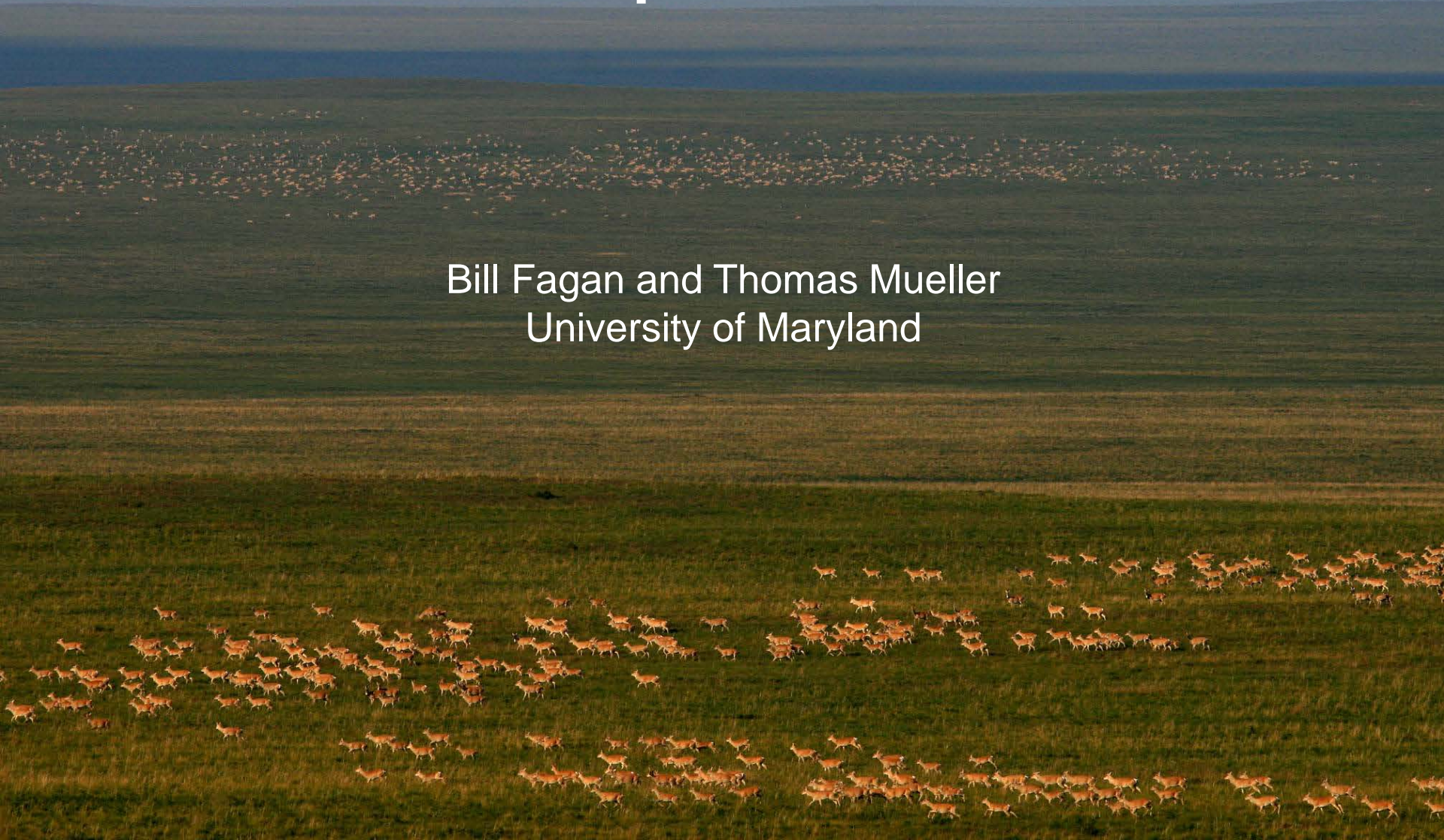


# Migration, Nomadism, and Range-Residency: How Landscape Dynamics Link Individual Movements to Population-Level Patterns

Bill Fagan and Thomas Mueller  
University of Maryland



# My collaborator:

Dr. Thomas Mueller

- University of Maryland
- Smithsonian Conservation Biology Institute
- German Biodiversity and Research Center (BiK-F)



# A moment for pedagogy:

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# How Complex, Population-level Patterns Arise from Individual Movements

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## Key Elements:

- Population-level movement patterns
- Individual movement mechanisms
- Key role of dynamic resource landscapes

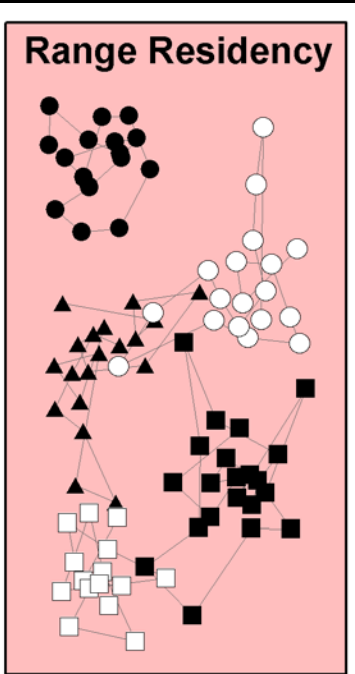
## Relevance:

- Ungulates, but also birds

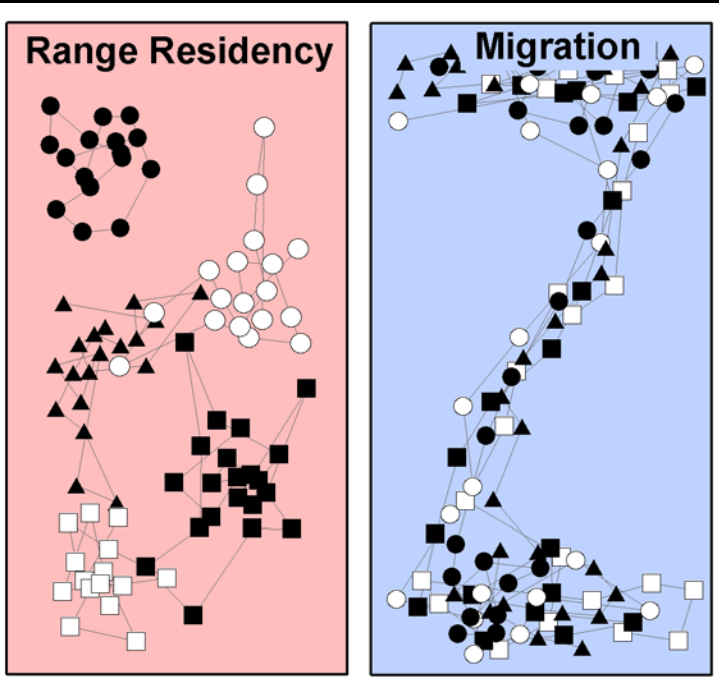
## Approaches:

- Theoretical ecology + ecoinformatics

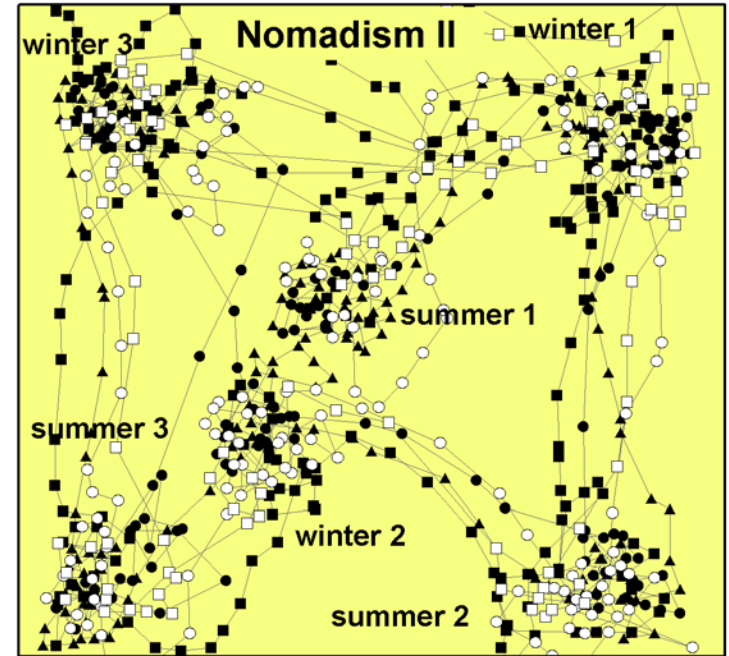
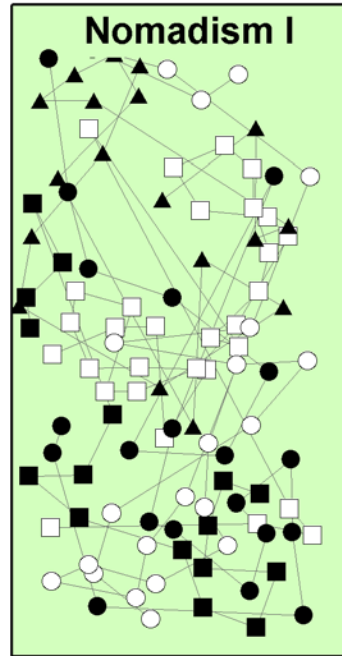
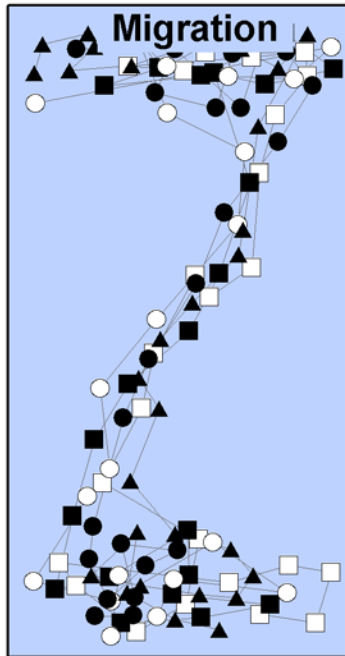
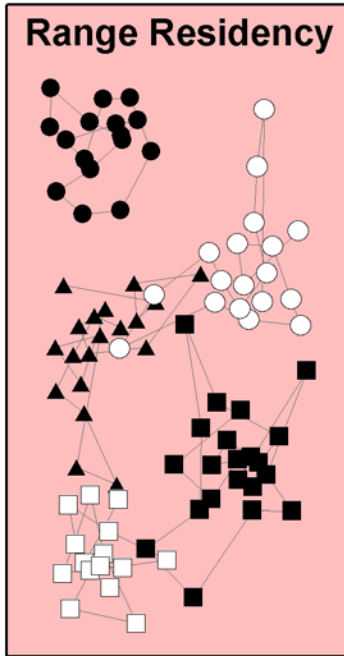
# Population-level distributions



# Population-level distributions



# Population-level distributions



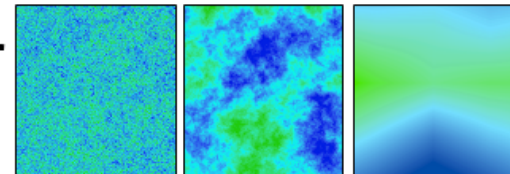


# Conceptual framework for resources, population distributions and movement mechanisms

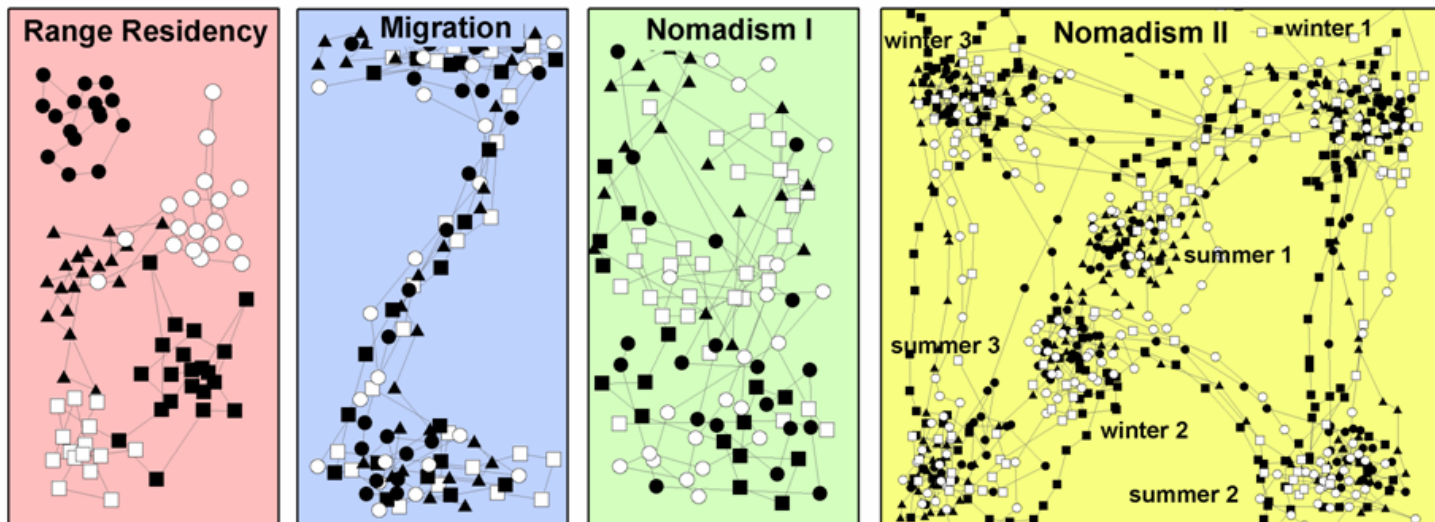
## Movement Mechanisms

*Non-oriented*  
*Oriented*  
*Spatial memory*

## Landscape Structure and Dynamics



## Individual Movement Paths & Population Distributions



# Outline :

## Overview

- Dynamics of resource landscapes
- Individual movement mechanisms

## Real Animal Movements

- Mongolian gazelles
- Comparisons among ungulate species

## Computational Modeling of Animal Movements

- Situation-dependent use of movement mechanisms
- Spatial memory as a navigation aid in dynamic  
landscapes

## Looking Forward

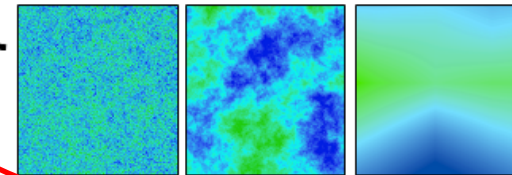
- Learning and Experience (Migratory Whooping Cranes)

# Conceptual framework for resources, population distributions and movement mechanisms

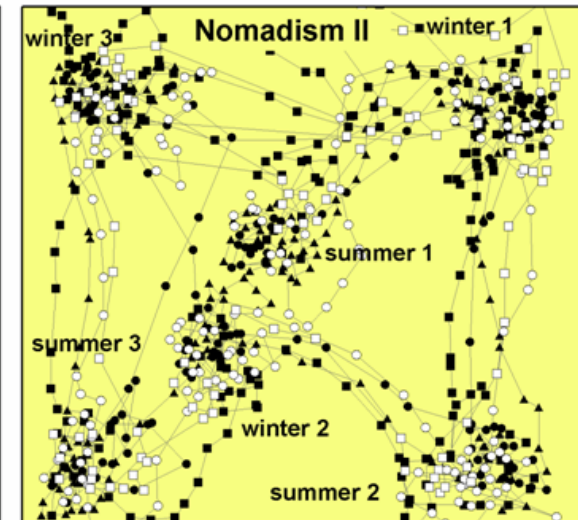
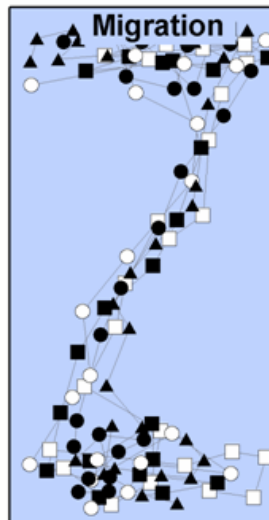
## Movement Mechanisms

*Non-oriented*  
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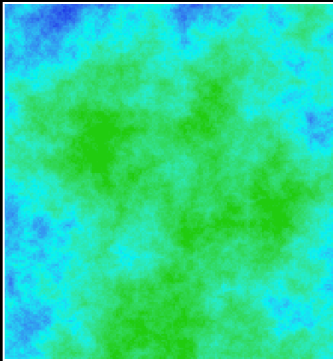
## Individual Movement Paths & Population Distributions



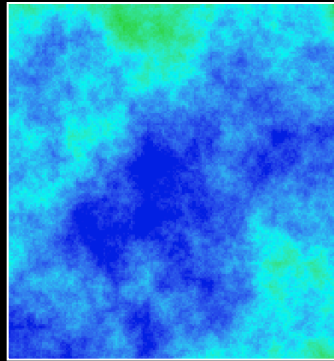
# Resources...variability across 4 gradients:

a) Amount

many



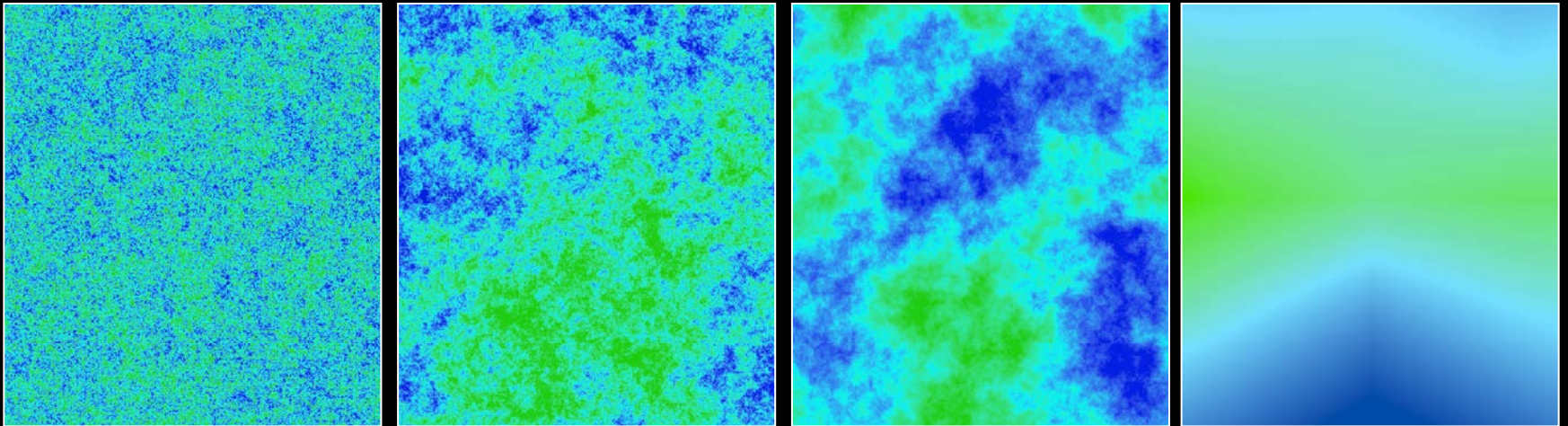
few



## Resources...variability across 4 gradients:

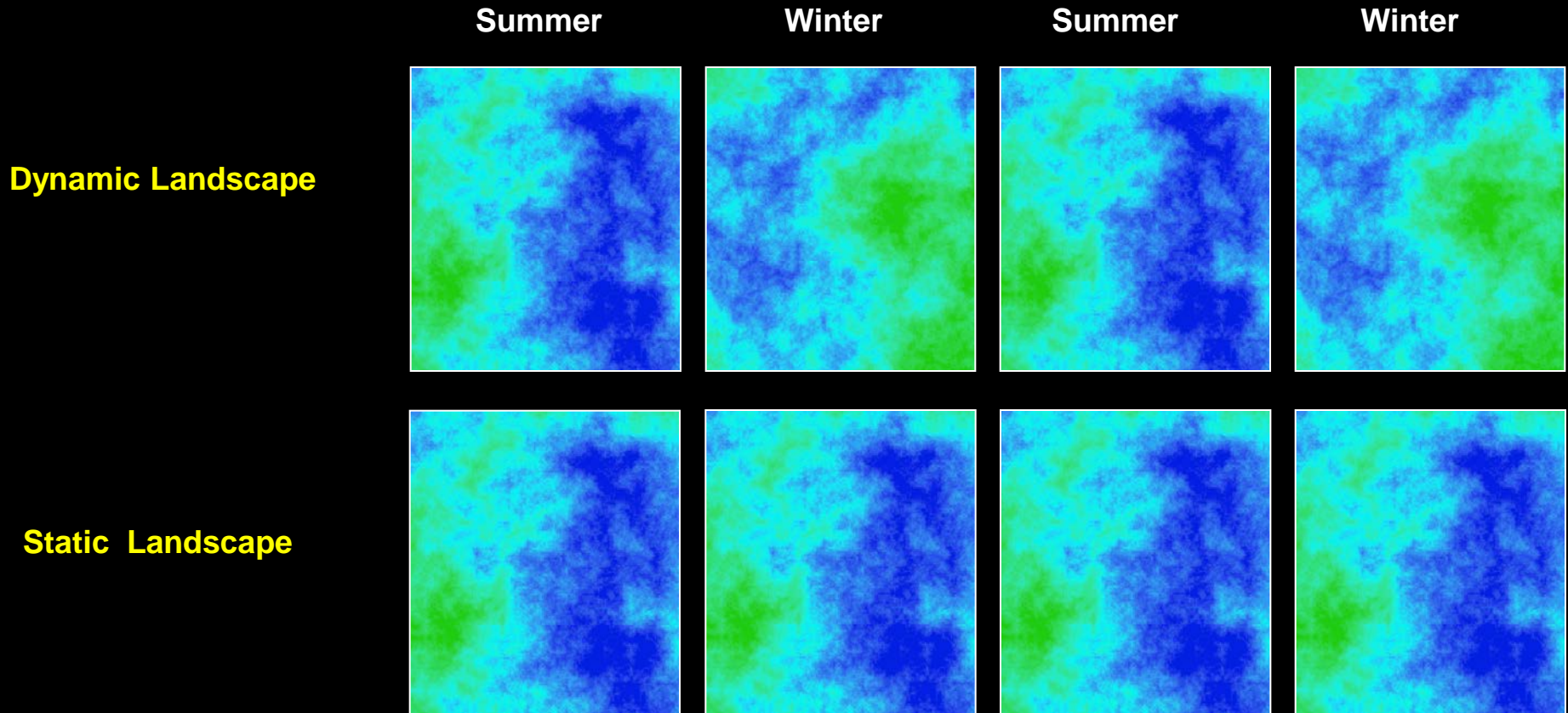
- a) Amount
- b) Spatial variability

Fine ▶ coarse



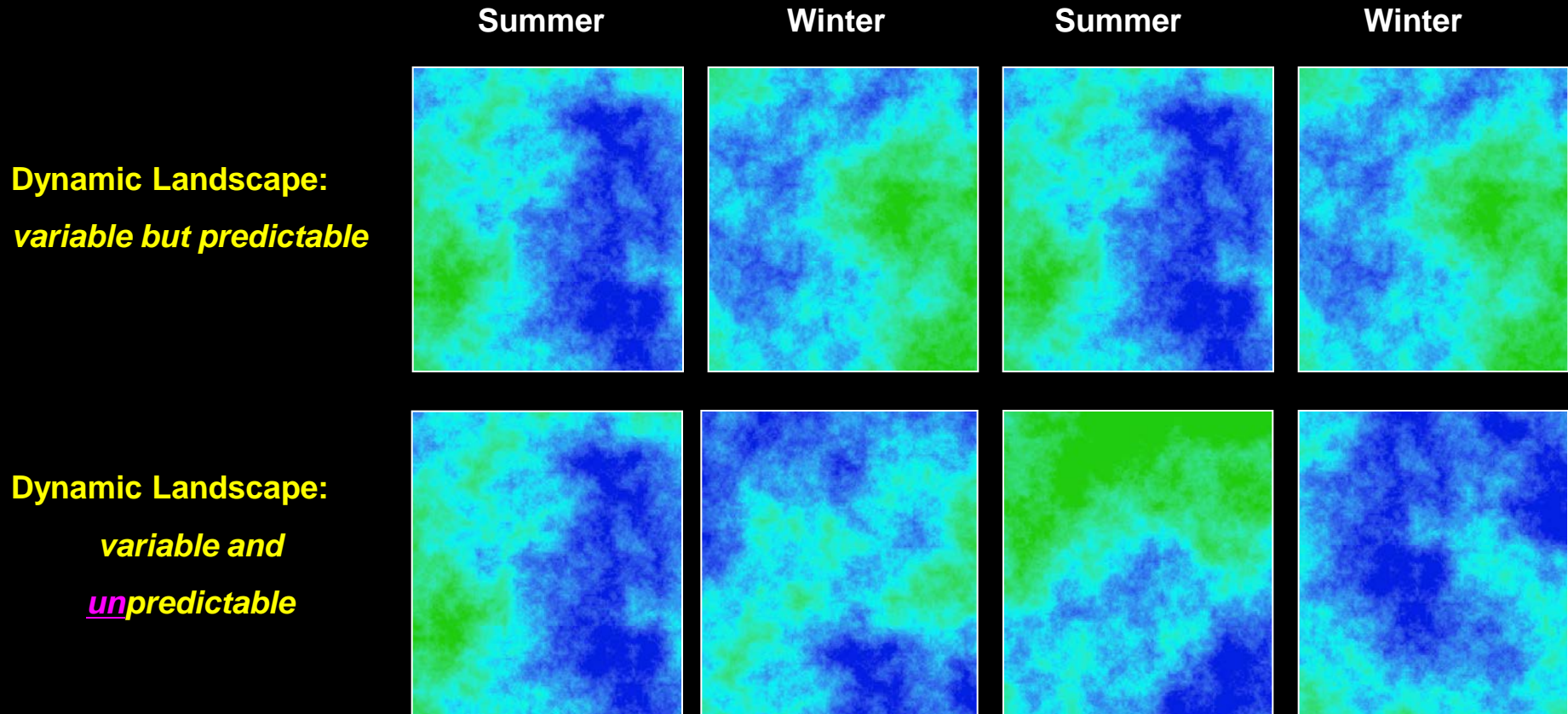
## Resources...variability across 4 gradients:

- a) Amount
- b) Spatial variability
- c) Temporal variability

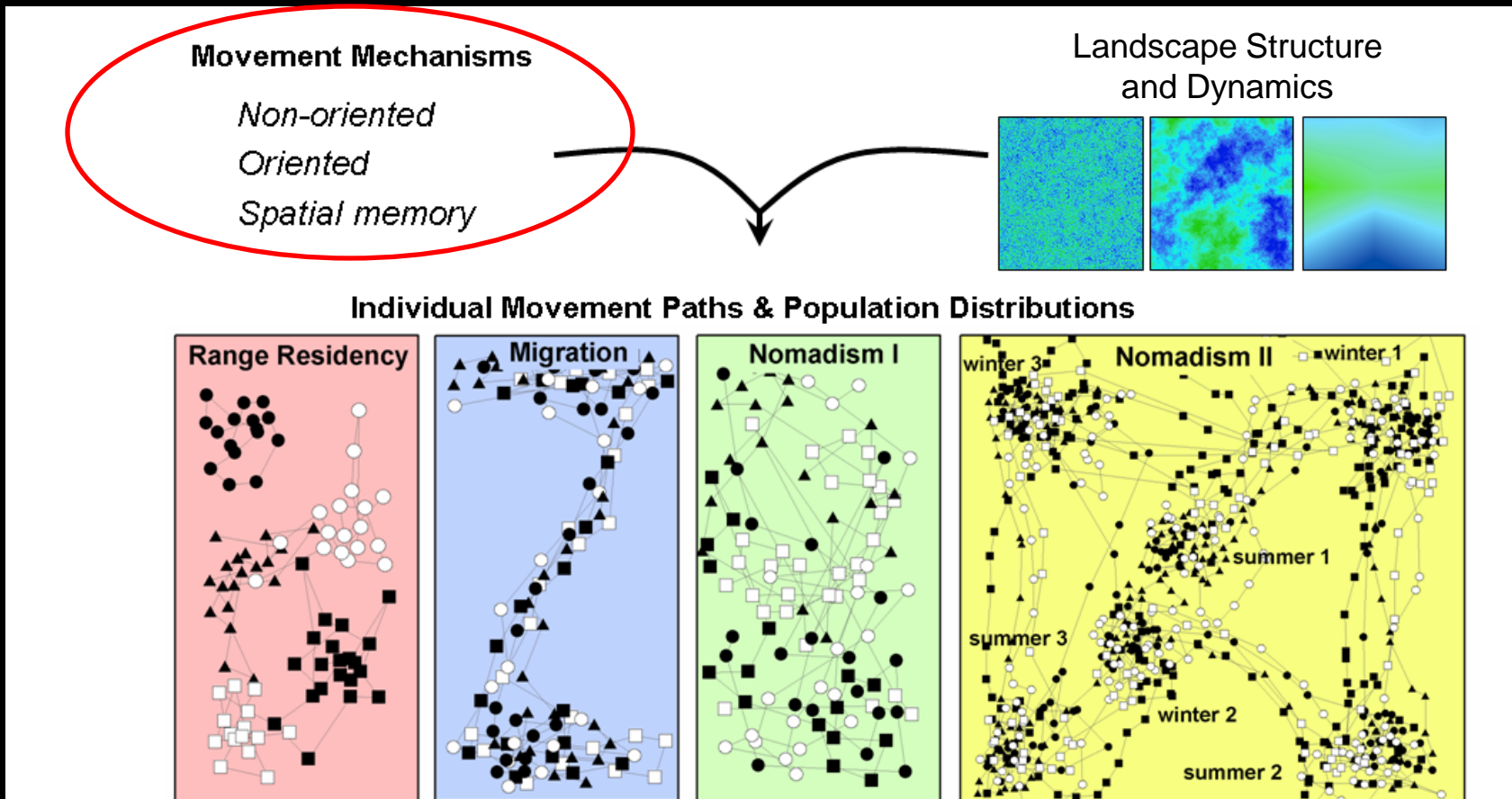


## Resources...variability across 4 gradients:

- a) Amount
- b) Spatial variability
- c) Temporal variability
- d) Predictability



# Conceptual framework for resources, population distributions and movement mechanisms





# Individual level movement mechanisms:

## (1) *Non-oriented* (e.g., diffusion)

- sensory stimuli such as stomach fullness
- stimuli coming from an animal's current location
- cause an alteration in an individual's movement parameters (speed, turning angle)
- movement decision with random direction



# Individual level movement mechanisms:



## (2) *Oriented*, based on taxis and perceptual range

- e.g. visual detection of food good habitats
- stimuli stem from a location beyond the animal's current position
- movement in a predictable direction.



## Individual level movement mechanisms:

(3) *Spatial memory*, based on previous information derived from the recollection of

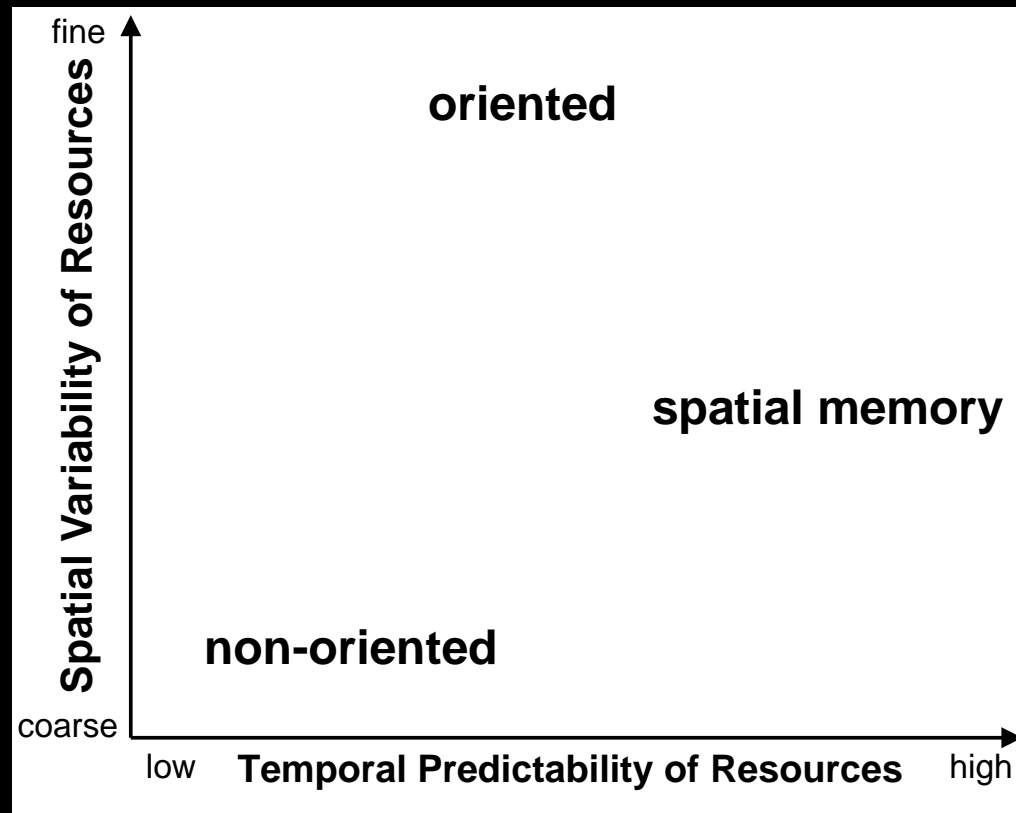
- an individual's own history,
- communication with conspecifics,
- or as a genetic inheritance from its ancestors

- *path integration* (e.g., wobble dance in bees or magnetic compasses in birds)
- *cognitive maps* (e.g., geomagnetic coordinates and use of landmarks)



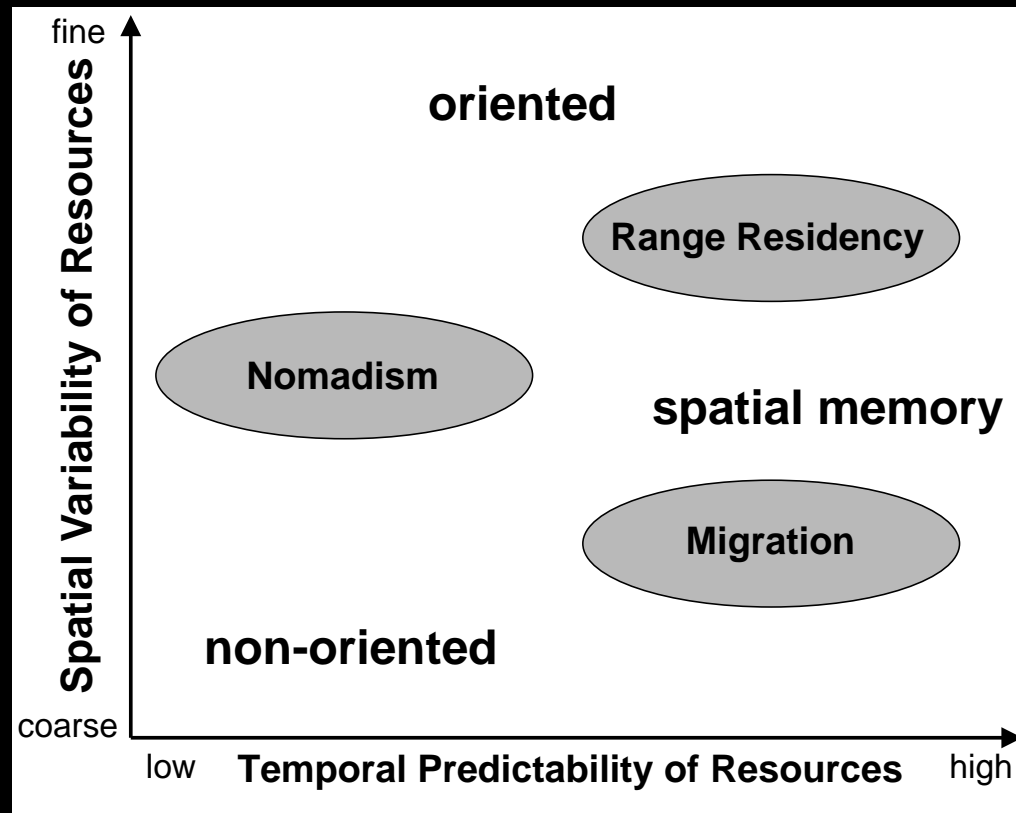
# Resource landscapes:

- 1) Determine the effectiveness of alternative movement mechanisms



# Resource landscapes:

- 1) Determine the effectiveness of alternative movement mechanisms
- 2) Lead to different emergent population-level distribution patterns



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- Learning and Experience (Migratory Whooping Cranes)



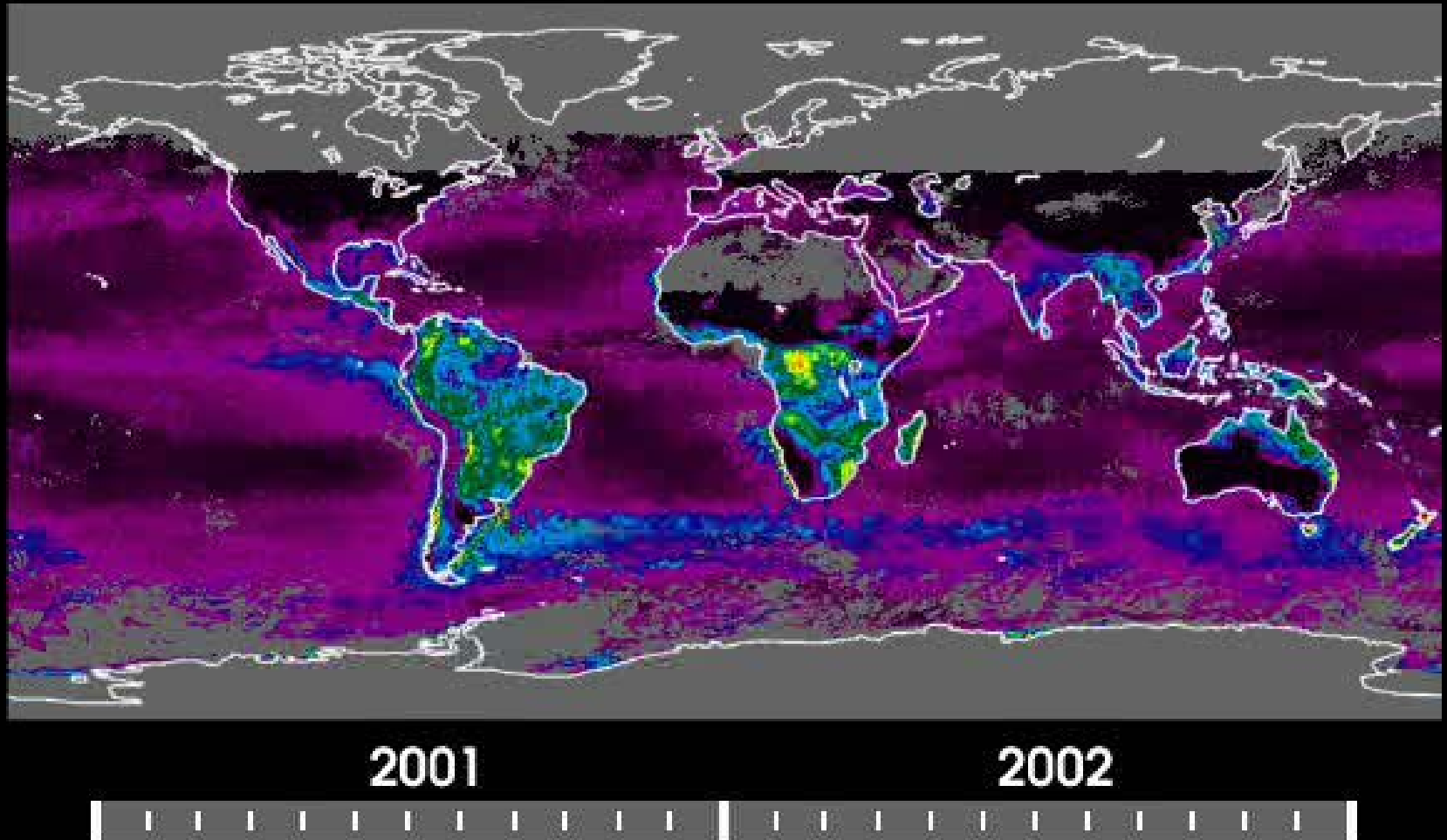






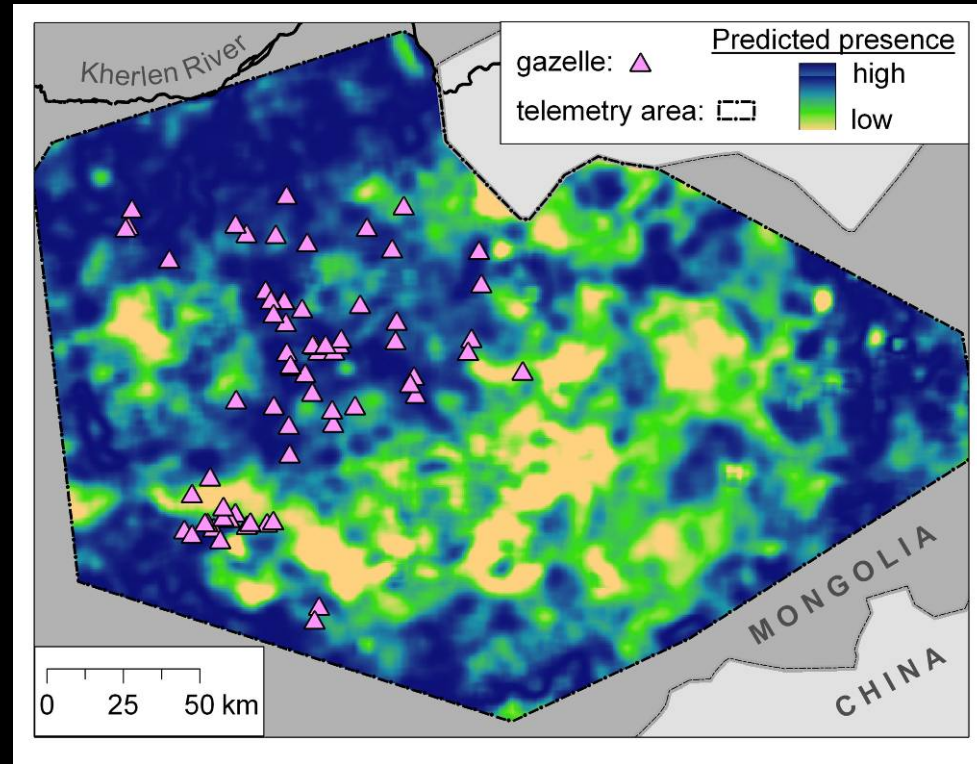
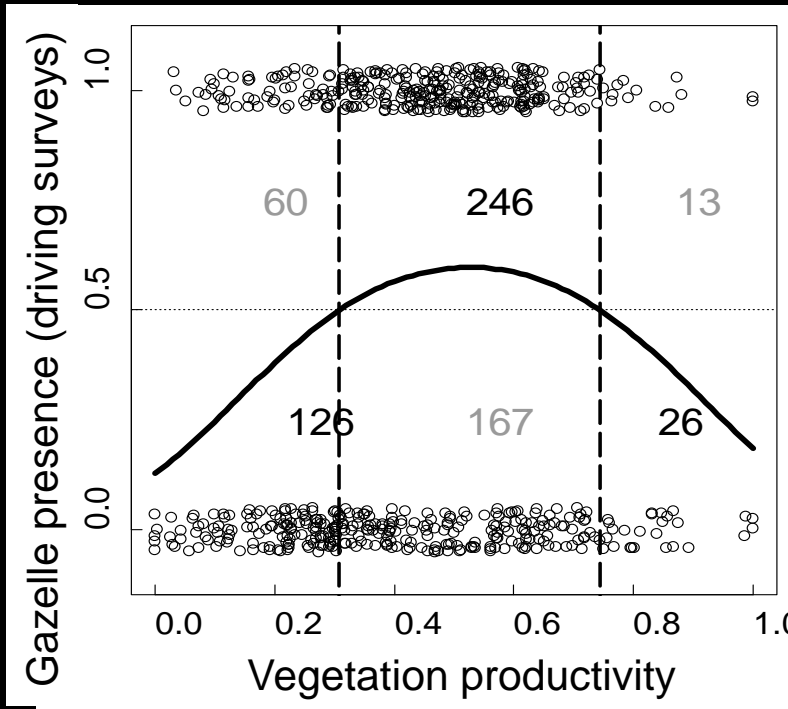
# NDVI timeseries of vegetation 'greenness'

GIMMS dataset: 8 km resolution, but 30 years of biweekly data



# Measuring resources for gazelles

Occupancy is greatest for mid-range NDVI values



# Collecting data on movement & habitat use

## Steps to Field Project



# Collecting data on movement & habitat use

## Steps to Field Project

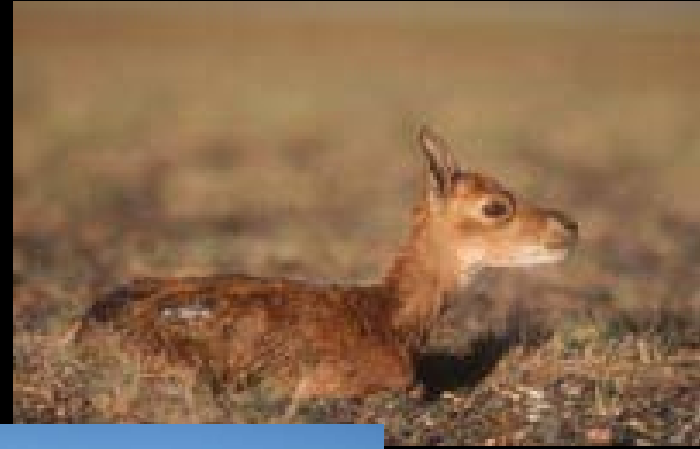
- 0) Theoretical ecologist applies for animal care and use permit



# Collecting data on movement & habitat use

## Steps to Field Project

### 1) Put Satellite Collars on Gazelles



# Collecting data on movement & habitat use

## Steps to Field Project

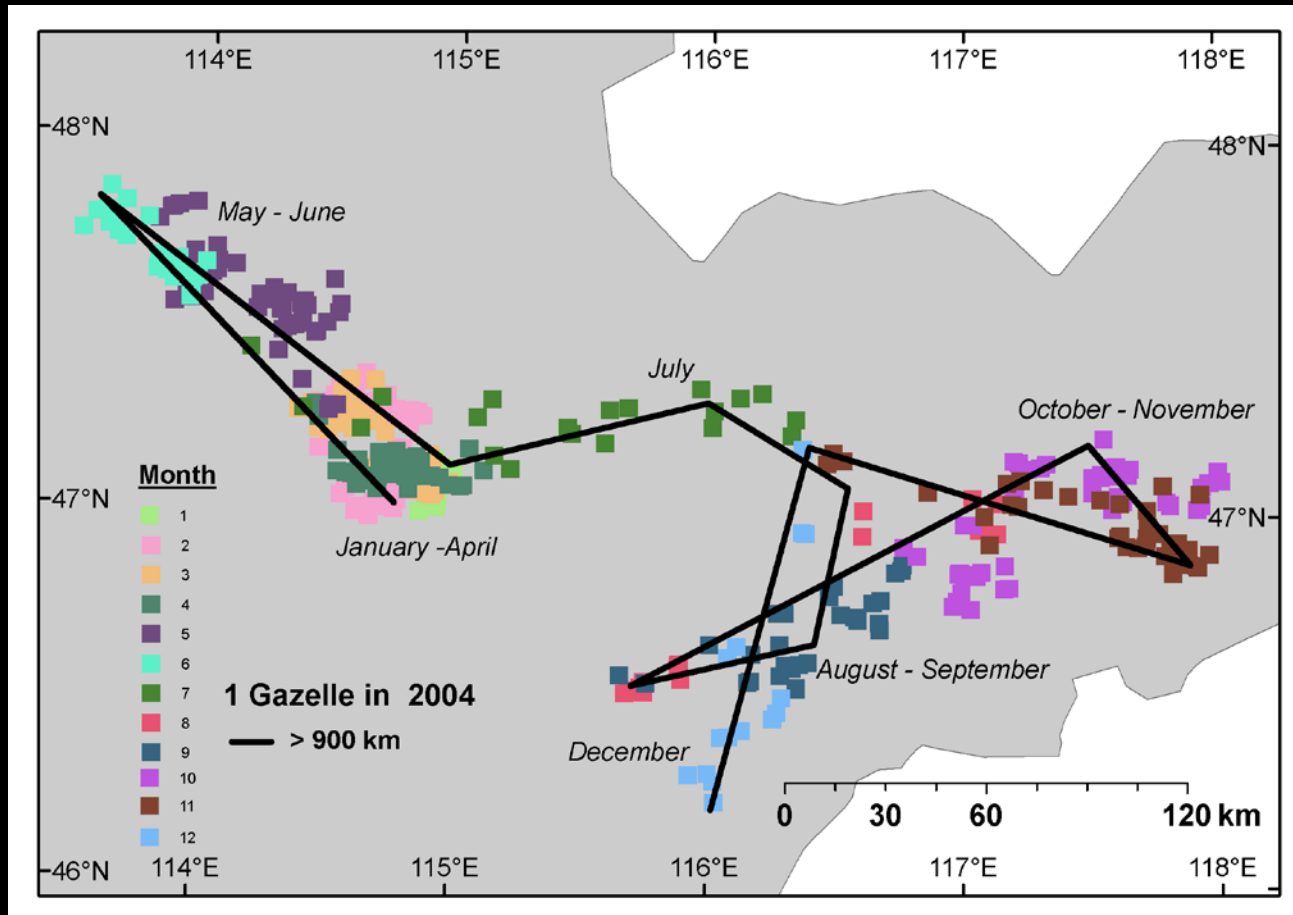
- 1) Put Satellite Collars on Gazelles
- 2) Read Email from Gazelles



# Collecting data on movement & habitat use

## Steps to Field Project

- 1) Put Satellite Collars on Gazelles
- 2) Read Email from Gazelles





# Characterizing Movement of Mongolian Gazelles

Serengeti - Mara  
Ecosystem

~400,000 wildebeest

25,000 km<sup>2</sup>

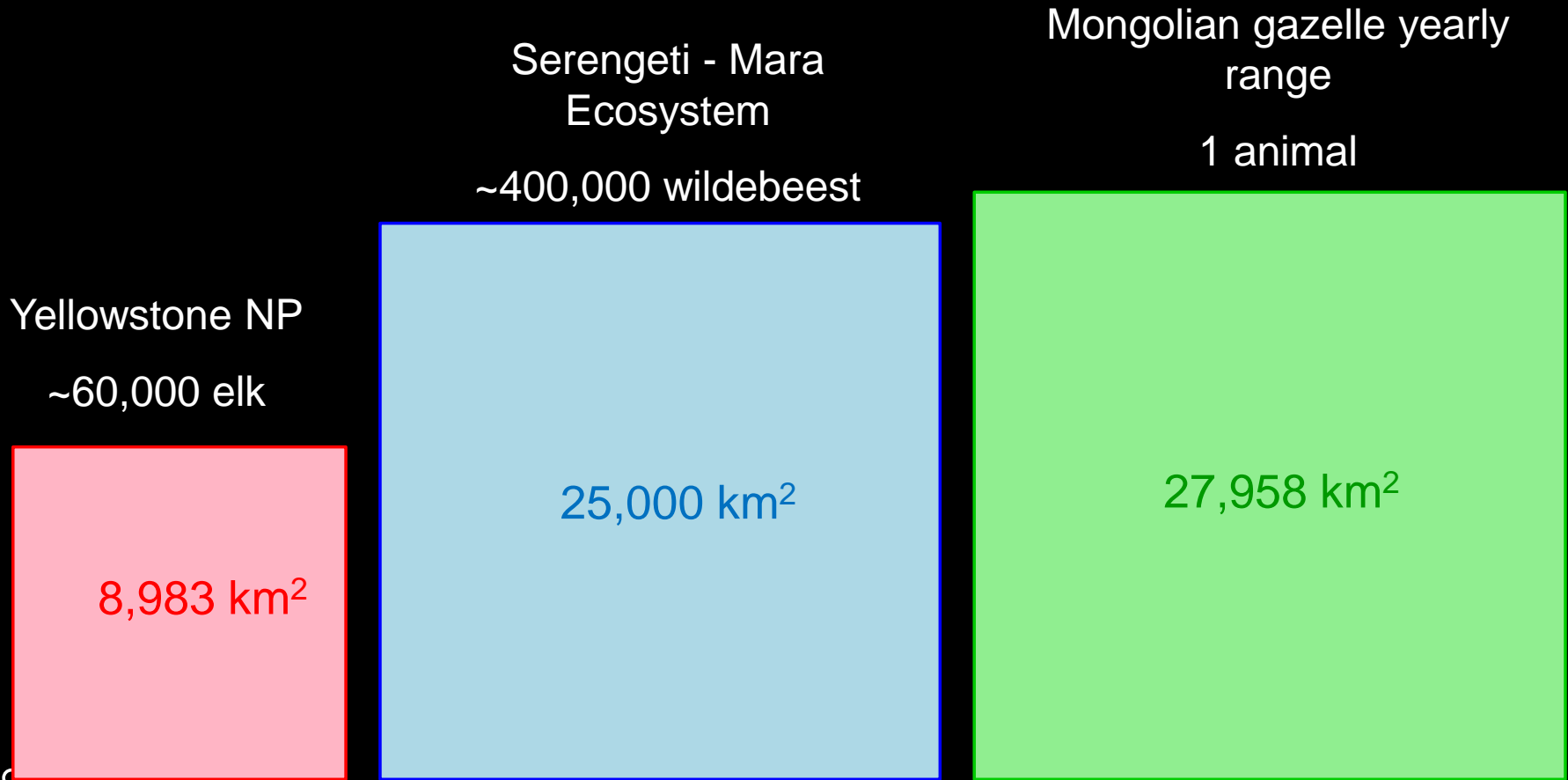
Yellowstone NP

~60,000 elk

8,983 km<sup>2</sup>

c

# Characterizing Movement of Mongolian Gazelles



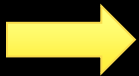
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# Dynamics of population distributions: Multispecies comparison

## Data: Four different ungulate species:

### - **Caribou of the Porcupine herd**

*(Craig Nicolson, UMASS & Porcupine Caribou Technical Committee)*

### - **Mongolian gazelle**

*(UMASS, WCS, UMD, NZP)*

### - **Patagonian guanaco**

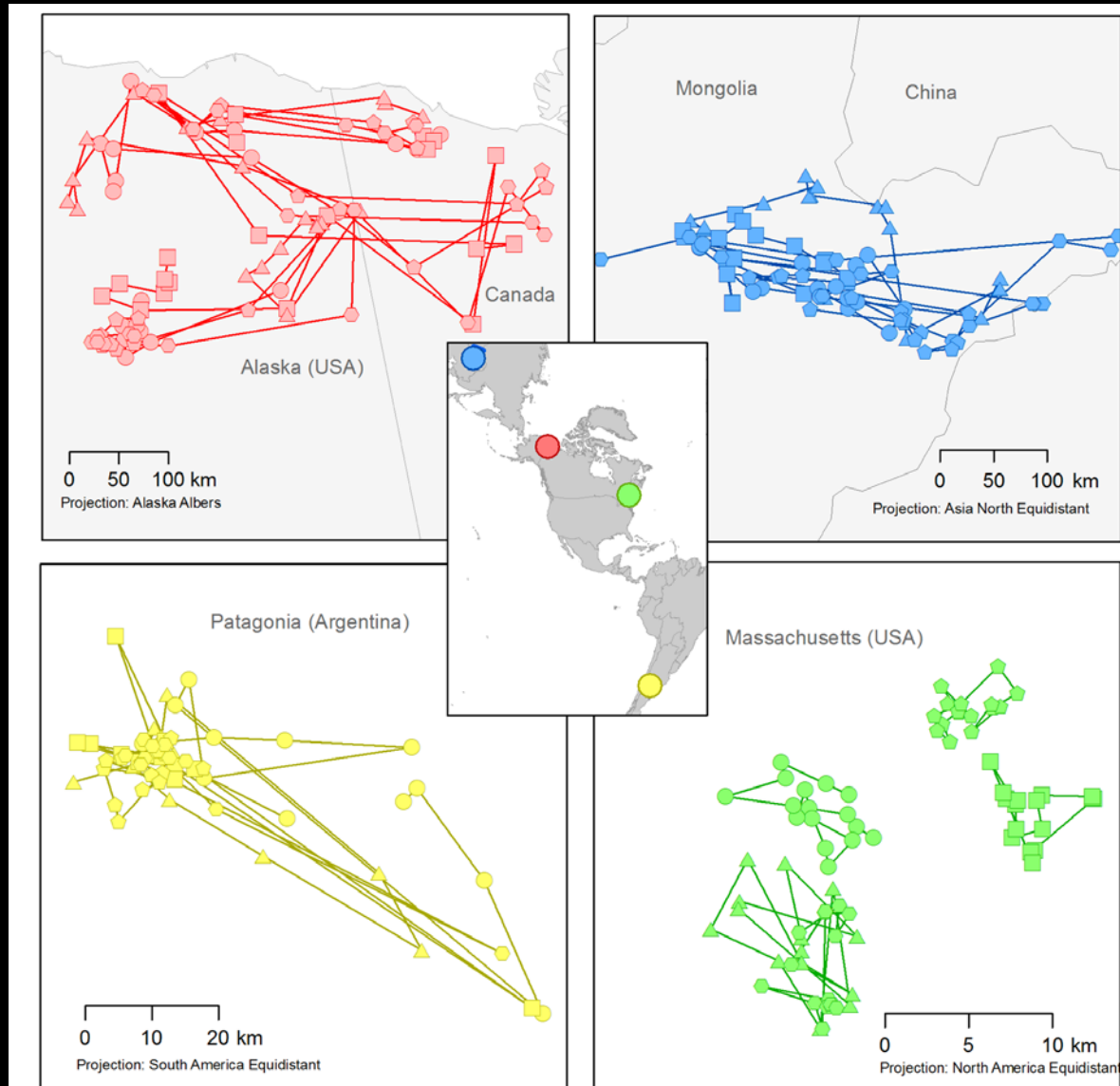
*(Andres Novaro, Argentine Research Council)*

### - **Moose in Massachusetts**

*(David Wattles, Stephen DeStefano, UMASS)*

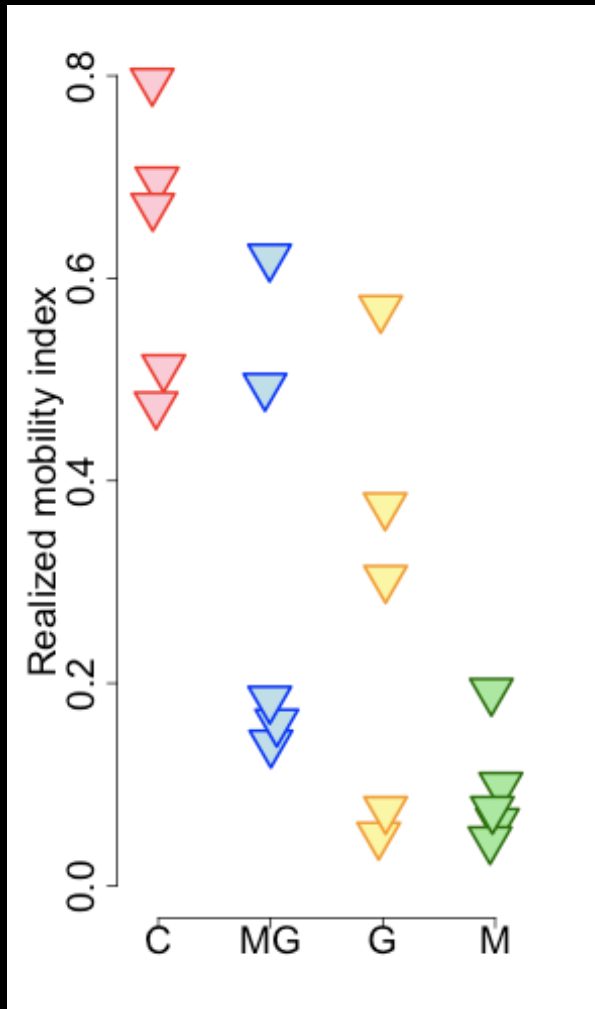
# Dynamics of population distributions: Multispecies comparison

Notice  
scales !



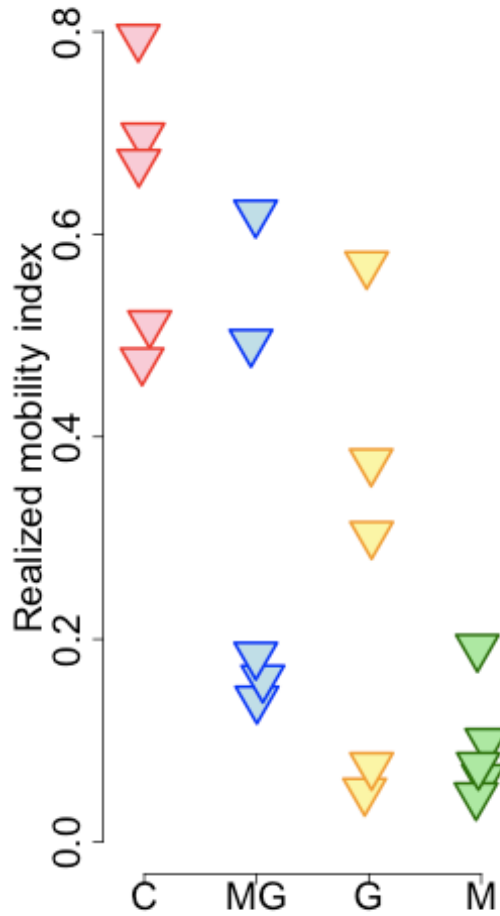
# Dynamics of population distributions: Multispecies comparison

Realized mobility

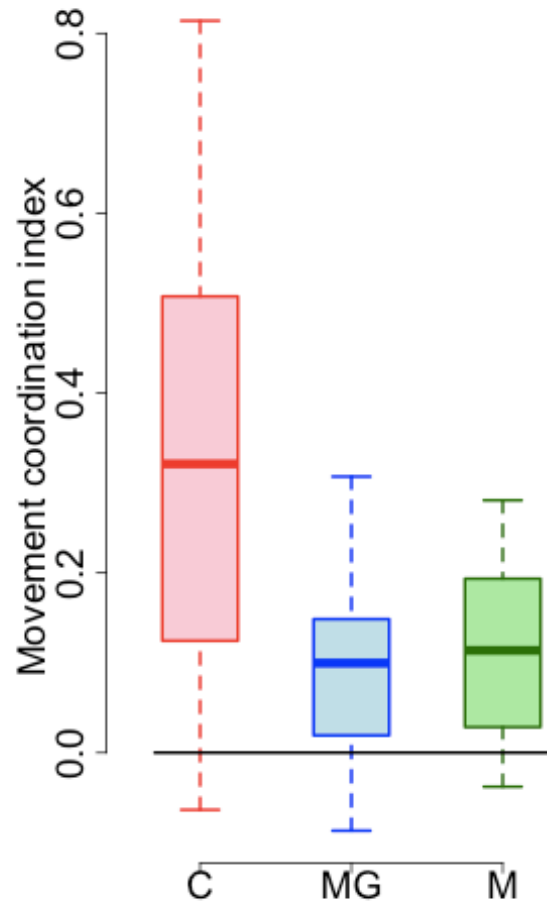


# Dynamics of population distributions: Multispecies comparison

Realized mobility

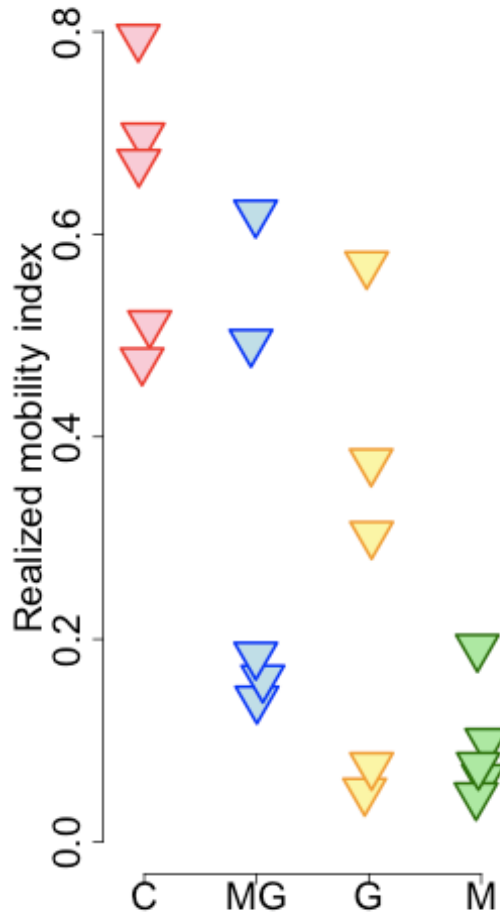


Movement coordination

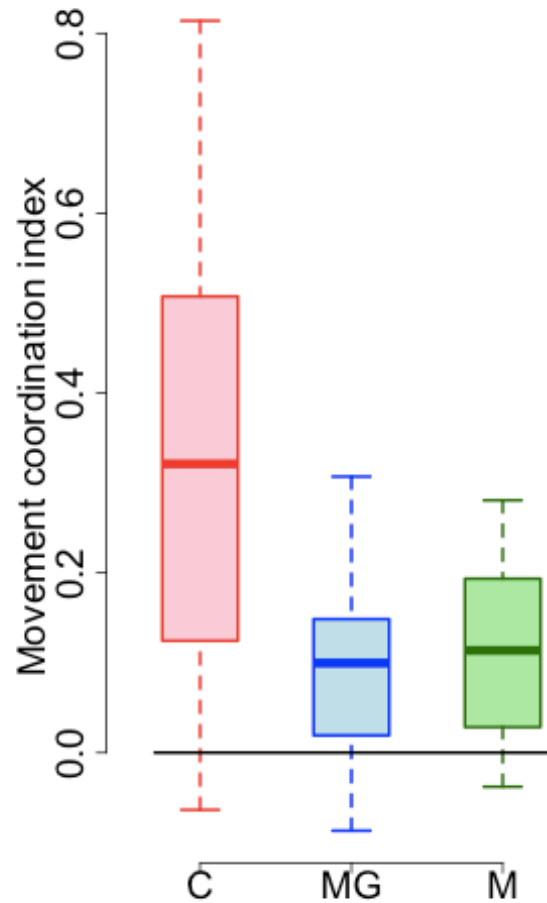


# Dynamics of population distributions: Multispecies comparison

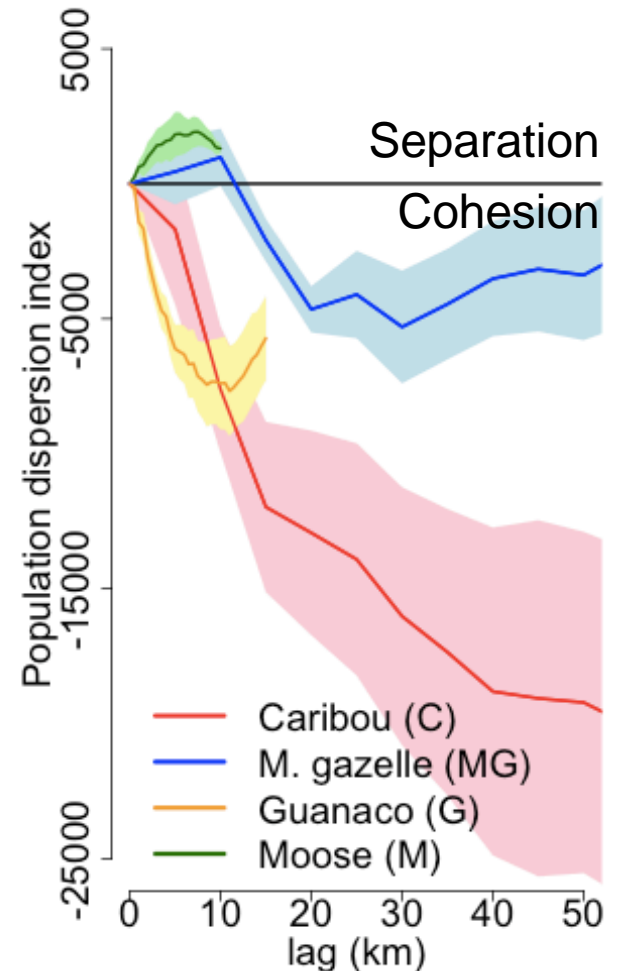
Realized mobility



Movement coordination

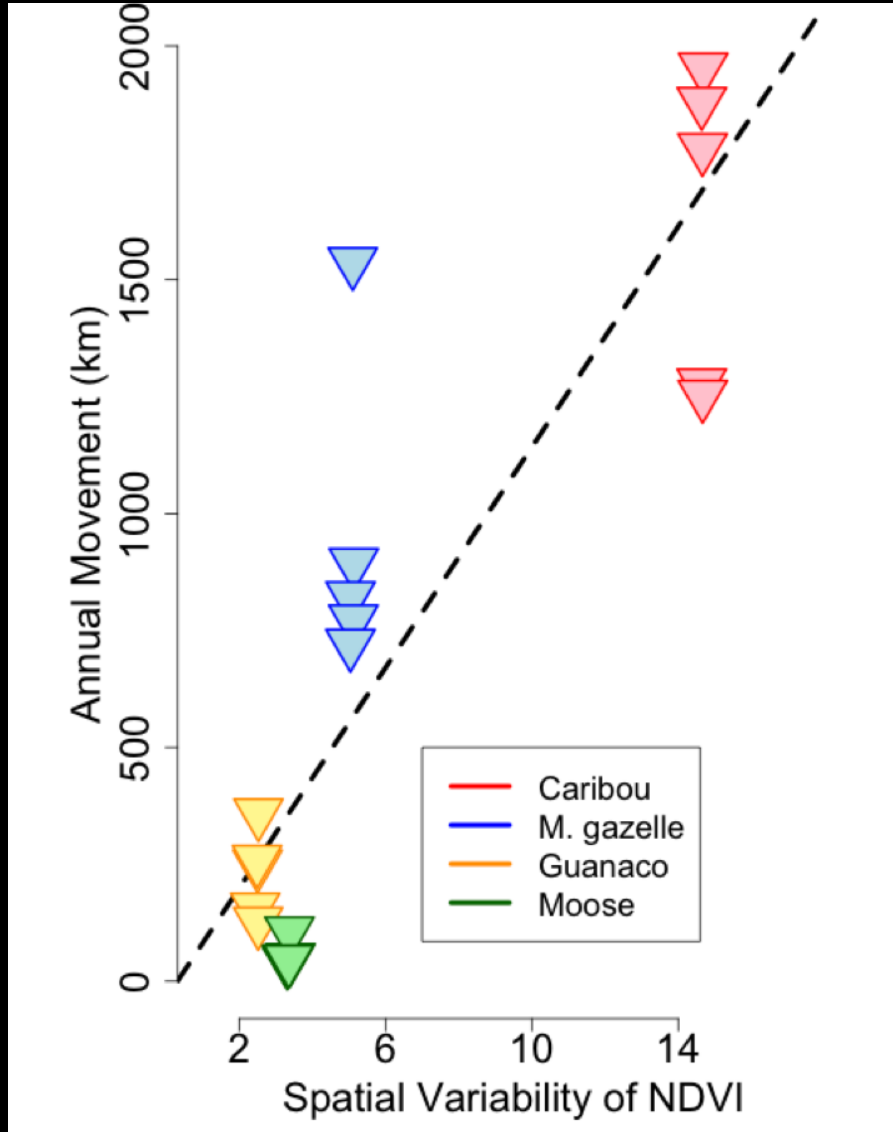


Population dispersion

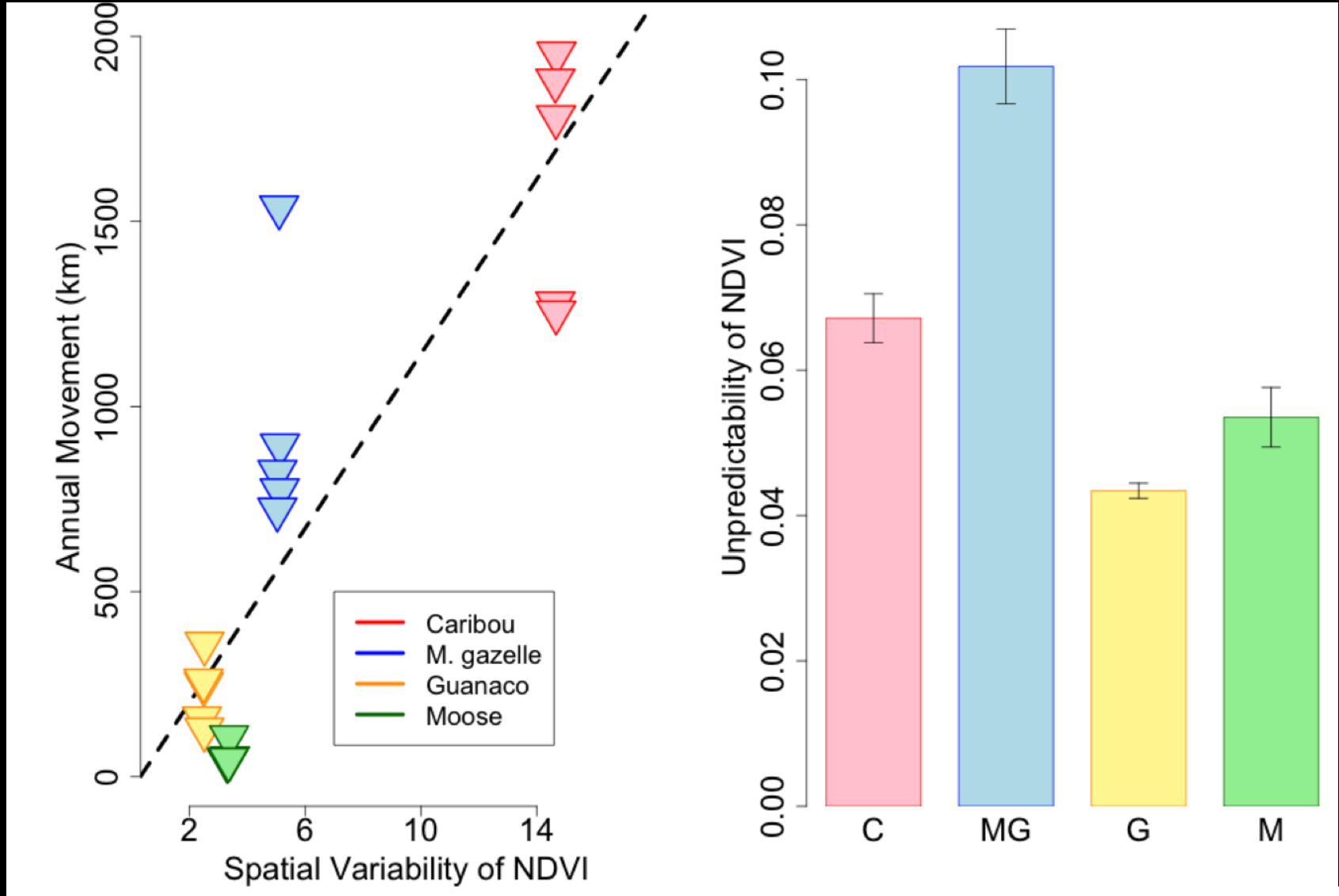




# Relating Dynamics of Population Distributions to Dynamics of Landscapes

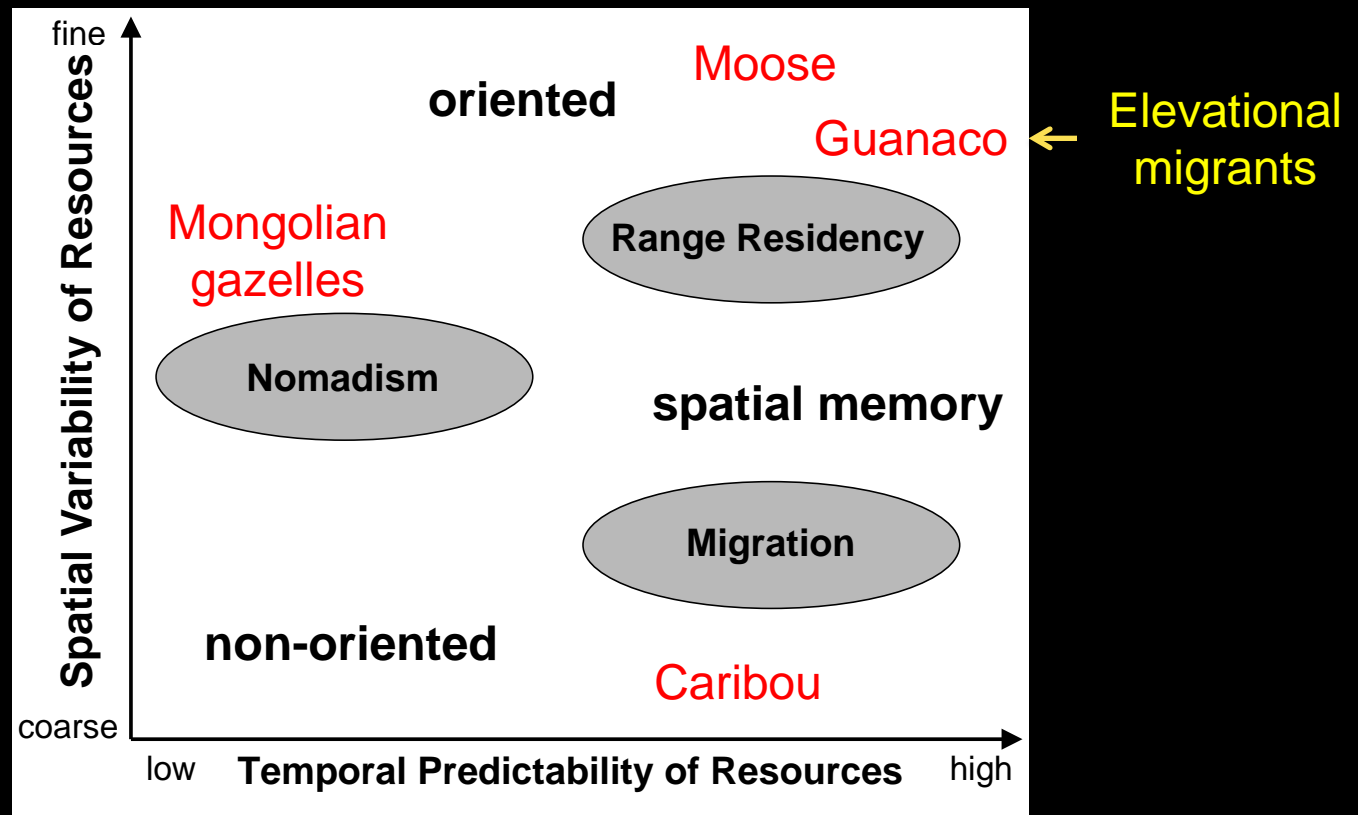


# Relating Dynamics of Population Distributions to Dynamics of Landscapes



# Resource landscapes:

- 1) Determine the effectiveness of alternative movement mechanisms
- 2) Lead to different emergent population-level distribution patterns



# Outline :

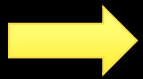
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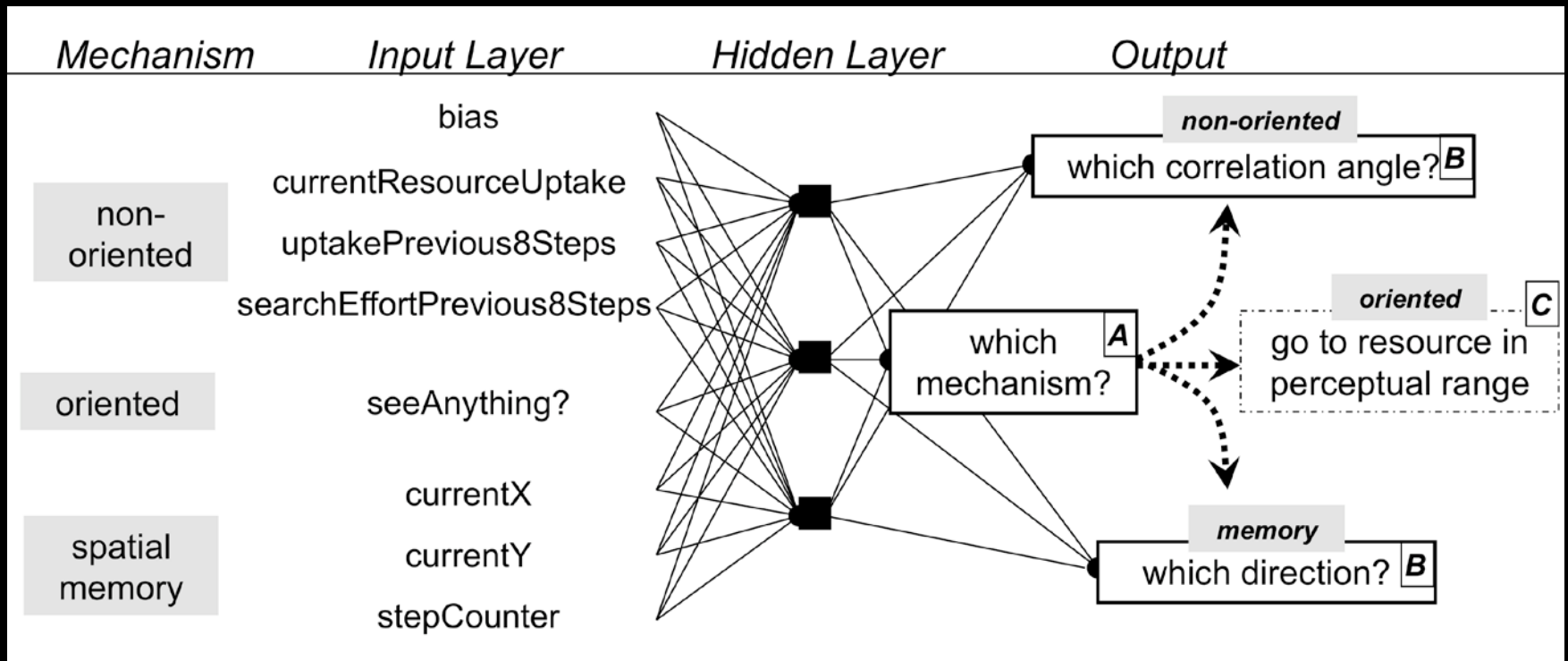
- Situation-dependent use of movement mechanisms
- Spatial memory as a navigation aid in dynamic landscapes

## Looking Forward

- Learning and Experience (Migratory Whooping Cranes)

# Individual-based Neural Net Genetic Algorithm (ING) Model

A consumer seeking resources by moving through a heterogeneous landscape ...



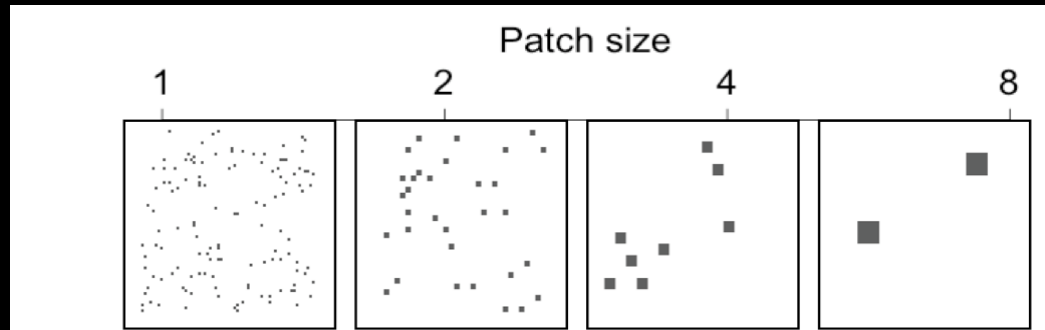
→ Designed so that individual movement mechanisms may be “turned off”

# Individual-based Neural Net Genetic Algorithm (ING) Model

Two key landscape features:

4

## 1) Patch Size



## 2) Resource Predictability

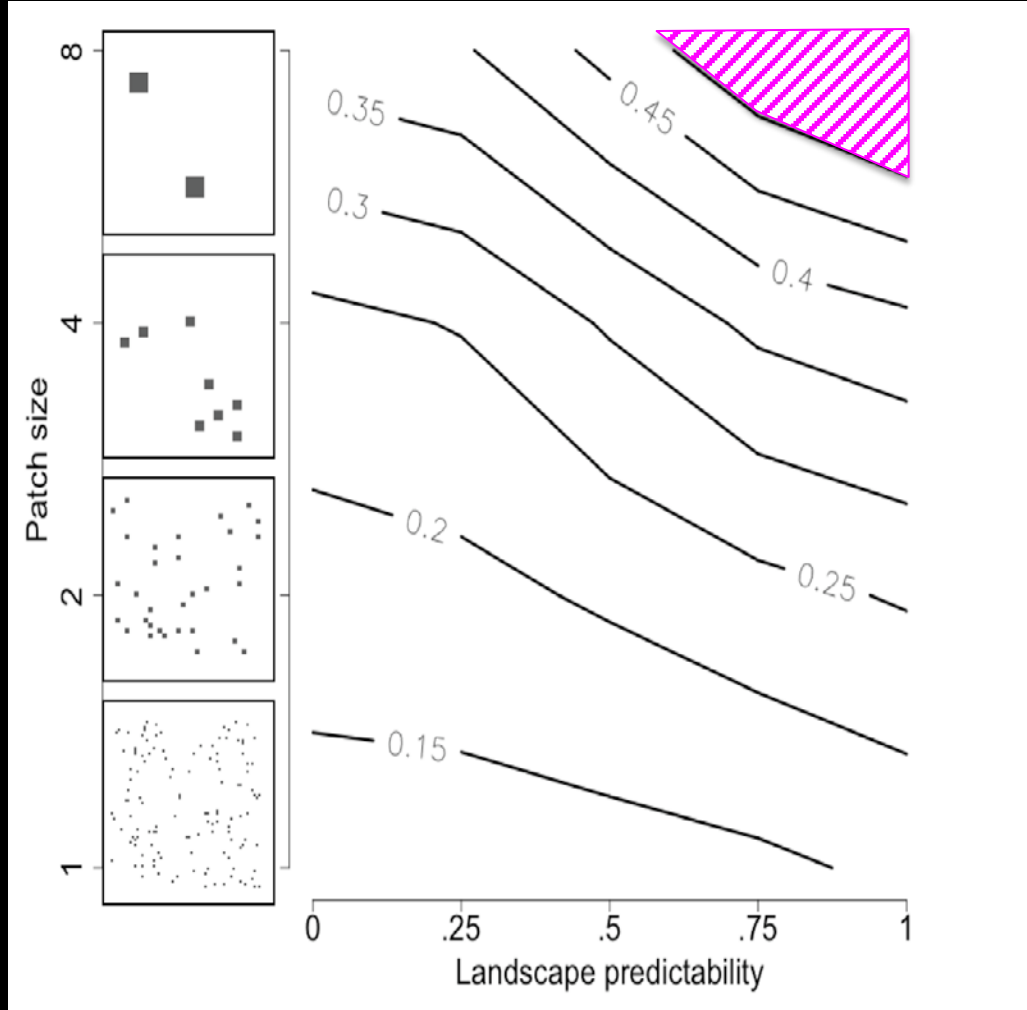
Probability Patch Does Not Move Between Generations

Foci:

- 1) Frequency
- 2) Time of use
- 3) “Relevance” of different movement mechanisms

$$\text{Relevance} = 1 - \left[ \frac{\text{efficiency}_{\text{reduced neural network}}}{\text{efficiency}_{\text{full neural network}}} \right]$$

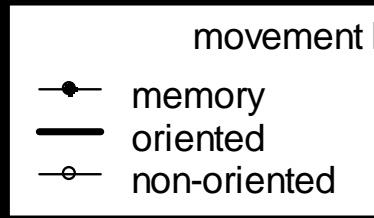
# Efficiency is greatest in predictable landscapes with large patch sizes



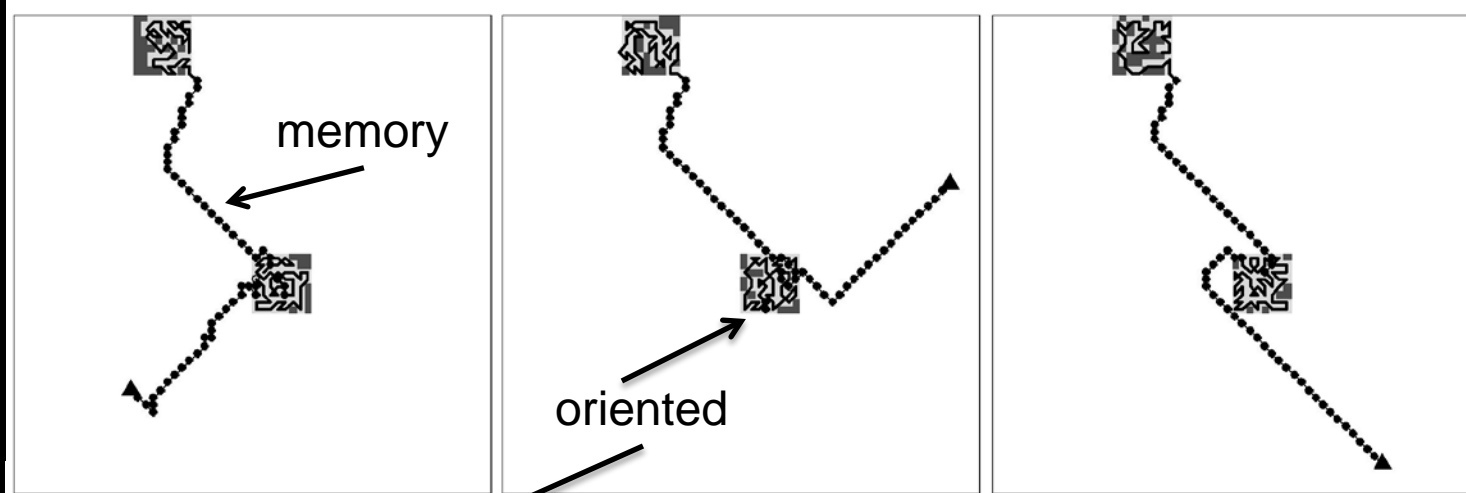
Contours are  
efficiency of  
movement

( Avg. resources per  
movement step )

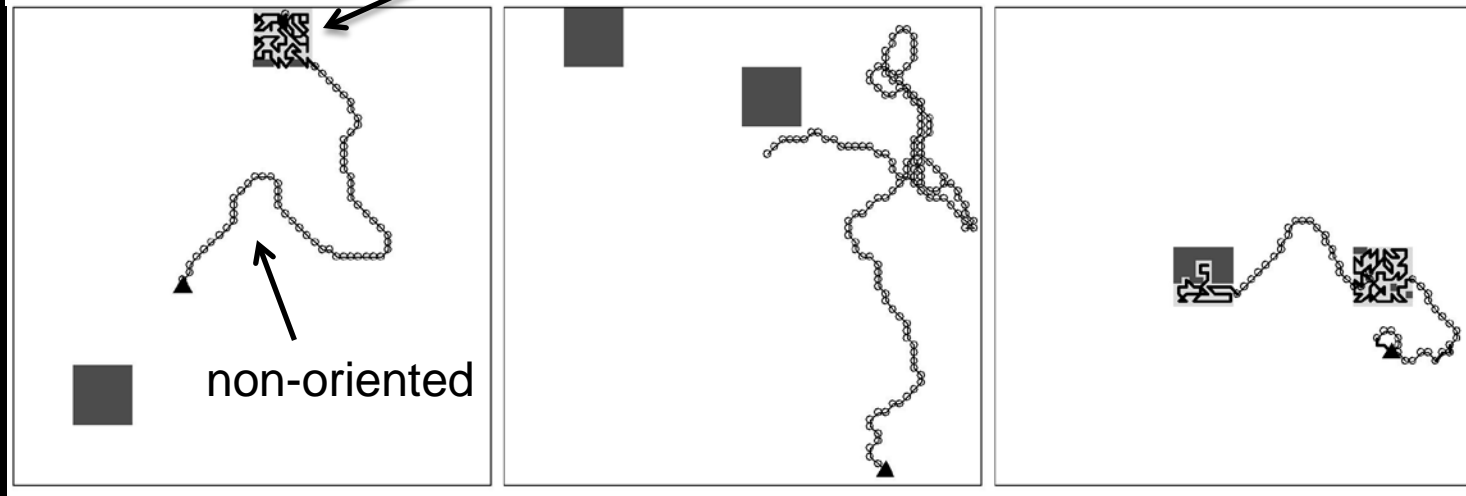
# Consumers evolved to use different mechanisms in different situations



Predictable Resources

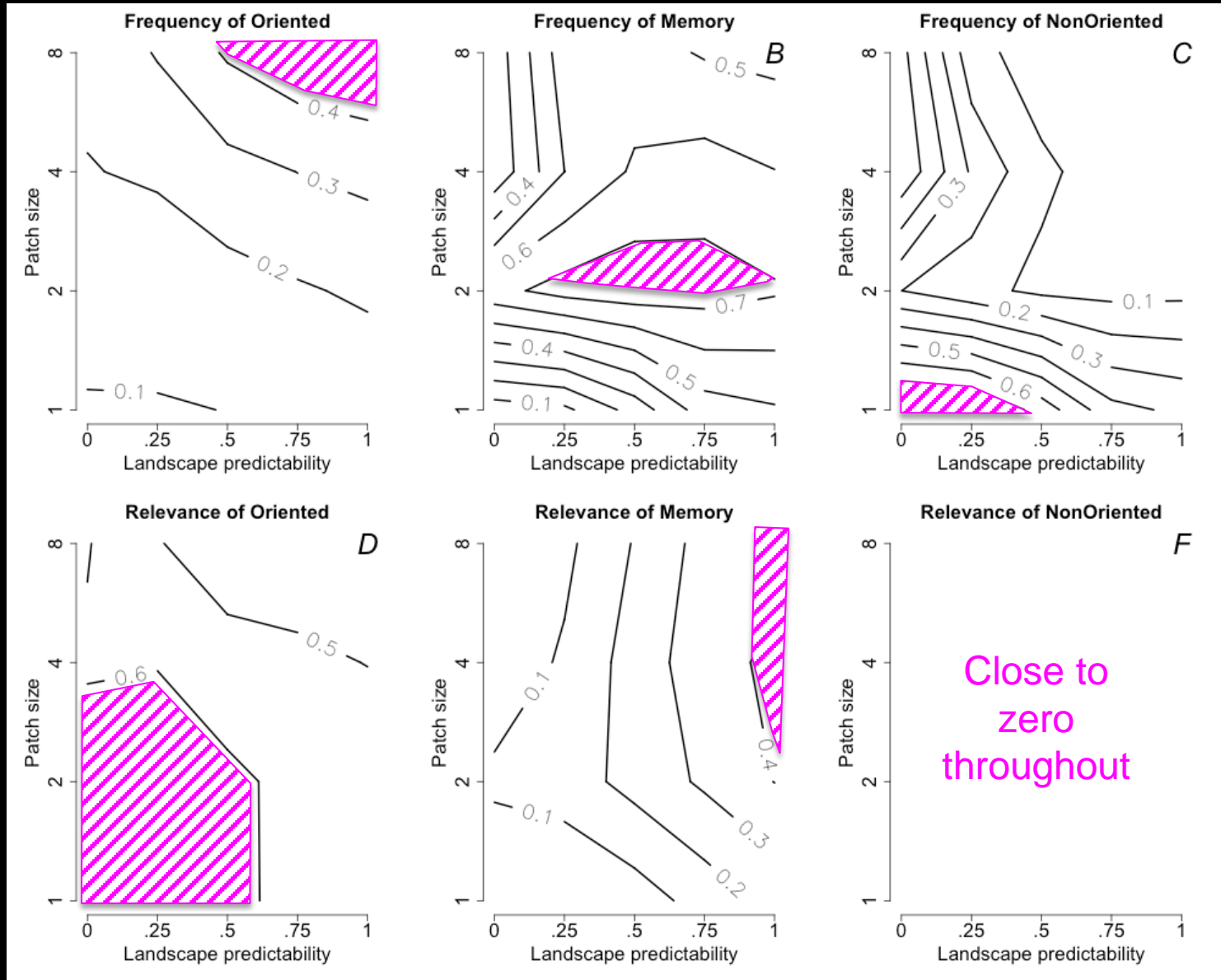


Unpredictable Resources

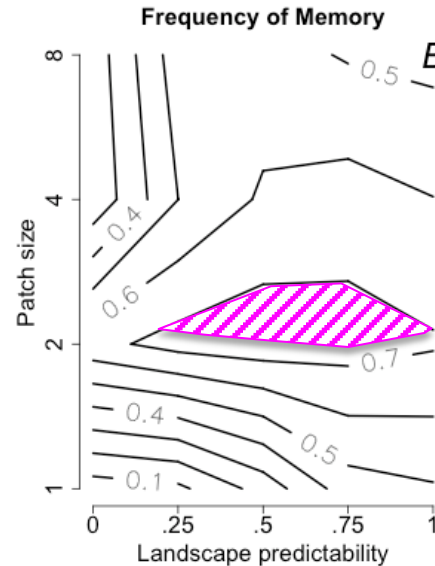




# Consumers evolved to use different mechanisms in different situations



# Consumers evolved to use different mechanisms in different situations



Most unexpected result:

Memory used extensively at intermediate patch sizes to systematically search the entire domain

Memory may contribute to 'superdiffusion' observed in many empirical systems

$$MSD = Dt^{\alpha}, \quad \alpha > 1$$

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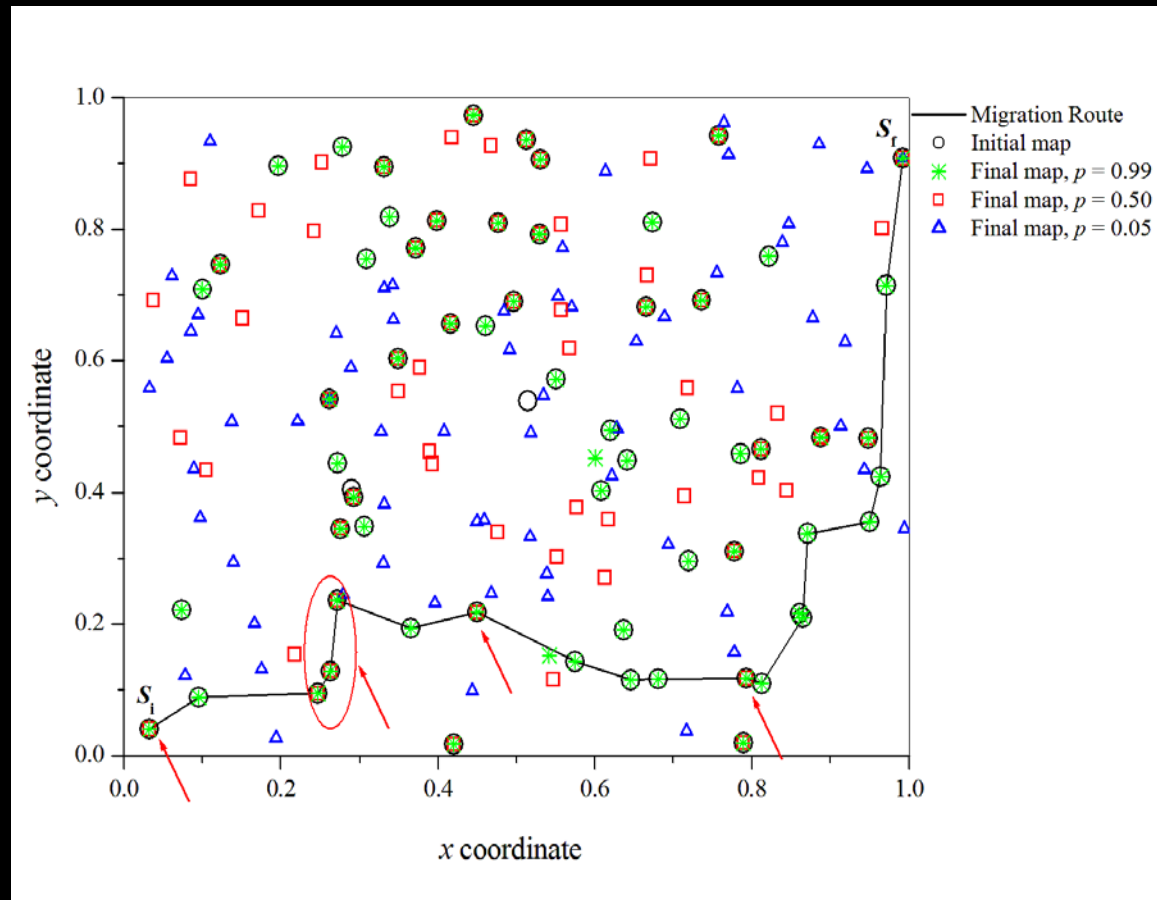
landscapes

## Looking Forward

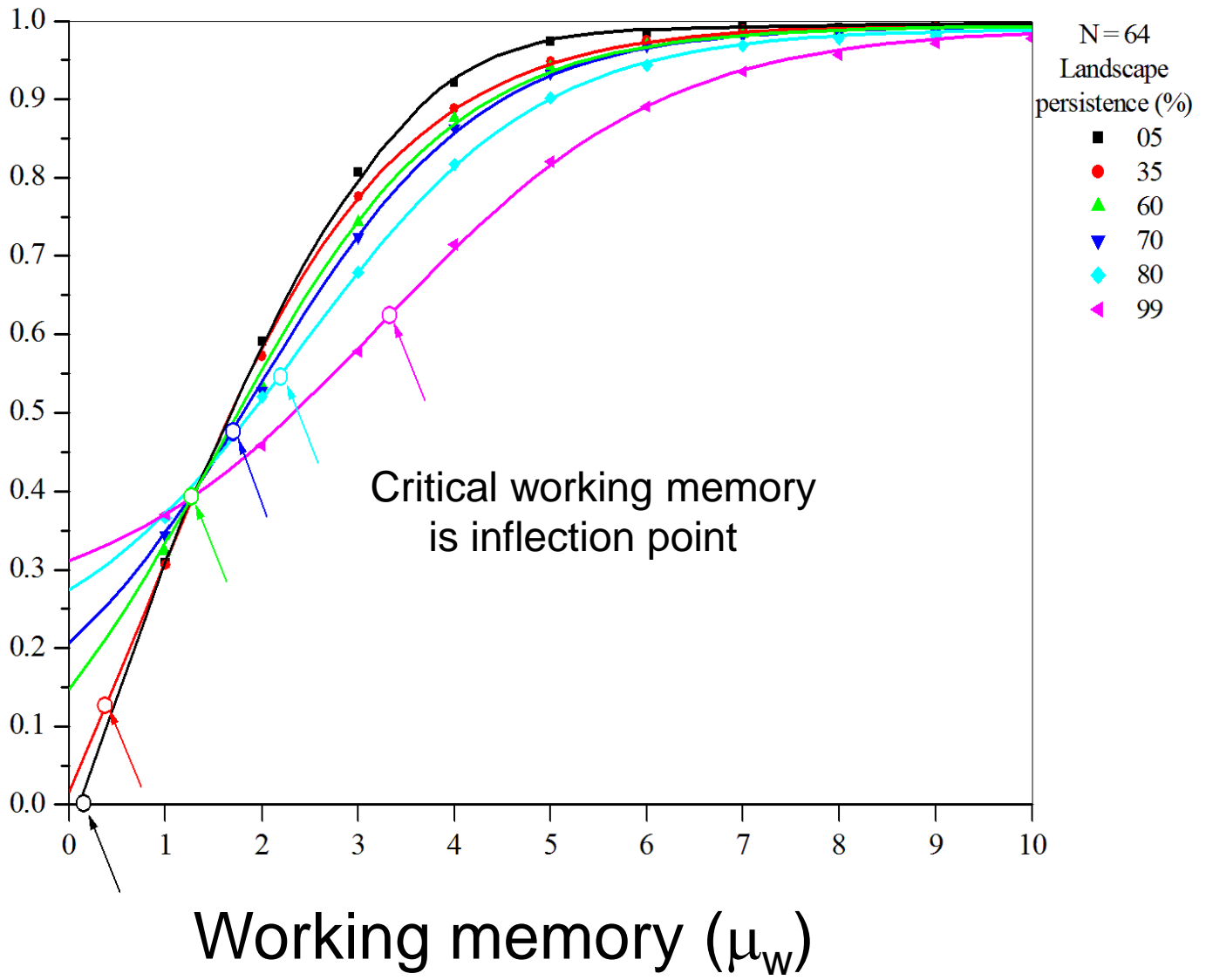
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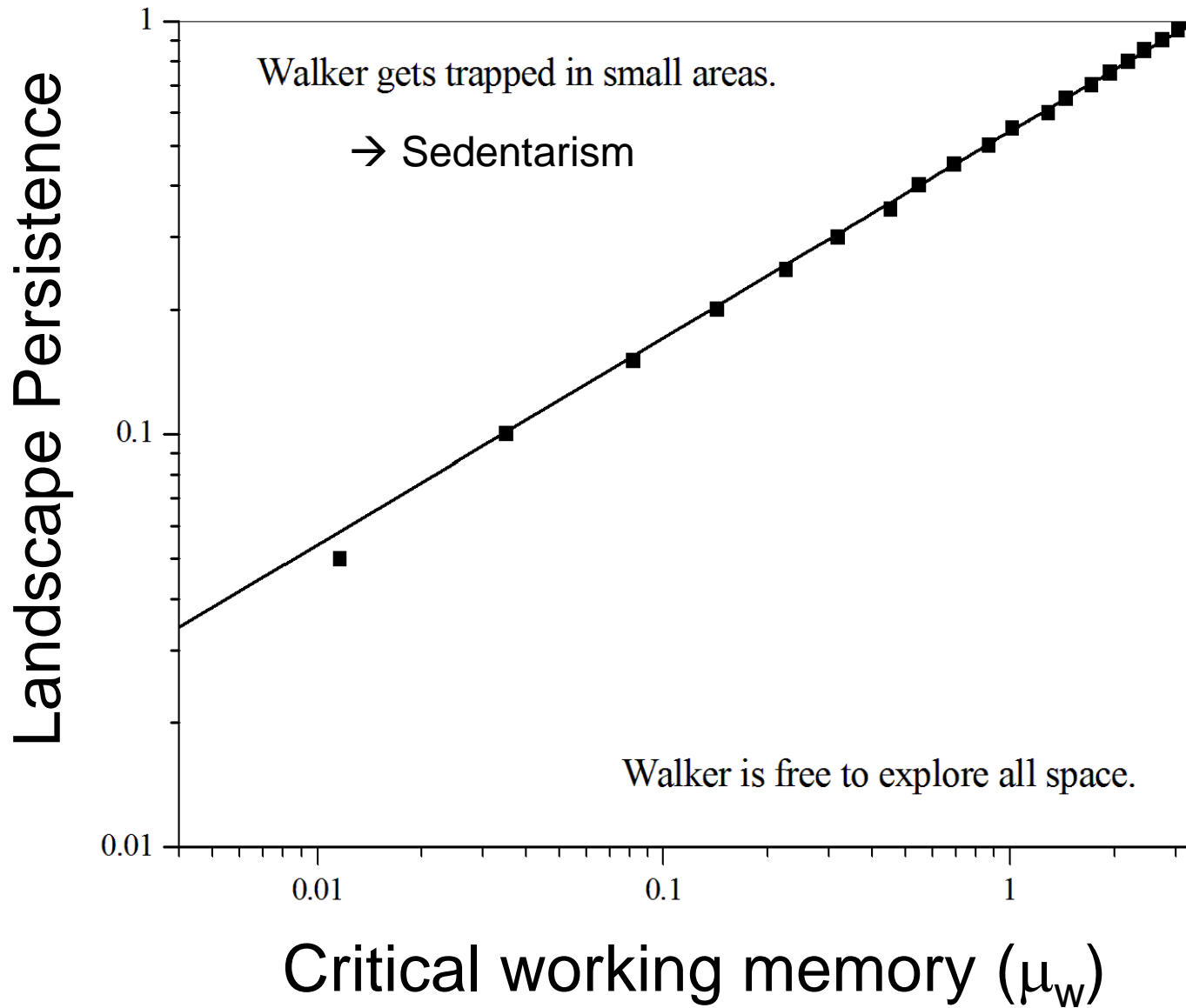
# Navigating through a dynamic, disordered landscape

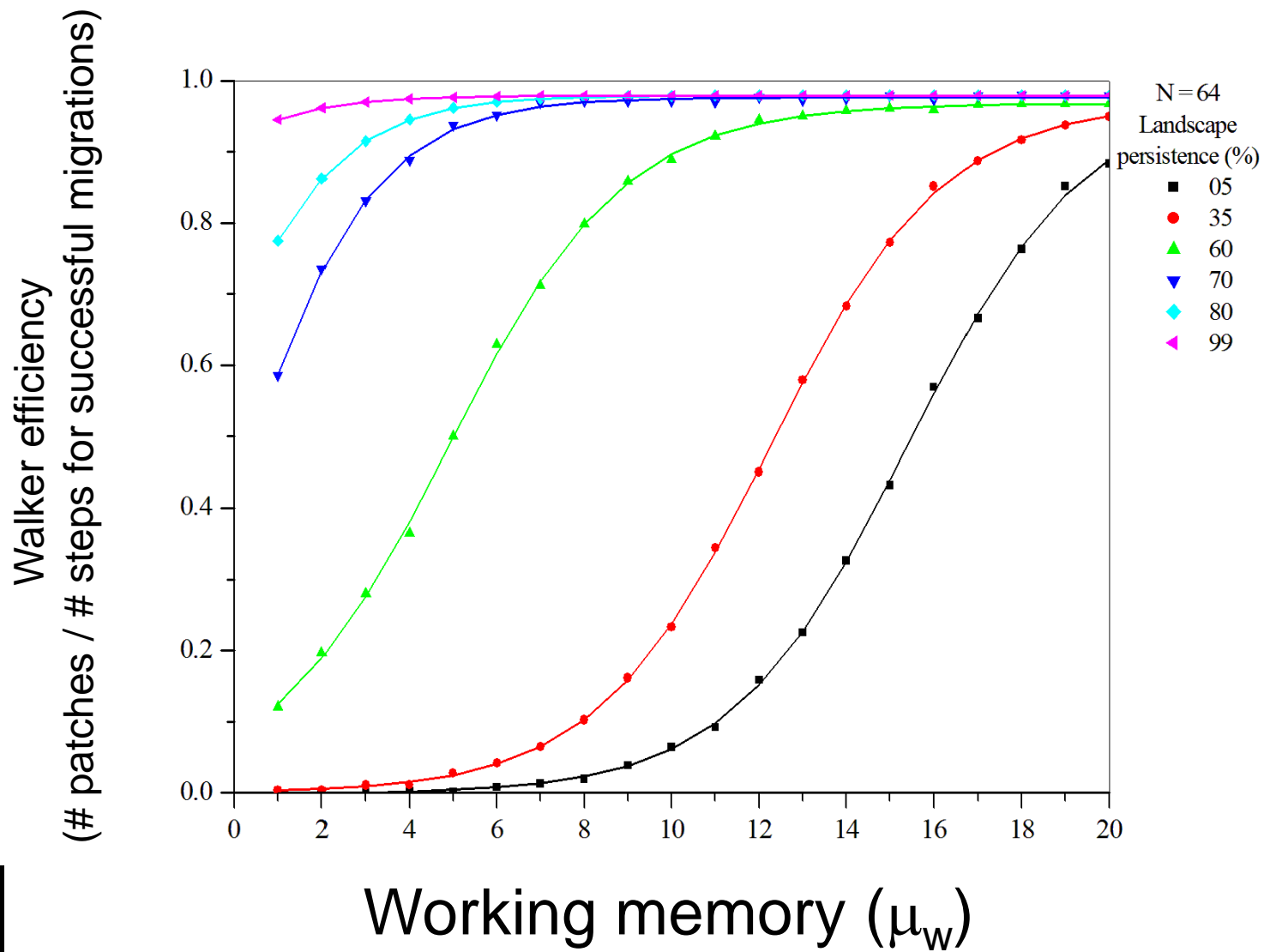
- Habitat patches, which can be transient
- Reference memory (shortest path across)
- Working memory (most recent  $n$  patches)
- Rule 1: If on migration route, go to next patch in reference memory, provided it exists
- Rule 2: Go to the nearest patch not in the working memory

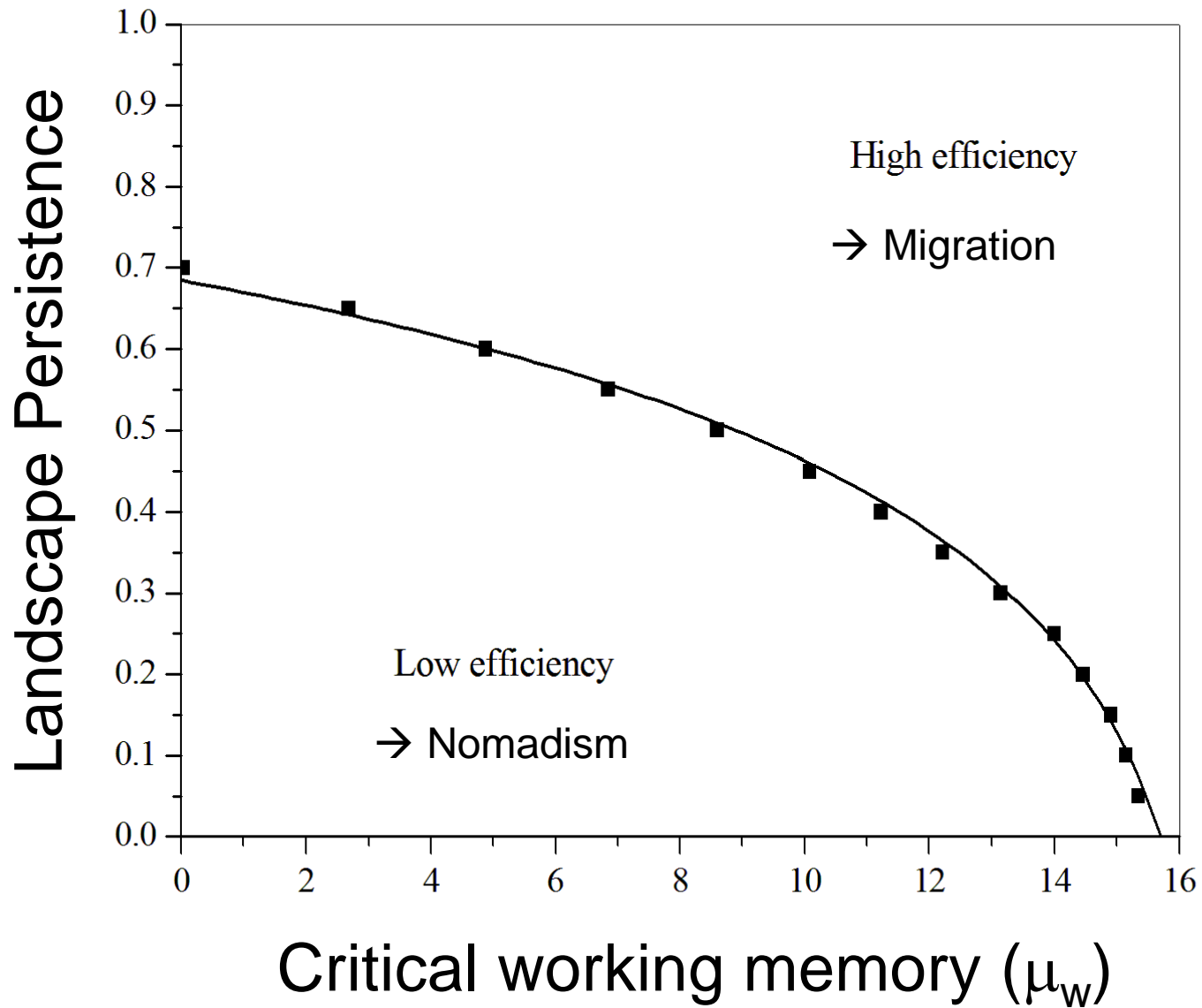


Fraction of times walker  
successfully migrates

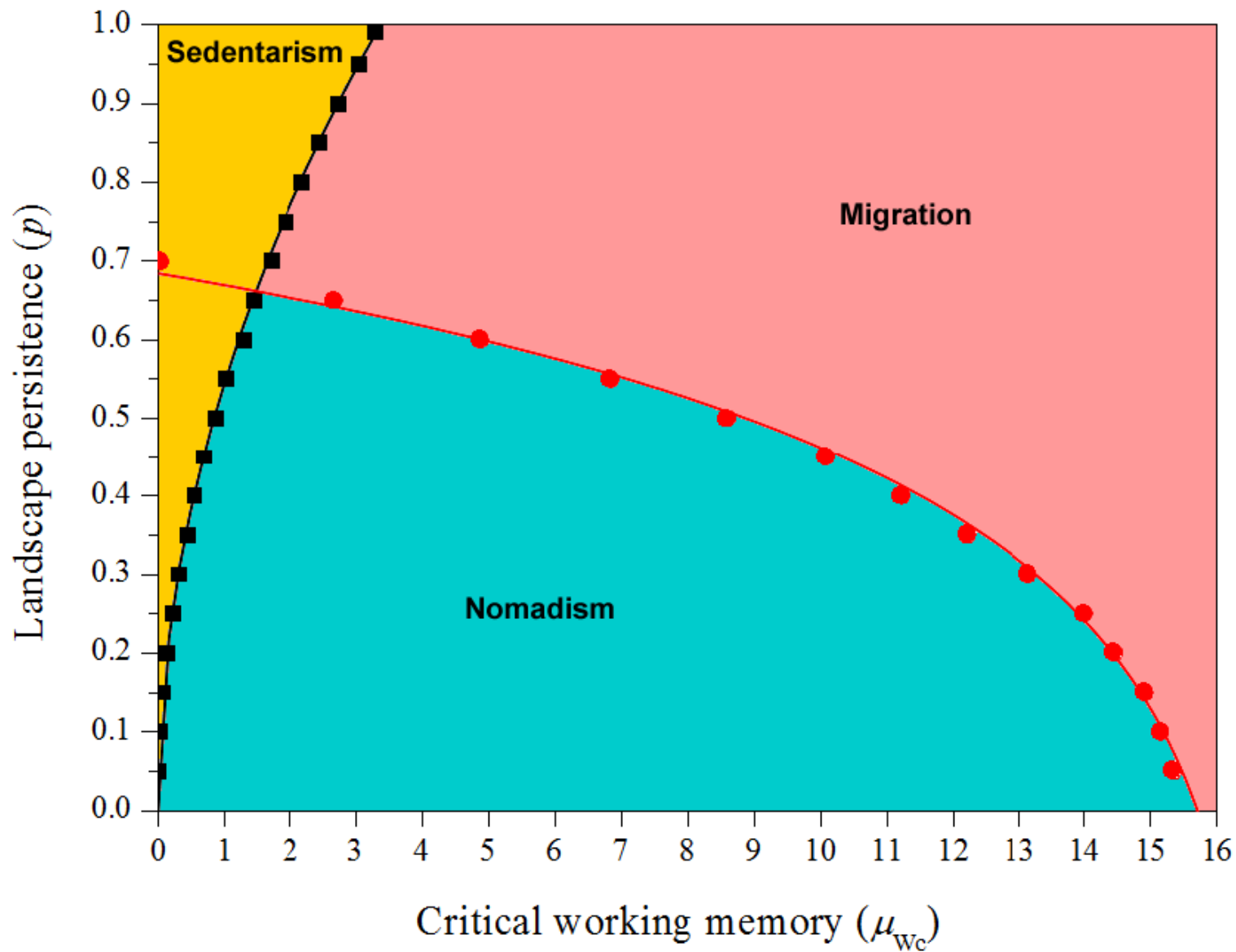












## Collaborators:

- Volker Grimm (UFZ, Germany)
- Kirk Olson (Wildlife Conservation Society)
- Peter Leimgruber (Smithsonian)
- Todd Fuller (Univ. Mass.)
- Craig Nicolson (Univ. Mass.)
- Andres Novaro (Argentine Research Council)
- Maria Bolgeri (Argentine Scientific Agency)
- Gunnar Dressler (UFZ, Germany)
- Justin Calabrese (Smithsonian)
- David Wattles (Univ. Mass. / USGS)
- Steven DeStefano (Univ. Mass. / USGS)
- Devatuyla Kavathekar (Univ. Maryland)
- Juliana Berbert (Univ. Estadual Paulista, Brazil)
- Roberto Kraenkel (Univ. Estadual Paulista, Brazil)
- Jim Tucker (NASA)

## Funding:

- US National Science Foundation
  - Ecology Panel
  - Advances in Bioinformatics Panel

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### Whooping Crane Migration Route



## Whooping Crane (*Grus americana*)

- tallest bird in North America
- one of only 2 crane species in North America
- long lived >20 years in the wild
- ~ 70 mating pairs in Wood Buffalo NP



## Whooping Crane Migration Route



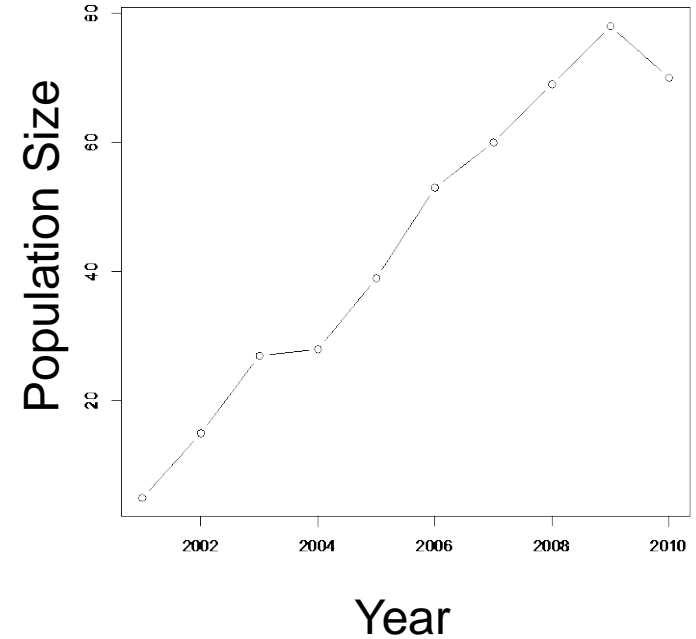
## Whooping Crane (*Grus americana*)

“Experimental” eastern flock migrates from Wisconsin to Florida



## Eastern Flock of Whooping Cranes

- Not yet reproducing in wild
- Population augmented from captive breeding
- Captive birds don't instinctively know how to migrate, so they must be taught ...





## Eastern Flock of Whooping Cranes

- Unique opportunities for studying long distance movements

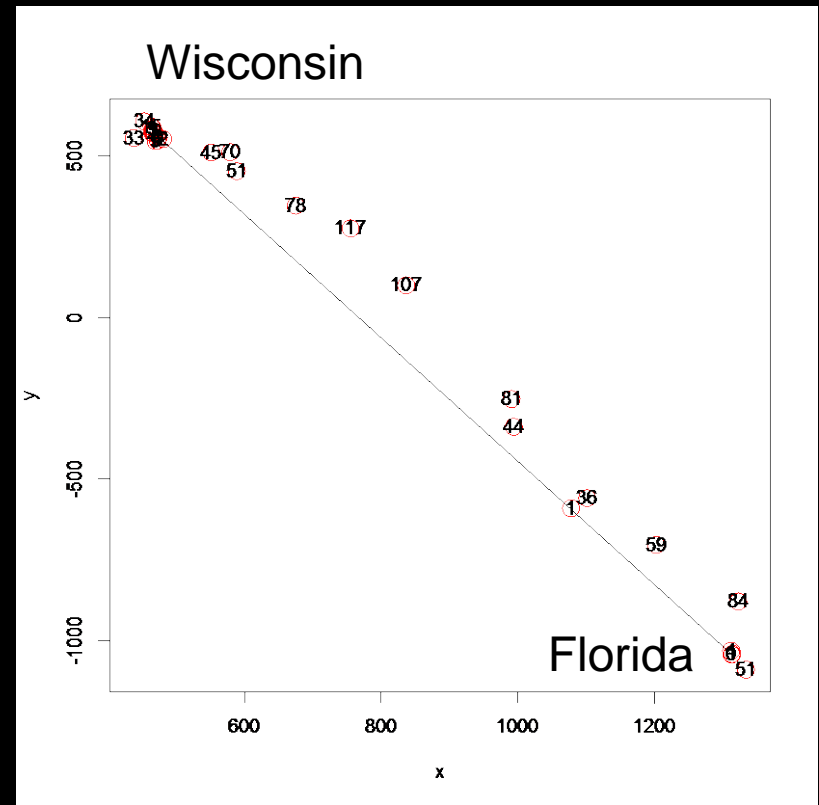


- Individuals trained in controlled ways, and tracked over many years:
  - *Information on learning (age, group composition)*
- Human – controlled breeding :
  - *Known pedigrees*
- **Tease apart genetics from environmental influences (work in progress / not today)**



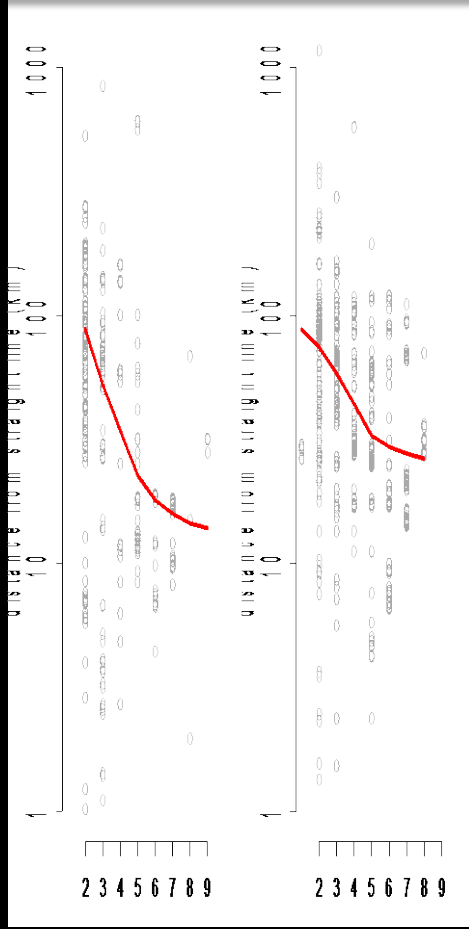
# Quantifying migratory movements

- First southbound flight: trained by ultralight aircraft
- Subsequent flights (N and S) : birds only, individually or in groups
- Intense monitoring (and GPS)
  - give spatiotemporal details of each bird's migration
- Measure:
  - Departure/ arrival dates
  - Trip duration
  - Deviation from straight line
- How do cranes' migratory journeys change across years ?



# Experience brings efficiency: older birds fly direct

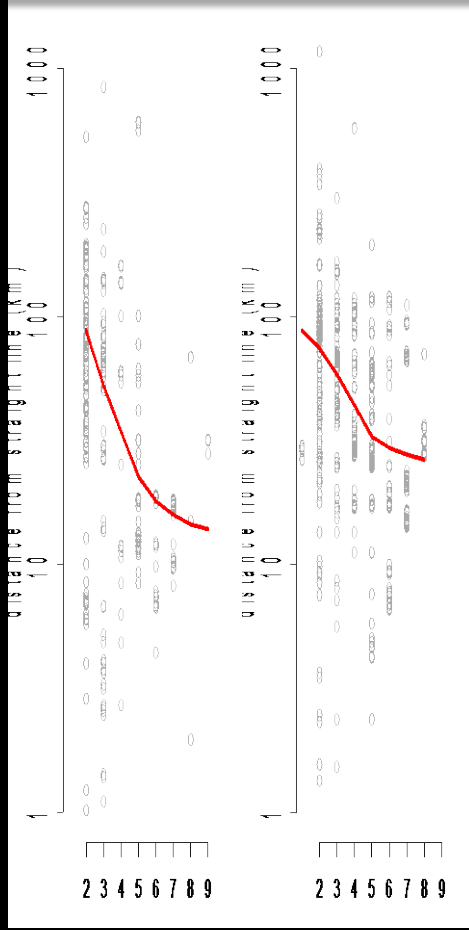
Cumulative Deviation from Straight Line (km)



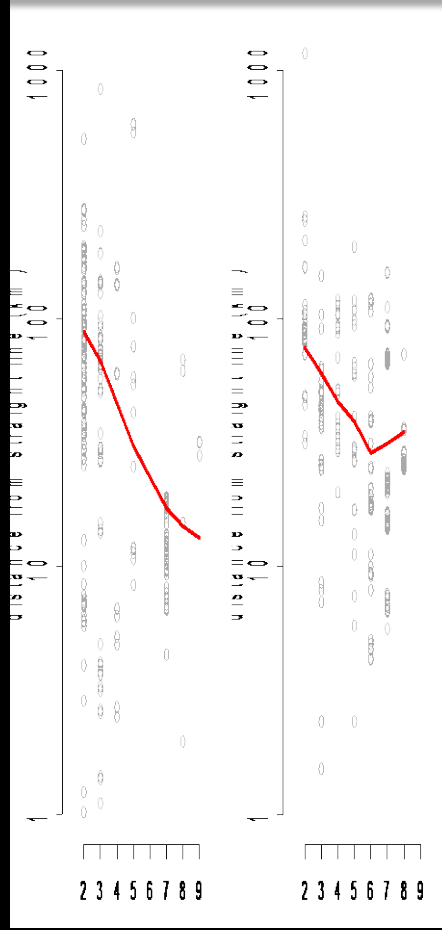
Individual Age

# Experience brings efficiency: older birds fly direct

Cumulative Deviation from Straight Line (km)



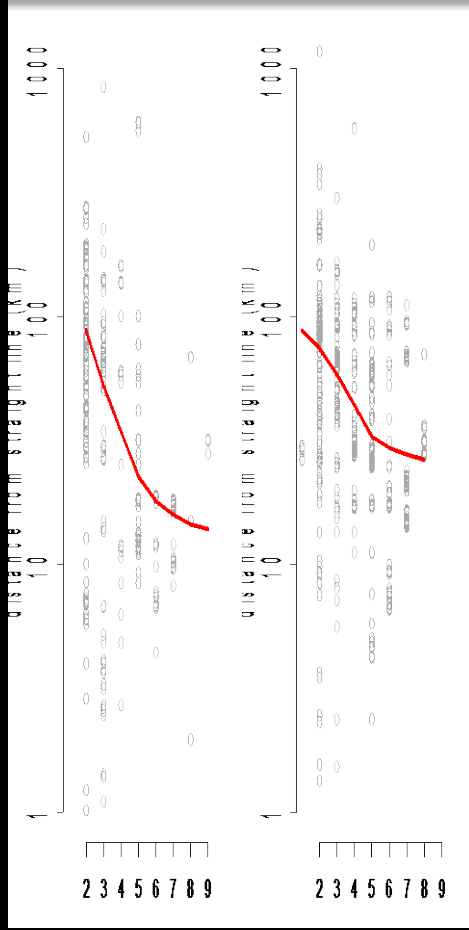
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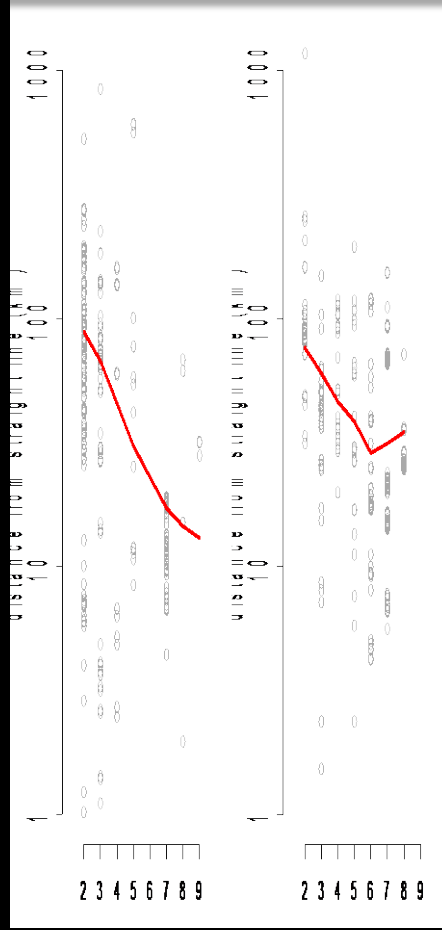
Oldest Individual  
in group

# Experience brings efficiency: older birds fly direct

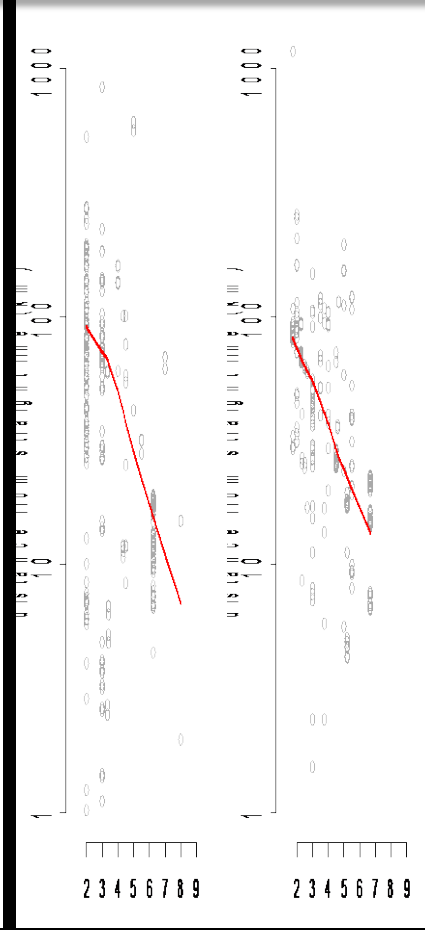
Cumulative Deviation from Straight Line (km)



Individual Age



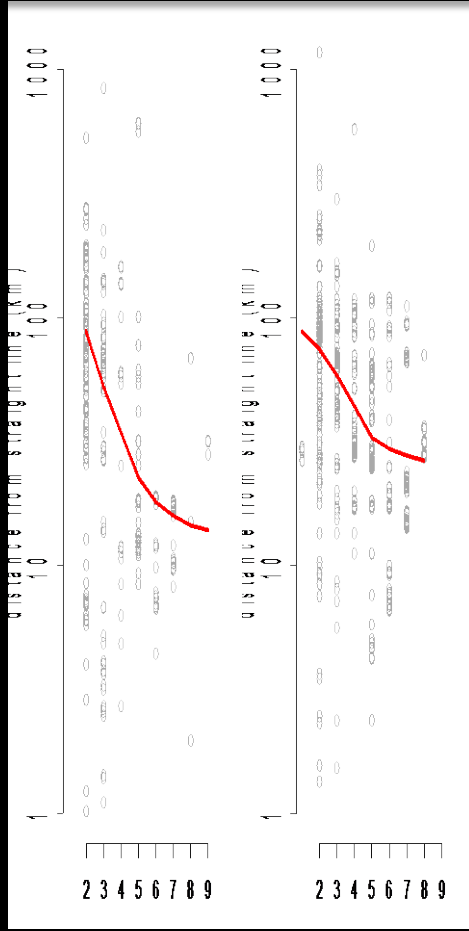
Oldest Individual  
in group



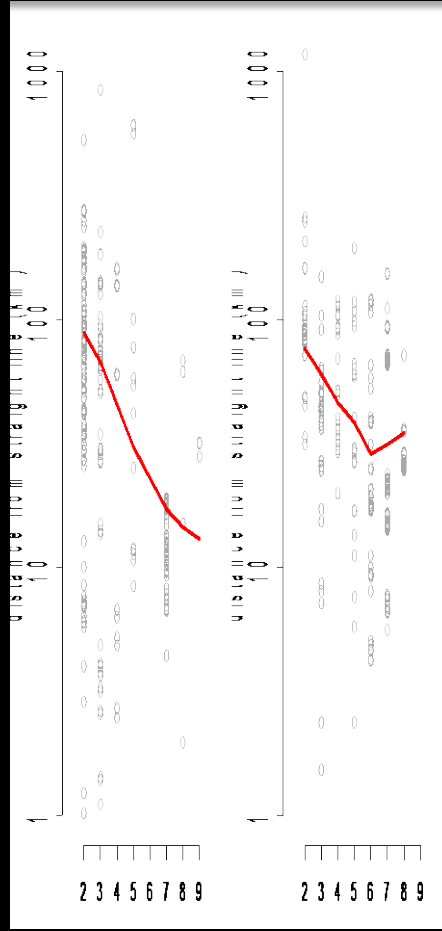
Average Group Age

# Experience brings efficiency: older birds fly direct

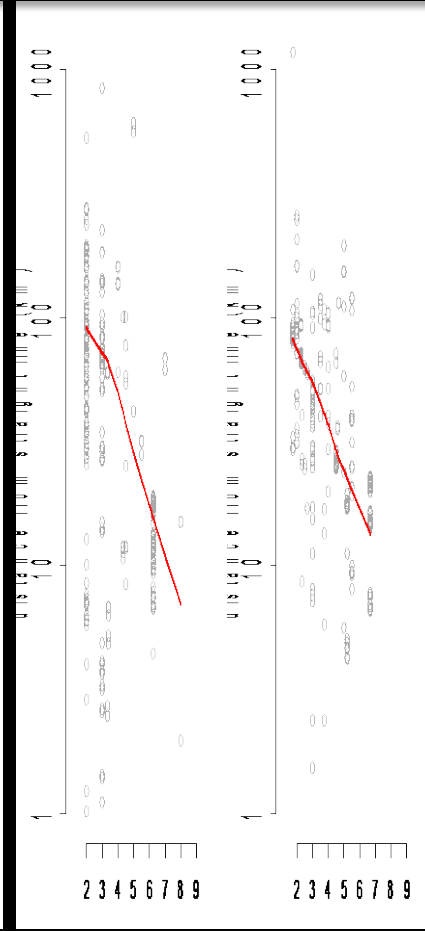
Cumulative Deviation from Straight Line (km)



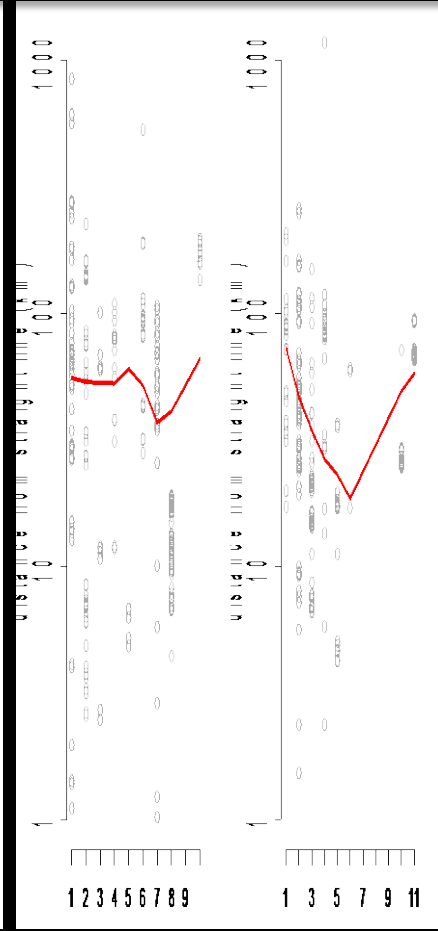
Individual Age



Oldest Individual  
in group



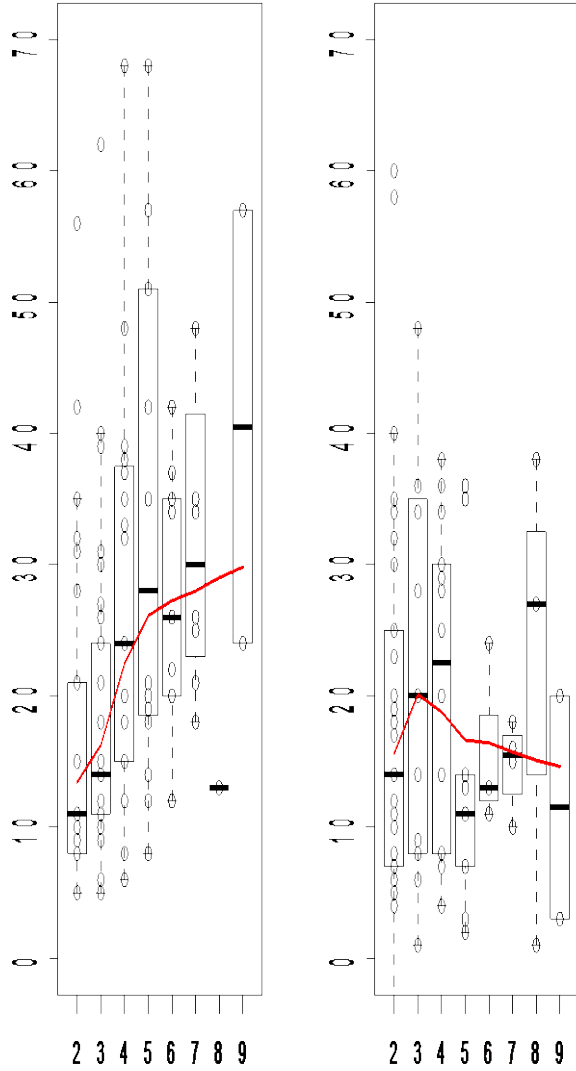
Average Group Age



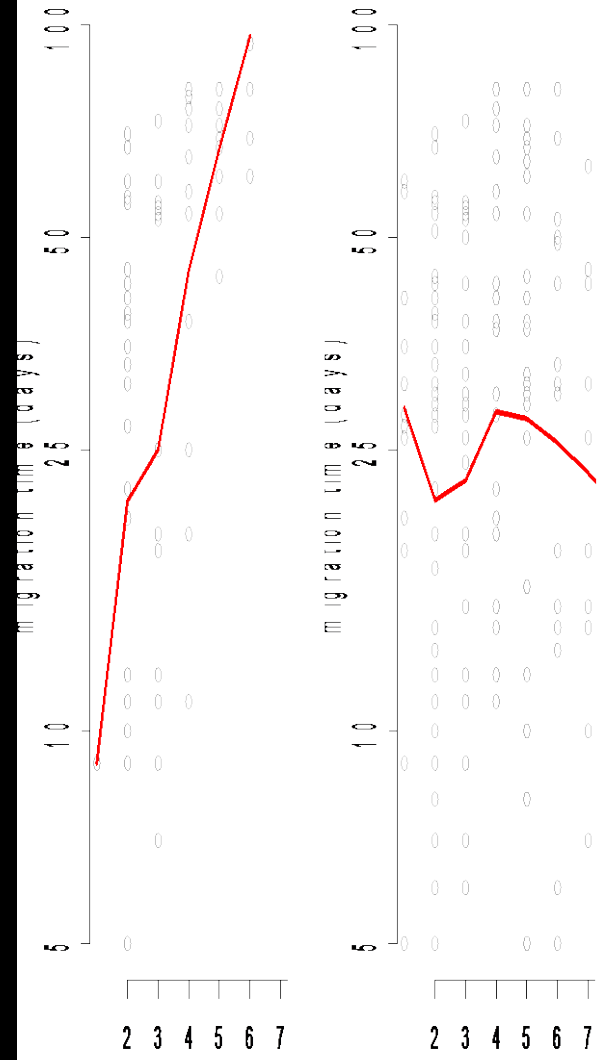
Group Size

# Older birds travel more slowly

Days en route between winter and summer grounds



Individual Age



Average Age of Group

## So older cranes:

- 1) Fly more directly with much less deviation (85% reduction in 9 years)
- 2) Take longer to travel the migration route
- 3) Depart and arrive earlier on both N- and S-bound legs (not shown)

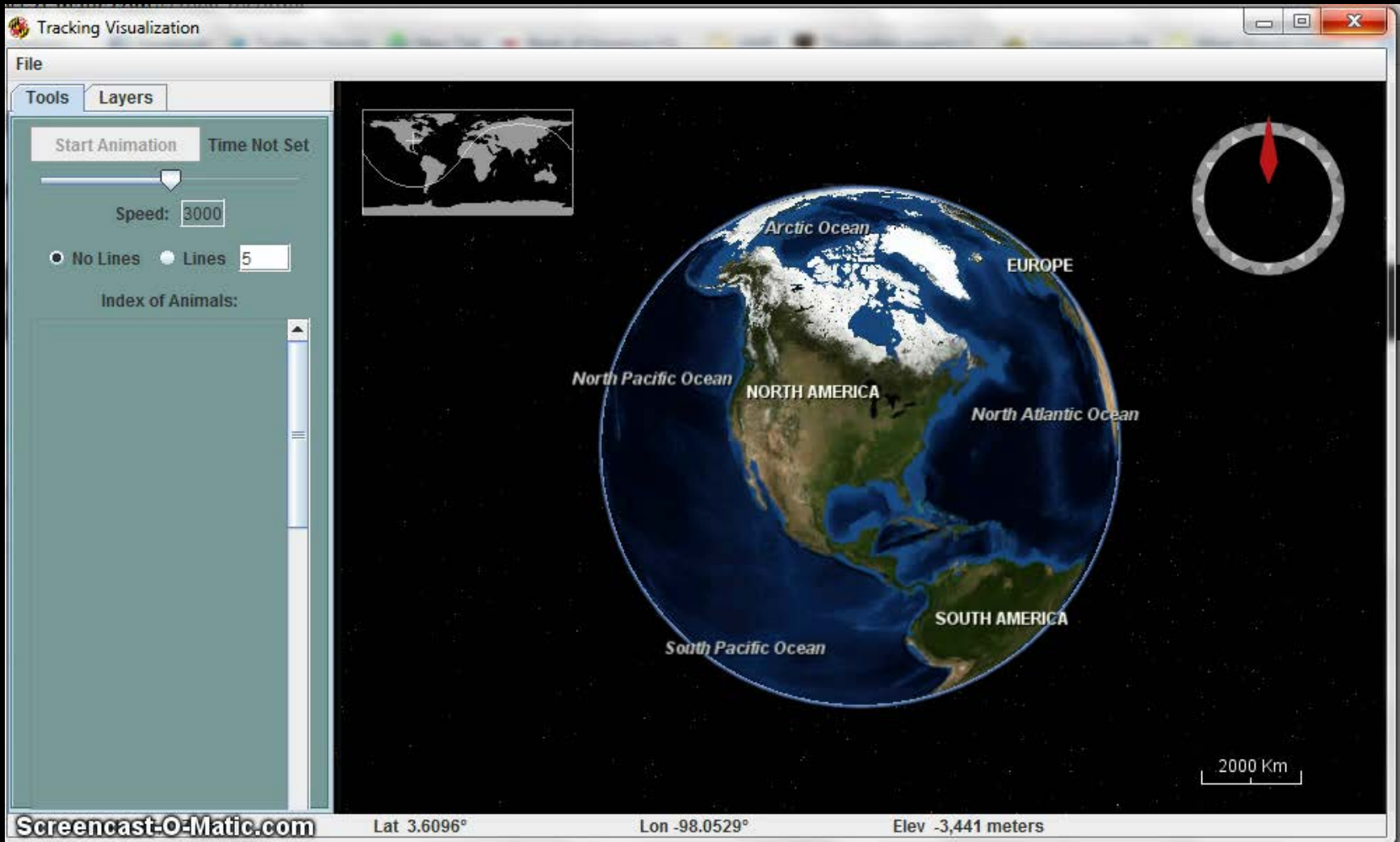
## So older cranes:

- 1) Fly more directly with much less deviation (85% reduction in 9 years)
- 2) Take longer to travel the migration route
- 3) Depart and arrive earlier on both N- and S-bound legs (not shown)

Do not anthropomorphize this .....



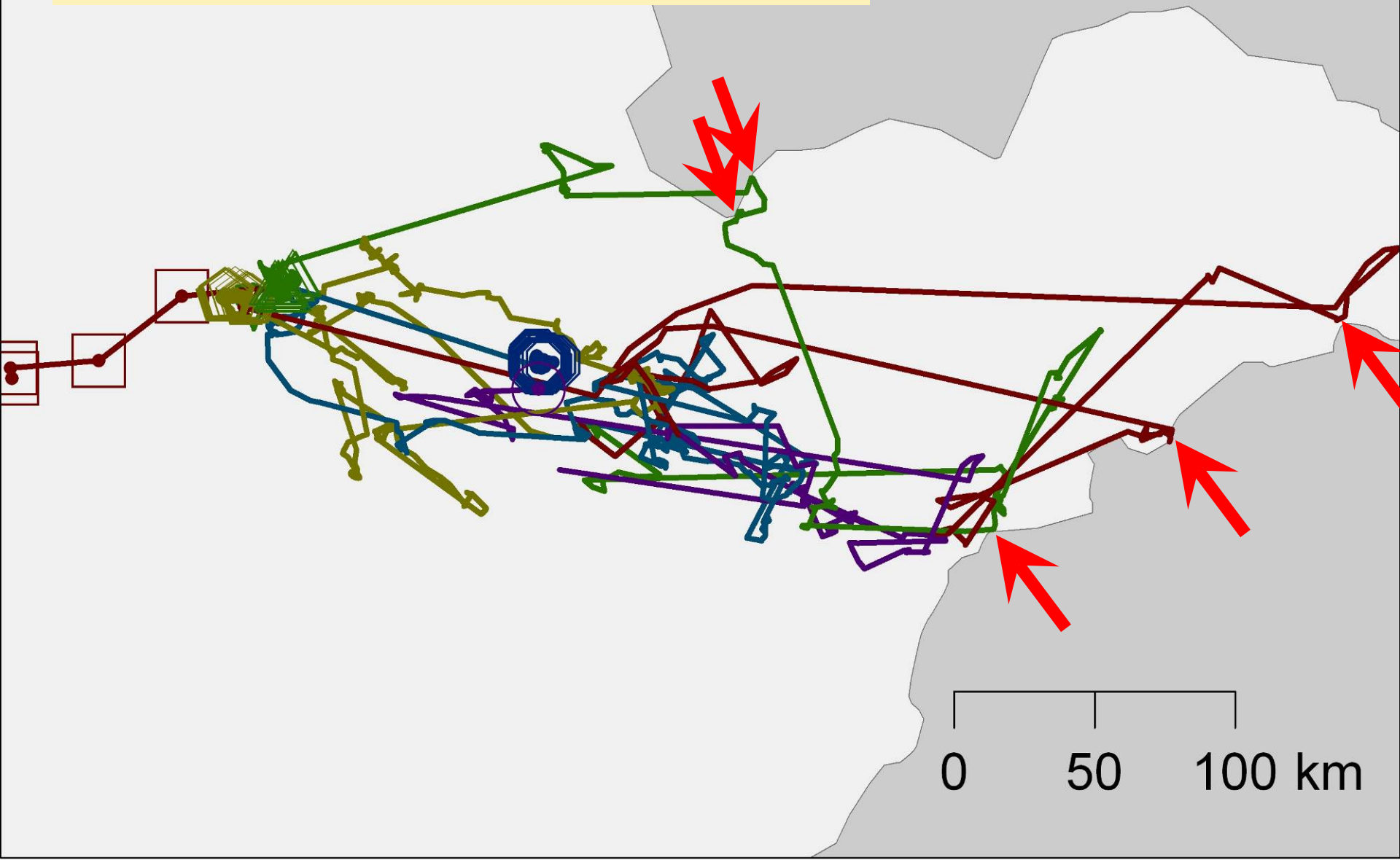
# A Google Earth Plug-in to Aid Visualization of Animal Movements



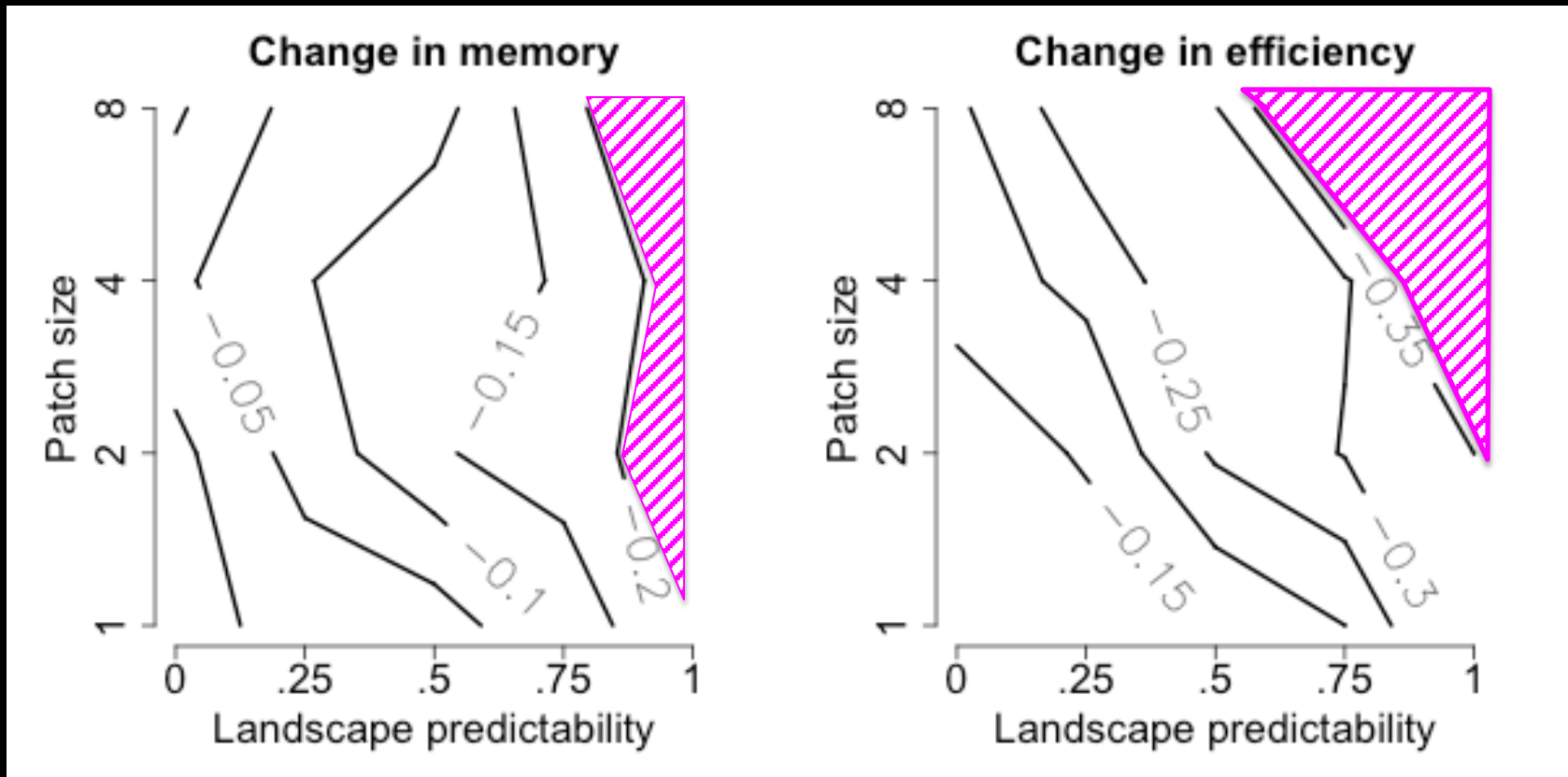
Java World Wind transitioning to a Google API

Kavathekar et al. in prep.

**Gazelles encounter border fences  
→ Real world reflecting boundaries**



# Effects of imposing a barrier to movement



# Animal distributions and movement behaviors in relation to resource dynamics

1. Framework of resource distributions and animal movements

*Part 2 : (empirical)*

> Resource distributions and movements of Mongolian gazelle

*Part 3 : (empirical)*

> Comparison of movements between species



# Part 1: Conceptual framework for resources, population distributions and movement mechanisms

## Movement Mechanisms

*Non-oriented*

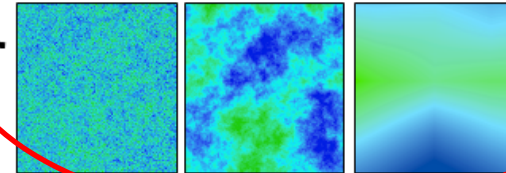
*Oriented*

*Spatial memory*

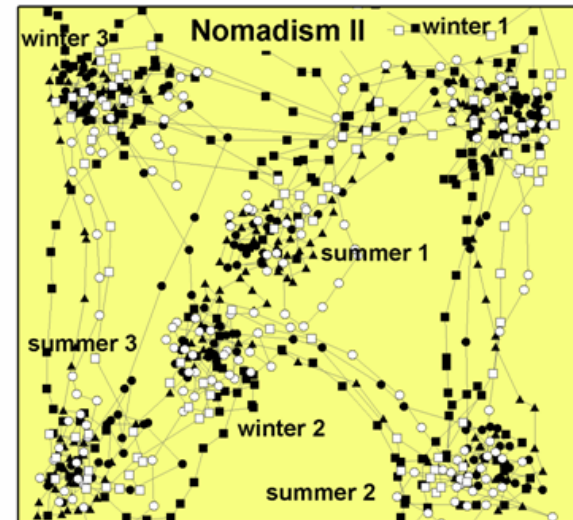
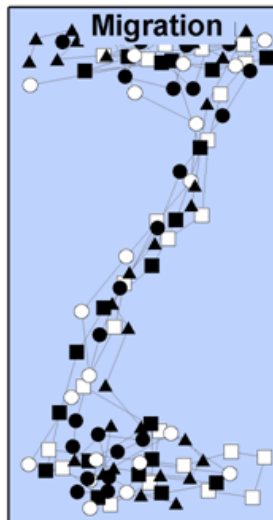
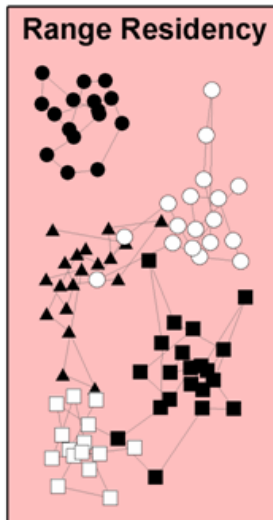


## Landscape Structure

*i.e., amount, variability, predictability, and heterogeneity of resources*

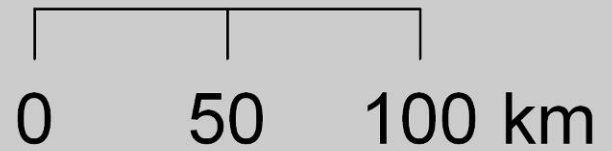
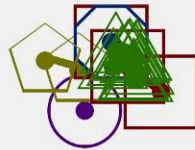


## Individual Movement Paths & Population Distributions

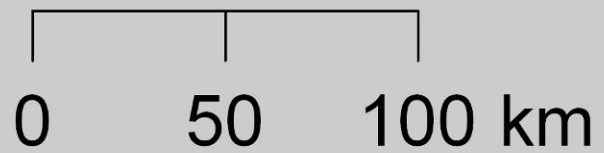
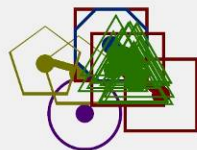


# Visualization of Gazelle Movements

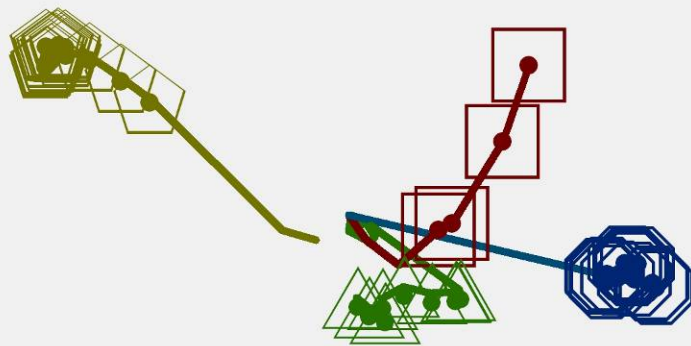
Sep 4, 2007



Sep 4, 2007



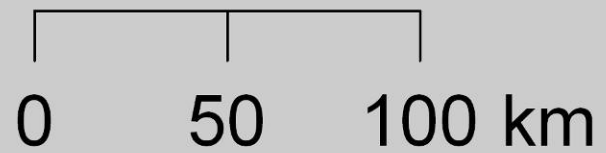
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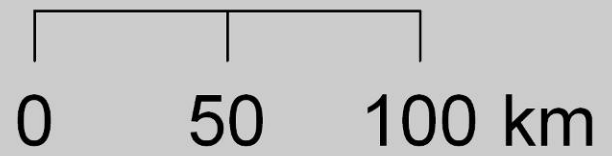
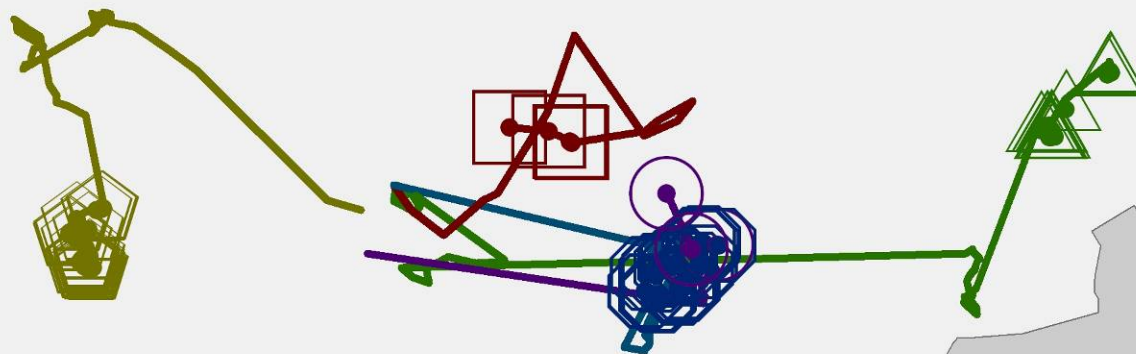
0 50 100 km



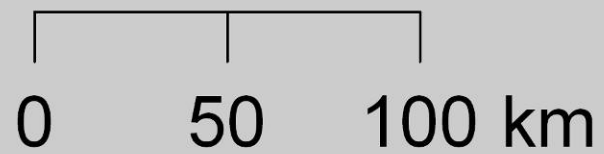
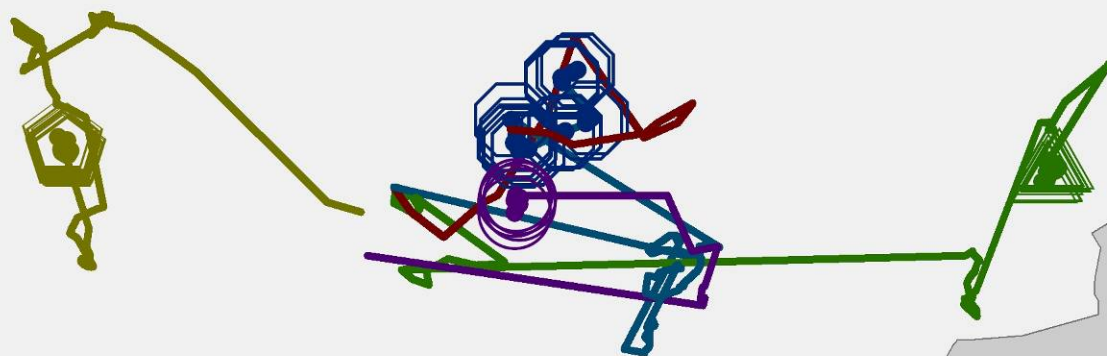
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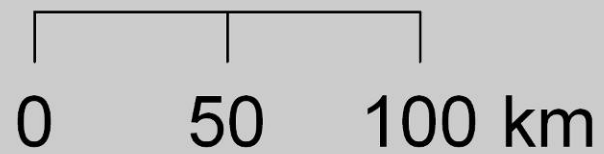
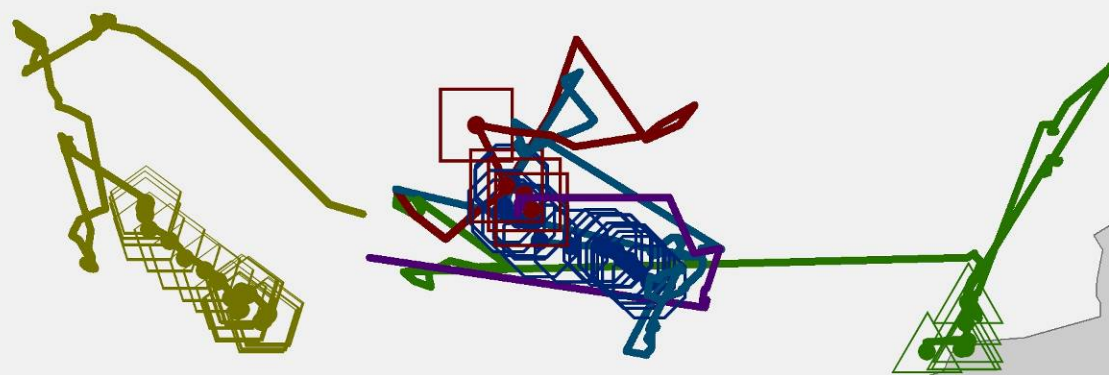
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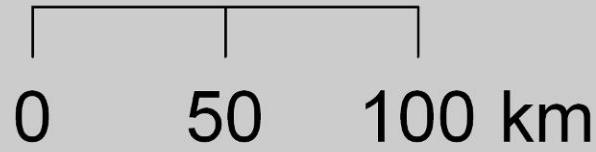
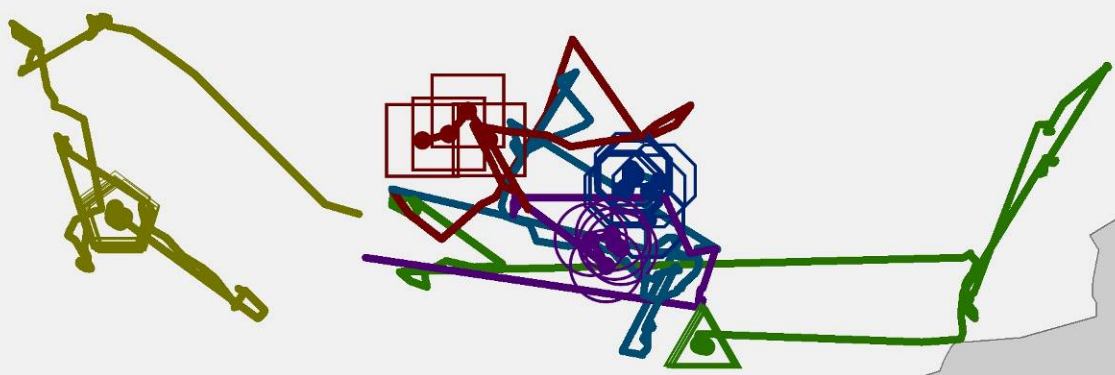
Nov 1, 2007



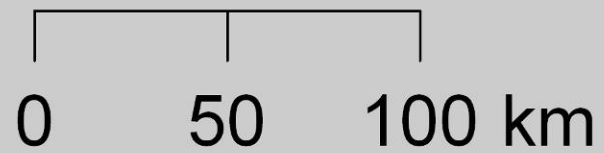
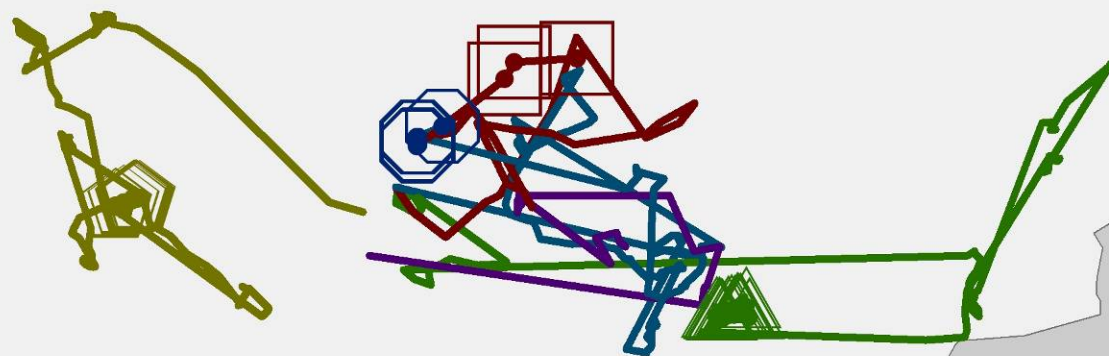
Nov 17, 2007



Dec 3, 2007



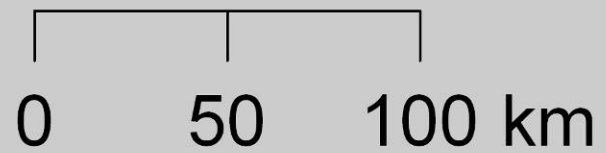
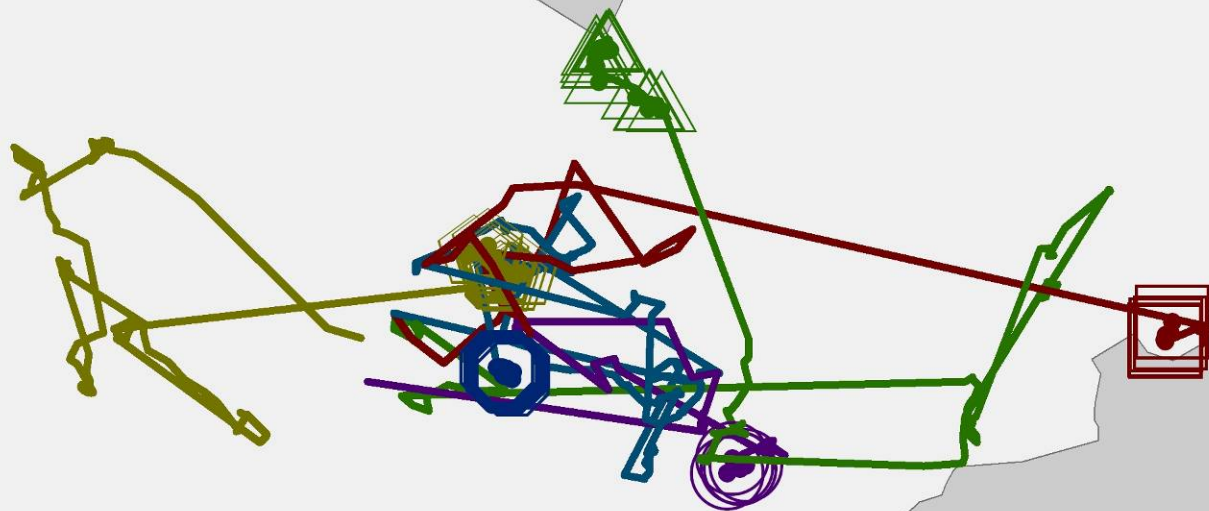
Dec 19, 2007



Jan 1, 2008

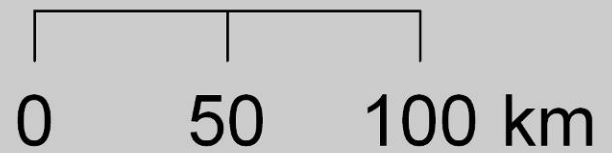
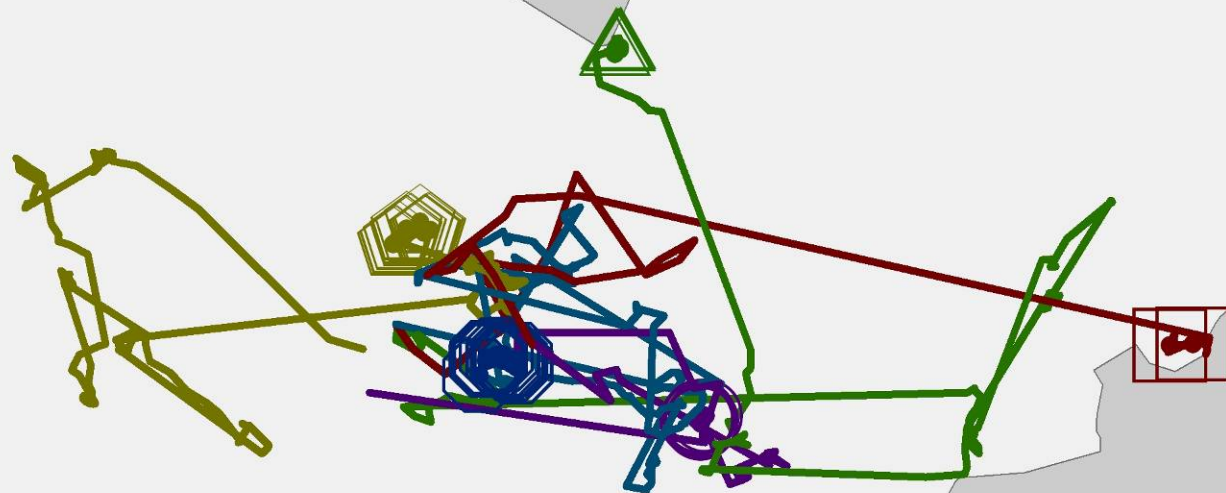


Jan 17, 2008

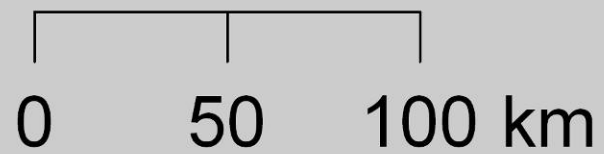
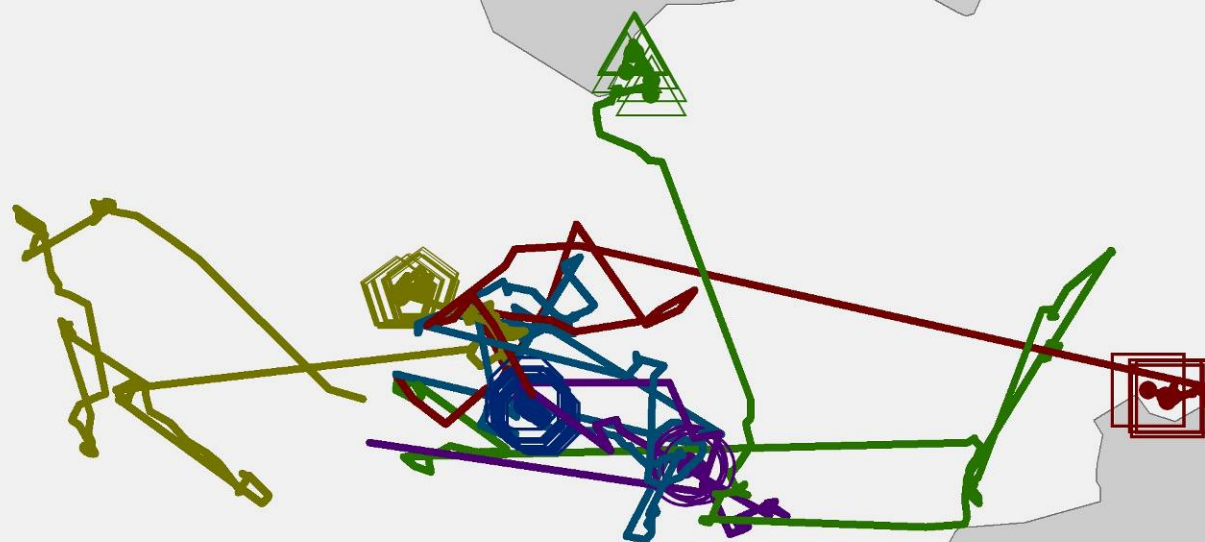




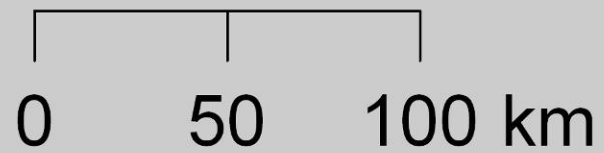
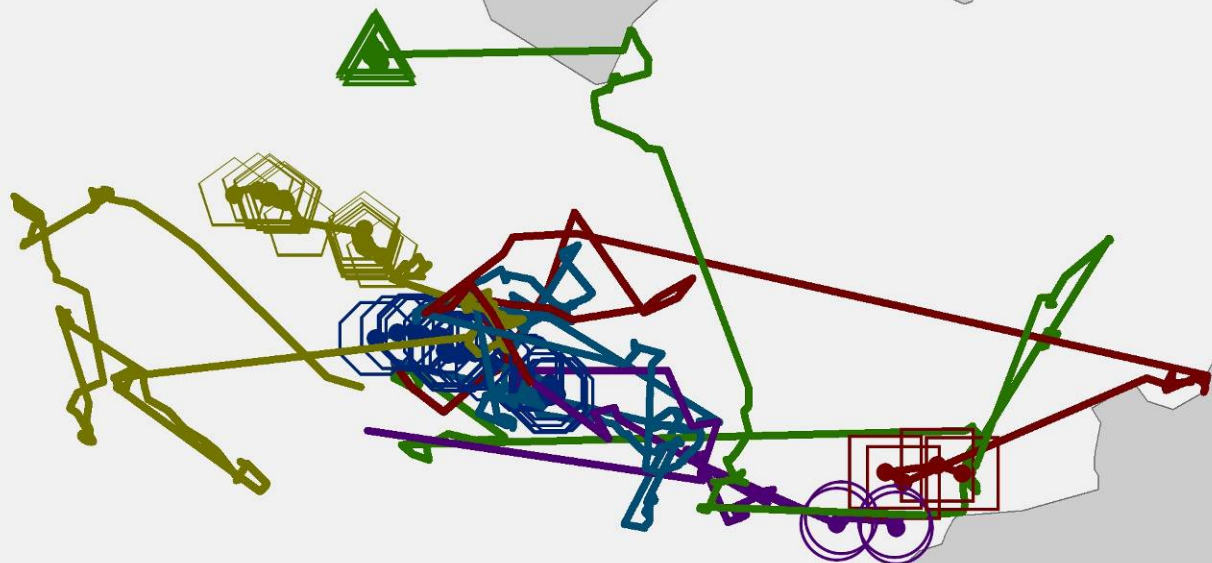
Feb 2, 2008



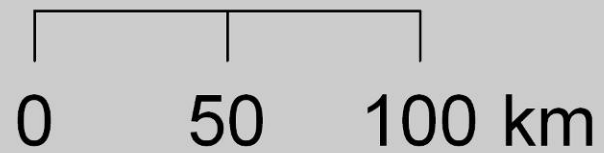
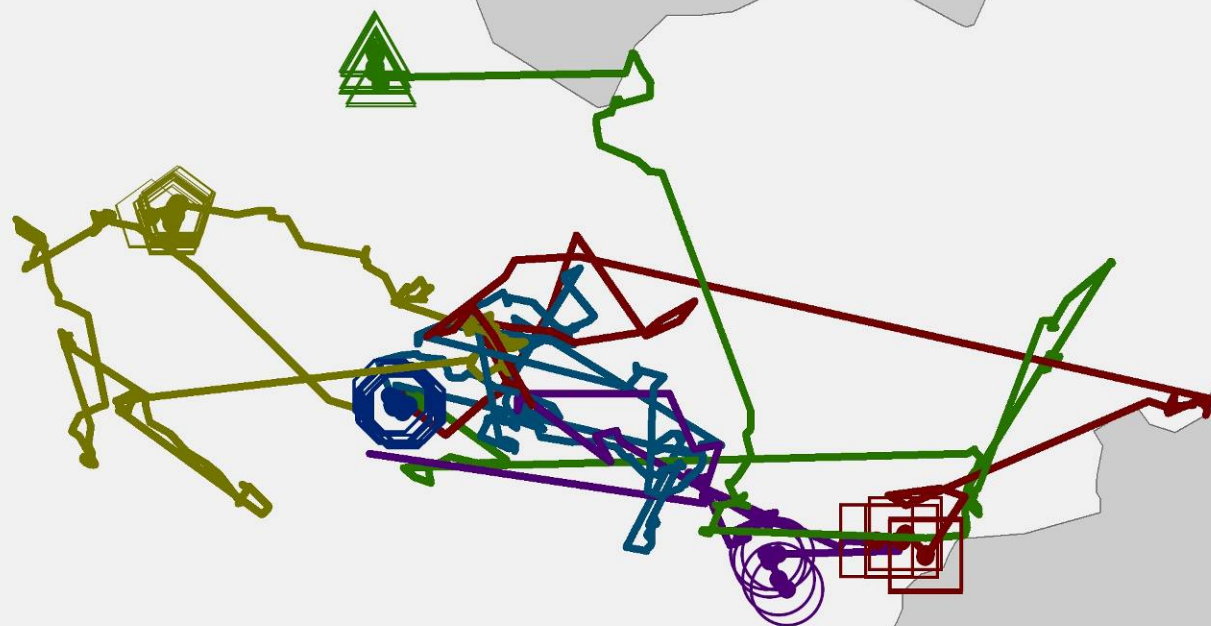
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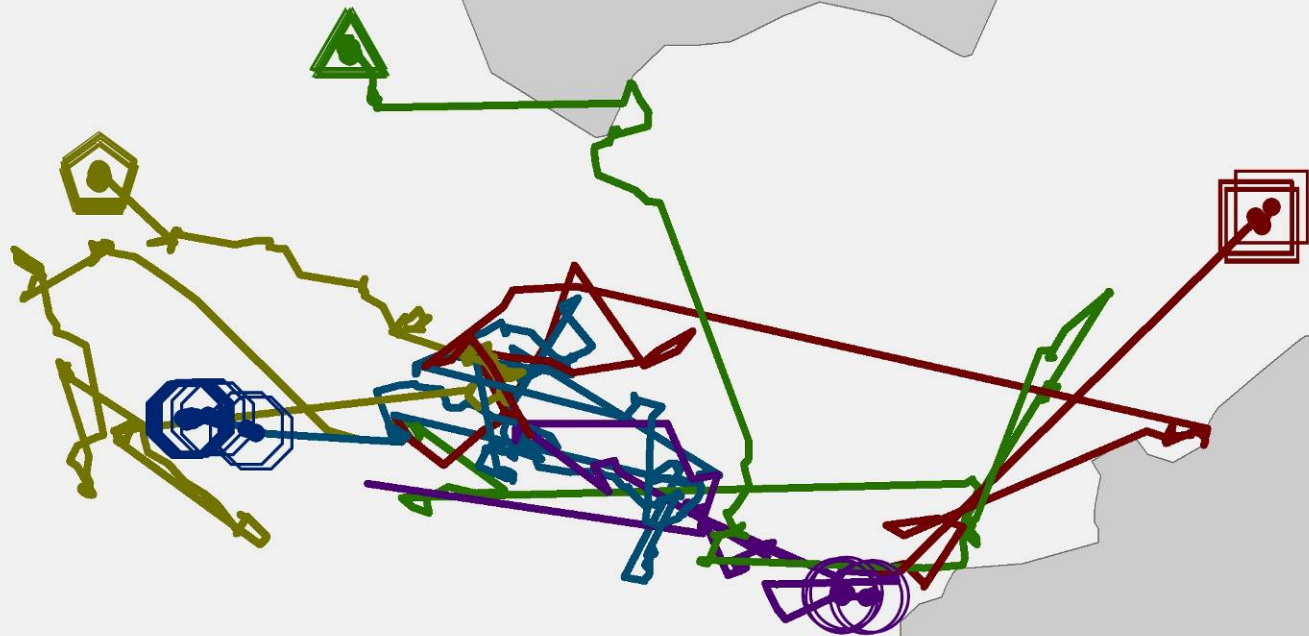
Mar 6, 2008



Mar 22, 2008

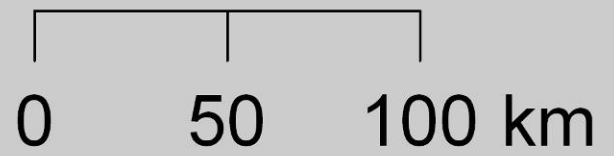
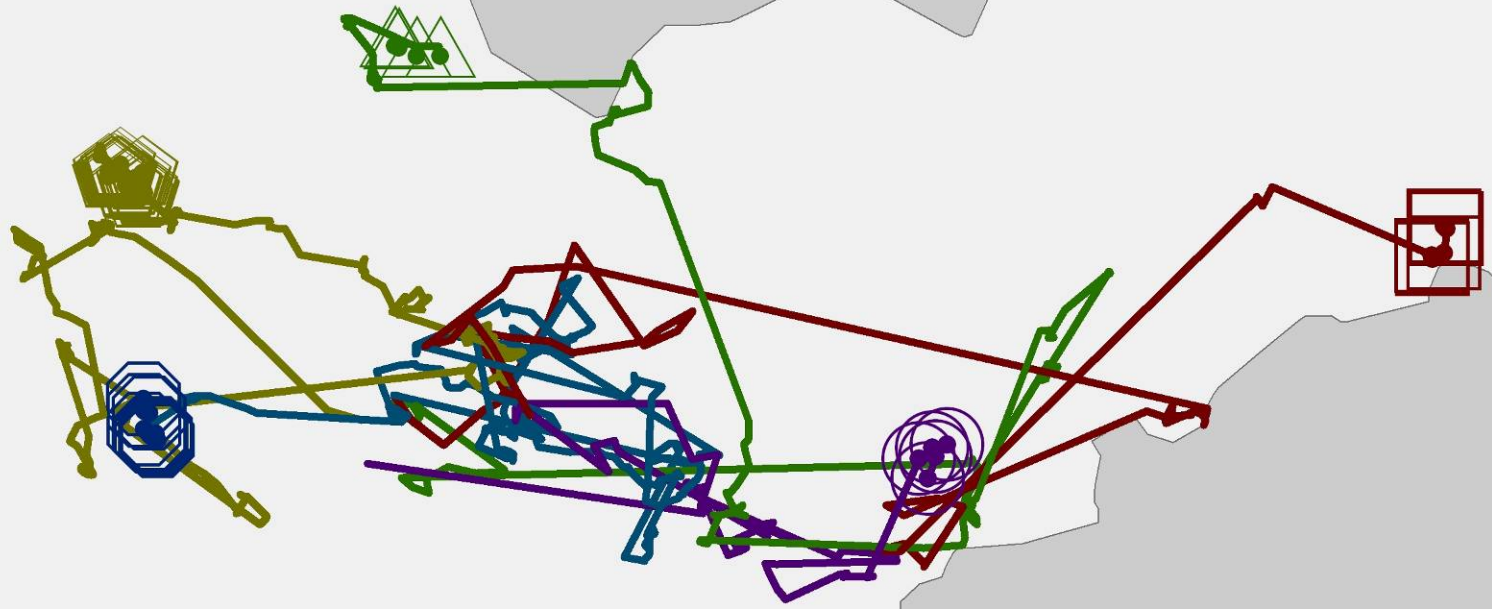


Apr 7, 2008

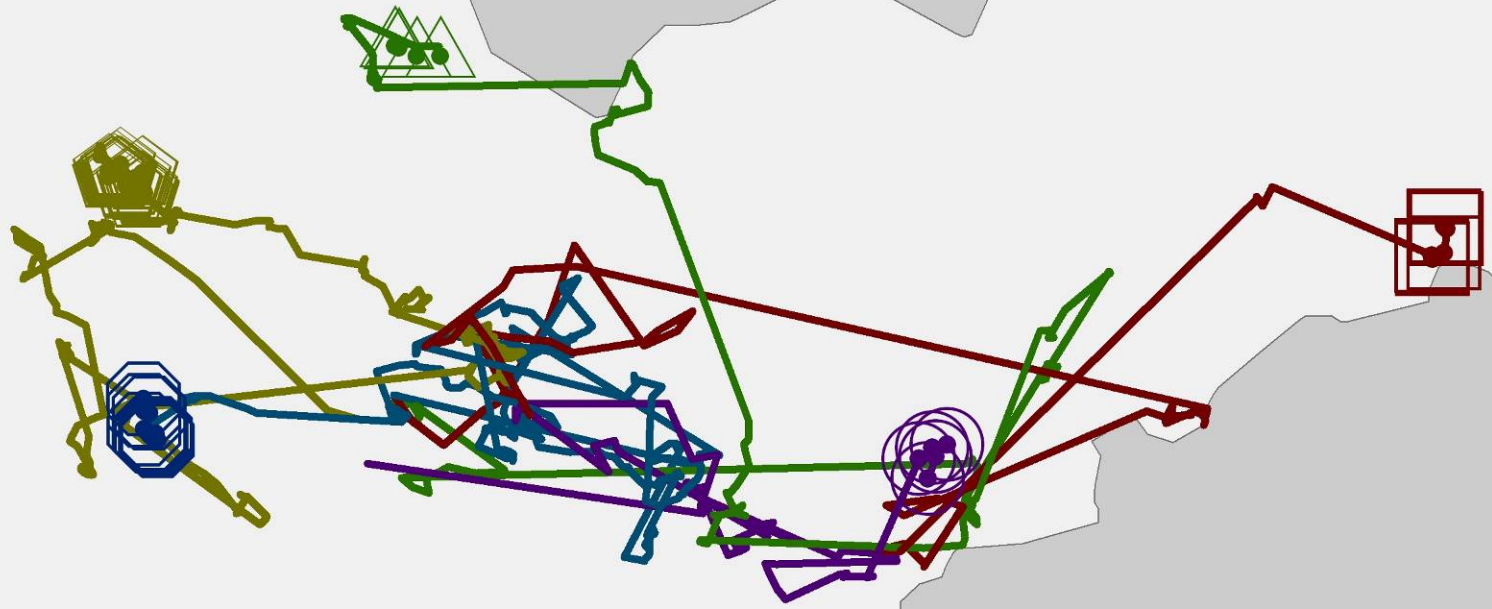


0 50 100 km

Apr 23, 2008

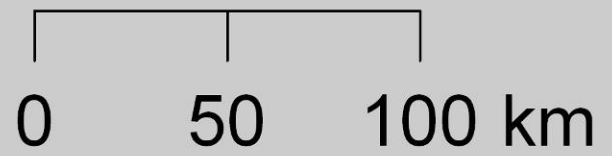
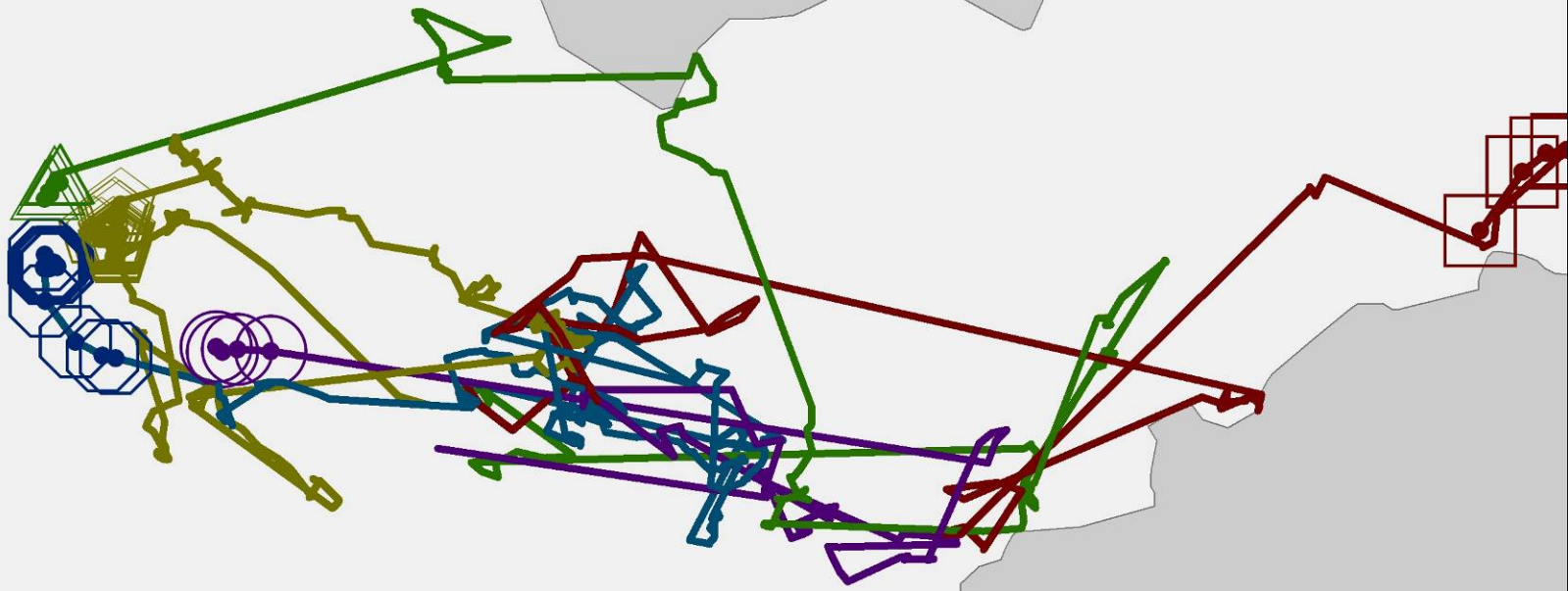


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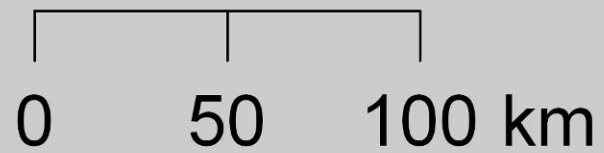
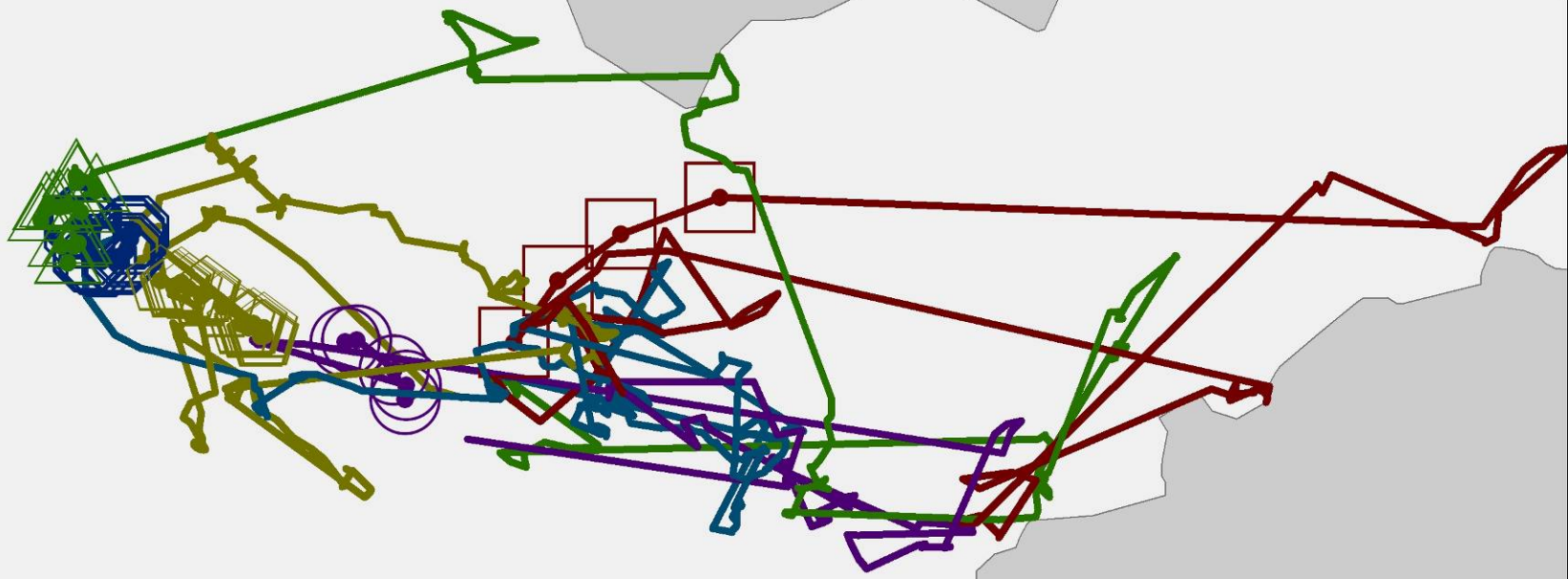
0 50 100 km

May 9, 2008

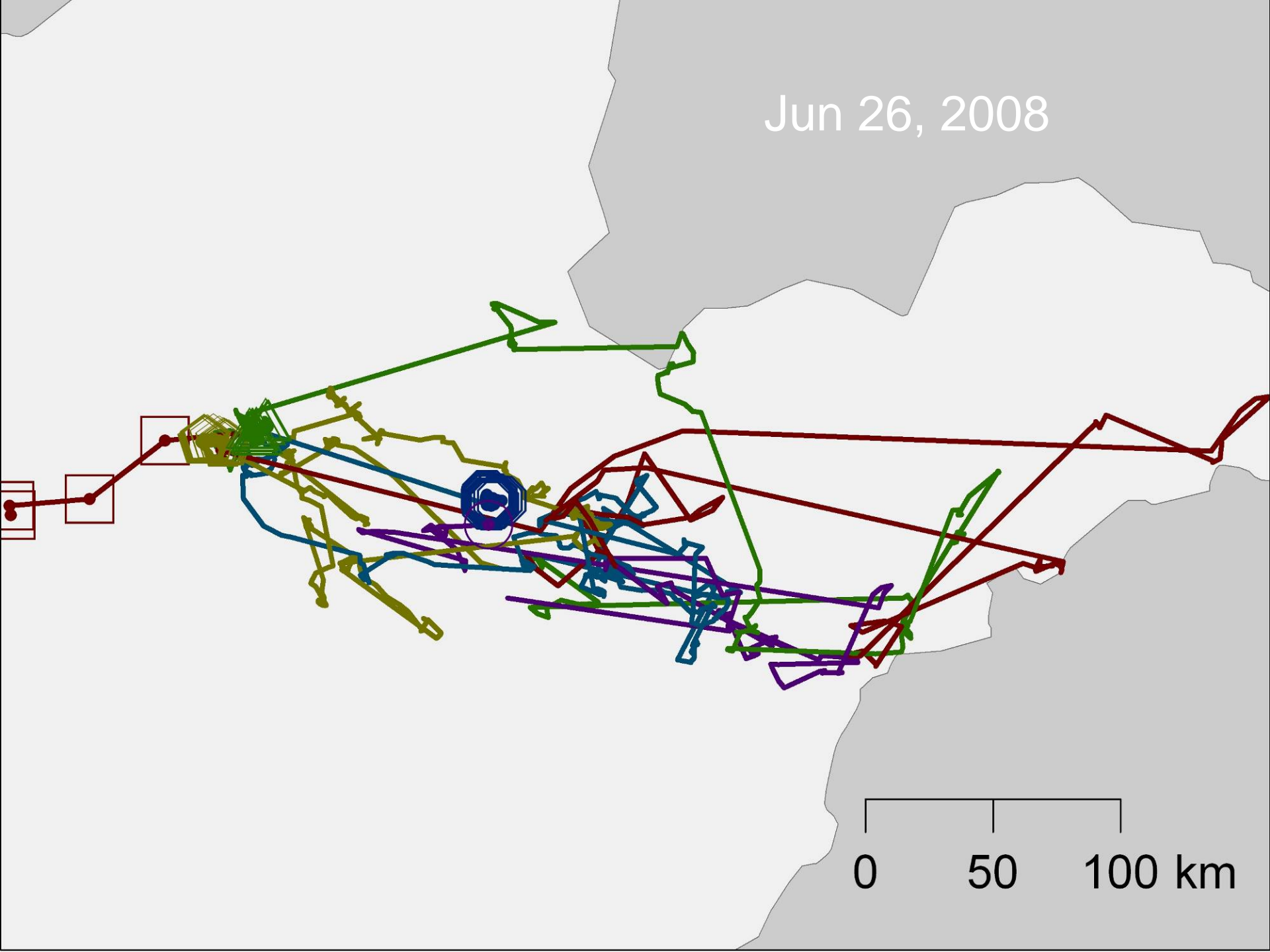




May 25, 2008



Jun 26, 2008



# Whooping Crane Eastern Flock

## Spring Migration, 2004



# Discussion

## Conservation Strategies Nomadism versus Migration:

- protection of seasonal ranges (e.g. calving grounds)
- protection of migration routes
- integrative landscape approaches vs. protected areas
- Minimum Dynamic area

## Coping with changes in patterns of primary productivity as a consequence of climate change:

What population level pattern and which individual level movement behaviors are more threatened or more flexible?

