An Ecological Case Study Stage I: Modelling and Numerical Simulation Stage II: Predicting Regular vs Irregular Patterns Stage III: Predicting Wave Properties Stage IV: Multiple Obstacles and Conclusions

# Periodic Travelling Waves in Ecology

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Heriot-Watt University

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This talk can be downloaded from my web site

www.ma.hw.ac.uk/ $\sim$ jas



An Ecological Case Study Stage I: Modelling and Numerical Simulation Stage II: Predicting Regular vs Irregular Patterns Stage III: Predicting Wave Properties Stage IV: Multiple Obstacles and Conclusions

#### In collaboration with:

#### Matthew Smith



#### Xavier Lambin



#### **Outline**

- An Ecological Case Study
- Stage I: Modelling and Numerical Simulation
- Stage II: Predicting Regular vs Irregular Patterns
- Stage III: Predicting Wave Properties
- 5 Stage IV: Multiple Obstacles and Conclusions



Field Voles in Kielder Forest What is a Periodic Travelling Wave? What Causes the Spatial Component of the Oscillations?

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An Ecological Case Study
Stage I: Modelling and Numerical Simulation
Stage II: Predicting Regular vs Irregular Patterns
Stage III: Predicting Wave Properties
Stage IV: Multiple Obstacles and Conclusions

Field Voles in Kielder Forest

What is a Periodic Travelling Wave? What Causes the Spatial Component of the Oscillations?

#### Field Voles in Kielder Forest

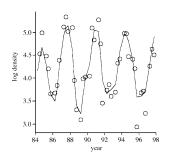






#### Field Voles in Kielder Forest





Field voles in Kielder Forest are cyclic (period 4 years).



#### Field Voles in Kielder Forest





Field voles in Kielder Forest are cyclic (period 4 years). Spatiotemporal field data shows that the cycles are spatially organised into a periodic travelling wave, speed 19km/year, direction 72° from N.

Field Voles in Kielder Forest
What is a Periodic Travelling Wave?
What Causes the Spatial Component of the Oscillations?

## What is a Periodic Travelling Wave?

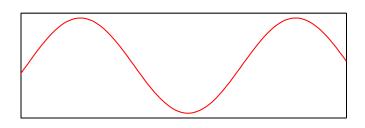
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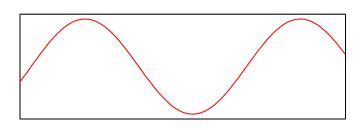


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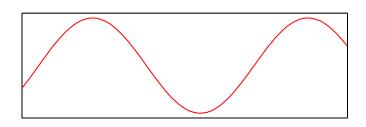


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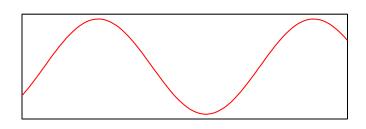


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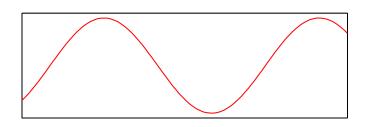


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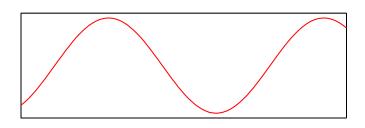


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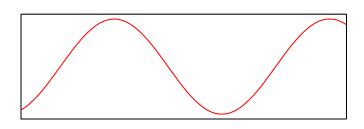


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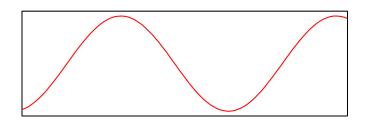


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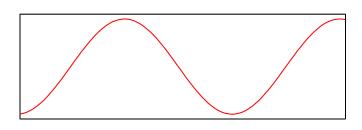


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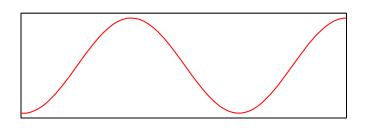


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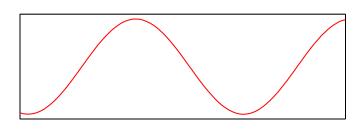


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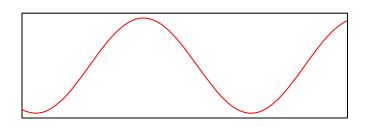


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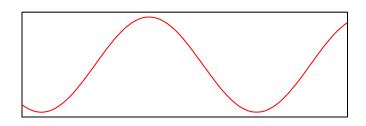


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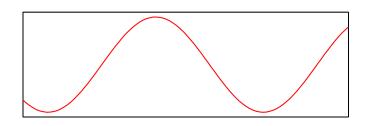
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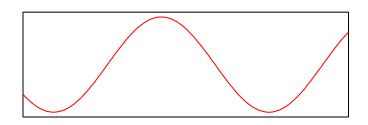


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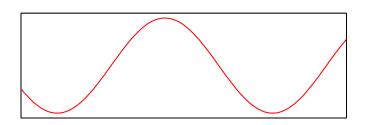


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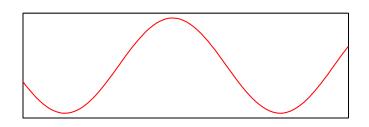


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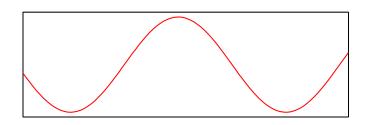


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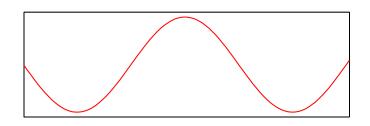


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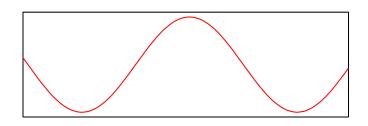


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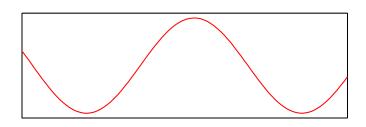


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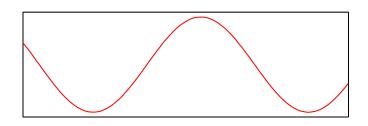


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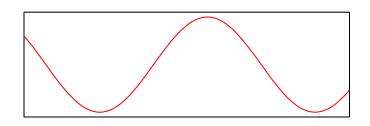


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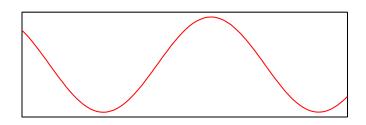


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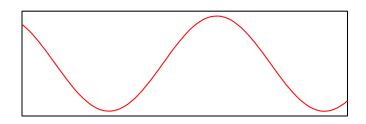


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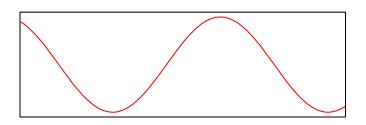


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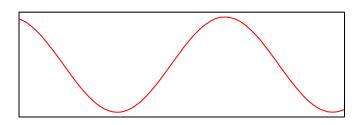


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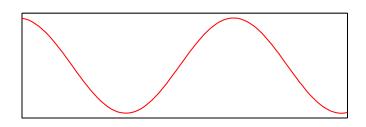


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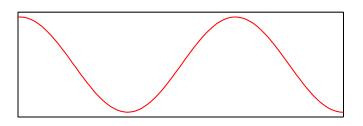


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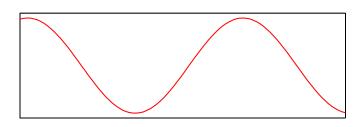


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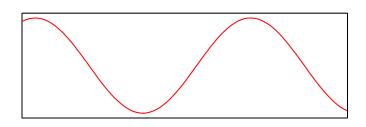


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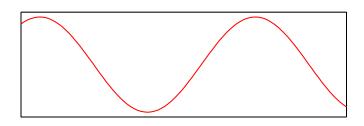


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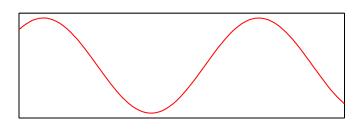


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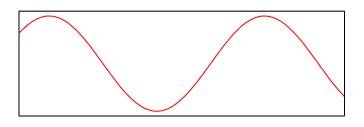


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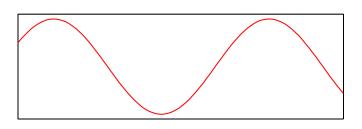


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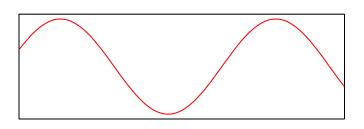


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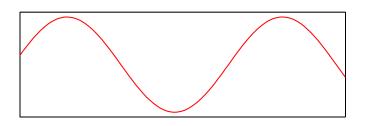


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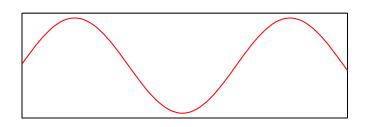


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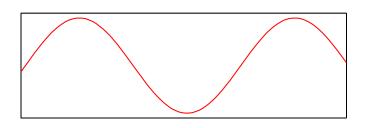


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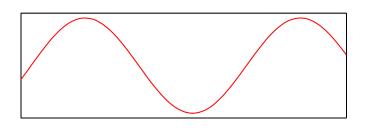


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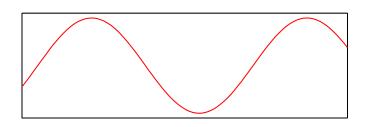


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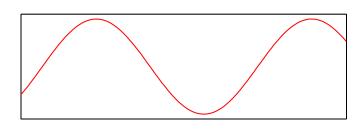


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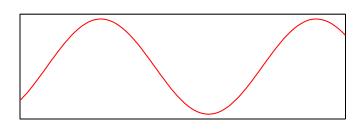


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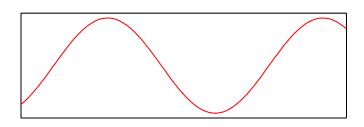


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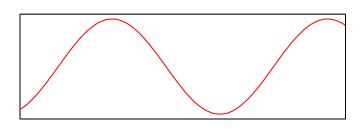


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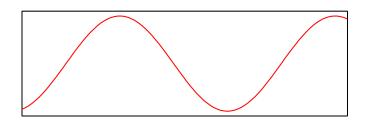


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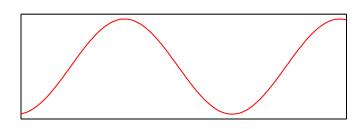


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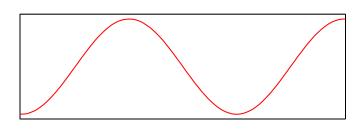


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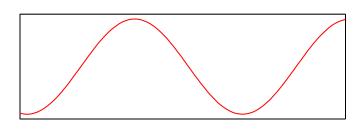


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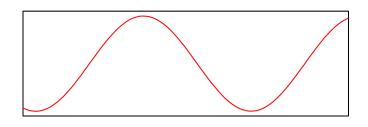
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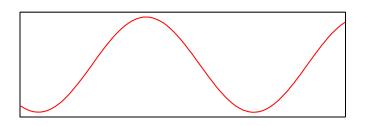


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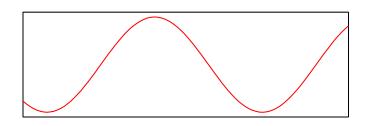
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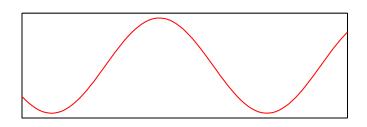


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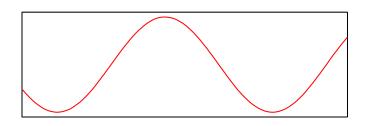


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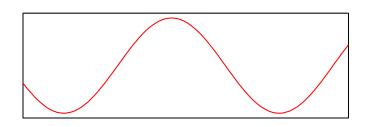


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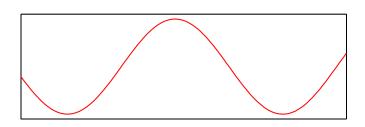


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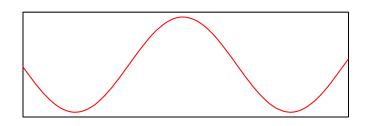


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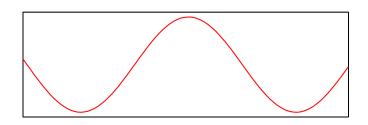


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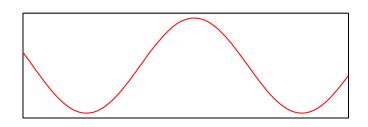


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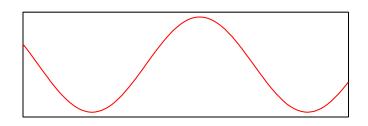


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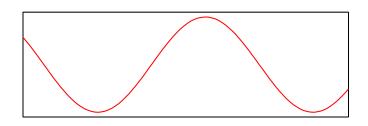


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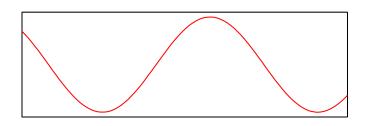


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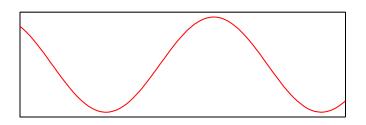


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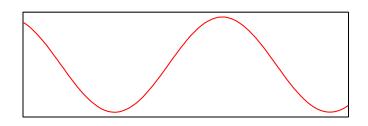


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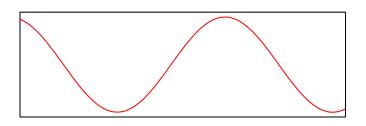


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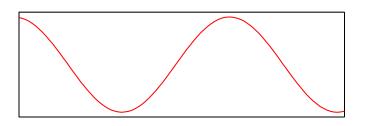


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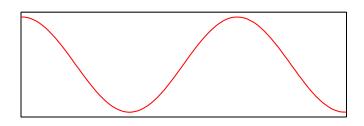


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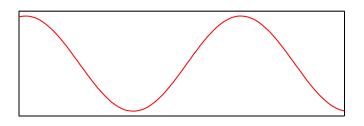


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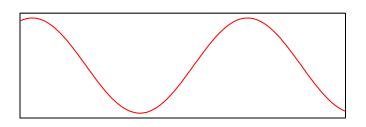


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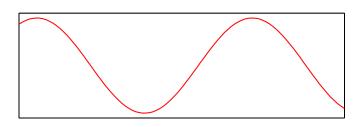


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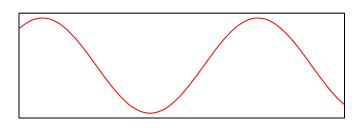


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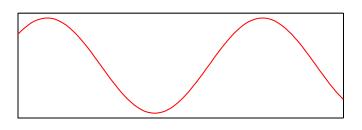


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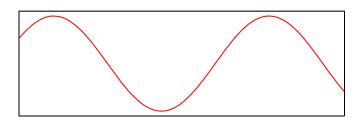


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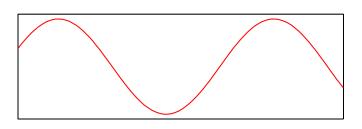


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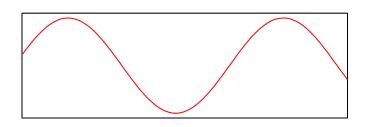


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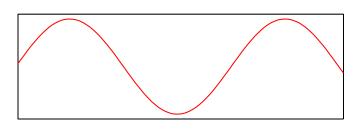


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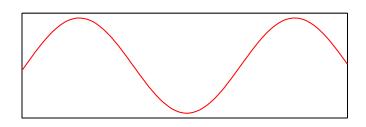


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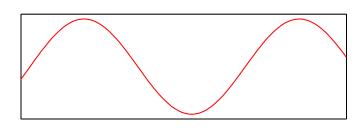


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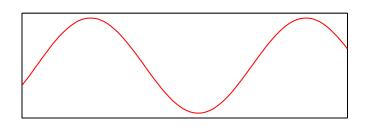


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Space



Field Voles in Kielder Forest
What is a Periodic Travelling Wave?
What Causes the Spatial Component of the Oscillations?

# What Causes the Spatial Component of the Oscillations?





Hypothesis: the periodic travelling waves are caused by the large central reservoir.



Field Voles in Kielder Forest A Standard Predator-Prey Model Boundary Conditions in the Field Vole Example Typical Model Solution Examples of Regular and Irregular Pattern Generation

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#### Field Voles in Kielder Forest

For modelling, we need an assumption on the cause of the population cycles.





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#### Field Voles in Kielder Forest

For modelling, we need an assumption on the cause of the population cycles.





We assume that vole cycles are caused by predation by weasels, and study using a standard predator-prey model.

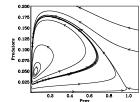
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# A Standard Predator-Prey Model

#### predators

$$\partial p/\partial t = \underbrace{D_p \nabla^2 p}_{\text{dispersal}} + \underbrace{akph/(1+kh)}_{\substack{\text{benefit from predation}}} - \underbrace{bp}_{\substack{\text{death}}}$$

# Phase plane of kinetics:



$$\partial h/\partial t = \underbrace{D_h \nabla^2 h}_{\text{dispersal}} + \underbrace{rh(1 - h/h_0)}_{\text{intrinsic}} - \underbrace{ckph/(1 + kh)}_{\text{predation}}$$



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# Boundary Conditions in the Field Vole Example

- Voles are an important prey species for owls and kestrels
- The open expanse of Kielder Water will greatly facilitate hunting at its edge



Short eared owl



Common kestrel



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# Boundary Conditions in the Field Vole Example

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- Therefore we expect very high vole loss at the reservoir edge, implying a Robin boundary condition

$$\frac{\partial}{\partial n} \left( \begin{array}{c} \text{vole} \\ \text{density} \end{array} \right) = - \left( \begin{array}{c} \text{large} \\ \text{constant} \end{array} \right) \cdot \left( \begin{array}{c} \text{vole} \\ \text{density} \end{array} \right)$$



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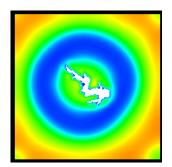
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- To a good approx, vole density = 0 at the reservoir edge
- At the edge of the forest, a zero flux boundary condition is a natural assumption

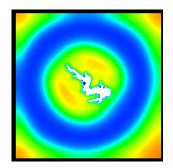


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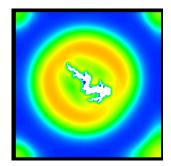


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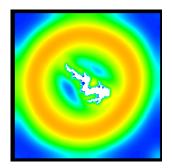


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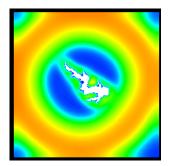


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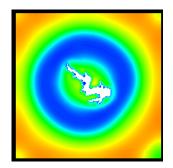


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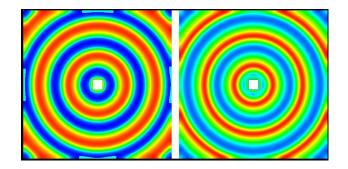
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# Periodic Wave Generation on a Large Domain





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# Movie of Wave Generation on a Large Domain

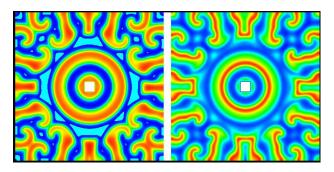
Click here to play the movie



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# An Example of Irregular Pattern Generation

For some parameter values, obstacles with Dirichlet boundary conditions generate irregular spatiotemporal patterns.





Noted Predator-Prey Model

Boundary Conditions in the Field Vole Example

Typical Model Solution

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# Movie of Irregular Pattern Generation

Click here to play the movie



Standard Theory of Periodic Travelling Wave One-Dimensional Problem The Eigenvalue Problem Numerical Calculation of Eigenvalue Spectrum Back to Wave Generation in 1-D Simulations

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# Regular and Irregular Patterns: the Goal

Goal: to predict which parameter sets will give periodic travelling waves, and which will give spatiotemporal irregularity.



# Standard Theory of Periodic Travelling Wave

Mathematically, a periodic travelling wave is a soln of form  $U(x \pm ct)$ , with U(.) periodic.

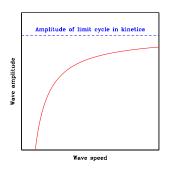
There is an extensive literature on periodic travelling waves in oscillatory reaction-diffusion equations



## Standard Theory of Periodic Travelling Wave

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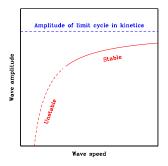
Theorem (Kopell & Howard, 1973): An oscillatory reaction-diffusion system has a one-parameter family of periodic travelling wave solutions if the diffusion coefficients are sufficiently close to one another.



## Standard Theory of Periodic Travelling Wave

Mathematically, a periodic travelling wave is a soln of form  $U(x \pm ct)$ , with U(.) periodic.

Some members of the periodic travelling wave family are stable as solutions of the partial differential equations, while others are unstable.



### One-Dimensional Problem

To simplify the field vole problem, solve on  $0 < x < x_{max}$  with

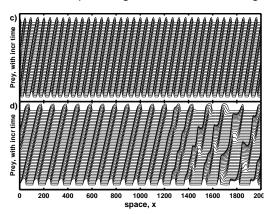
$$h = p = 0$$
 at  $x = 0$   $\leftrightarrow$  edge of reservoir  $h_x = p_x = 0$  at  $x = x_{max}$   $\leftrightarrow$  edge of forest

In fact the condition at  $x = x_{max}$  plays no significant role, and we can consider the equations on  $0 < x < \infty$ .



#### Periodic Wave Generation in 1-D Simulations

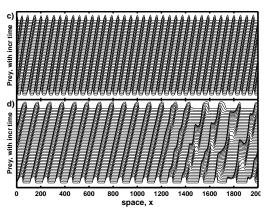
Example of periodic wave generation by boundary conditions corresponding to the reservoir edge in 1-D:





### Periodic Wave Generation in 1-D Simulations

Example of periodic wave generation by boundary conditions corresponding to the reservoir edge in 1-D:



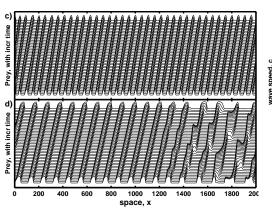
Conclusion: irregular patterns occur when the (Dirichlet) boundary condition at x = 0 generates a periodic travelling wave that is unstable.

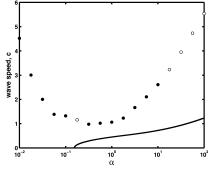
Therefore we must investigate wave stability in detail.



### Periodic Wave Generation in 1-D Simulations

Example of periodic wave generation by boundary conditions corresponding to the reservoir edge in 1-D:





Reaction-diffusion eqns: 
$$u_t = D_u u_{zz} + c u_z + f(u, v)$$

$$v_t = D_v v_{zz} + c v_z + g(u, v)$$
Periodic wave satisfies:  $0 = D_u U_{zz} + c U_z + f(U, V)$ 

$$0 = D_v V_{zz} + c V_z + g(U, V)$$
Consider  $u(z, t) = U(z) + e^{\lambda t} \overline{u}(z)$  with  $|\overline{u}| \ll |U|$ 

$$v(z, t) = V(z) + e^{\lambda t} \overline{v}(z)$$
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$$\Rightarrow \text{ Eigenfunction eqn: } \lambda \overline{u} = D_u \overline{u}_{zz} + c \overline{u}_z + f_u(U, V) \overline{u} + f_v(U, V) \overline{v}$$

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Boundary conditions: 
$$\overline{u}(0) = \overline{u}(L)e^{i\gamma} \quad (0 \le \gamma < 2\pi)$$
  
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 $\overline{v}(0) = \overline{v}(L)e^{i\gamma} \quad (0 \le \gamma < 2\pi)$ 



### Numerical Calculation of Eigenvalue Spectrum

(based on Jens Rademacher, Bjorn Sandstede, Arnd Scheel Physica D 229 166-183, 2007)

 solve numerically for the periodic wave by continuation in c from a Hopf bifn point in the periodic wave eqns

$$0 = D_{U}U_{zz} + cU_{z} + f(U, V)$$
  

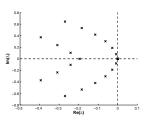
$$0 = D_{V}V_{zz} + cV_{z} + g(U, V) \quad (z = x - ct)$$



## Numerical Calculation of Eigenvalue Spectrum

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- solve numerically for the periodic wave by continuation in c from a Hopf bifn point in the periodic wave eqns
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$$\lambda \overline{u} = D_{u}\overline{u}_{zz} + c\overline{u}_{z} + f_{u}(U, V)\overline{u} + f_{v}(U, V)\overline{v}, \quad \overline{u}(0) = \overline{u}(L)$$

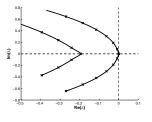
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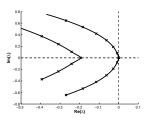
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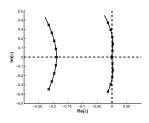
This gives the eigenvalue spectrum, and hence (in)stability



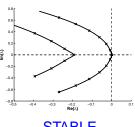
Numerical Calculation of Eigenvalue Spectrum

### Numerical Calculation of Eigenvalue Spectrum

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**Eckhaus** instability



UNSTABLE

STABLE

This gives the eigenvalue spectrum, and hence (in)stability



# Stability in a Parameter Plane

By following this procedure at each point on a grid in parameter space, regions of stability/instability can be determined.

In fact, stable/unstable boundaries can be computed accurately by numerical continuation of the point at which

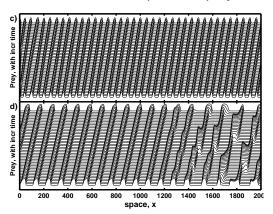
$$Re\lambda = Im\lambda = \gamma = \partial^2 Re\lambda/\partial \gamma^2 = 0$$

(Eckhaus instability point)



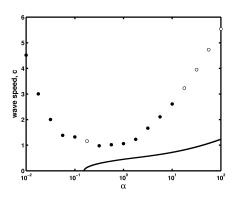
#### Back to Wave Generation in 1-D Simulations

Example of periodic wave generation by Dirichlet boundary conditions in the predator-prey model:



#### Back to Wave Generation in 1-D Simulations

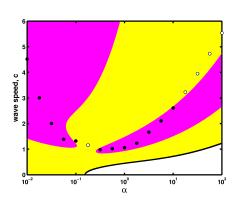
From such simulations, we can easily calculate wave speed vs parameters





#### Back to Wave Generation in 1-D Simulations

From such simulations, we can easily calculate wave speed vs parameters



Our stability calculations explain the surprising results from simulations of periodic wave generation



The wave Selection Problem
Step 1: Reduction to Normal Form
Step 2: Exact Solution for the Wave Amplitude
Step 3: Deduce Wave Properties from Amplitude

#### **Outline**

- 1 An Ecological Case Study
- Stage I: Modelling and Numerical Simulation
- Stage II: Predicting Regular vs Irregular Patterns
- Stage III: Predicting Wave Properties
- 5 Stage IV: Multiple Obstacles and Conclusions



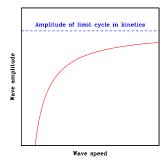
Step 1: Reduction to Normal Form

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### The Wave Selection Problem

An oscillatory reaction-diffusion system has a one-parameter family of periodic travelling waves.

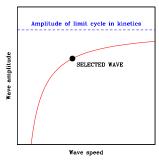


Step 1: Reduction to Normal Form

Step 2: Exact Solution for the Wave Amplitude

#### The Wave Selection Problem

An oscillatory reaction-diffusion system has a one-parameter family of periodic travelling waves.



#### **Key Question:**

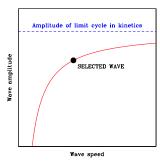
which member of the wave family is selected by the boundary condition at the reservoir edge?

Step 1: Reduction to Normal Form

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#### The Wave Selection Problem

An oscillatory reaction-diffusion system has a one-parameter family of periodic travelling waves.



#### **Key Question:**

which member of the wave family is selected by the boundary condition at the reservoir edge?

This question can be answered analytically when  $D_p = D_h$ , close to Hopf bifurcation in the kinetics.



Step 1: Reduction to Normal Form

Step 2: Exact Solution for the Wave Amplitude

## Step 1: Reduction to Normal Form

Consider the case of  $D_p = D_h$  close to Hopf bifurcation in the kinetics. Then standard normal form analysis reduces the predator-prey model to

$$u_t = u_{xx} + \lambda(r)u - \omega(r)v$$
 where  $\lambda(r) = 1 - r^2$   
 $v_t = v_{xx} + \omega(r)u + \lambda(r)v$   $\omega(r) = \omega_0 - \omega_1 r^2$ .

Here 
$$\omega_0 = \frac{2}{C(A-1)-(A+1)} \left[ \frac{A(A^2-1)}{A(A^2-1)} \right]^{1/2} + \left[ \frac{A-1}{A(A+1)B} \right]^{1/2}$$

$$\omega_1 = \frac{4A^2B^2+(A^2-1)(A^2+5)AB+(A^2-1)^2}{6A^{5/2}(A^2-1)^{1/2}B^{3/2}}$$



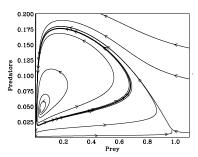
Step 1: Reduction to Normal Form

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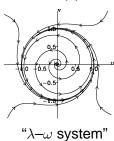
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Stage IV: Multiple Obstacles and Conclusions

The Wave Selection Problem

Step 1: Reduction to Normal Form

Step 2: Exact Solution for the wave Amplitude
Step 3: Deduce Wave Properties from Amplitude

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The periodic travelling wave family is

$$u = r^* \cos \left[ \omega(r^*)t \pm \sqrt{\lambda(r^*)}x \right]$$
$$v = r^* \sin \left[ \omega(r^*)t \pm \sqrt{\lambda(r^*)}x \right]$$



Step 2: Exact Solution for the Wave Amplitude

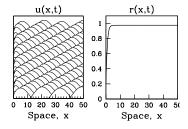
pp 3: Deduce Wave Properties from Amplitude

### Step 2: Exact Solution for the Wave Amplitude

For the  $\lambda$ – $\omega$  equations, the long term solution is

$$r(x,t) \equiv \sqrt{u^2 + v^2} = R(x)$$

independent of time



The Wave Selection Problem
Step 1: Reduction to Normal Form

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For the  $\lambda$ – $\omega$  equations, the long term solution is

$$r(x,t) \equiv \sqrt{u^2 + v^2} = R(x)$$

independent of time, where

$$R(x) = r_{ptw} \tanh\left(x/\sqrt{2}\right)$$

with 
$$r_{ptw} = \left\{ \frac{1}{2} \left[ 1 + \sqrt{1 + \frac{8}{9}\omega_1^2} \right] \right\}^{-1/2}$$



The Wave Selection Problem
Step 1: Reduction to Normal Form
Step 2: Exact Solution for the Wave Amplitude
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### Step 3: Deduce Wave Properties from Amplitude

The periodic travelling wave amplitude is  $r_{ptw} = \left\{\frac{1}{2}\left[1+\sqrt{1+\frac{8}{9}\omega_1^2}\right]\right\}^{-1/2}$ . The wave solution is

$$u = r_{ptw} \cos[\omega(r_{ptw})t \pm \lambda(r_{ptw})^{1/2}x]$$

$$v = r_{ptw} \sin[\omega(r_{ptw})t \pm \lambda(r_{ptw})^{1/2}x]$$

$$(\lambda(r) = 1 - r^2, \omega(r) = \omega_0 - \omega_1 r^2).$$

Therefore: wavelength 
$$= 2\pi/\sqrt{1-r_{ptw}^2}$$
 time period  $= 2\pi/(\omega_0-\omega_1r_{ptw}^2)$  speed  $= (\omega_0-\omega_1r_{ptw}^2)/\sqrt{1-r_{ptw}^2}$ 

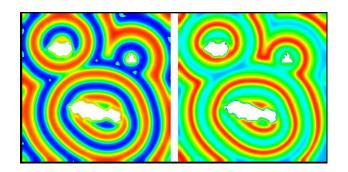


#### **Outline**

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- 2 Stage I: Modelling and Numerical Simulation
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An Ecological Case Study Stage I: Modelling and Numerical Simulation Stage II: Predicting Regular vs Irregular Patterns Stage III: Predicting Wave Properties Stage IV: Multiple Obstacles and Conclusions Typical Predator-Prey Solution with Multiple Obstacles Competition between Obstacles Wavelength vs Obstacle Radius Explanation of Competition between Obstacles Conclusions and Limitations

## Typical Predator-Prey Solution with Multiple Obstacles





An Ecological Case Study Stage I: Modelling and Numerical Simulation Stage II: Predicting Regular vs Irregular Patterns Stage III: Predicting Wave Properties Stage IV: Multiple Obstacles and Conclusions

Typical Predator-Prey Solution with Multiple Obstacles Competition between Obstacles Wavelength vs Obstacle Radius Explanation of Competition between Obstacles Conclusions and Limitations

### Competition between Obstacles

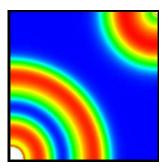
Question: How do the waves generated by different obstacles interact?



Typical Predator-Prey Solution with Multiple Obstacle Competition between Obstacles Wavelength vs Obstacle Radius Explanation of Competition between Obstacles Conclusions and Limitations

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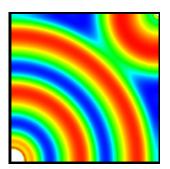




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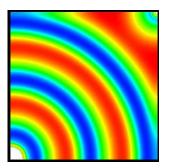
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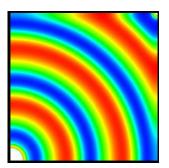
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# Competition between Obstacles

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An Ecological Case Study Stage I: Modelling and Numerical Simulation Stage II: Predicting Regular vs Irregular Patterns Stage III: Predicting Wave Properties Stage IV: Multiple Obstacles and Conclusions

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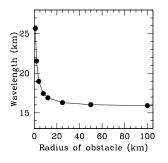
Question: How do the waves generated by different obstacles interact?

Answer: the wave generated by a larger obstacle dominates that generated by a smaller obstacle



# Wavelength vs Obstacle Radius

Numerical solutions for circular obstacles indicate that wavelength far from the obstacle varies with obstacle radius.

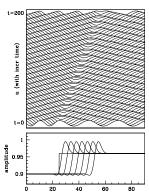


Larger obstacle ⇒ Shorter wavelength ⇒ Lower amplitude wave



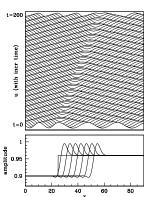
## **Explanation of Competition between Obstacles**

## Consider an interface between periodic waves in 1-D



# **Explanation of Competition between Obstacles**

### Consider an interface between periodic waves in 1-D



Analytical study of transition fronts in periodic wave amplitude shows that these move from a lower to a higher amplitude wave.

Therefore the wave generated by a larger obstacle will replace that generated by a smaller obstacle.



## Conclusions

- The expected behaviour at the edge of Kielder Water provides a possible explanation for the periodic travelling waves that are observed in field vole density.
- For other parameter sets, the same mechanism generates spatiotemporal irregularity. A detailed explanation of this is possible via numerical calculation of wave stability.
- Results on obstacle size and multiple obstacles are consistent with intuitive expectations, and explain why very large obstacles are required to give detectable periodic waves.



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# Conclusions (continued)

- Analytical periodiction of periodic travelling wave properties is possible close to Hopf bifurcation in the kinetics, by solving the wave selection problem.
- Since λ-ω equations are the normal form of any oscillatory reaction-diffusion system close to Hopf bifurcation, and since boundaries with Dirichlet conditions are common in applications, we expect both periodic travelling waves and spatiotemporal irregularity to be a general feature of such systems.



# Conclusions (continued)

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## **Mathematical Limitations**

### Mathematically, the major limitations are:

- Analytical prediction of wave stability away from Hopf bifurcation is not currently possible.
- There is not currently a solution of the wave selection problem away from Hopf bifurcation (either analytical or numerical).



# Relevant Papers and Software

J.A. Sherratt, M.J. Smith (2008) Periodic travelling waves in cyclic populations: field studies and reaction-diffusion models. *J. R. Soc. Interface* 5, 483-505.

This paper is a review of periodic travelling waves in ecological field data and in mathematical models of cyclic populations. The associated online material contains a detailed tutorial on numerical calculation of periodic travelling wave stability, including computer code (in Fortran).

The paper and the online material are freely available from my web site: www.ma.hw.ac.uk/~jas



# Relevant Papers and Software

J.A. Sherratt, X. Lambin, T.N. Sherratt (2003) The effects of the size and shape of landscape features on the formation of travelling waves in cyclic populations. *Am. Nat.* 162, 503-513.

This paper concerns ecological applications of periodic travelling wave generation by obstacles. The associated online material contains a detailed tutorial on the reduction of an oscillatory reaction-diffusion system to normal form close to Hopf bifurcation, including computer code (in Maple).

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## **List of Frames**



### An Ecological Case Study

- Field Voles in Kielder Forest
- What is a Periodic Travelling Wave?
- What Causes the Spatial Component of the Oscillations?



#### Stage I: Modelling and Numerical Simulation

- Field Voles in Kielder Forest
  - A Standard Predator-Prey Model
- Boundary Conditions in the Field Vole Example
- Typical Model Solution
- Examples of Regular and Irregular Pattern Generation



### Stage II: Predicting Regular vs Irregular Patterns

- Standard Theory of Periodic Travelling Wave
- One-Dimensional Problem
- The Eigenvalue Problem
- Numerical Calculation of Eigenvalue Spectrum
- Back to Wave Generation in 1-D Simulations



### Stage III: Predicting Wave Properties

- The Wave Selection Problem
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### Stage IV: Multiple Obstacles and Conclusions

- Typical Predator-Prey Solution with Multiple Obstacles
- Competition between Obstacles
- Wavelength vs Obstacle Radius
- Explanation of Competition between Obstacles
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