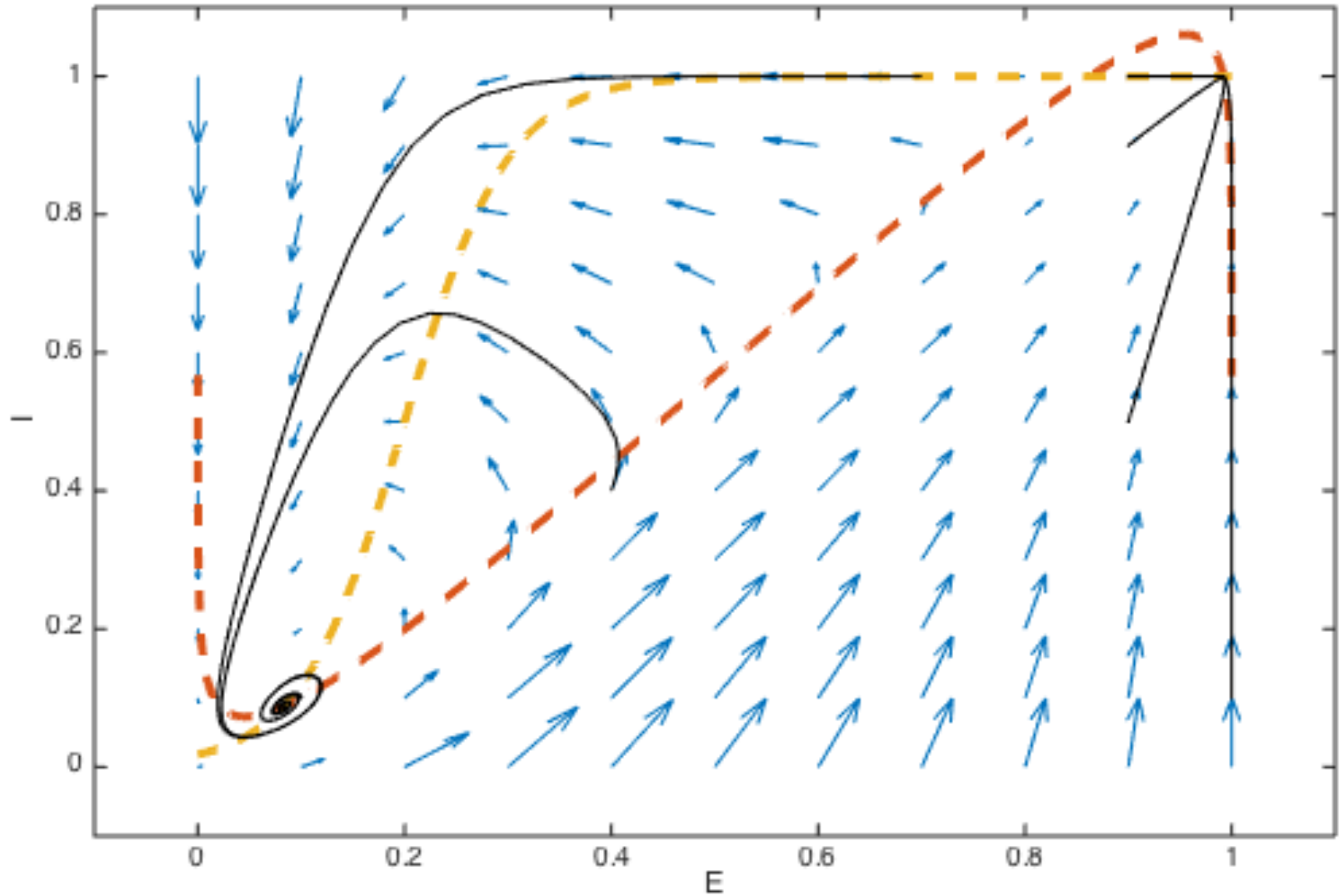
# Phase space with vector field and nullcline

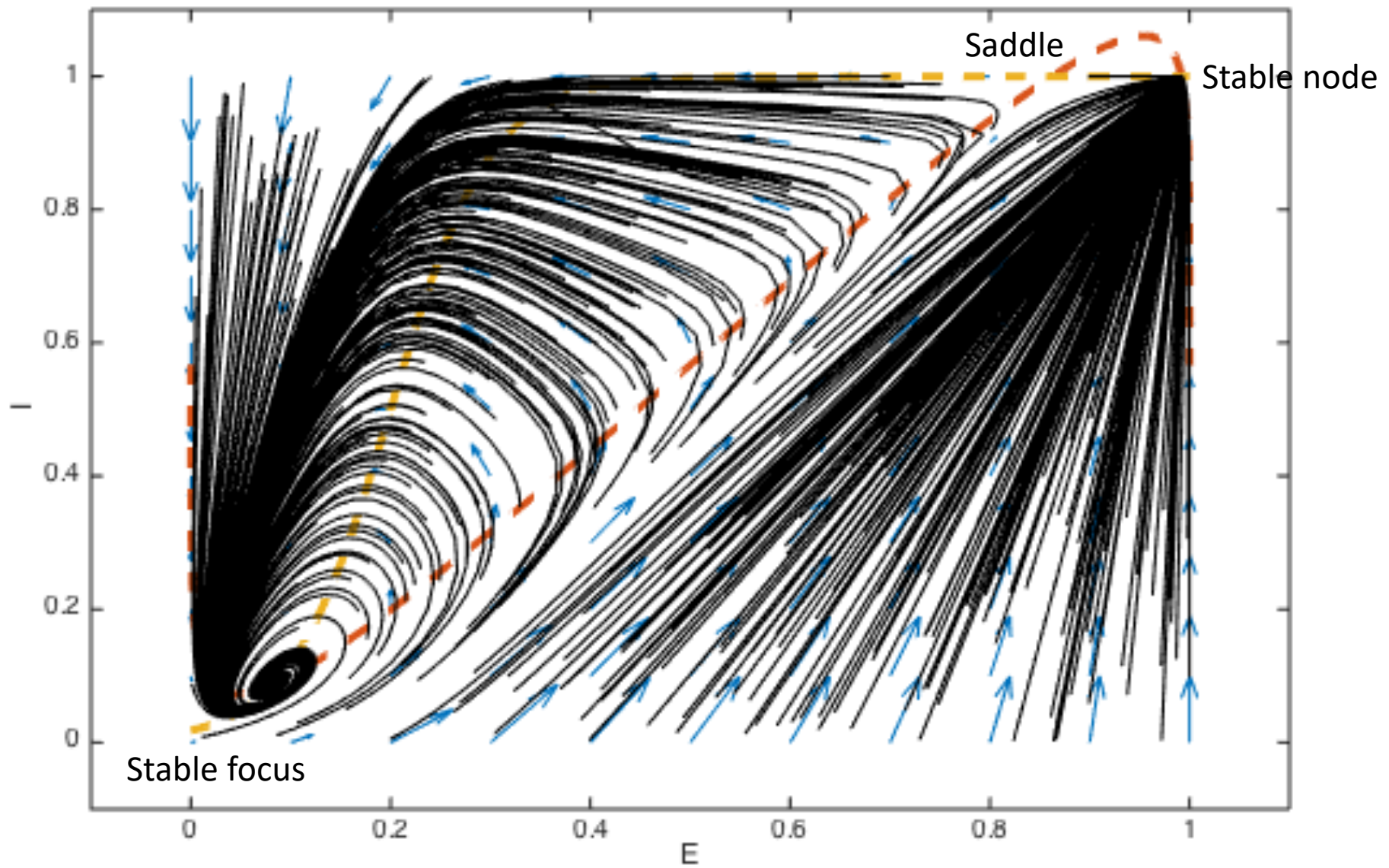




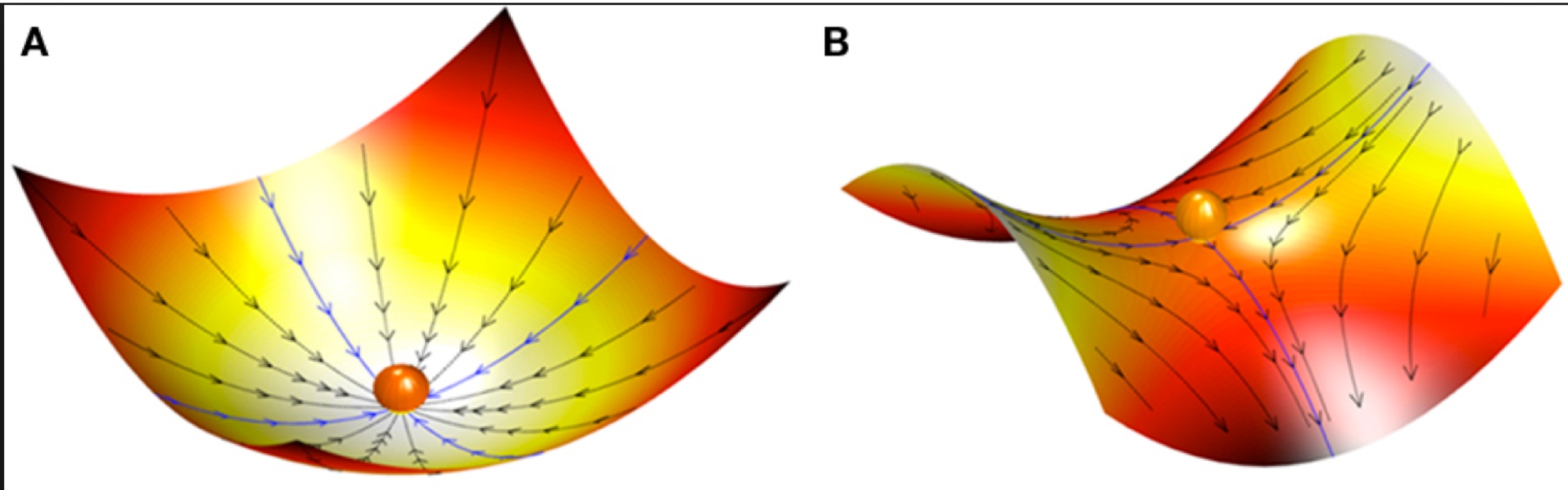


Increase self excitation (parameter  $a$ )

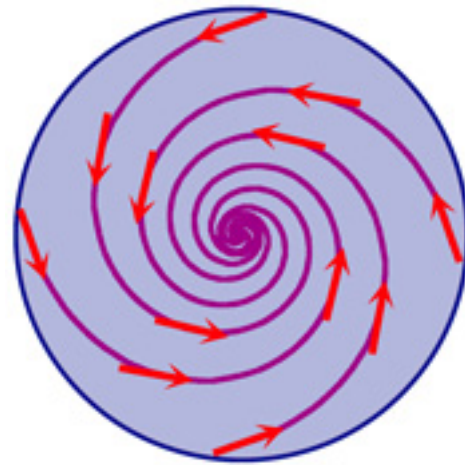
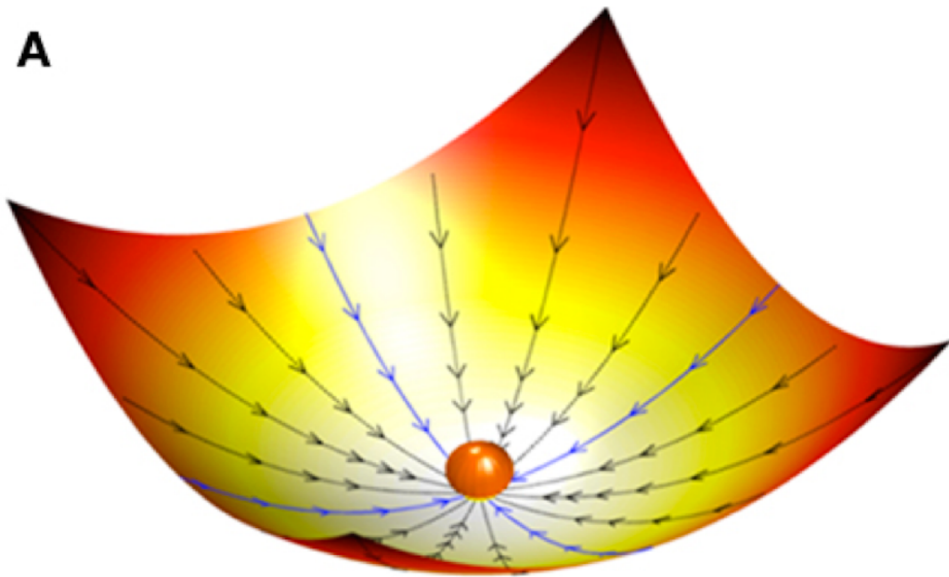




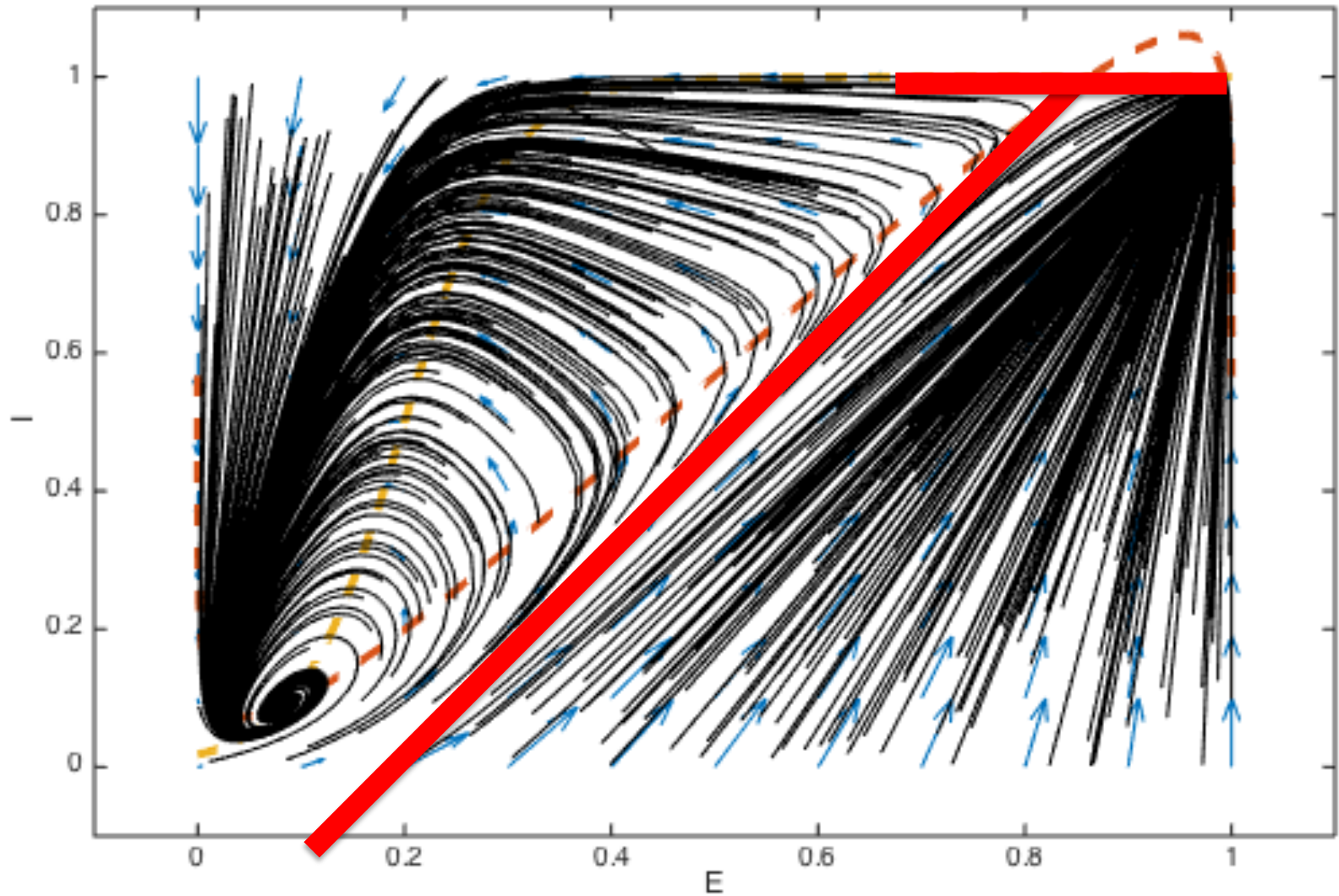
# Illustrating fixed point stability



# Node vs. Focus

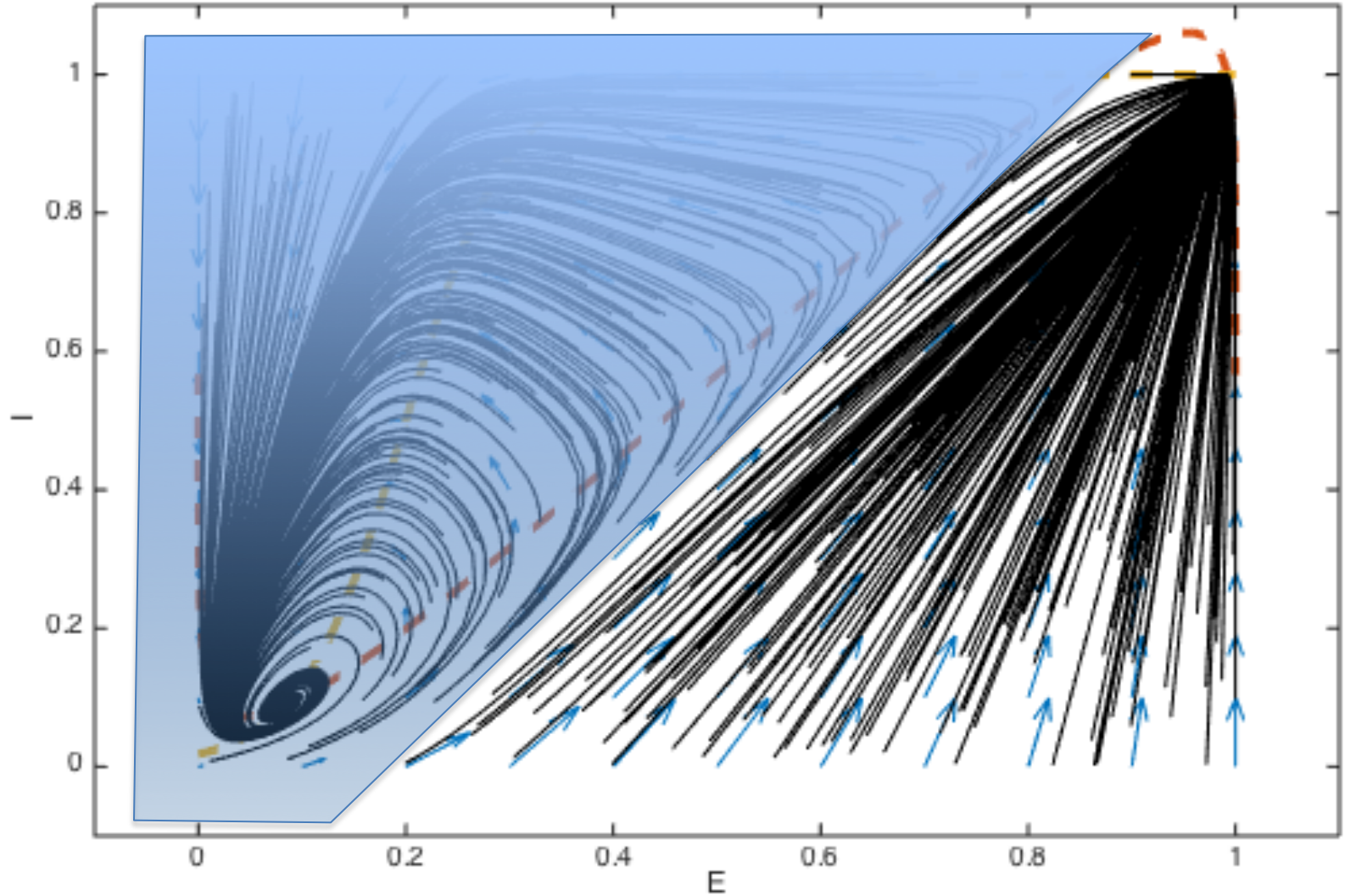


# Saddle and separatrix





# Basin of attraction



# Terminology recap

- Phase space/state space
- Vectorfield
- Fixed point (stable/unstable, focus/node)
- Nullcline
- Saddles, separatrix
- Bistability

# Solving for a steady state analytically (for yesterday's exercises)

$$dx/dt = k*x + c$$

$$dx/dt = 0$$

$$k*x_{ss} + c = 0$$

$$k*x_{ss} = -c$$

$$x_{ss} = -c/k$$



# Plotting phase space, vectorfields, nullclines

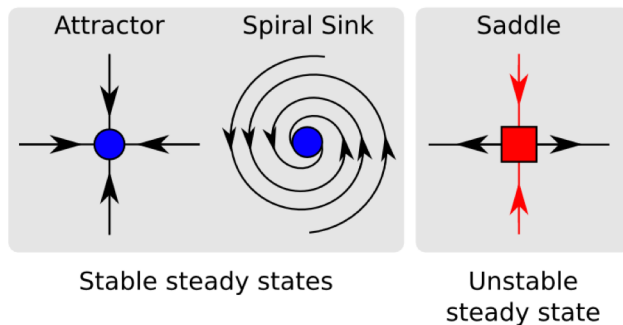
Google: pplane matlab

<http://math.rice.edu/~dfield/#8.0>

# Summary

**Flow:** The rate of change of the system at every state. On a phase portrait, arrows represent the flow. They have a length and direction proportional to the size and direction of change.

**Steady states:** States of the system for which the rate of change is zero. A steady state is **stable** if, upon perturbation, a trajectory will reconverge to it. Otherwise, the steady state is **unstable**.



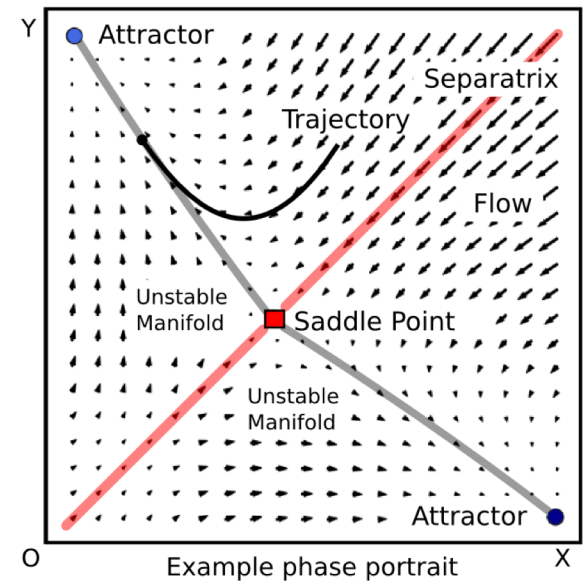
**Trajectory:** Curve that describes the change of state variables over time.

**Basin of attraction:** Region around a stable state from which all trajectories converge towards it.

**Separatrix:** Curve that separates basins of attraction.

**Unstable manifold:** Trajectory joining a saddle to an attractor.

A phase portrait represents a dynamical system in a graphical way. The approach has the advantage that trajectories can be understood in terms of their drivers, i.e. the distinctive features of a system.



# Quiz

- Where do nullclines come from?
- What do nullclines indicate in phase space?
- What is the intersection of nullclines?
  
- Where does the vector field come from?
- What is its relationship to nullclines?
- Why is the vector field useful?

# Quiz

- What effects can parameters have on the vector field and nullclines?
- What is a fixed point?
- Trick question: Does the fixed point depend on initial conditions?
- Trick question: Why is the vectorfield on a grid system?
- Why do trajectories never intersect?