



# Linking movement and population dynamics

(I wish...)

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# What Behavioral Details Should be Considered to Understand and Predict Spatio-Temporal Population Dynamics?





## What are the Effects of Landscape Heterogeneity on Population Dynamics?



# Mixing

- Classic population models assume well mixed systems
- This allows to write stuff such as:
$$\frac{dN}{dt} = rN \left( 1 - \frac{N}{K} \right)$$
- But:
  - Individuals are Discrete Entities
  - Most Ecological Interactions are Local
  - Landscapes are heterogeneous
- Hence:
  - Importance of spatial structure
  - Relevance of habitat fragmentation
  - Need to understand and predict movement



# Movement could be the Bridge connecting Behaviour, Landscape Ecology and Population Dynamics

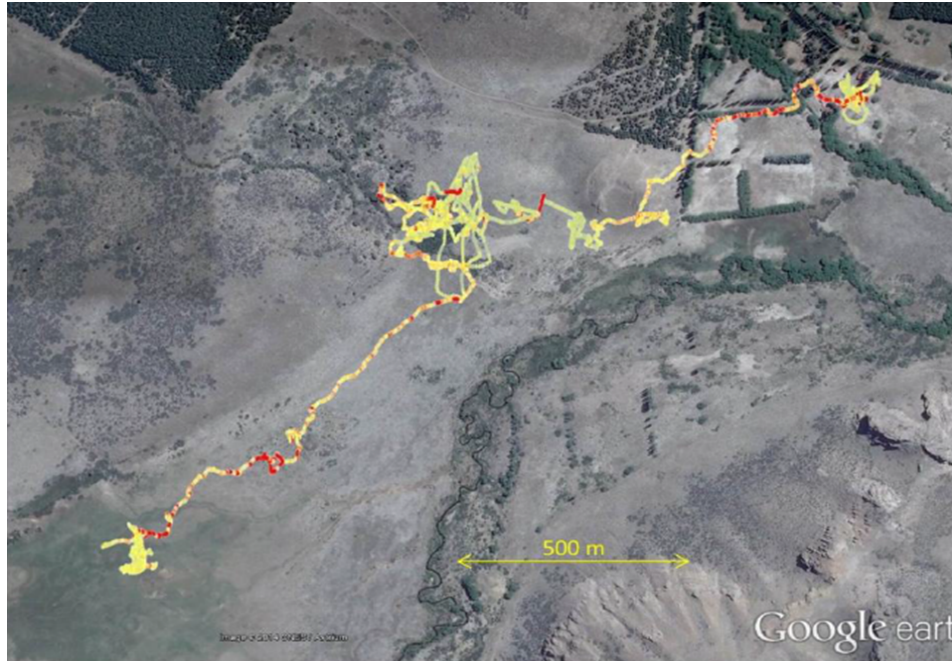
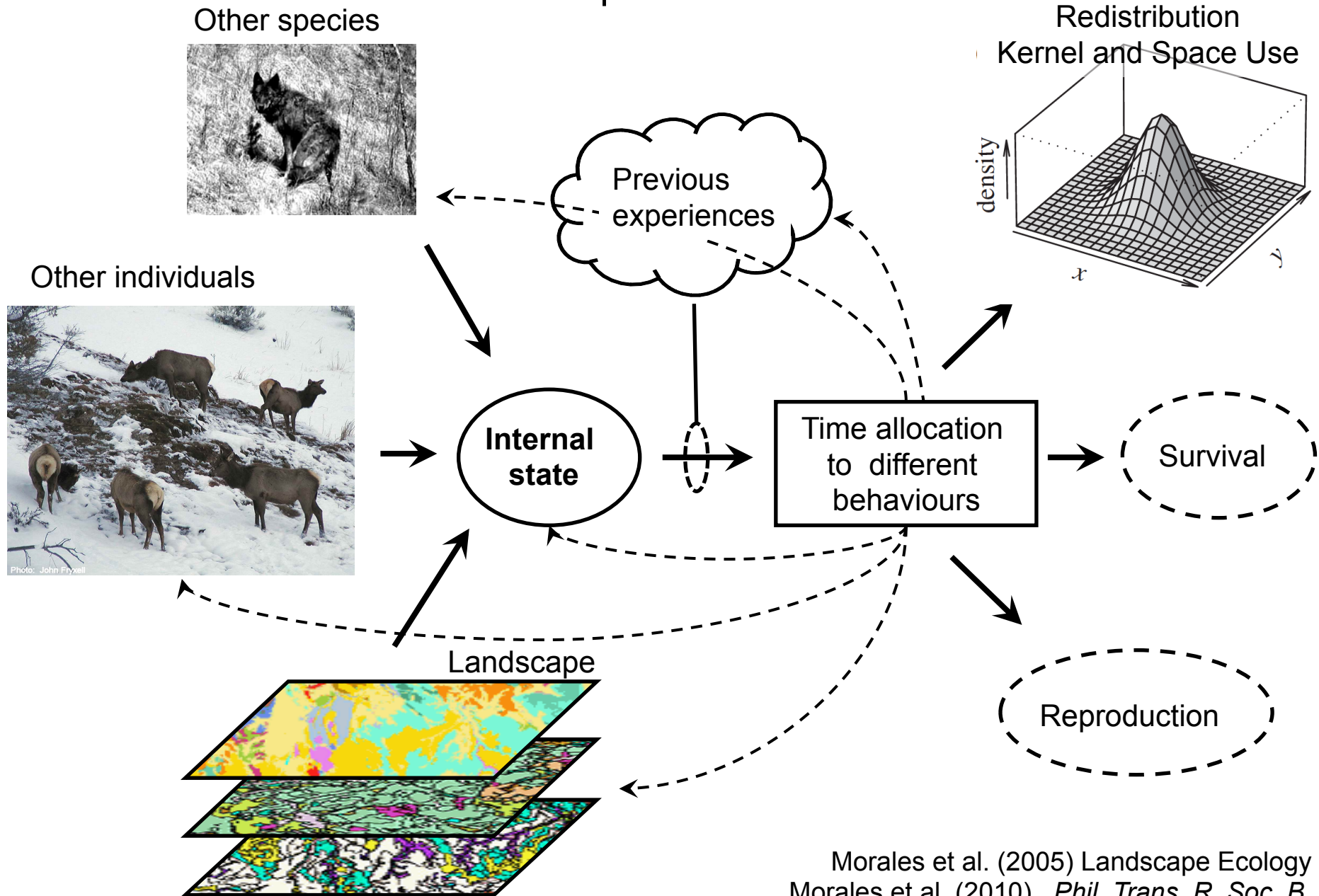


Photo Tomás Carlo



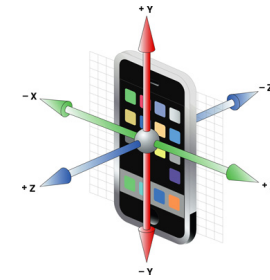
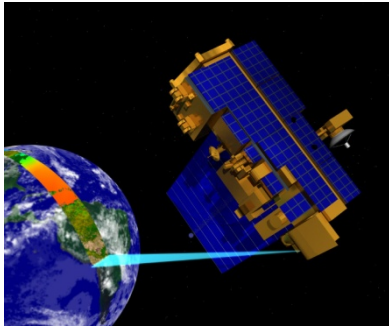
# A Conceptual Framework



Morales et al. (2005) Landscape Ecology  
Morales et al. (2010). *Phil. Trans. R. Soc. B.*

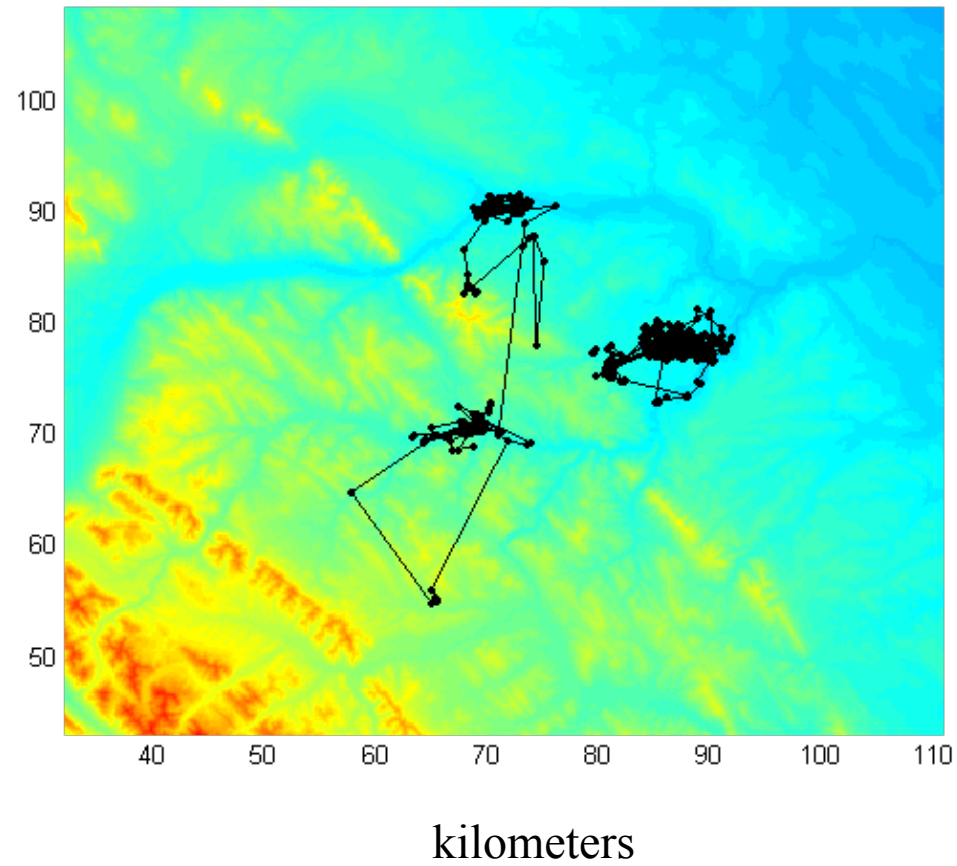


# New and Better Technologies for Data Collection





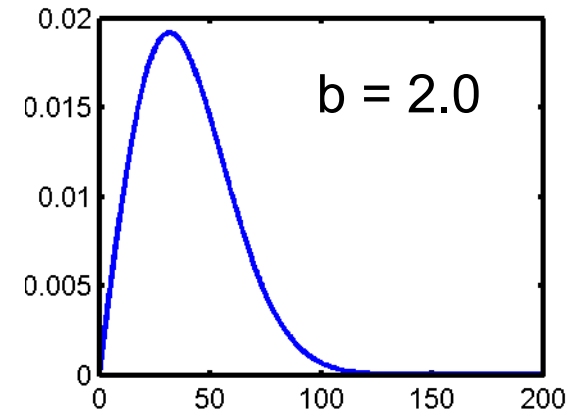
## Animals not Always Move in the Same Way...



# Probability Density Functions for Movement Components

Weibull

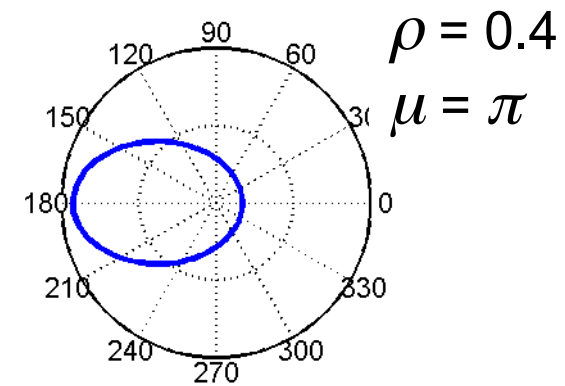
$$W(x) = abx^{b-1} \exp[-ax^b]$$



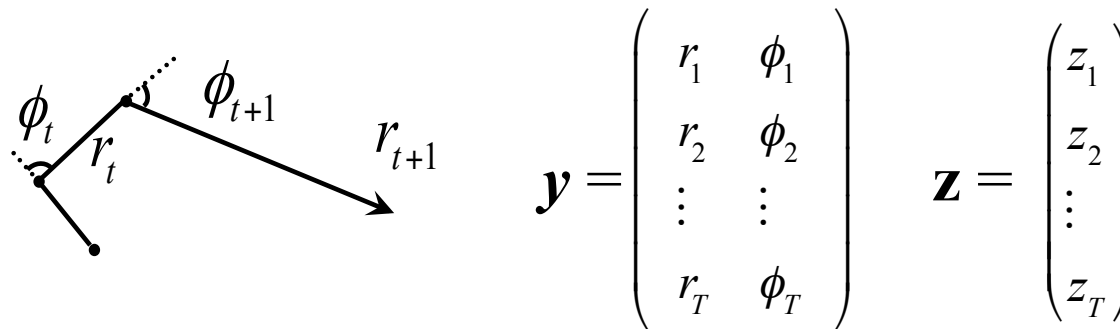
Wrapped Cauchy

$$C(\phi) = \frac{1}{2\pi} \frac{1 - \rho^2}{1 + \rho^2 - 2\rho \cos(\phi - \mu)}$$

$$0 \leq \phi \leq 2\pi, \quad 0 \leq \rho \leq 1$$



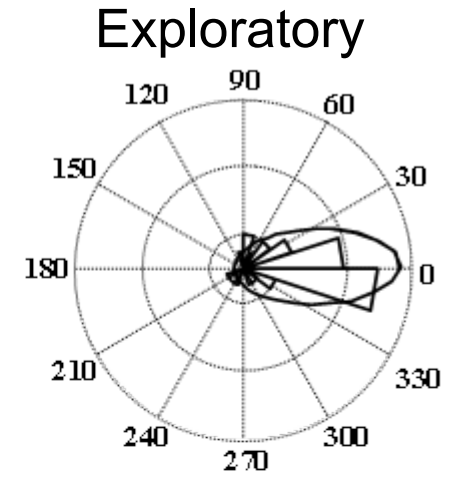
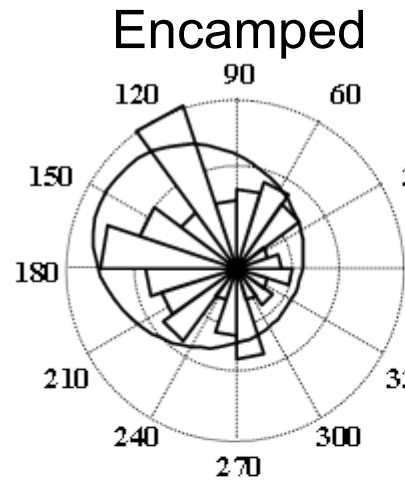
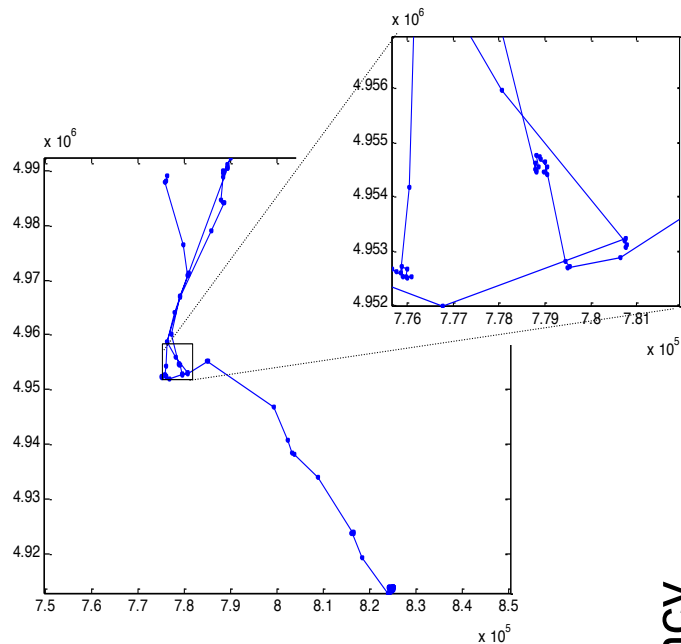
## Likelihood Function for a Given State Indicator Vector $\mathbf{z}$



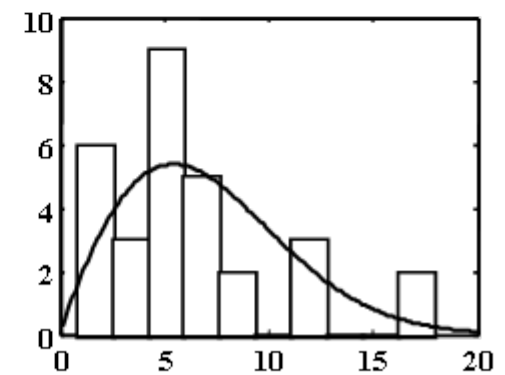
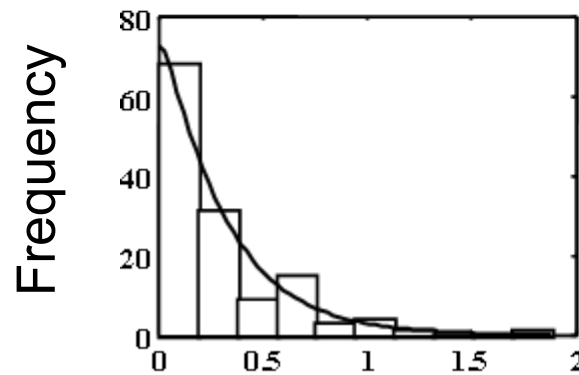
$$p(y|a, b, \mu, \rho) = \prod_{t=1}^T W(r_t | a_{z_t}, b_{z_t}) C(\phi_t | \mu_{z_t}, \rho_{z_t})$$



# e.g. Model Fit for Elk 287



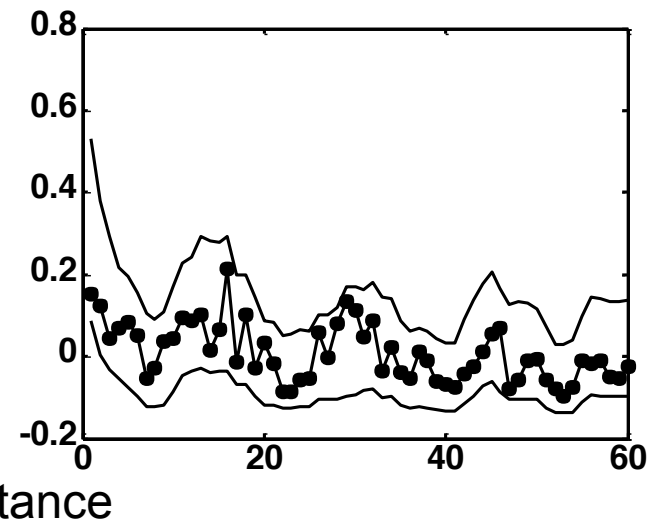
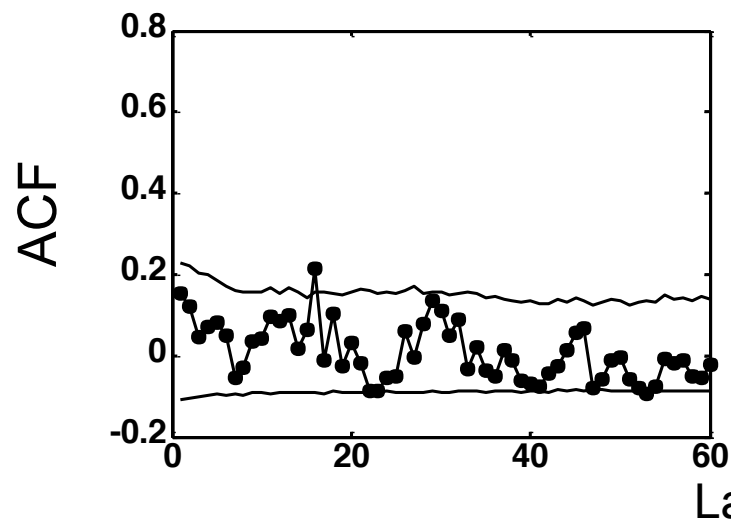
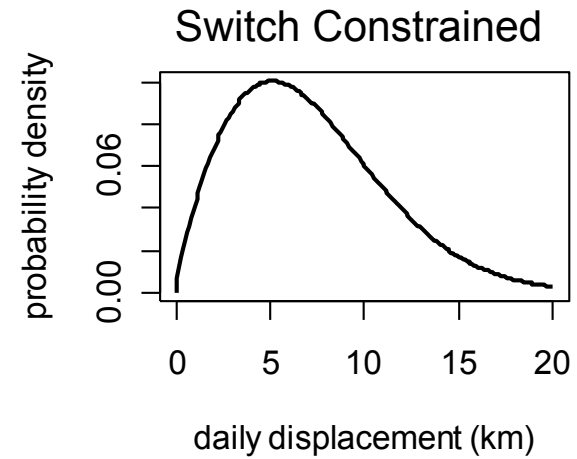
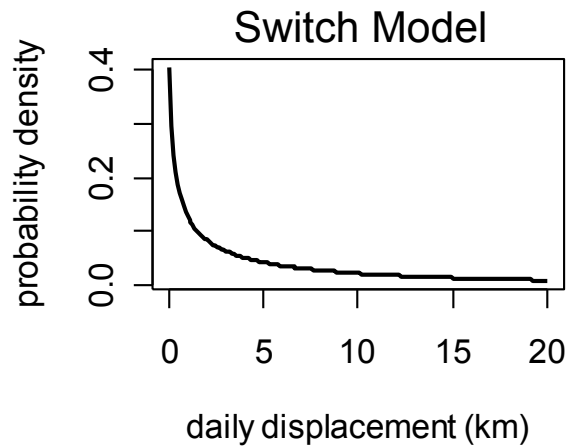
Turning Angles



Daily Movement Rate (km)

# Emergent Properties of Movement for Model Choice

## Step Distribution for Exploratory Movement



# Switching Among States

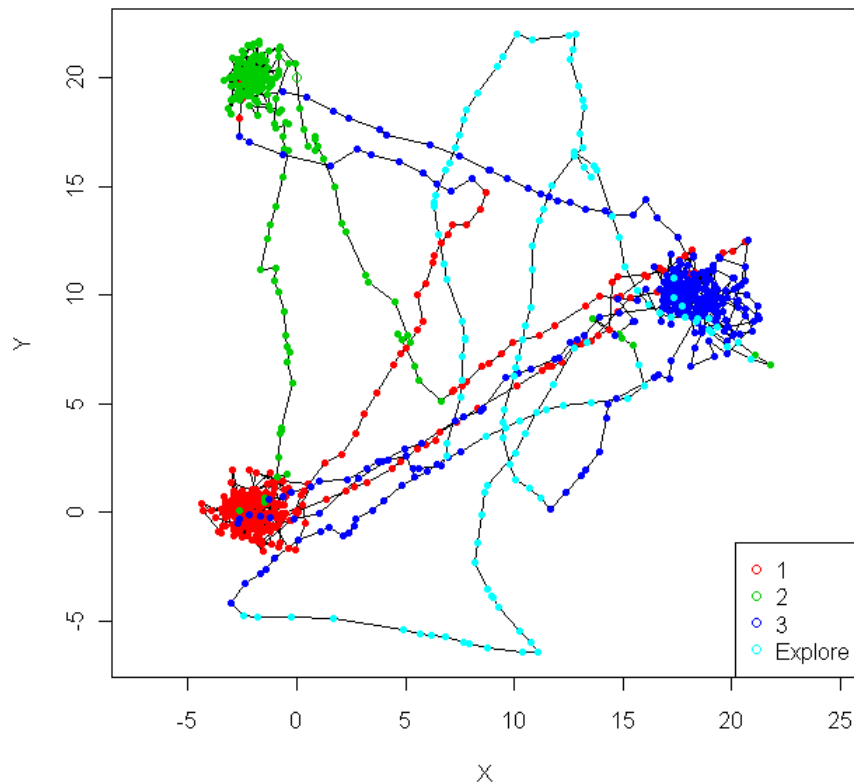
- Depending on:
  - Fixed probabilities
  - Where you are (habitat type)
  - Distance to habitat
  - Group size (Haydon et al. 2008)
  - Who is in the group (Ramos-Fernandez & Morales 2014)
  
- Probably realistic in many cases:
  - Time in current state
  - Distance to goal





# Incorporating Ecological Realism

- Movements may be biased, correlated, exploratory...



$$\phi_t | z_t \sim \text{wCauchy}(\lambda_t, \eta_t)$$

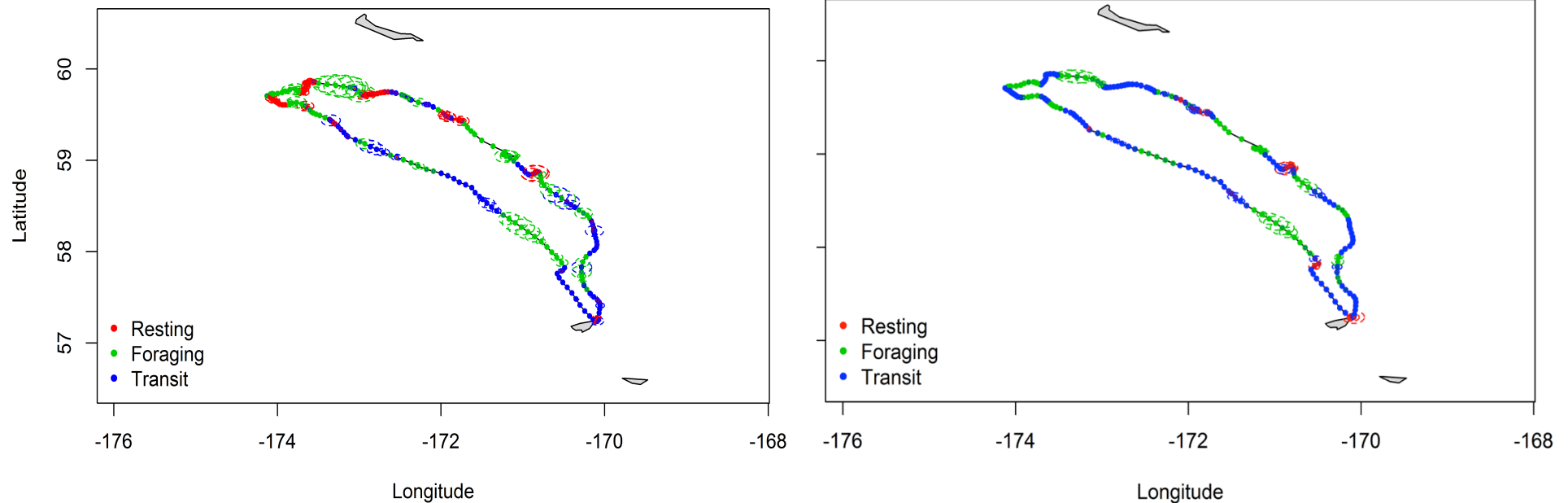
$$\lambda_t = \begin{cases} \phi_{t-1} & \text{if } z_t \text{ is exploratory} \\ (1 - \rho_t)\phi_{t-1} + \rho_t\mu_t & \text{otherwise} \end{cases}$$

$$\eta_t = \begin{cases} v_e & \text{if } z_t \text{ is exploratory} \\ \tanh(r_{z_t} \delta_t) & \text{otherwise} \end{cases}$$

$$z_t \sim \text{Categorical}(\psi_1, \dots, \psi_{c+1})$$

## Similar But Different... Continuous-Time RWs

- Continuous-time movement models more realistic. Especially to handle missing data and irregular observations.
- But autocorrelated velocity implies that long steps are associated with small turns. McClintock B.T. et al. (2014). *Movement Ecology*



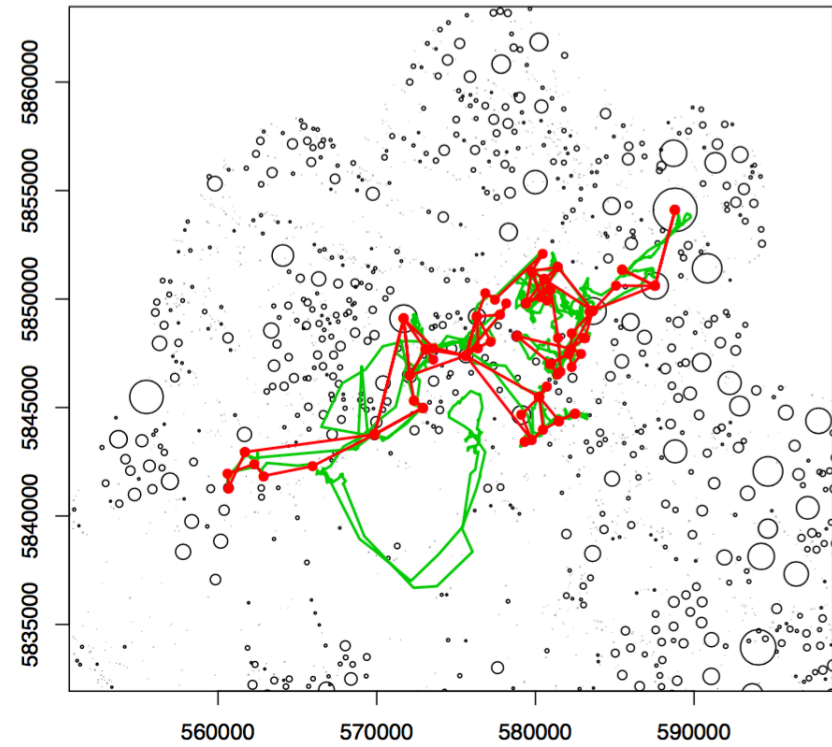
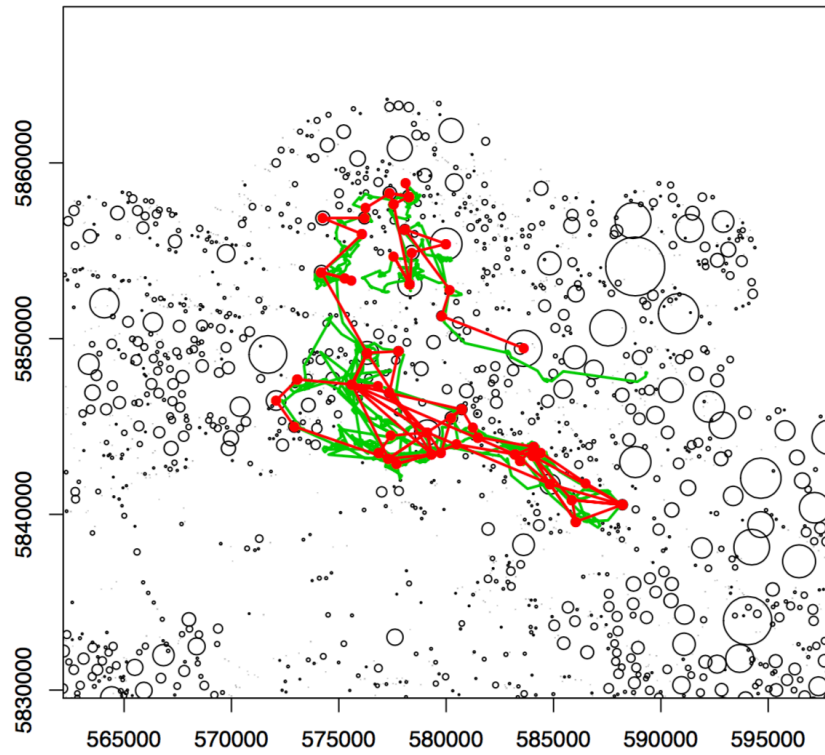
# Including Memory in Movement Models

- 19 relocated elk in Alberta (Animals are new to the landscape)
- GPS location every 2 hours for up to 12 months

How do they update their movement decisions as they learn about the landscape?

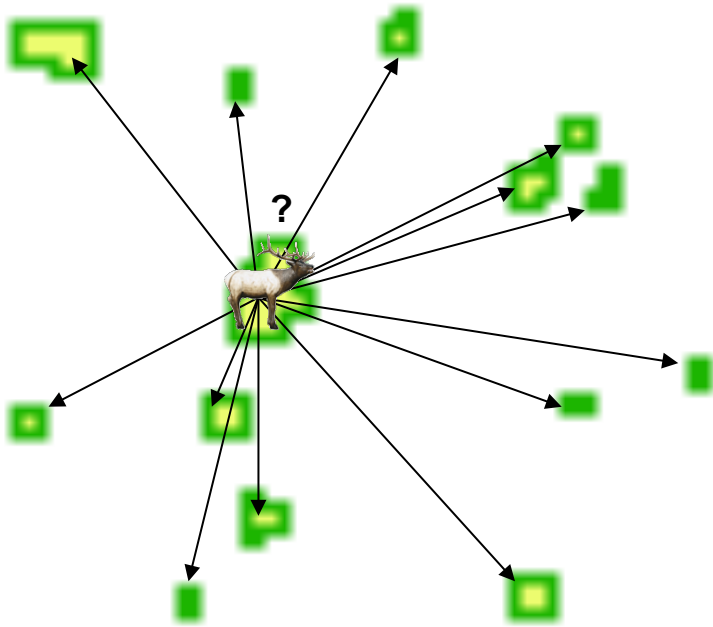
- Several simplifications:
  - “Foraging Patches” identified from GIS and field work
  - Movement transformed into patch-to-patch plus “residence” and travel time

# Relocated Elk in the Canadian Rockies



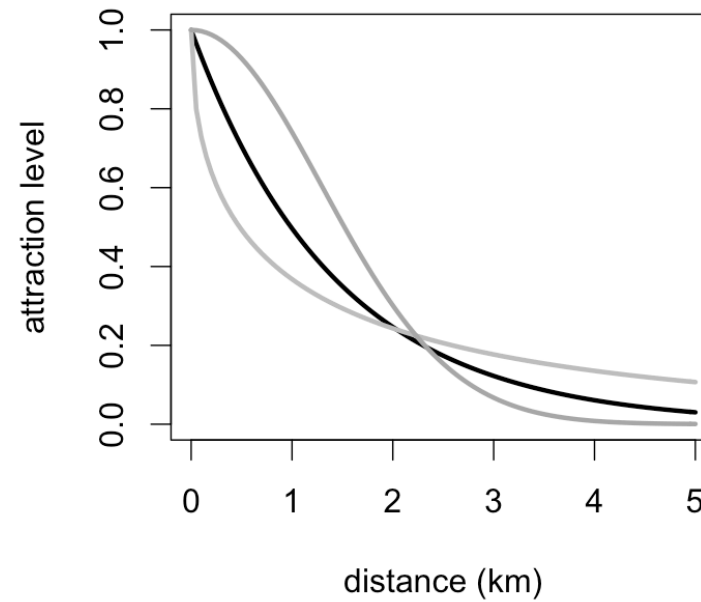
# Where to go next?

Distance only



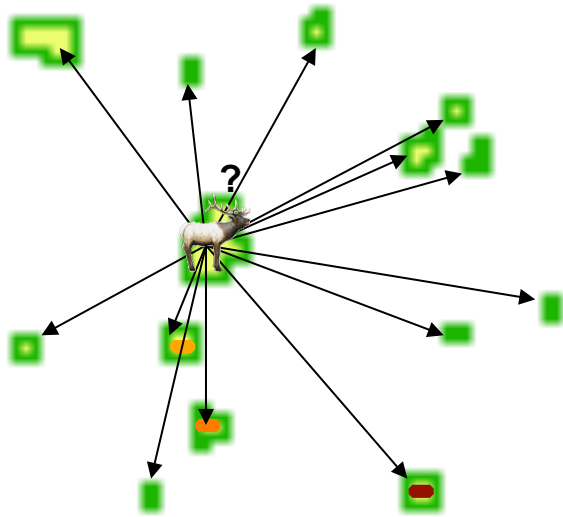
$$\delta_i = \exp(-a \times r_i^b),$$

$$D = \frac{\delta}{\sum \delta}$$





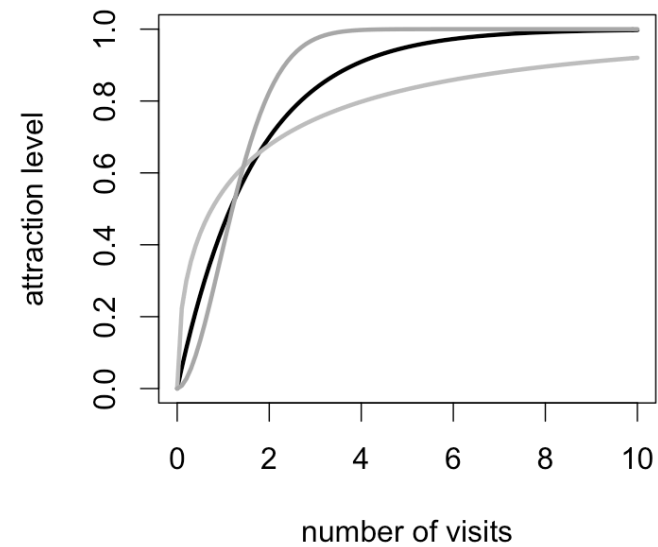
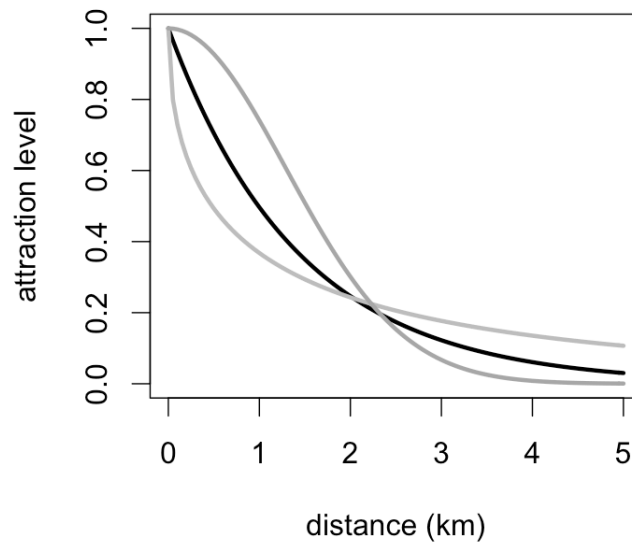
# Distance and number of visits



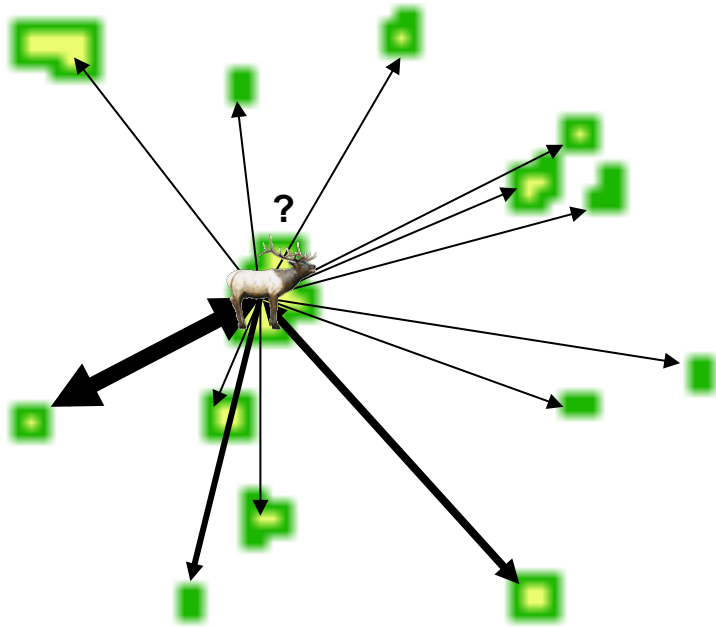
$$\delta_{ij} = \exp(-ar_{ij}^b),$$

$$\mu_{ij} = \begin{cases} \exp(-ct) & \text{if } v_j = 0 \\ 1 - \exp(-gv_j^h) & \text{otherwise} \end{cases}$$

$$D = \frac{\delta \times \mu}{\sum \delta \times \mu}$$



# Distance and "edge" use



$$\delta_{ij} = \exp(-ar_{ij}^b),$$

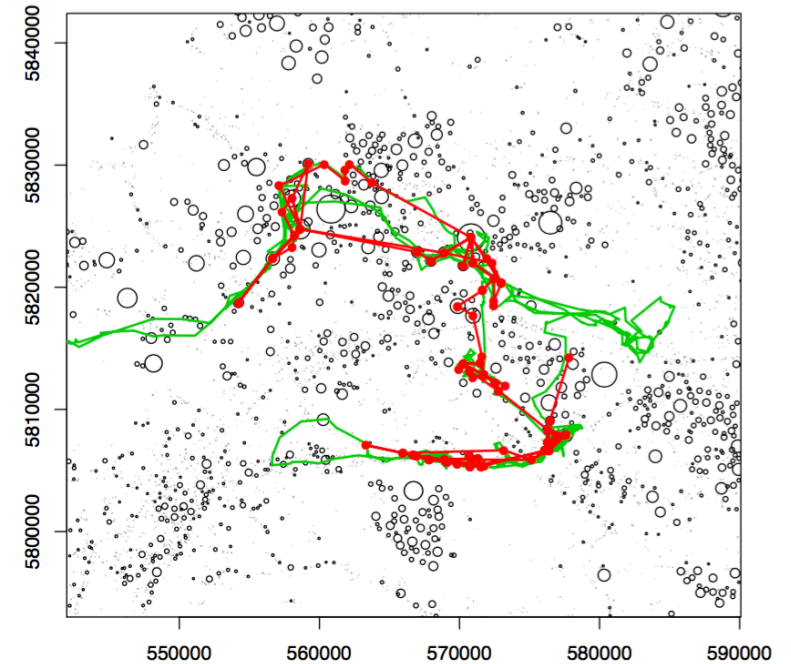
$$\mu_{ij} = \begin{cases} \exp(-ct) & \text{if } v_j = 0 \\ 1 - \exp(-gv_j^h) & \text{otherwise} \end{cases}$$

if  $v_j = 0$   
otherwise

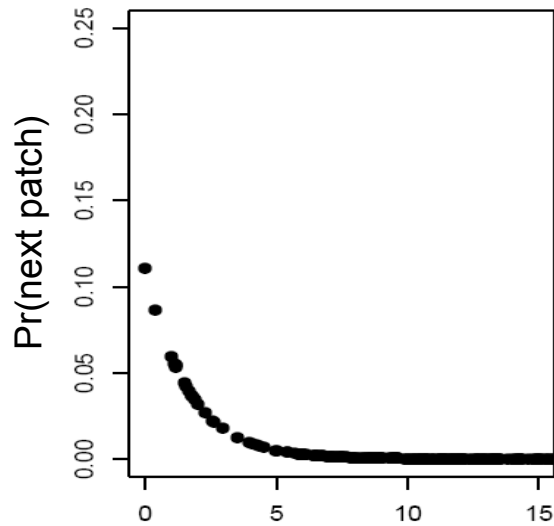
$$D = \frac{\delta \times \mu}{\sum \delta \times \mu}$$

# e.g. elk 4015

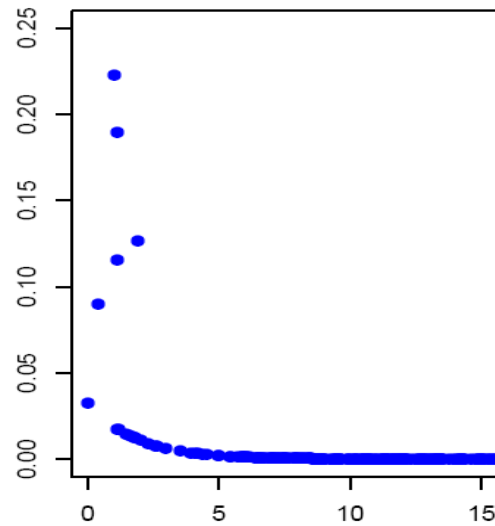
- Distribution of probabilities of being chosen for all patches at the last observed movement according to:



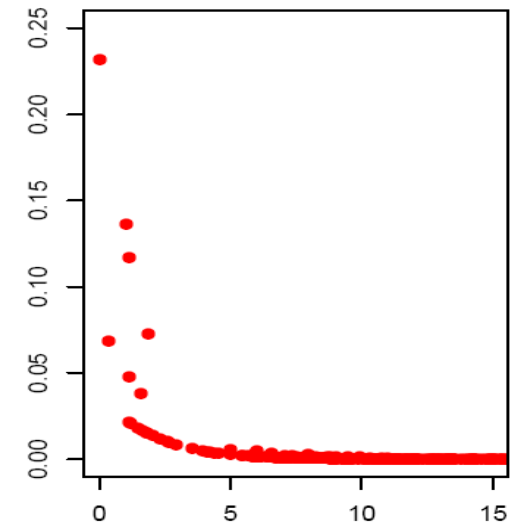
Distance Only



Node Use



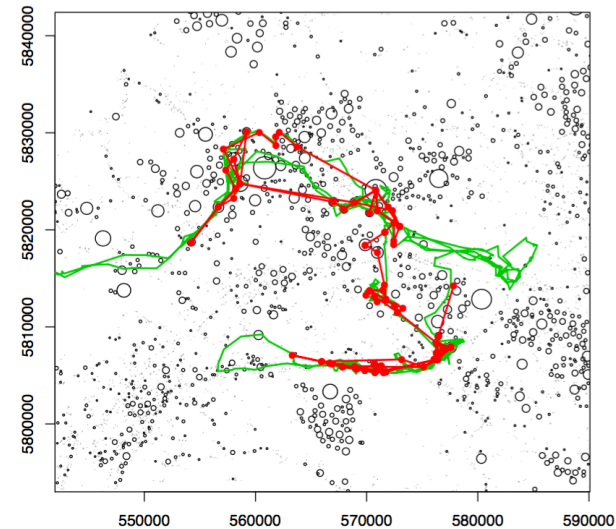
Edge Use



Distance (km)

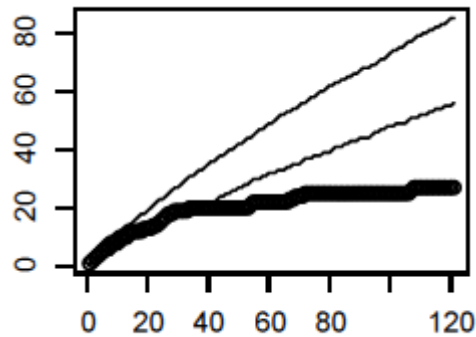
# Checking Emergent Properties

- Models fitted using Maximum Likelihood
- Model comparison using AIC shows that reinforcing “nodes” or “edges” fits equally well to the data
- But they are NOT equivalent!

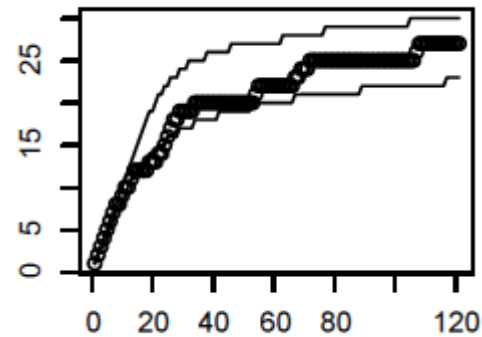


Unique Patches visited

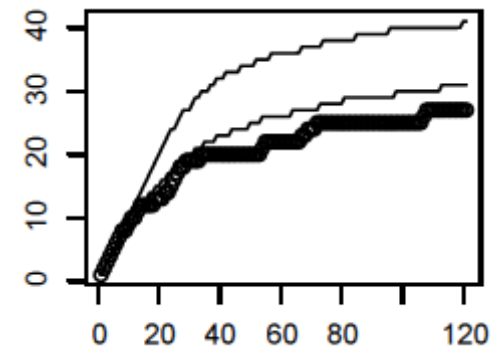
Distance



Nodes



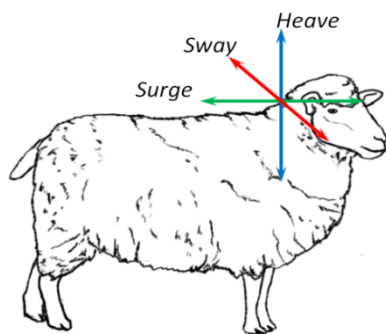
Edges



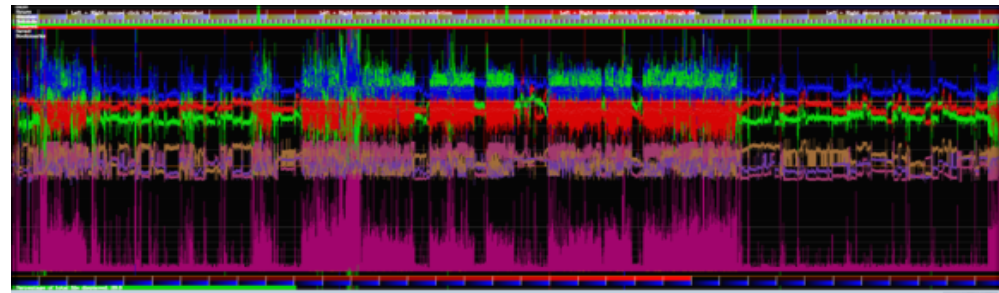
# of moves

# Even Bigger Models with More Sources of Data?

- Through **Biotelemetry** we can get lots of “extra” data
- For example, accelerometers can help in the identification of behavioral states



Acceleration ( $\text{m s}^{-2}$ )

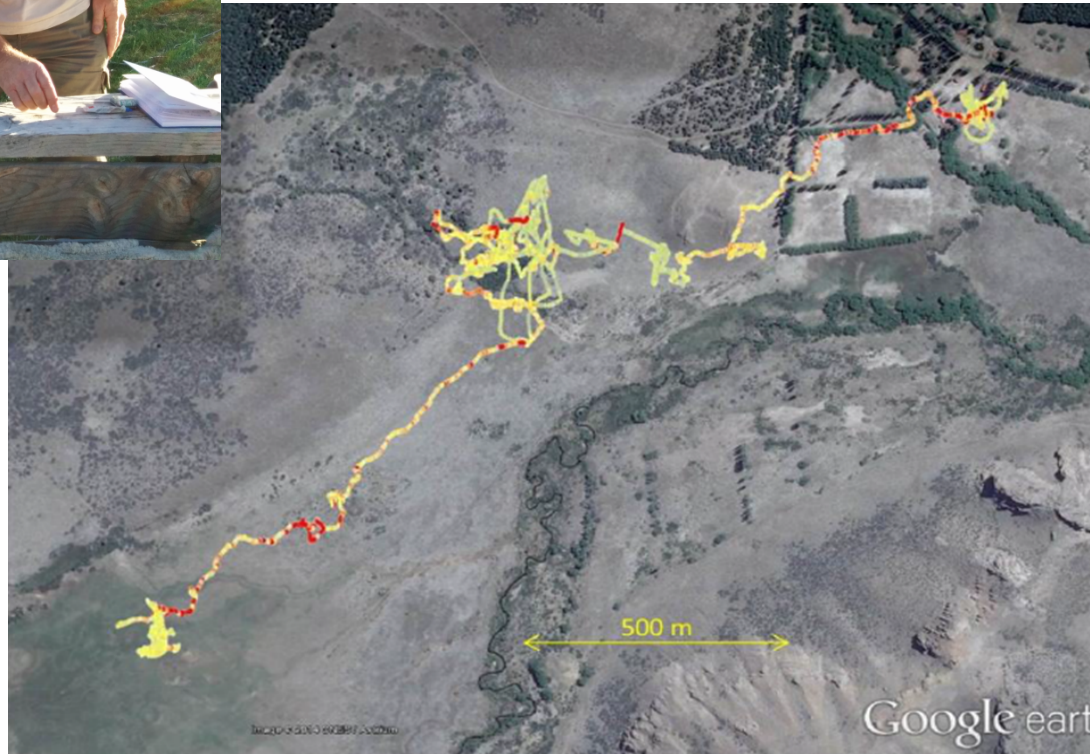


Time (seconds)

# Accelerometers and GPS



Agustina diVirgilio  
Sergio Lambertucci  
Rory Wilson

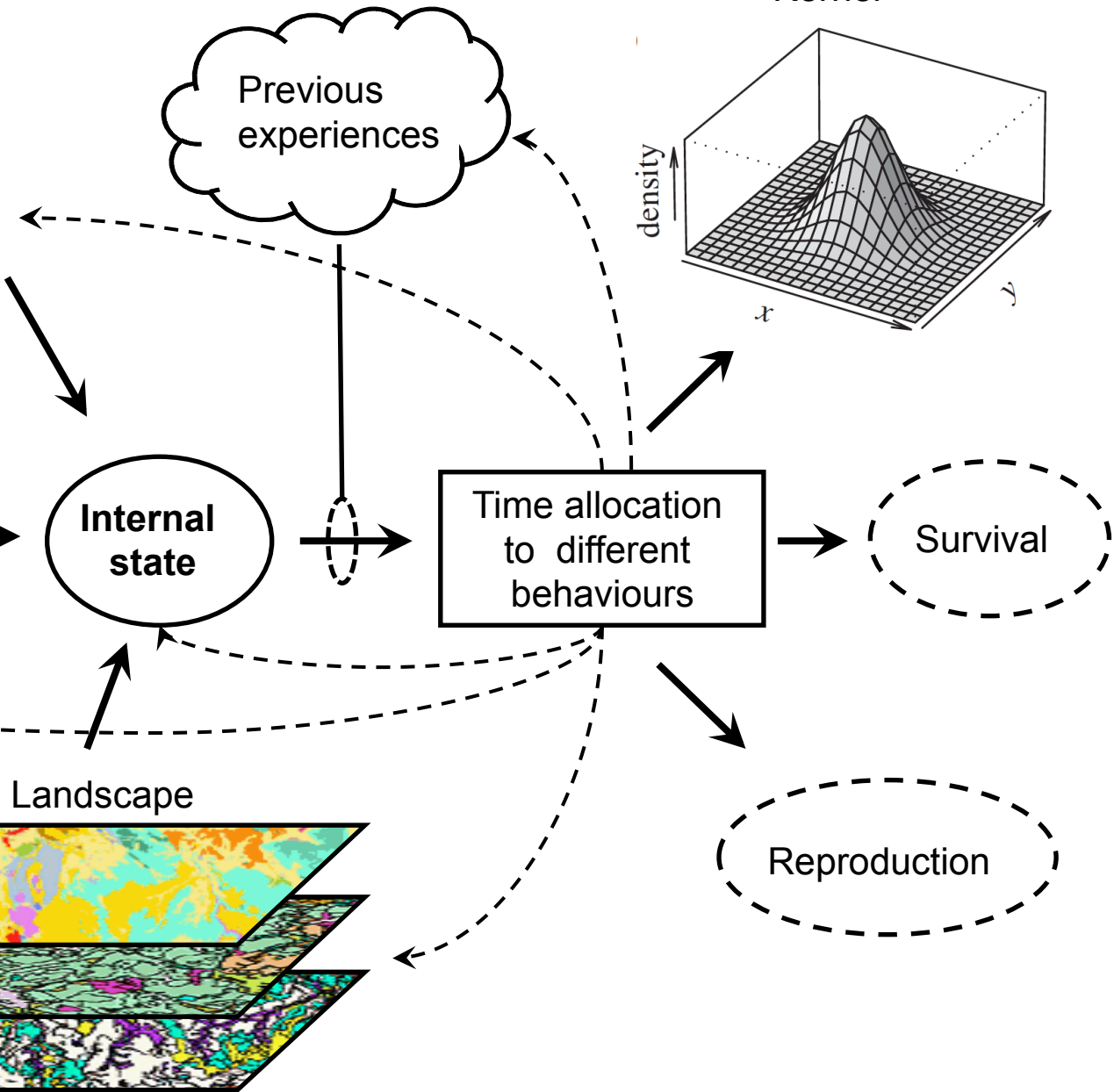




Other species



Other individuals



**and now it's time for something  
completely different**





# Seed Dispersal by Thrushes in Northern Spain



- Collaboration with Daniel García (Universidad de Oviedo) and Tomás Carlo (Penn State)



**Reports**  
Where do seeds go when they go far? Distance and directionality of avian seed dispersal in heterogeneous landscapes

**Articles**  
Precipitation legacies in desert grassland primary production occur through previous-year tiller density  
Experimental plant communities develop phylogenetically overdispersed abundance distributions during assembly  
Synchrony in dynamics of giant kelp forests is driven by both local recruitment and regional environmental controls



# Movement Sequences



*T. iliacus*



*T. philomelos*



*T. merula*



*T. pilaris*



*T. torquatus*



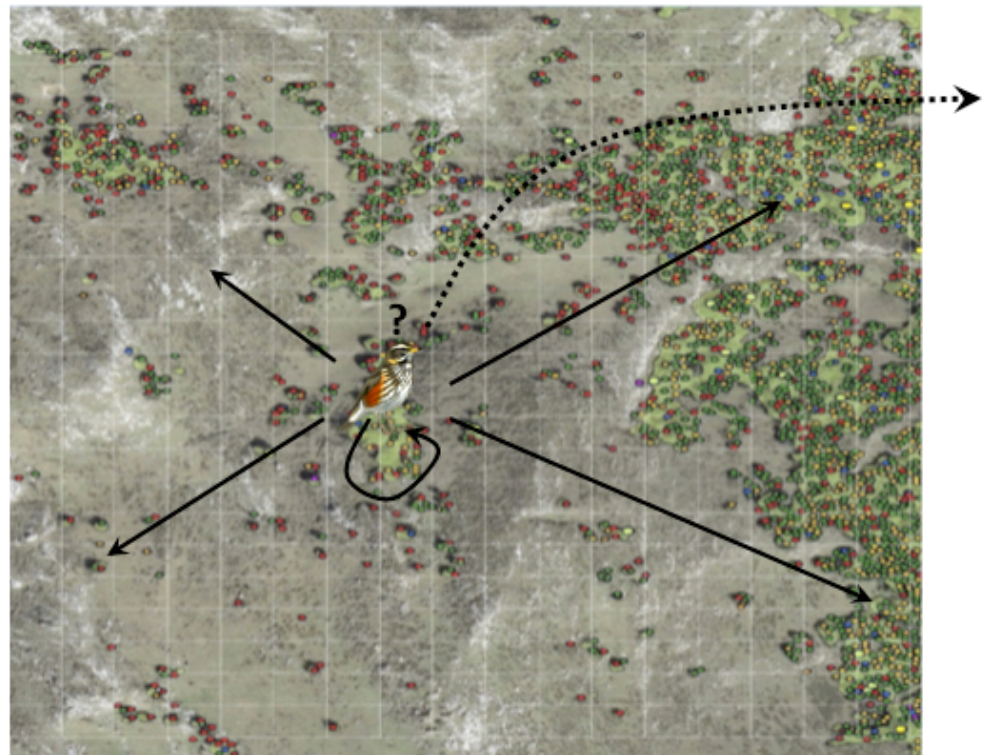
*T. viscivorus*



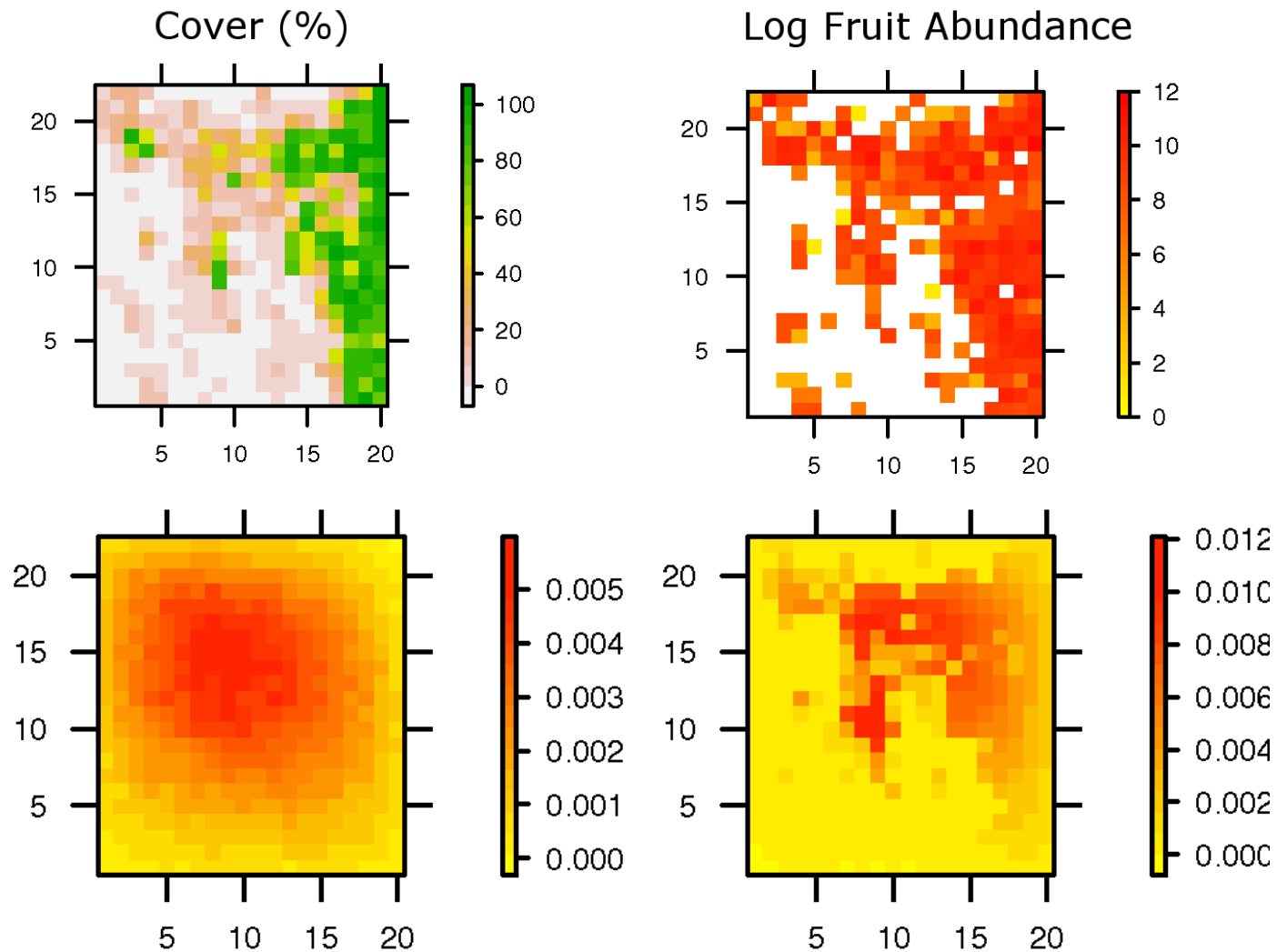
The Observers: Daniel García, José M. Herrera, Daniel Martínez and Javier Rodríguez-Pérez

# Bird Movement and Seed Dispersal

- Model:
  - Time perching
  - Fruit consumption
  - Gut passage time
  - Movement as function of distance, vegetation cover and fruit abundance
  - Movement time



# Importance of Bias

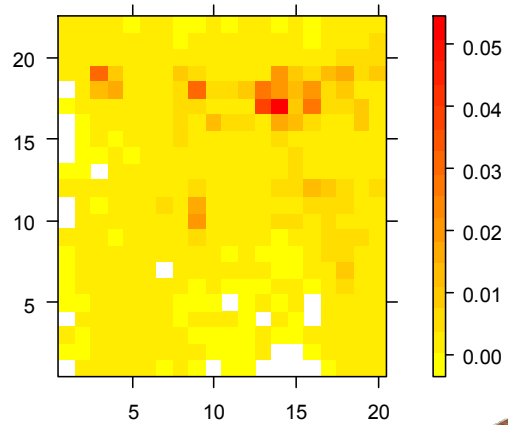




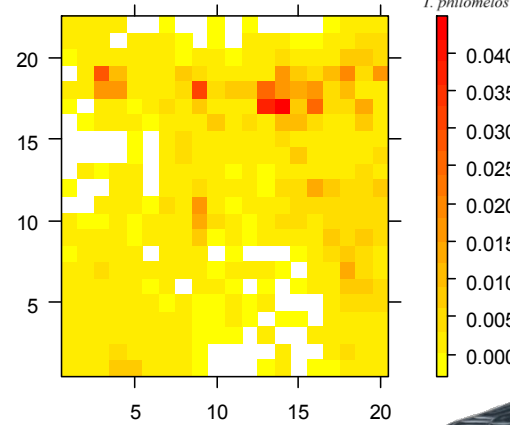
# Seed Rain by Bird Species



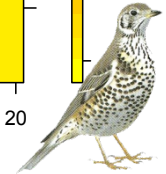
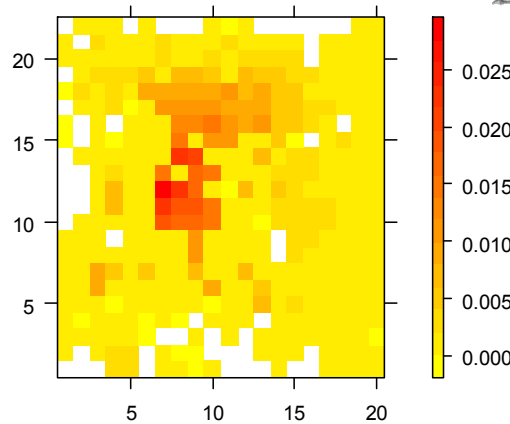
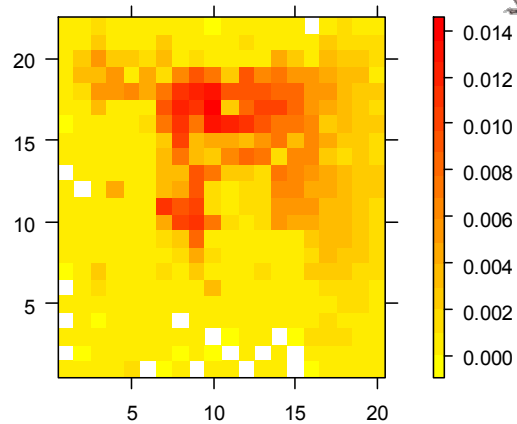
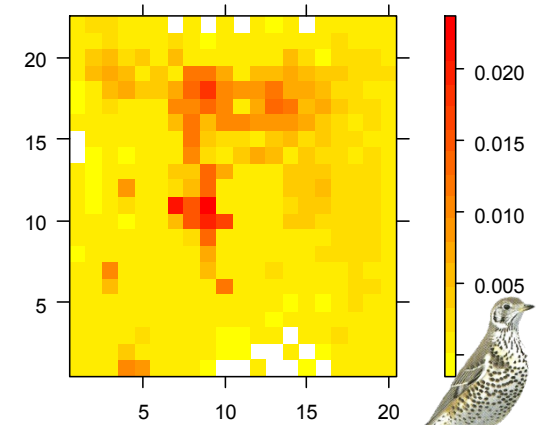
*T. iliacus*



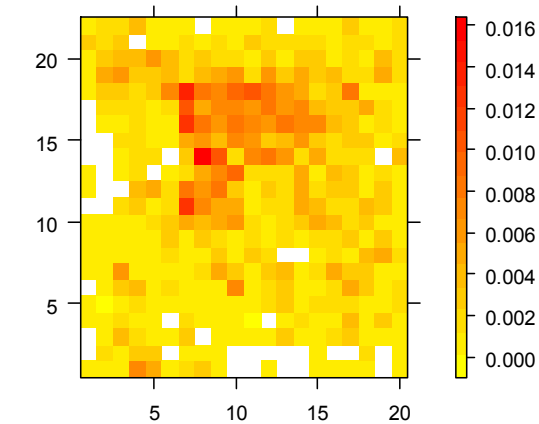
*T. philomelos*



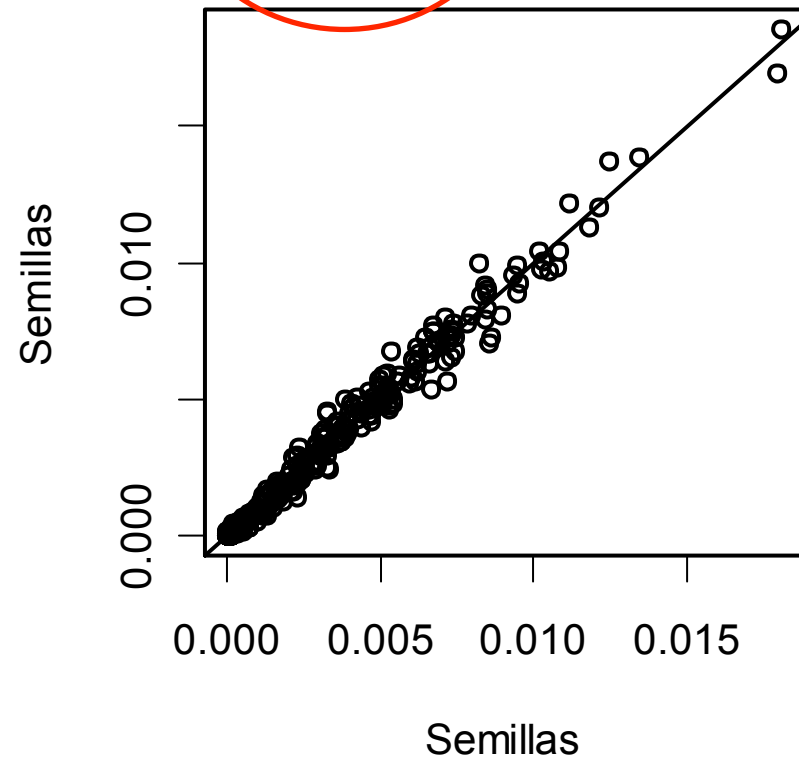
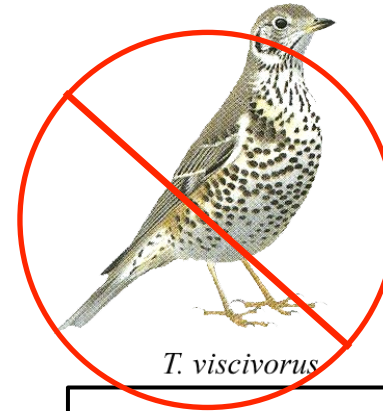
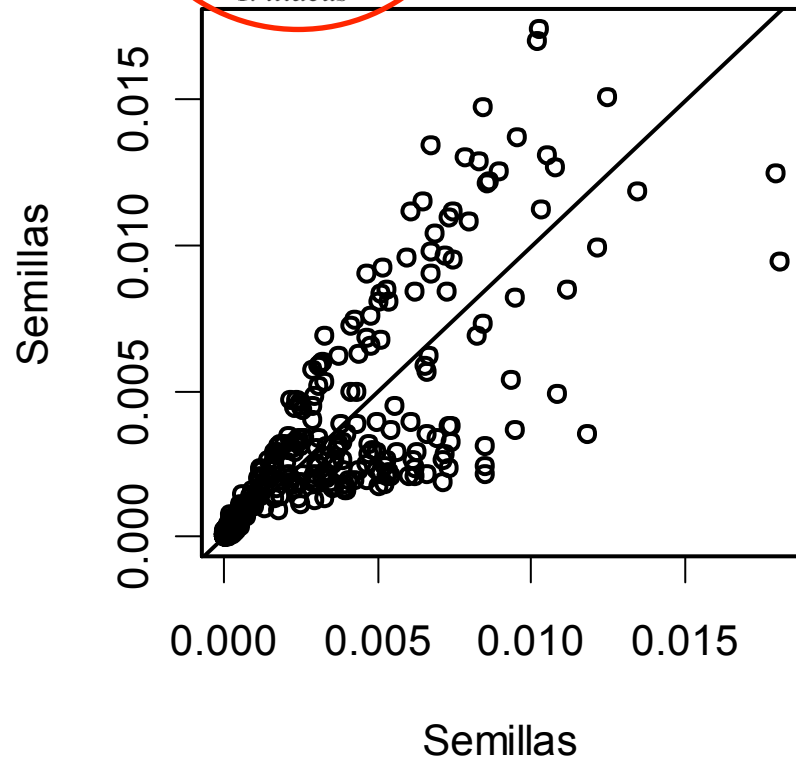
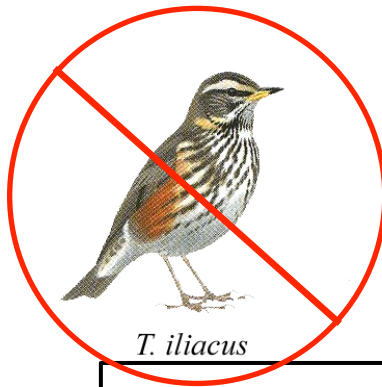
*T. merula*



*T. viscivorus*



# Changes in the Community of Dispersers



# Summary

- We should pay attention to different aspects of movement, including “emergent” properties
- Persistence might not be enough. Biased random walks more realistic in many conditions
- Memory (reinforcement) important for patterns of space use



Thanks!

<https://sites.google.com/site/pajarom/>

