

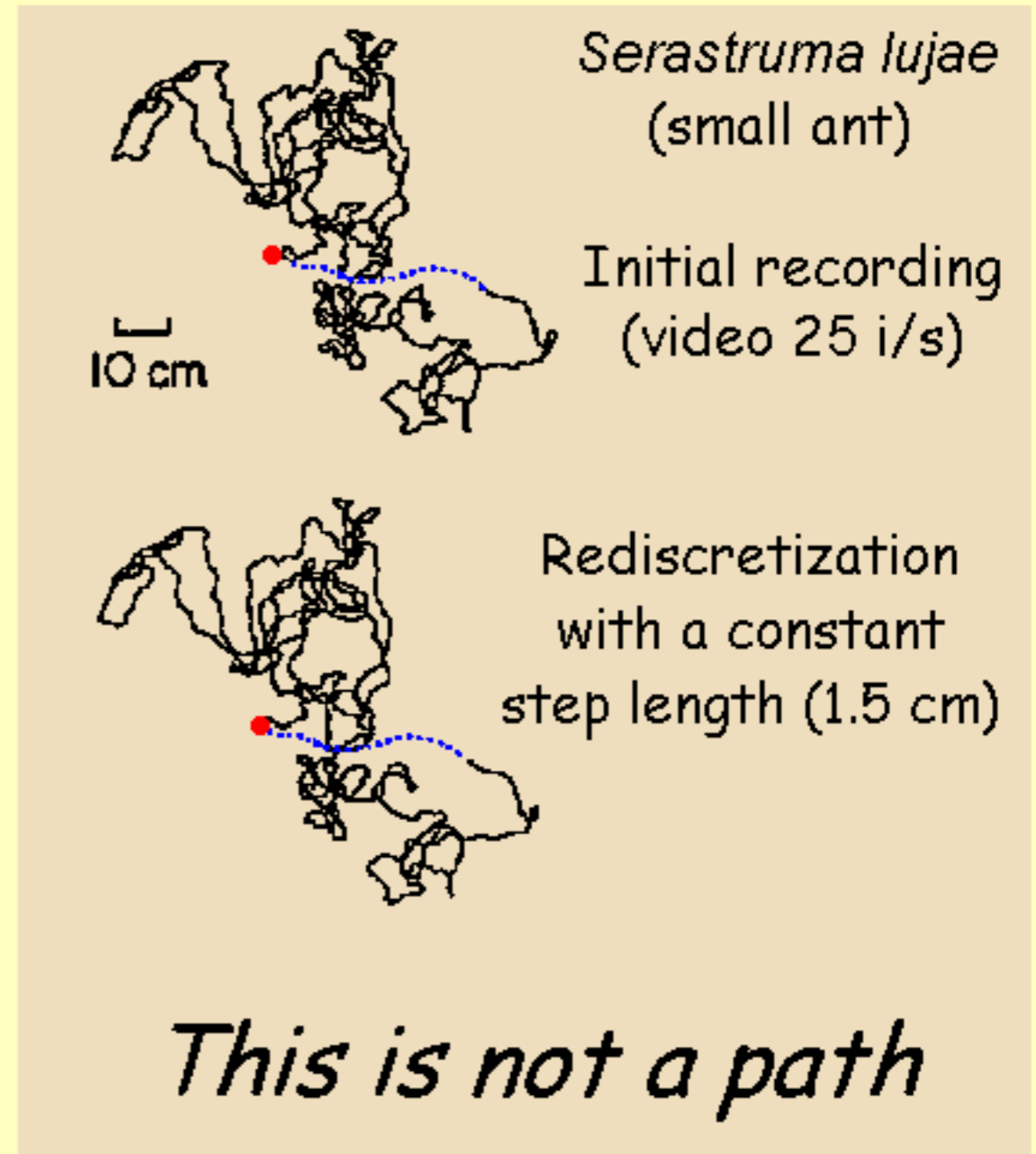
*On stationary researchers  
looking at moving animals*

# STATIONARITY AND SCALES IN ANIMAL MOVEMENTS

Simon Benhamou  
CEFE - CNRS Montpellier

**PATTERN  
OR  
PROCESS ?**

# Real World vs. World Models



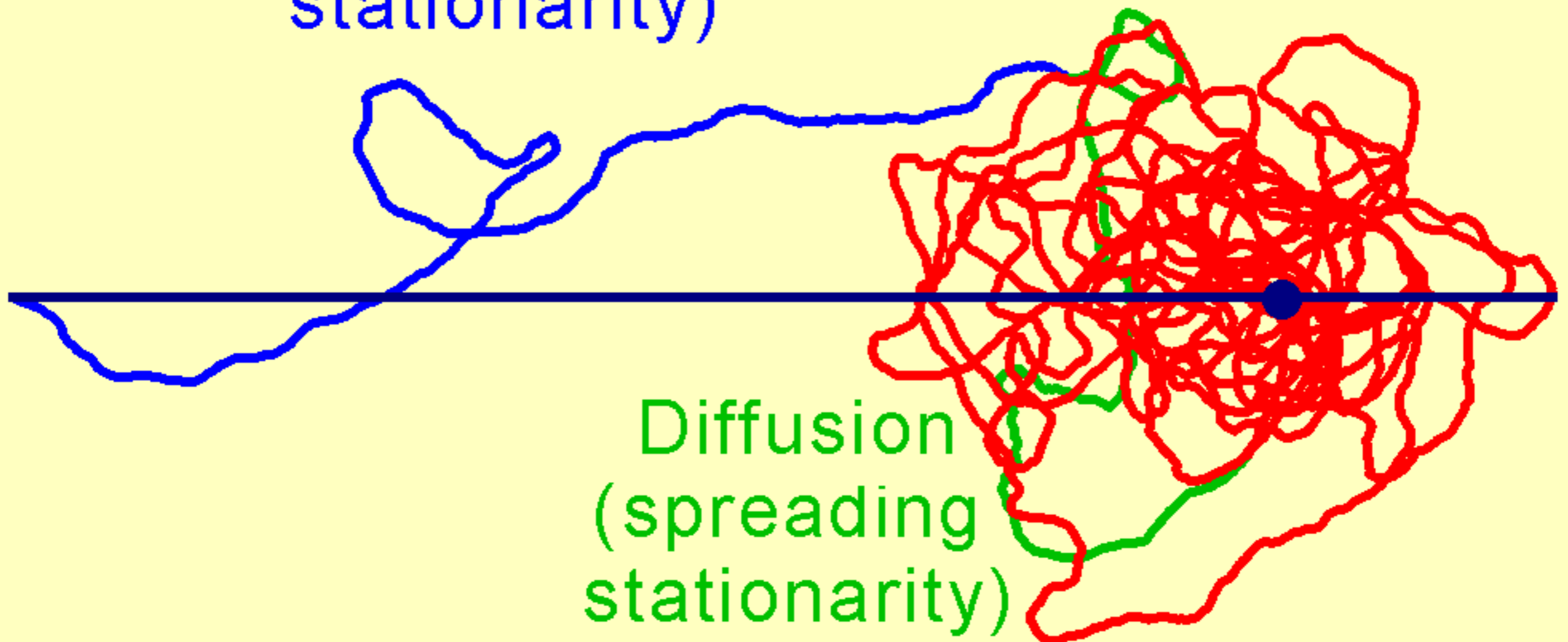
Movement Process => Pattern (path) => Path representation

inference

# Various patterns generated by ... a single process

Advection  
(direction  
stationarity)

Search-loops  
(location  
stationarity)

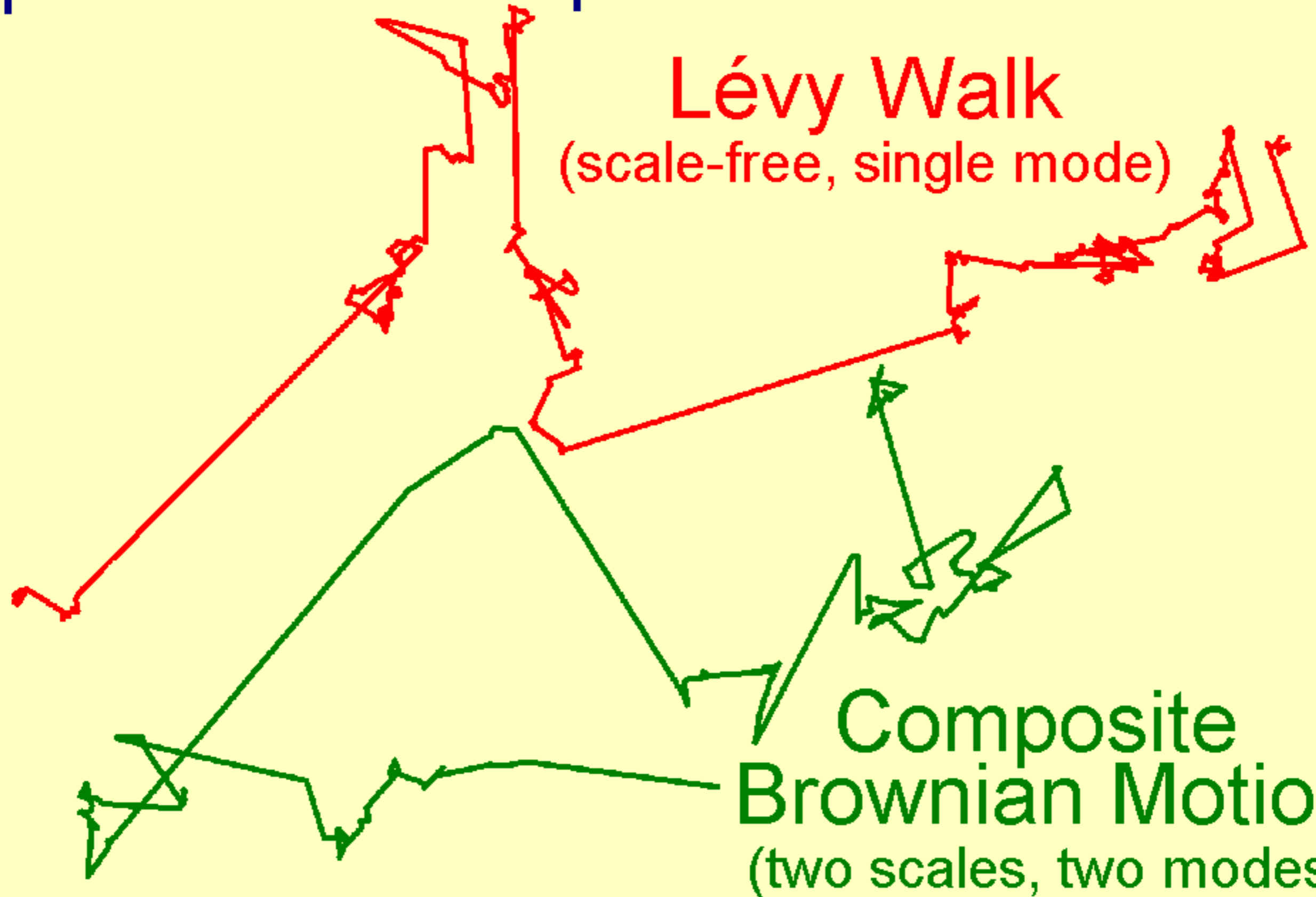


Diffusion  
(spreading  
stationarity)

# Similar patterns generated by ... quite different processes

Lévy Walk

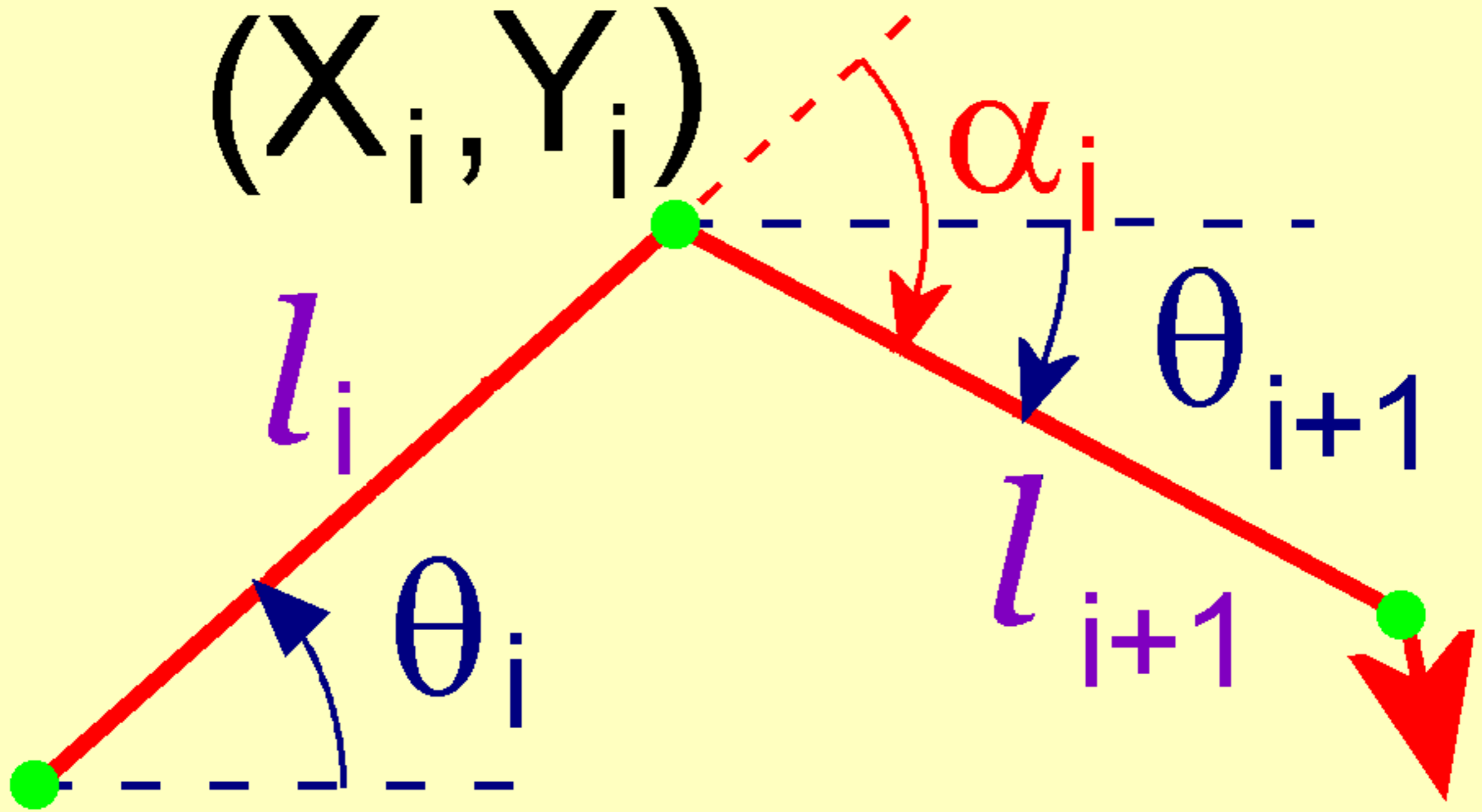
(scale-free, single mode)



Composite  
Brownian Motion  
(two scales, two modes)

# Sampling issue:

key path variables depend on the sampled locations in a complex way



key path **variables** (steps, turning angles)  
are just mathematical tools to represent  
animal paths in a tractable way

For a given scale and behavioural mode,  
key path **parameters** are:

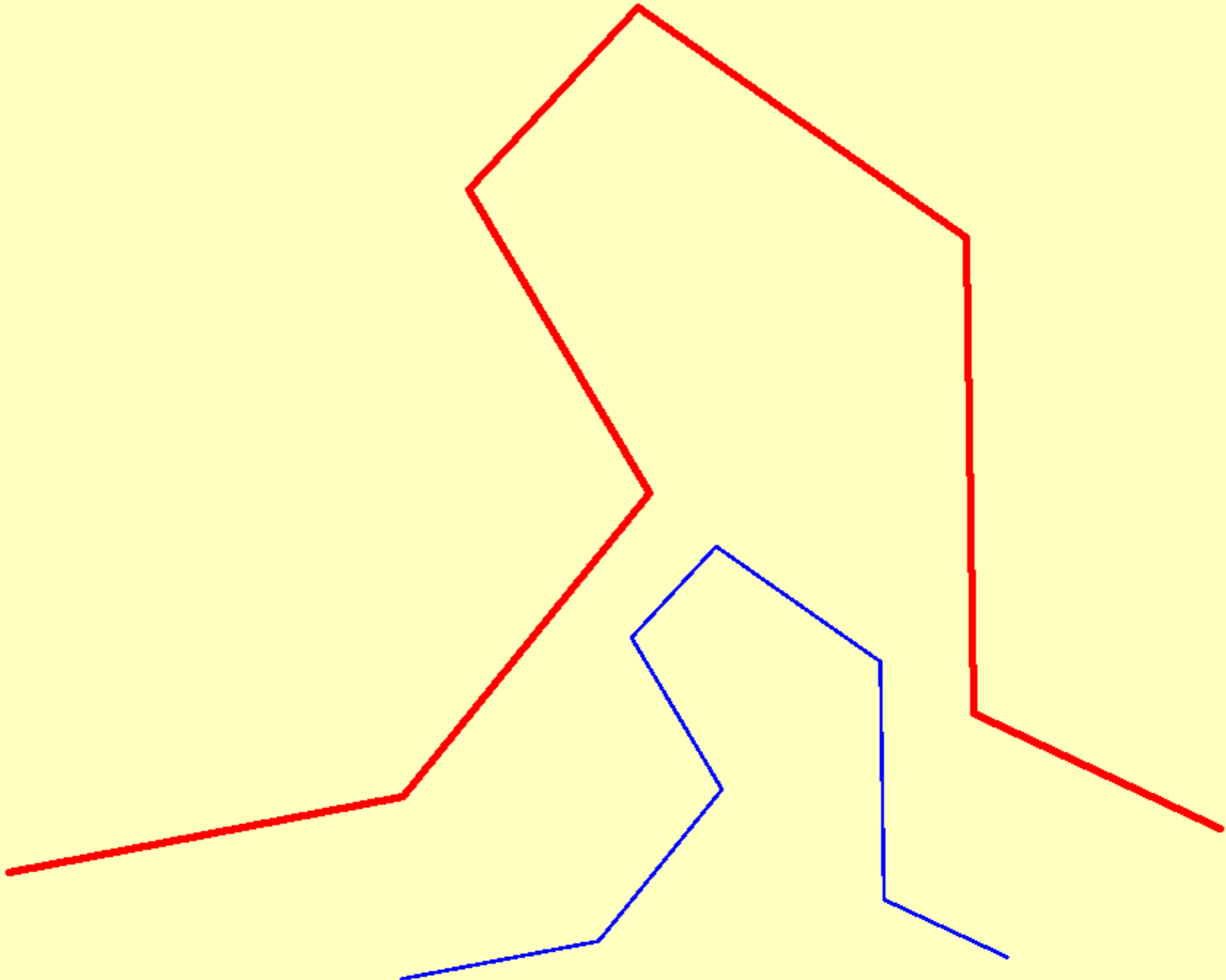
- persistence (inertia): local directional bias
- goal attractiveness: global directional bias
- stochasticity level

**=> Modelling animal paths as**  
Multi-scale and multi-mode  
Biased Correlated Random Walks

**STATIONARITY  
AND  
OBSERVATION SCALES**



"Scaling" effect



African buffalo

3-day tracking (30 km)

A location every 5 min.

"Sampling" effect

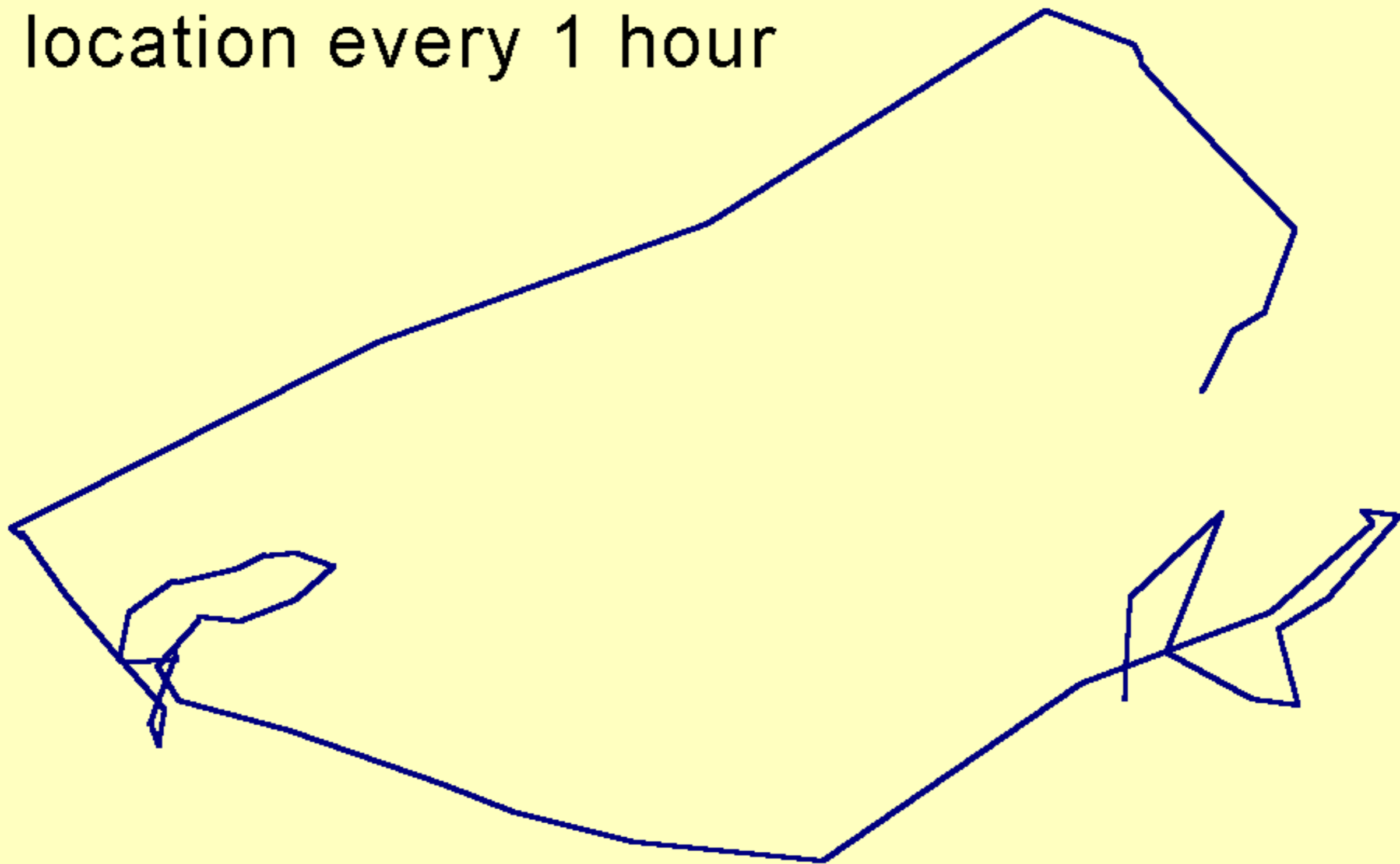


African buffalo

3-day tracking (30 km)

A location every 1 hour

"Sampling" effect

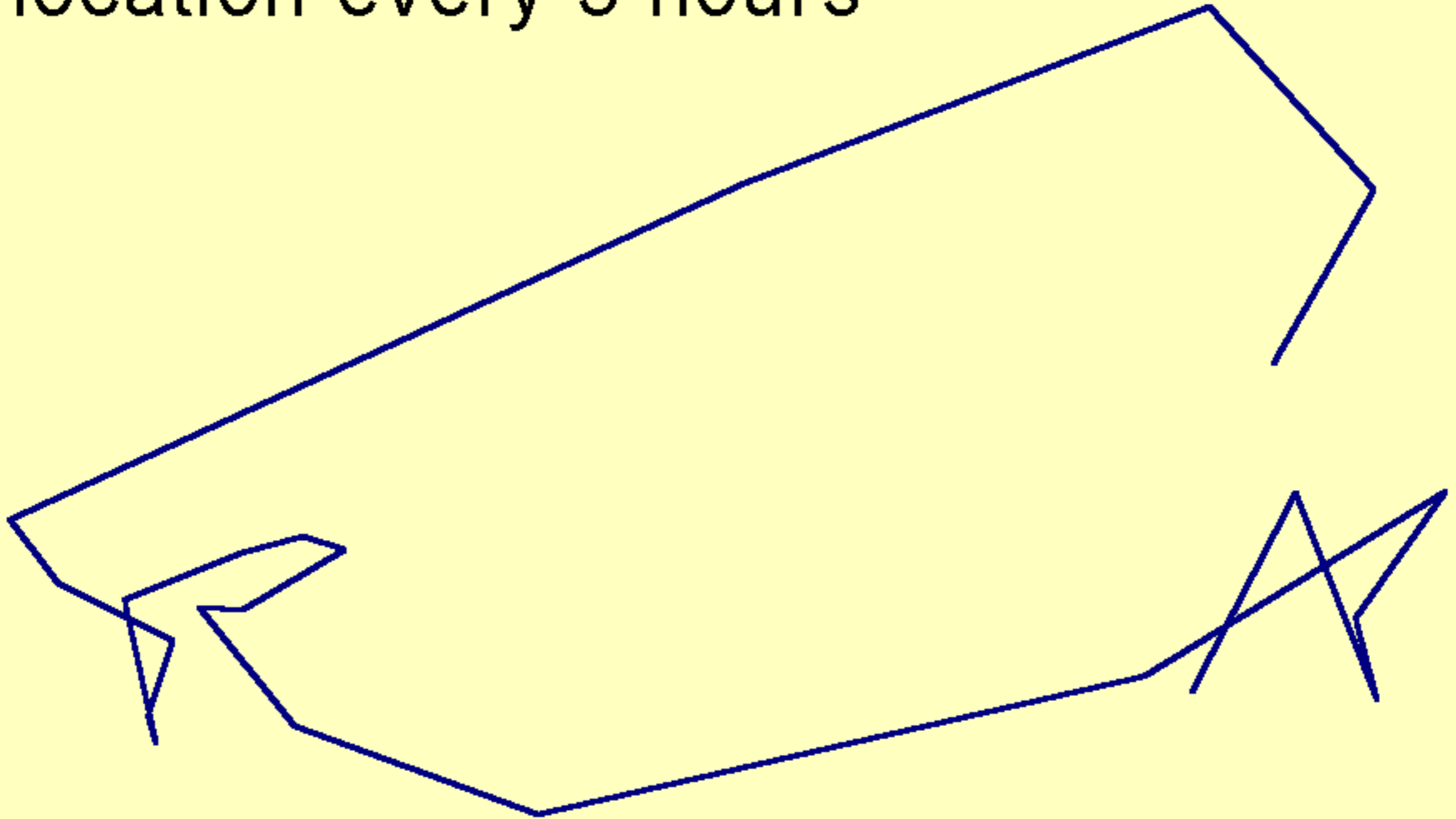


African buffalo

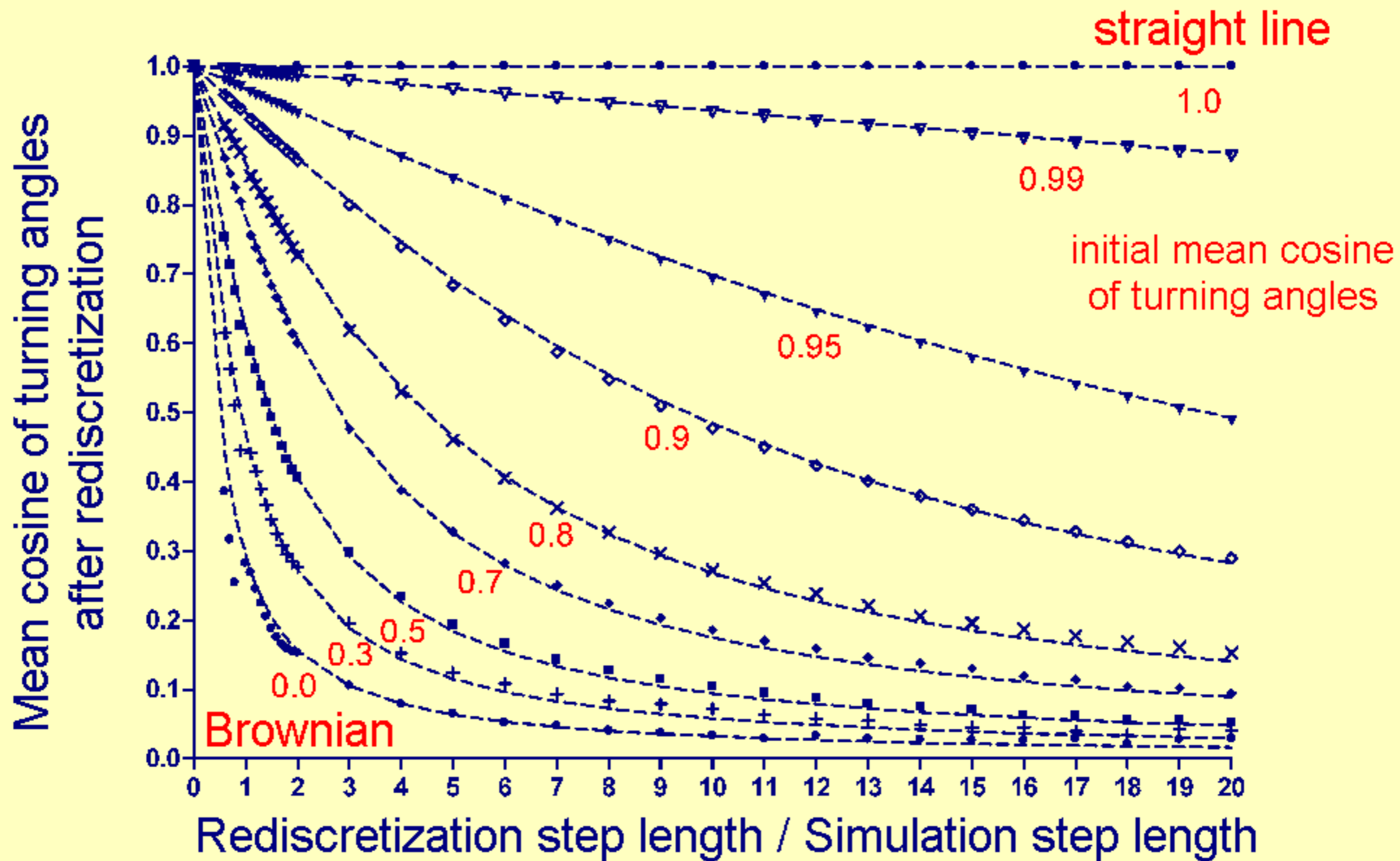
"Sampling" effect

3-day tracking (30 km)

A location every 3 hours



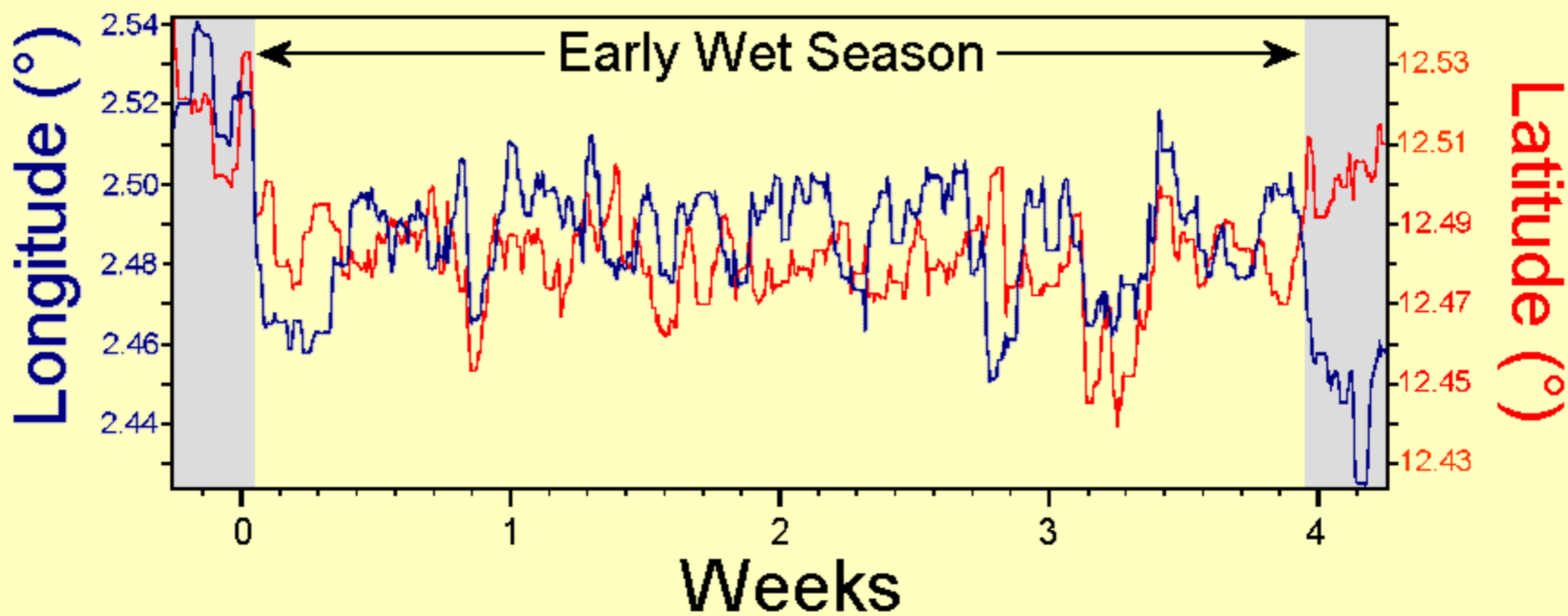
# Quantification of homogeneous search paths: Integrating turning angles and step length distributions



**STATIONARITY  
AND  
BIOLOGICAL SCALES**

# STATIONARITY: A SCALE-DEPENDENT CONCEPT

Movements of a GPS-tracked African buffalo in early wet season in the W Park, Niger (1 location every 30 min.)



# African buffalo

$D = 450 \text{ m}^2/\text{min}$

95  
90  
85  
80  
75  
70  
65  
60  
55  
50  
45  
40  
35  
30  
25  
20  
15  
10  
5

Preferences

R	.07
G	.14
A	.21
P	.57

Drift Speed

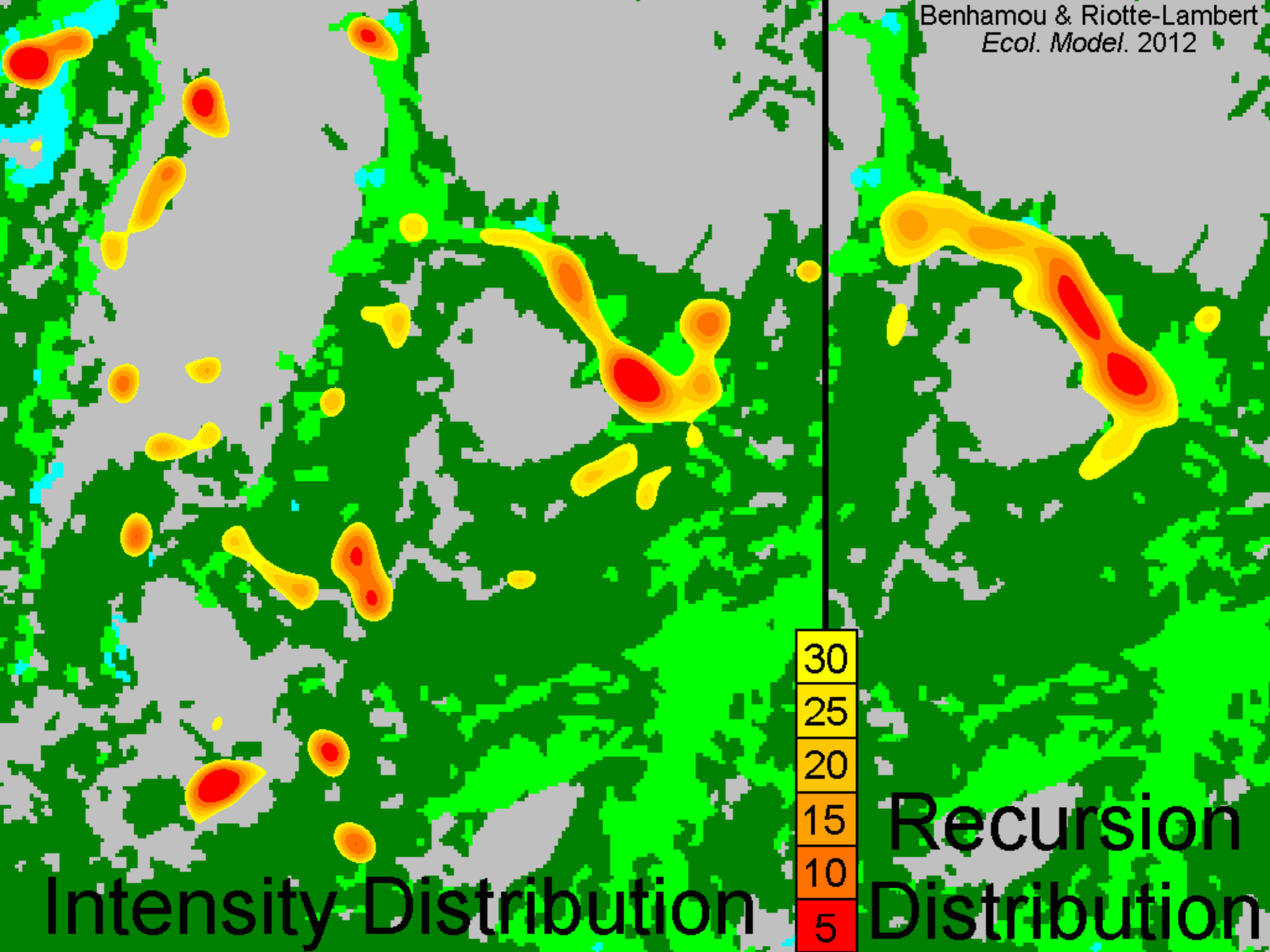
R	17
G	10
A	11
P	6

m/min

3 km

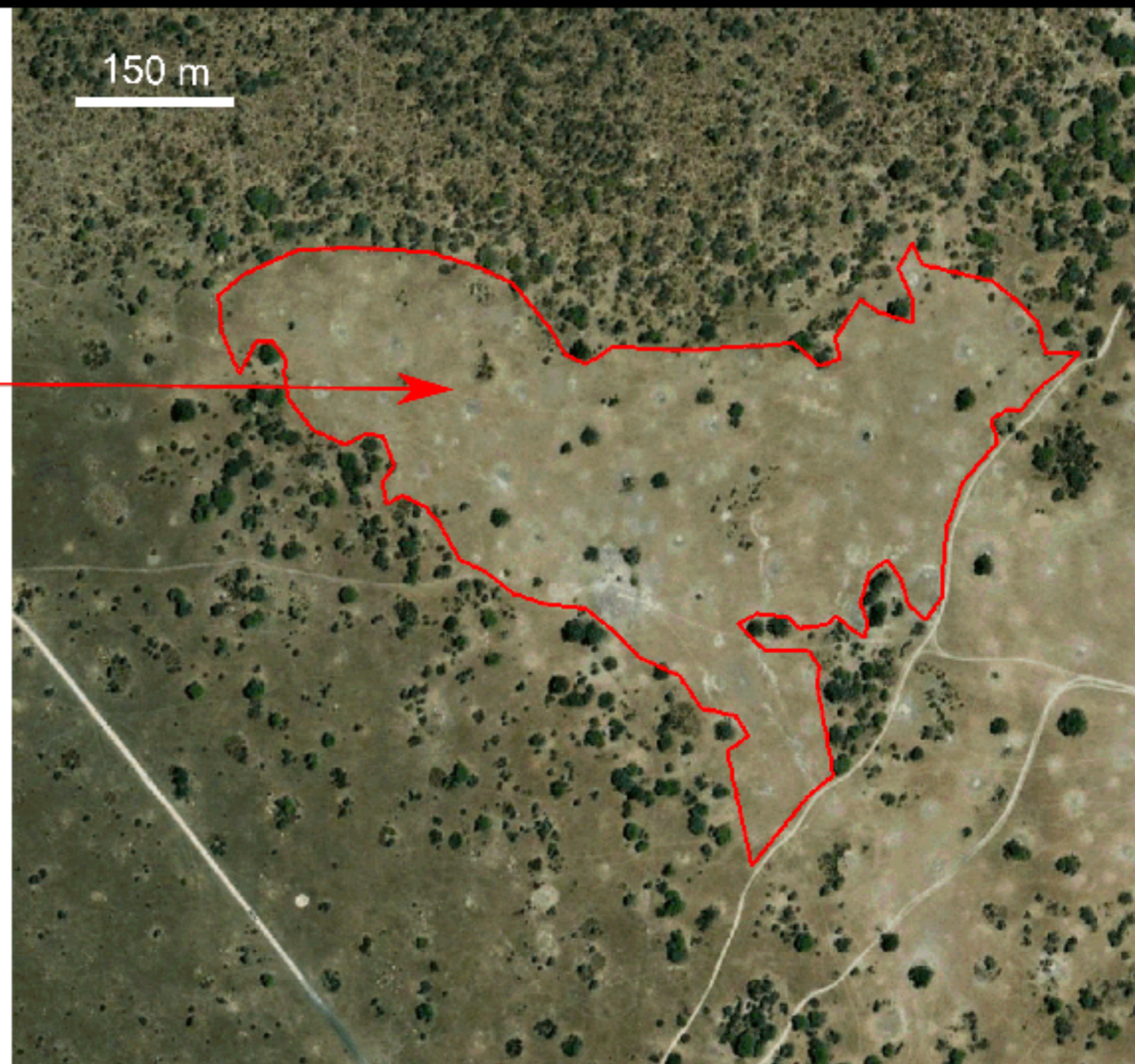
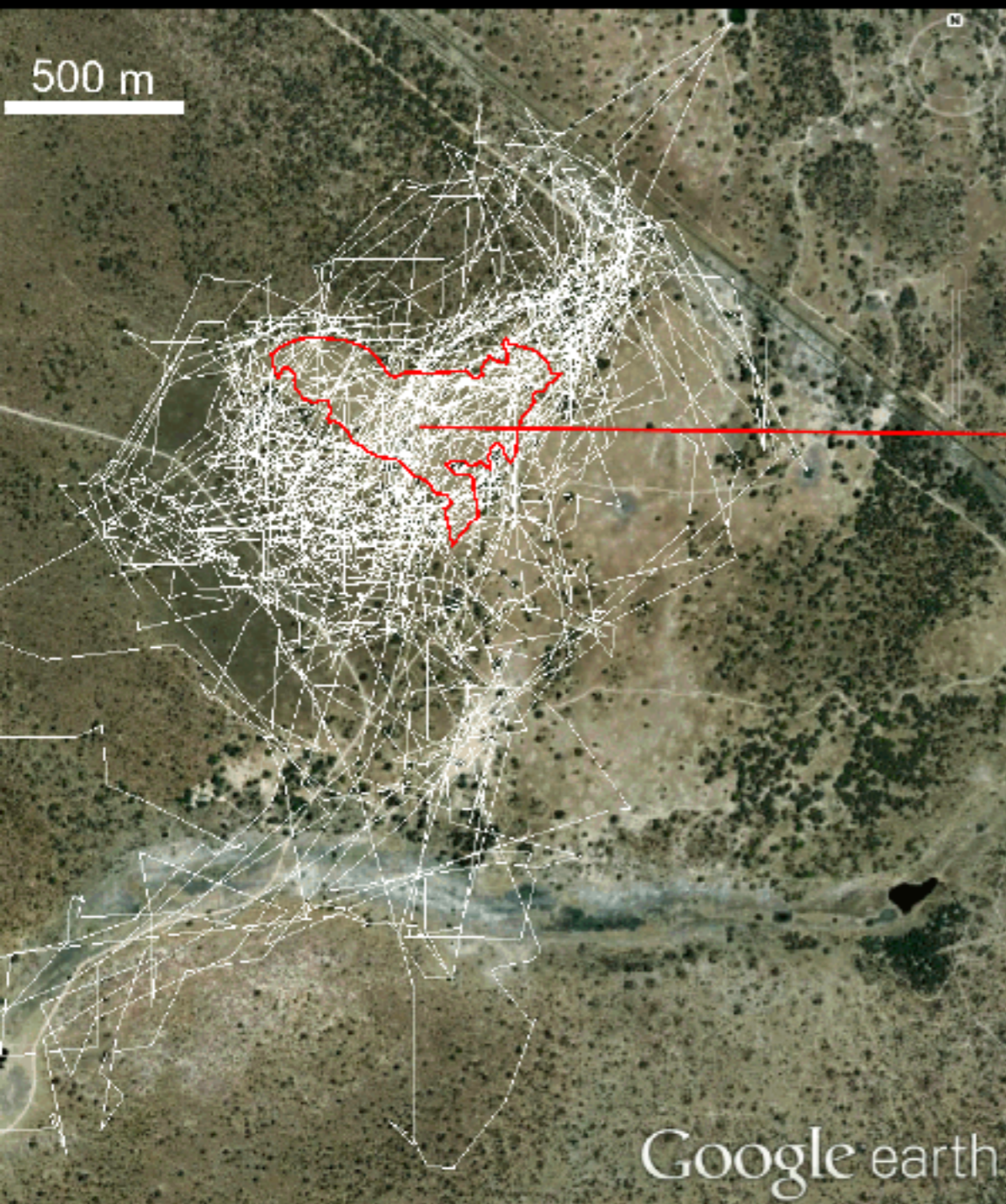
Benhamou,  
PLoS One  
2011

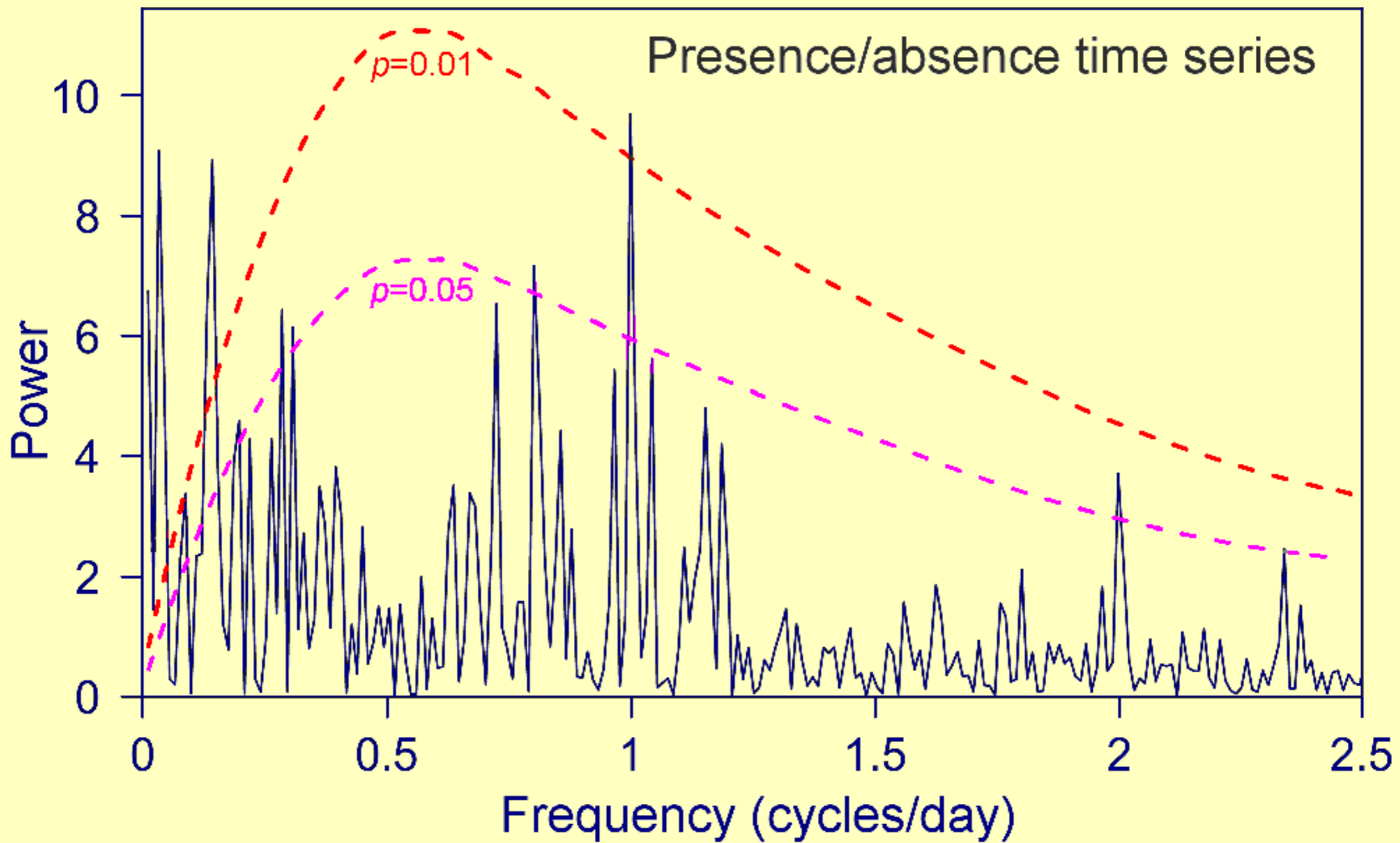


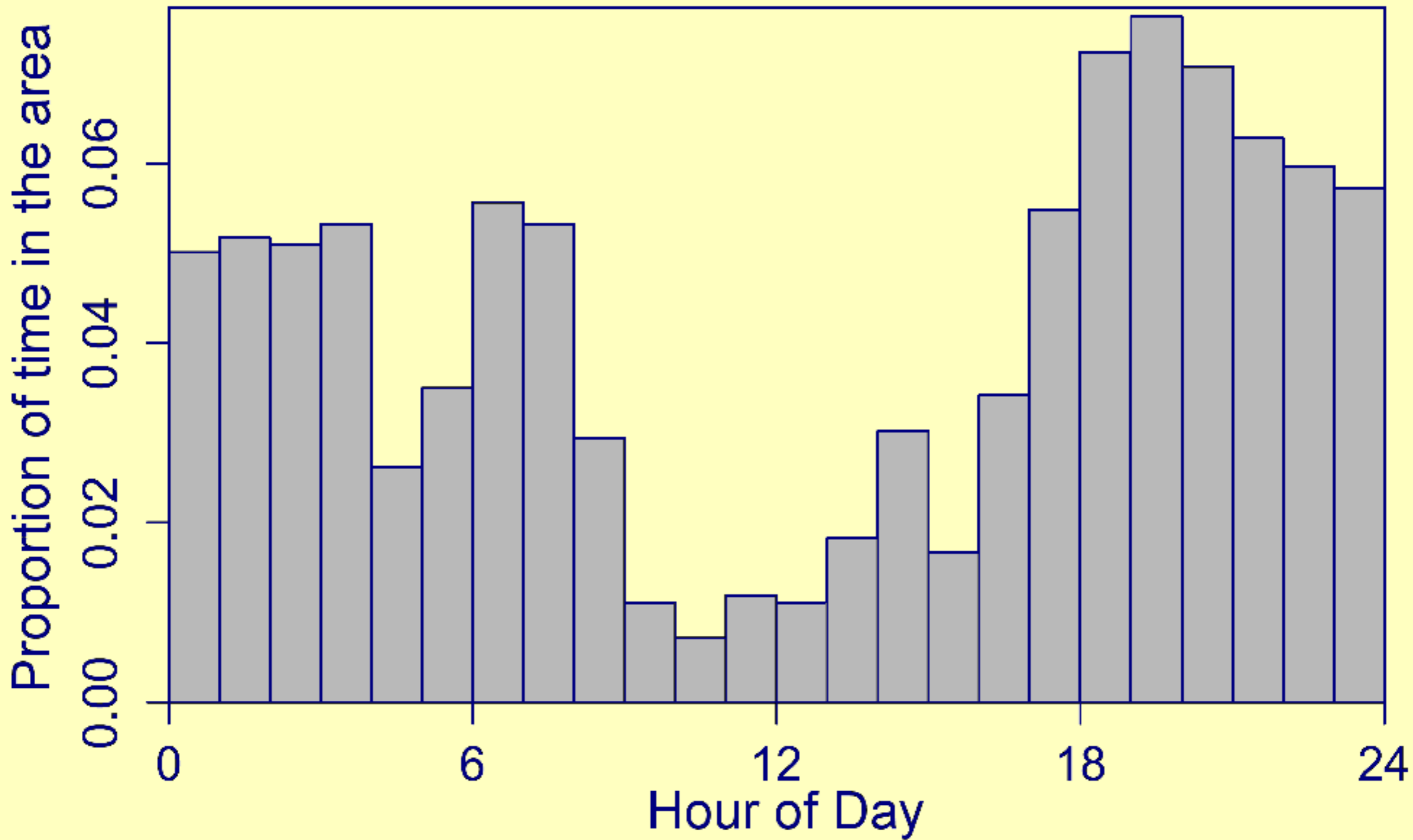


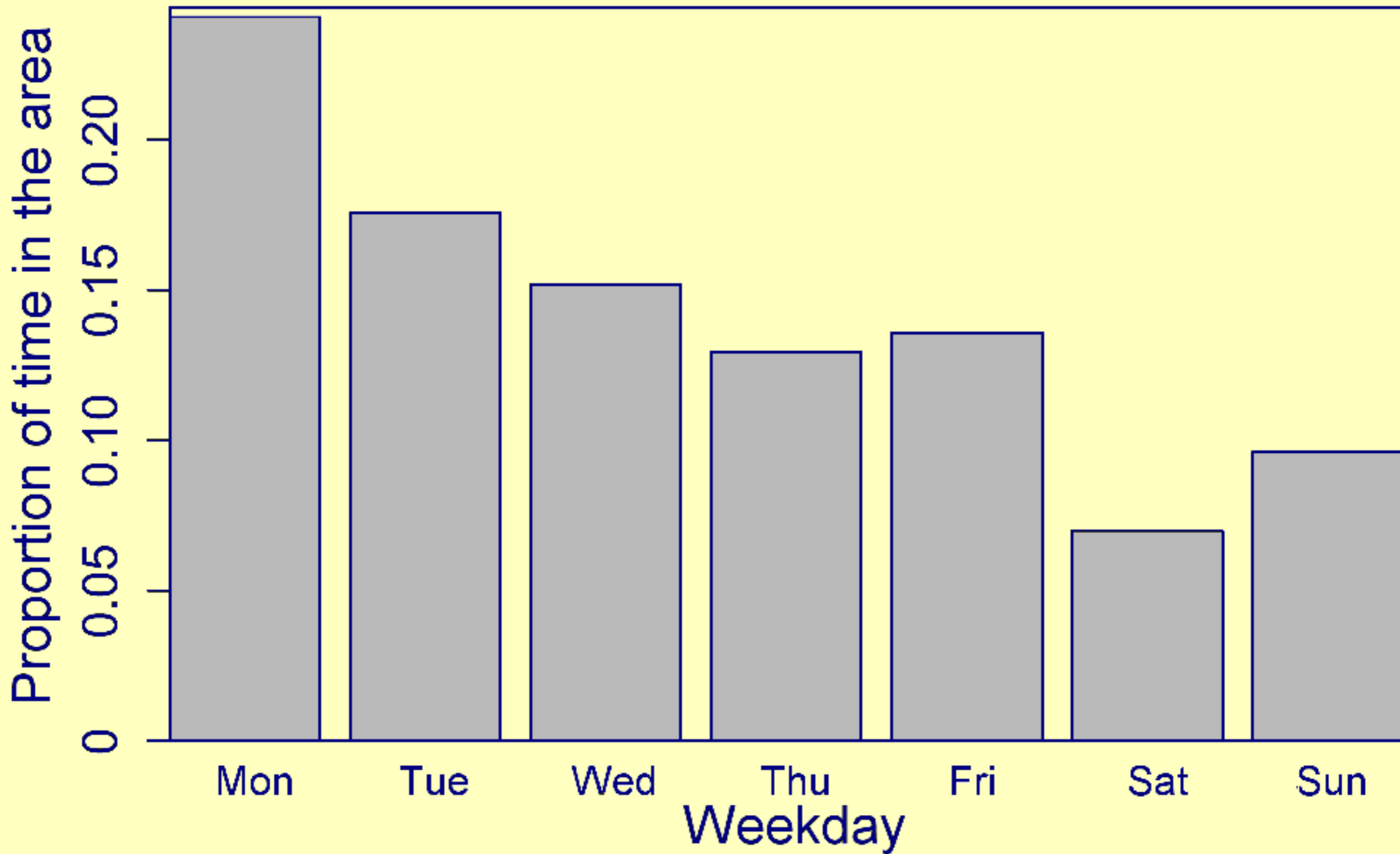
Intensity Distribution

Recursion  
Distribution

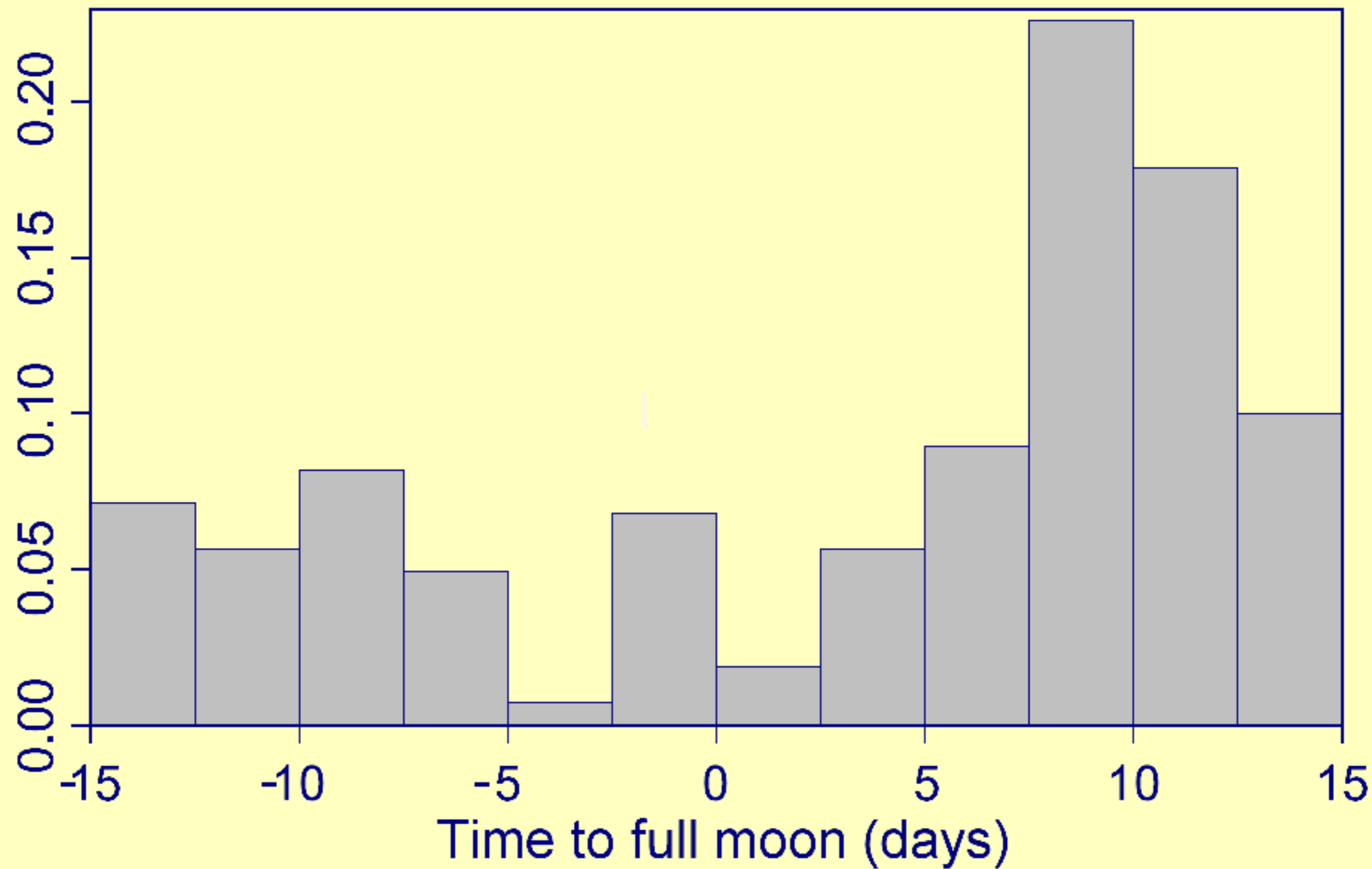


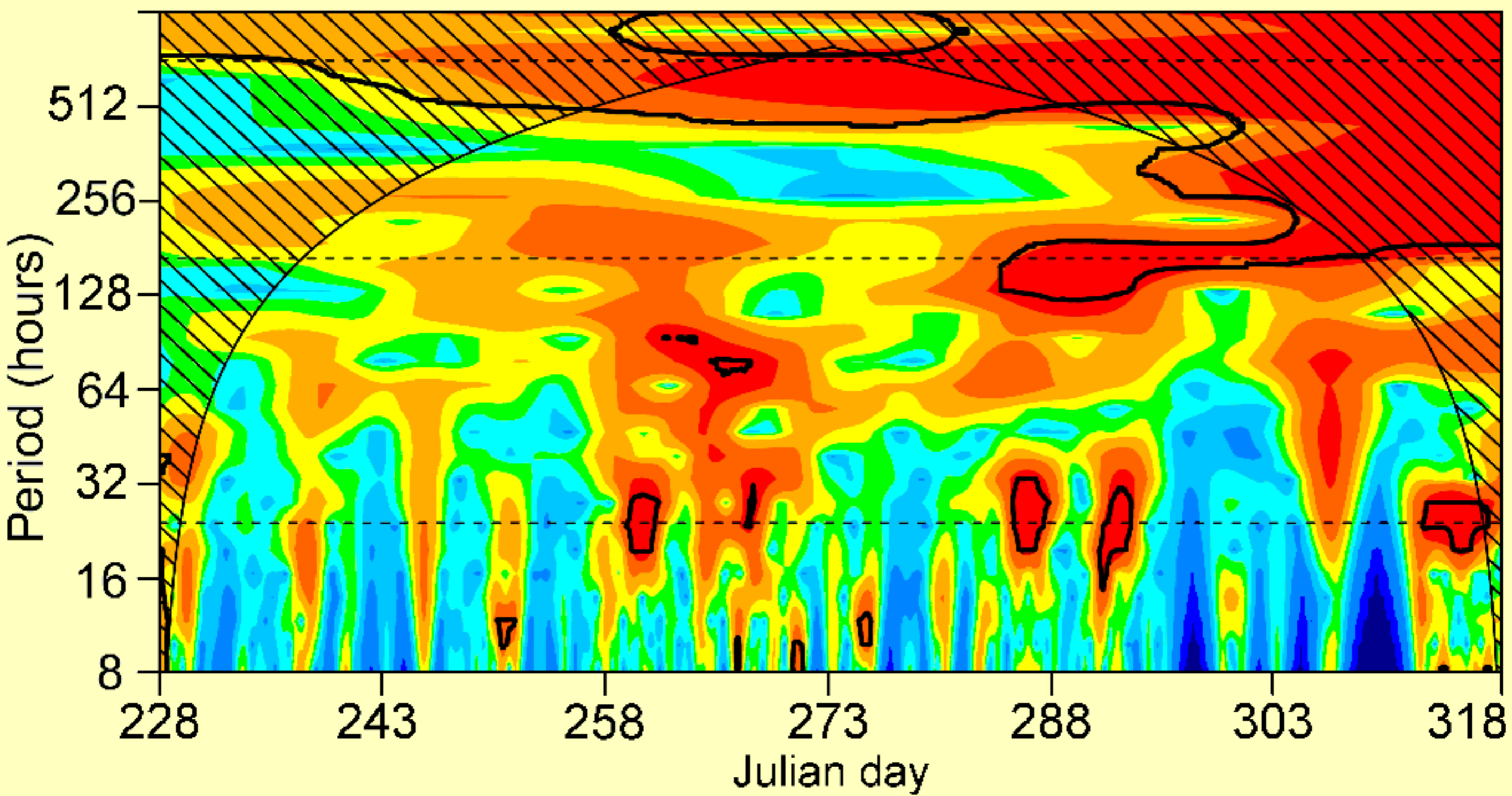


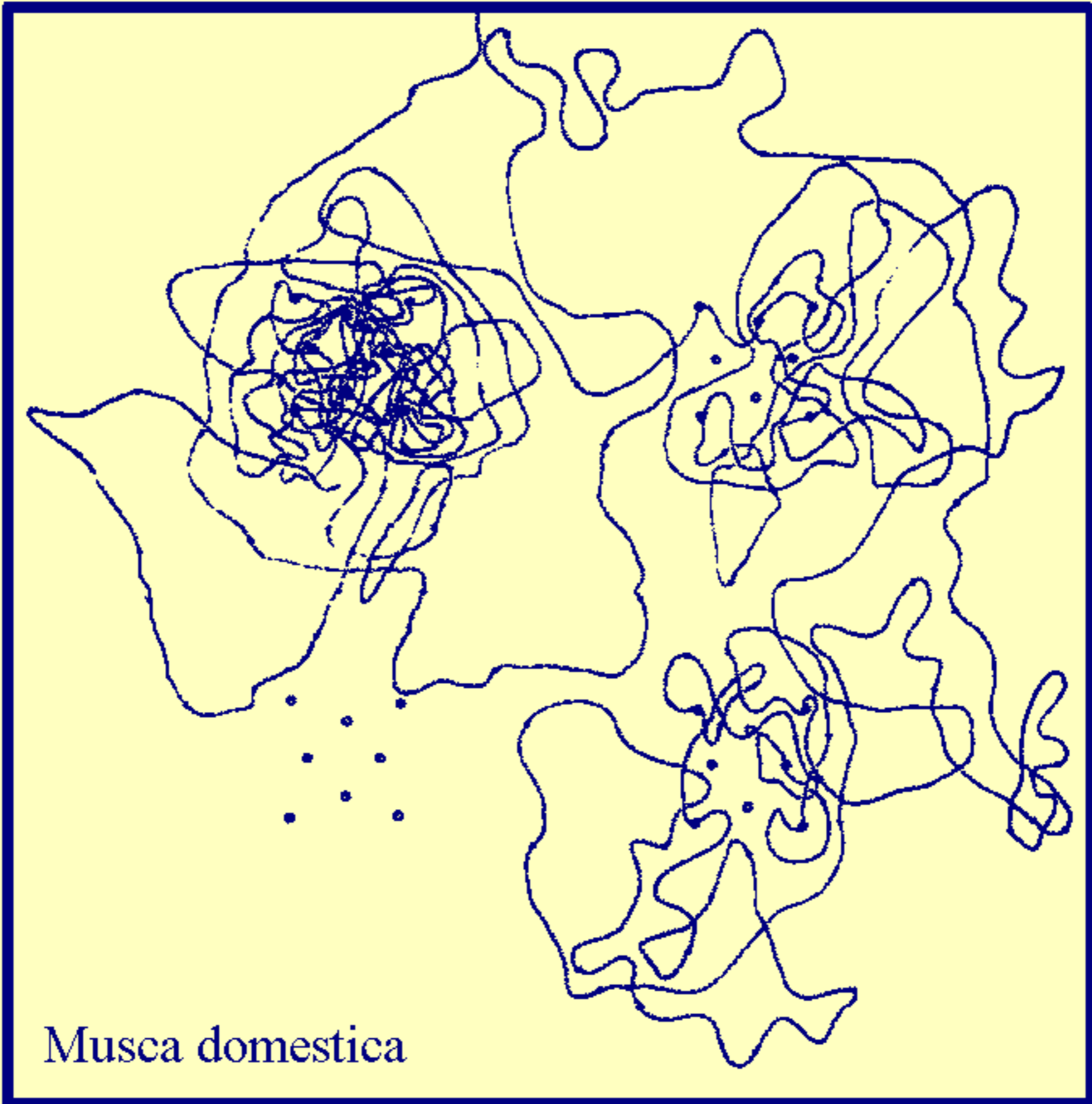




Proportion of night time in the area

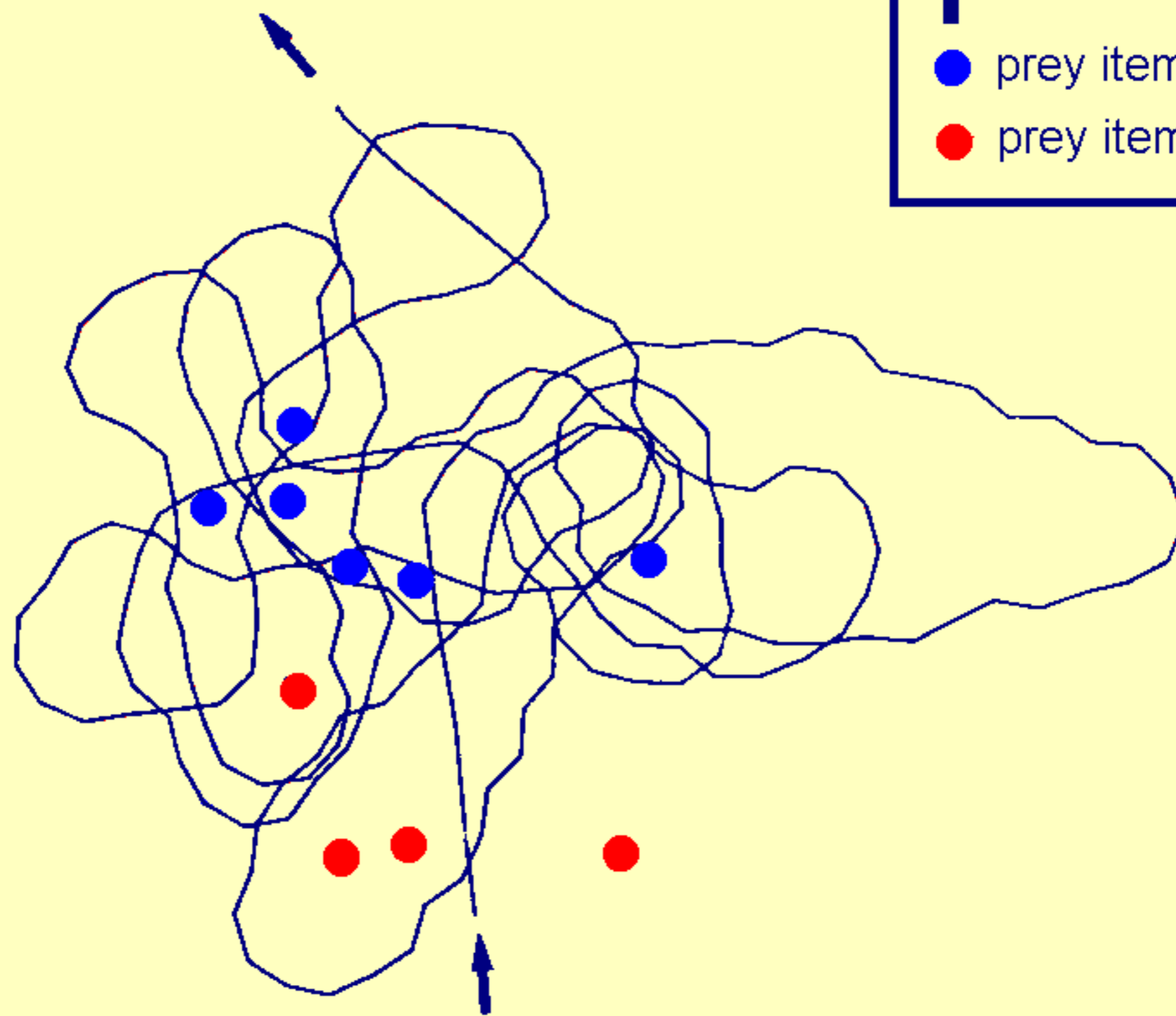






Musca domestica





**EVIDENCE FOR  
SCALE-SPECIFIC  
MOVEMENT  
PROCESSES**

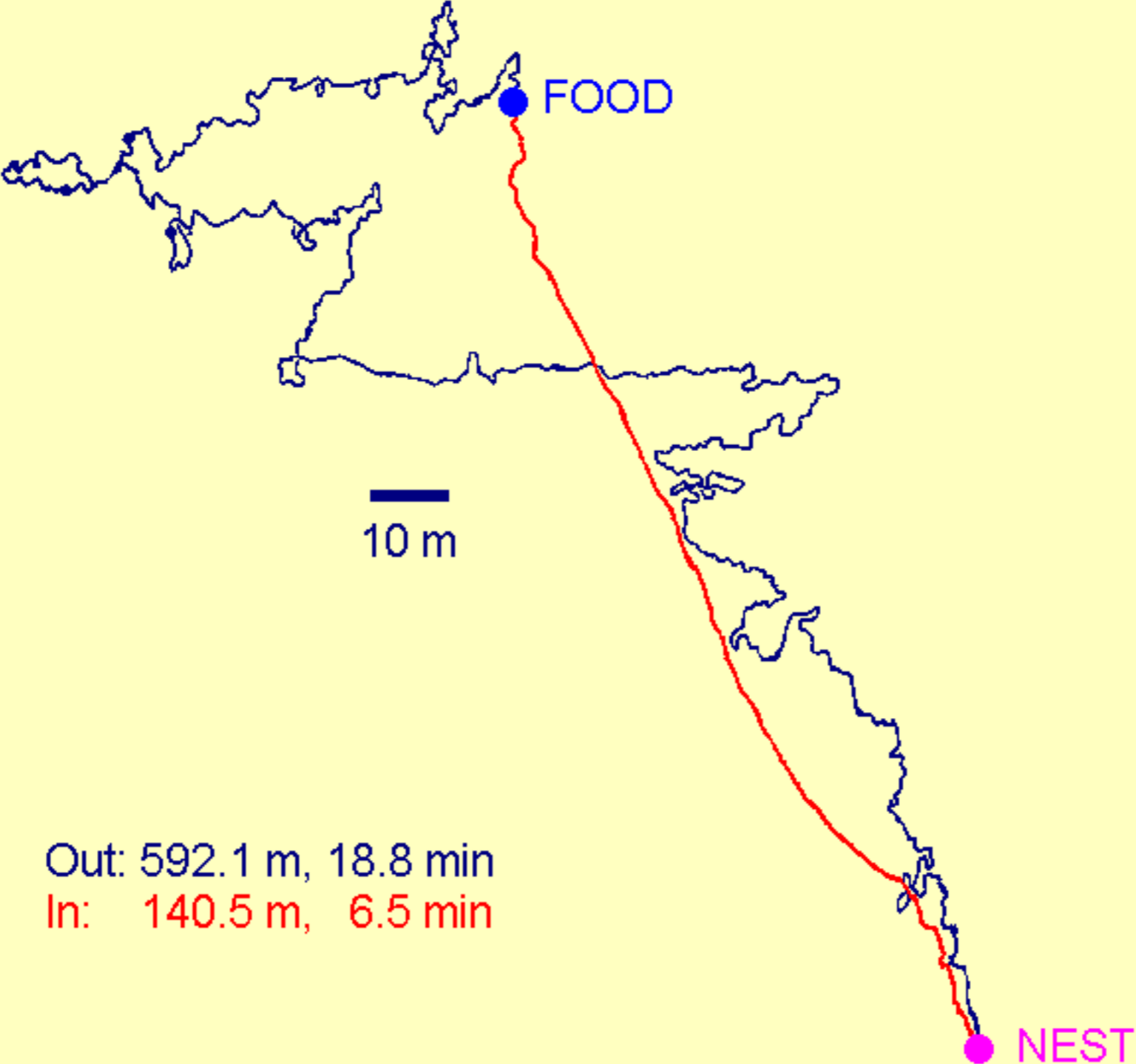
# EVIDENCE FOR SCALE-SPECIFIC NAVIGATION PROCESSES

Because of a trade-off between working range and accuracy, several (usually three) scales can be distinguished:

- + small scale: pinpointing the goal location
- + medium scale: navigating through a familiar environment
- + large scale: navigating through large unfamiliar environments

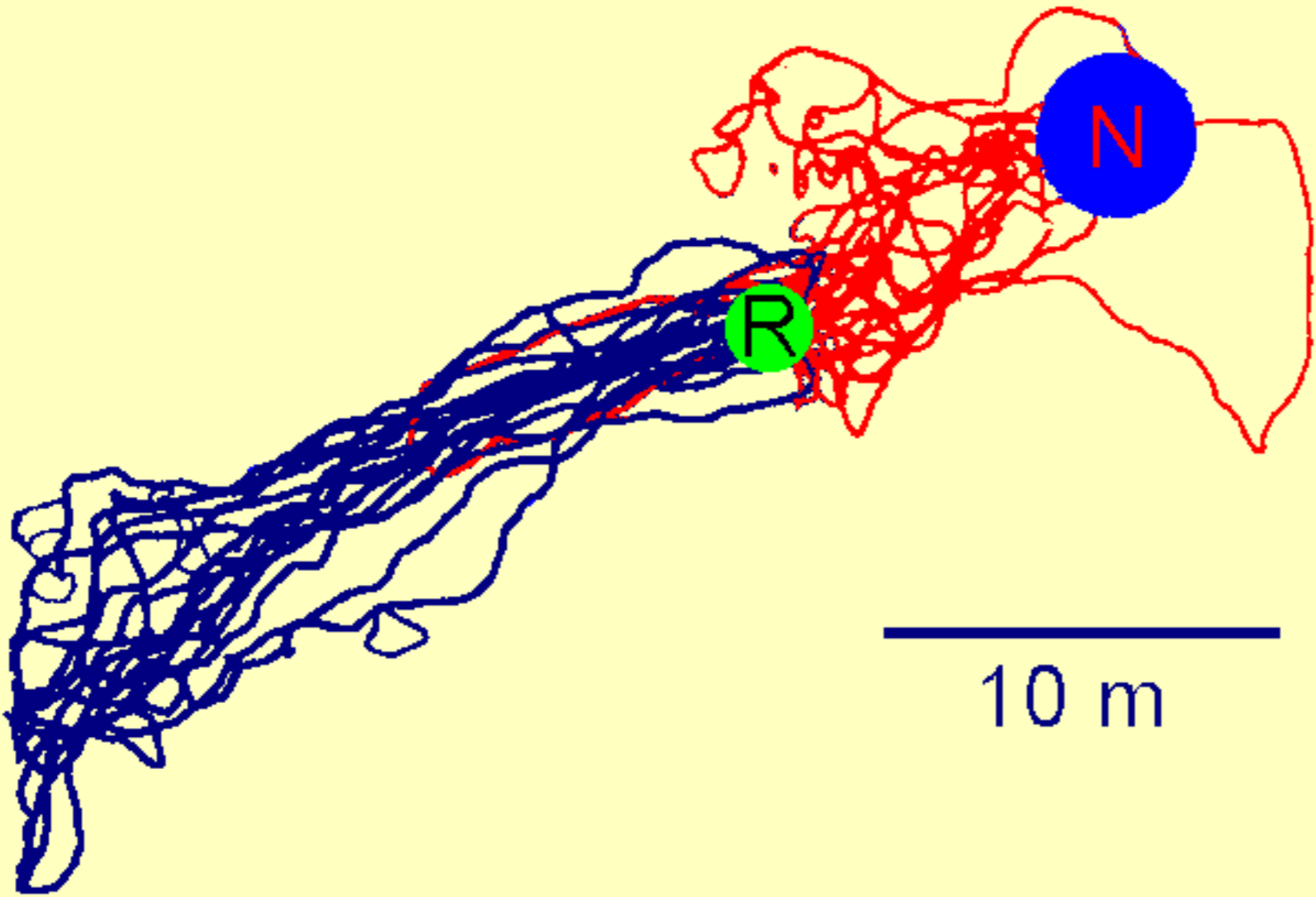
These scales are usually uncoupled and used sequentially

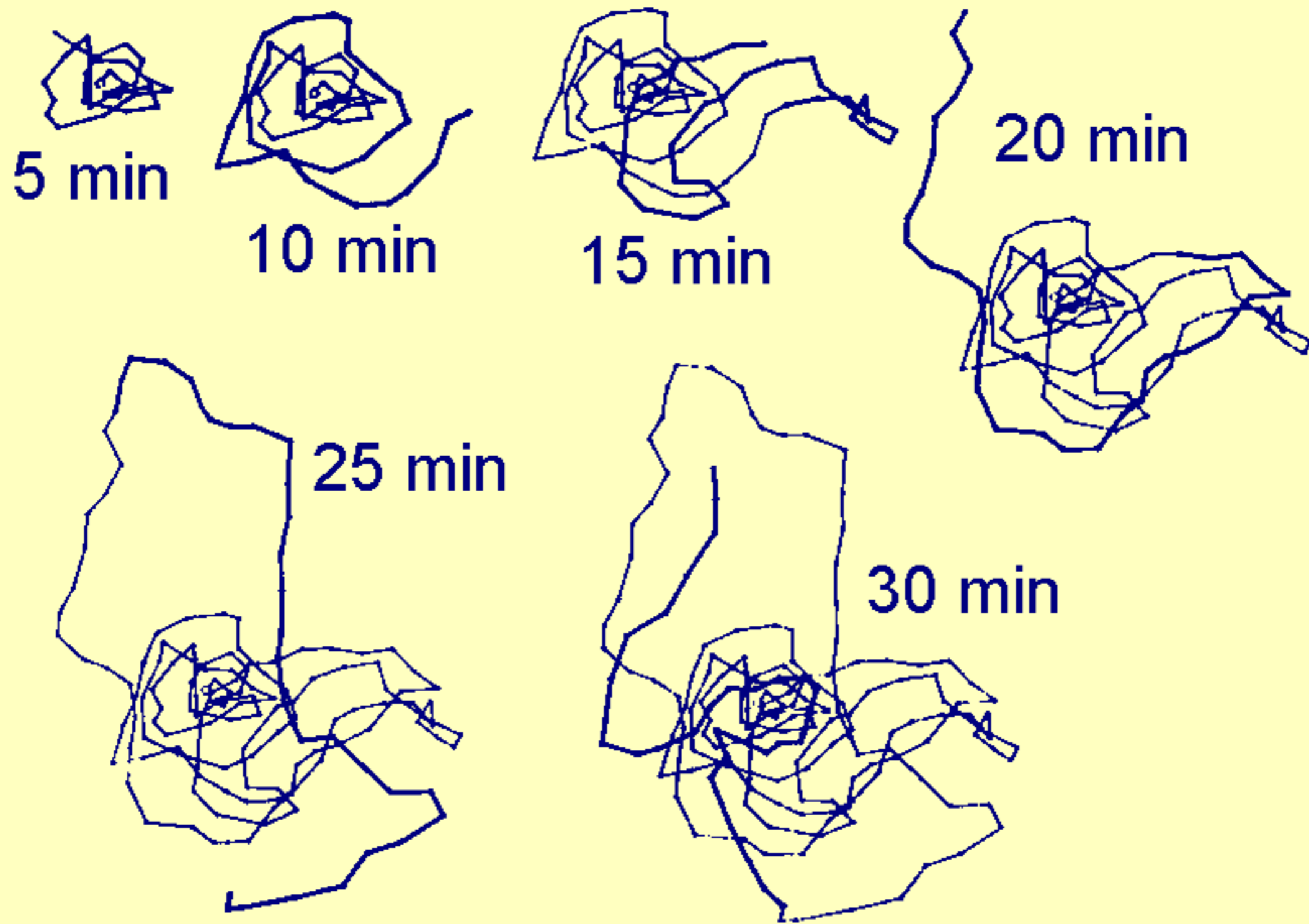
# Cataglyphis fortis



Cataglyphis fortis

F





# EVIDENCE FOR SCALE-SPECIFIC FORAGING PROCESSES

Because of the heterogeneity of the environment, at least two scales can be distinguished:

- + small scale: search for prey items between and within patches
- + large scale: patch to patch movement

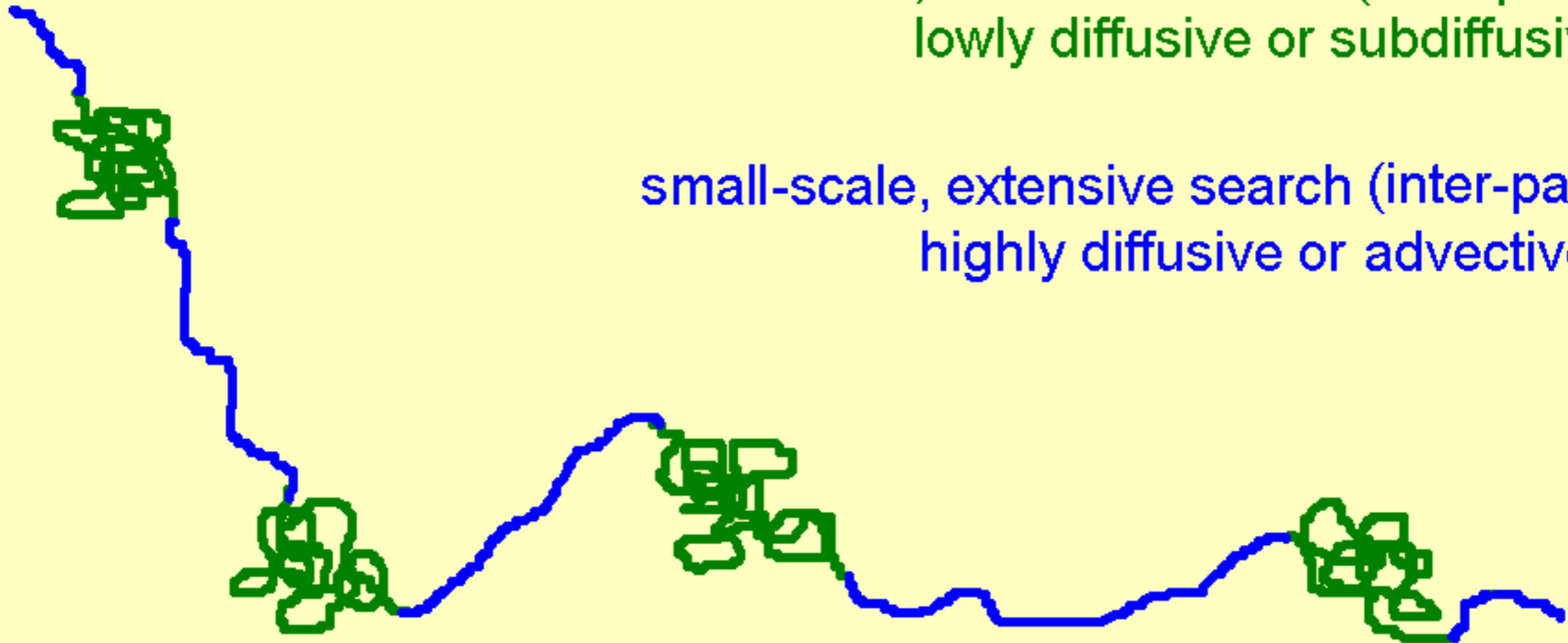
These scales may be partly coupled and are used simultaneously

Do not confound movement modes (or states) and scales

# Sequential search modes and simultaneous spatial scales

small-scale, intensive search (intra-patch):  
lowly diffusive or subdiffusive

small-scale, extensive search (inter-patch):  
highly diffusive or advective

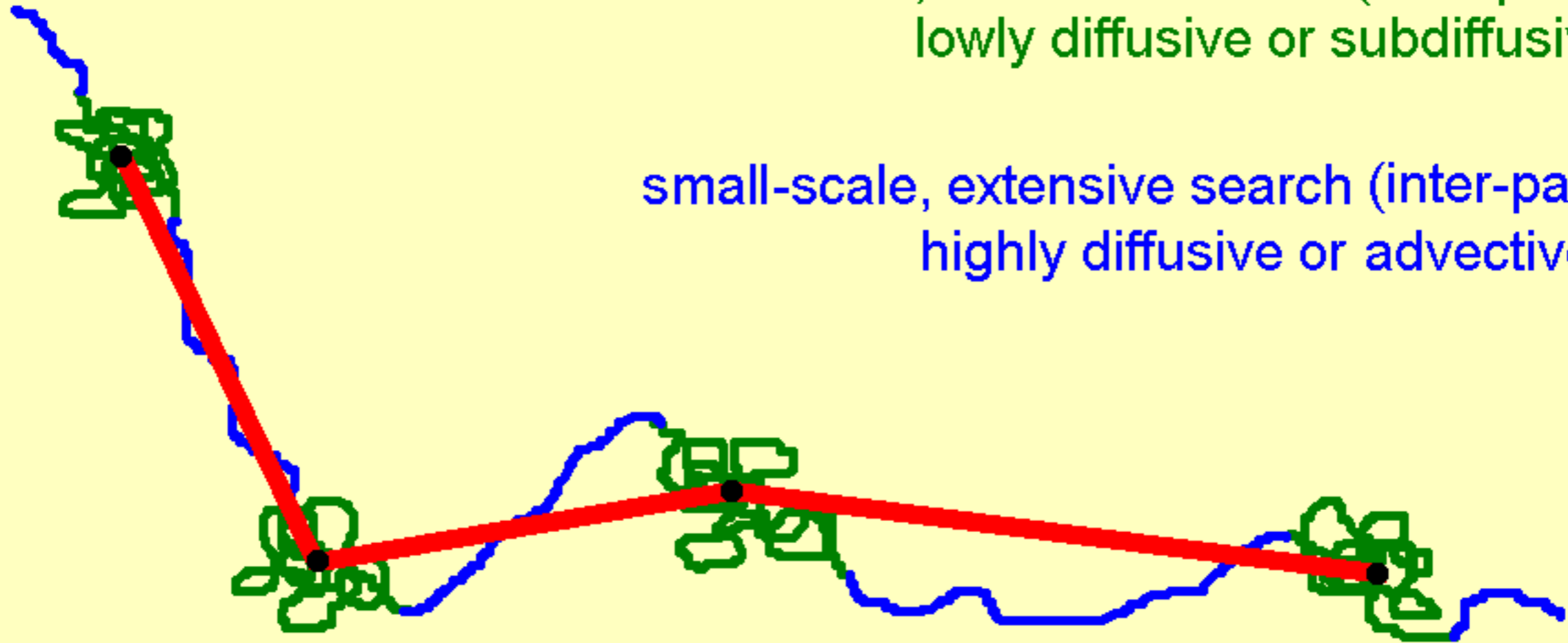




# Sequential search modes and simultaneous spatial scales

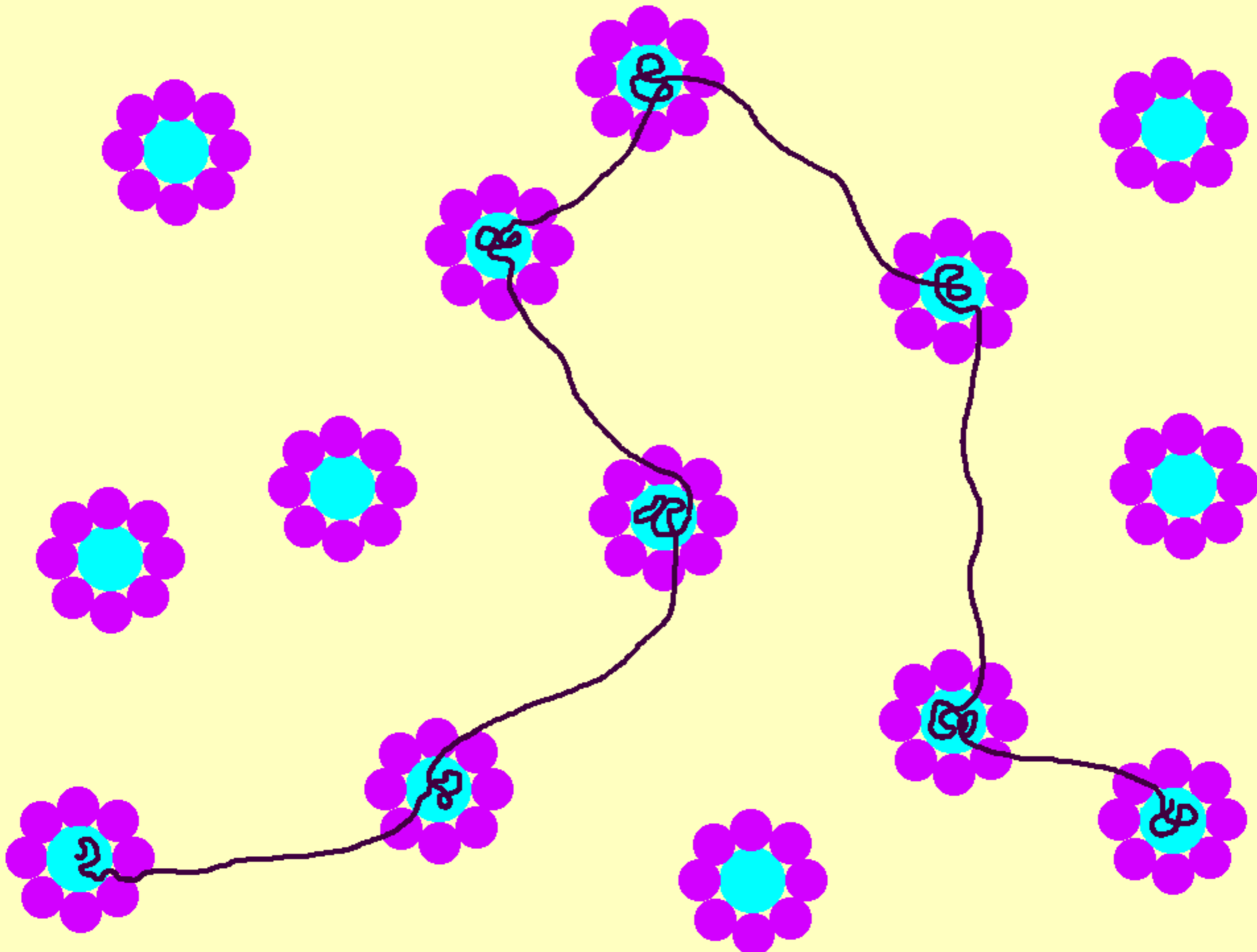
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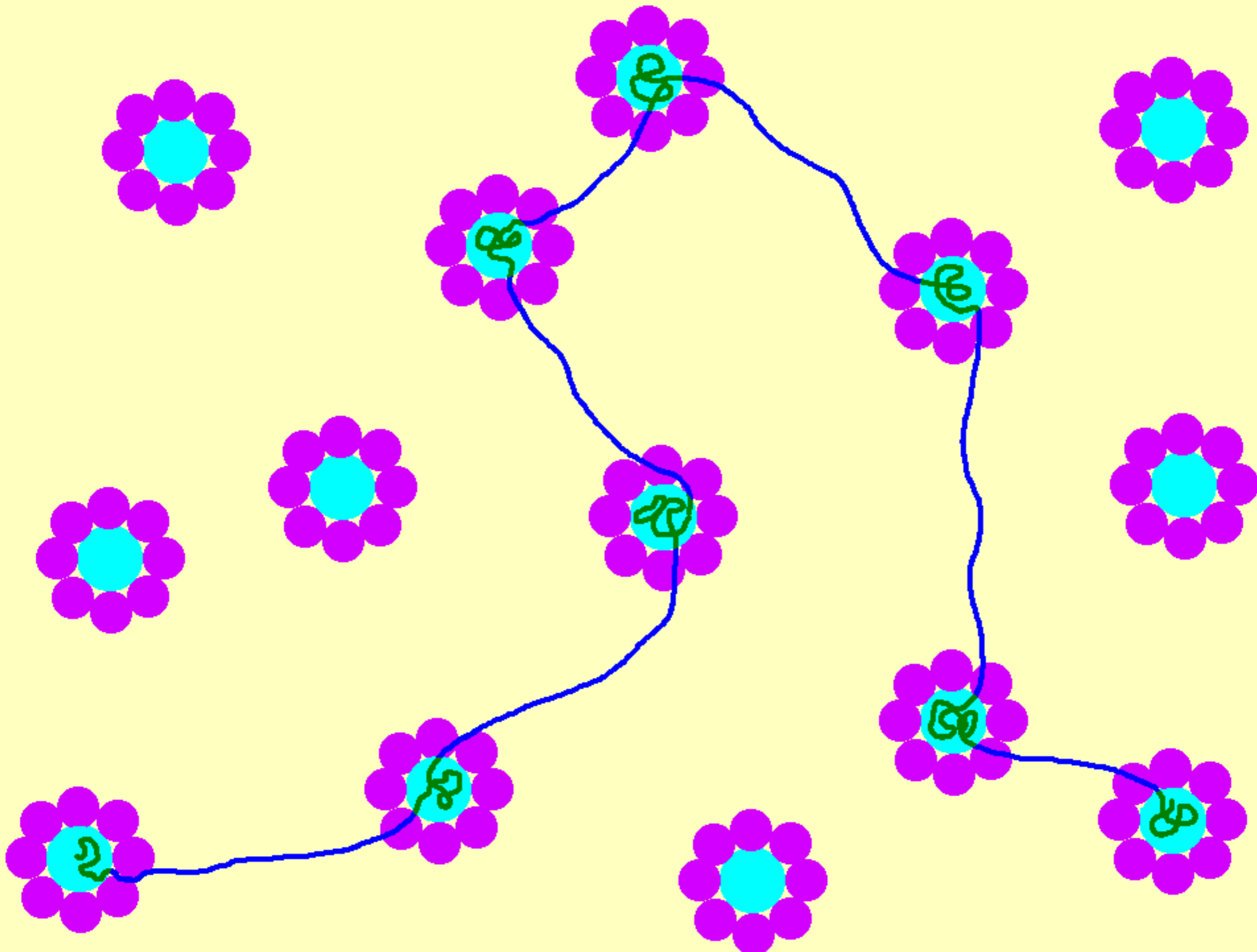
small-scale, extensive search (inter-patch):  
highly diffusive or advective

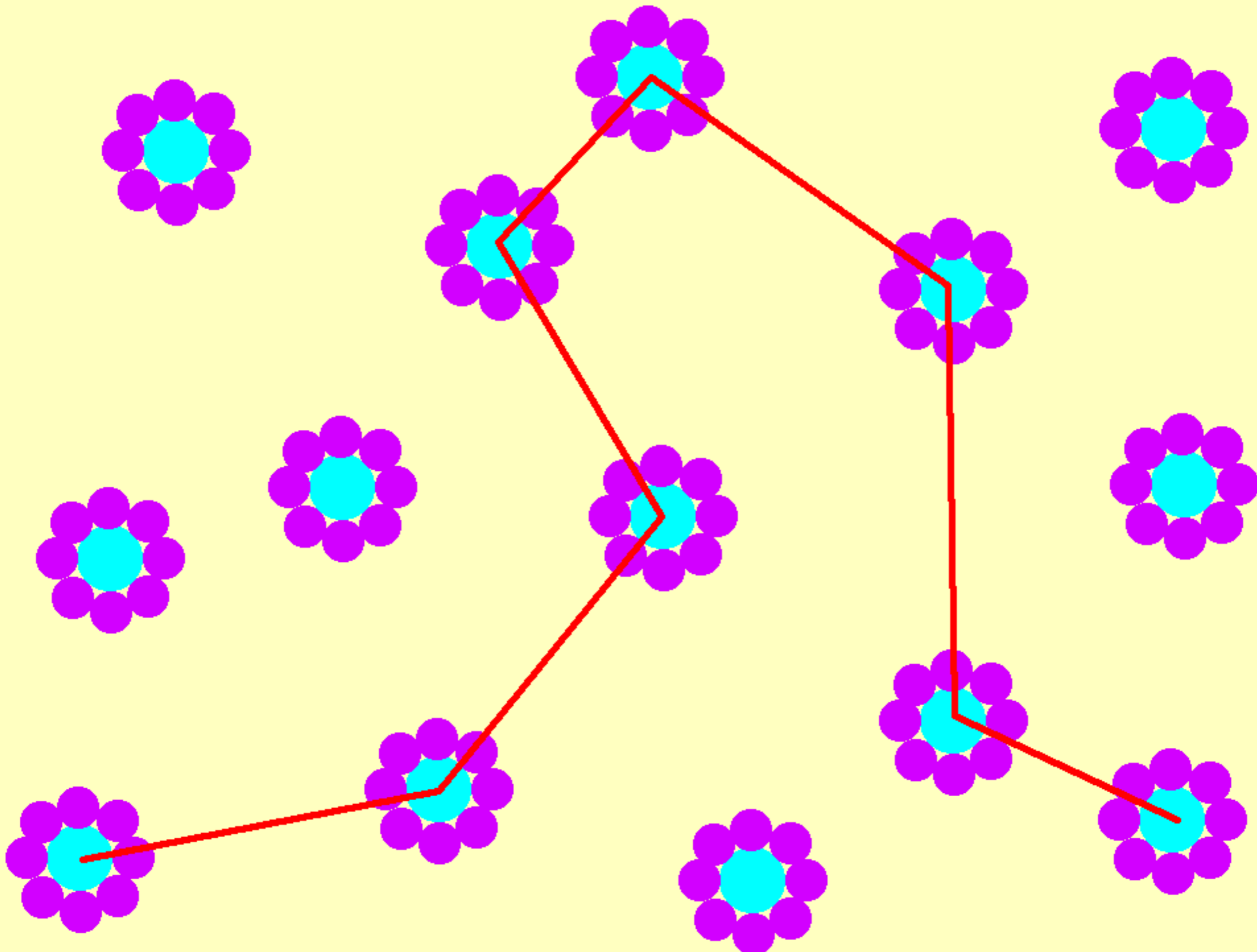


large-scale movement (sequence of visited patches):  
diffusive (random search)  
advective (migration)  
self-constrained (home range)

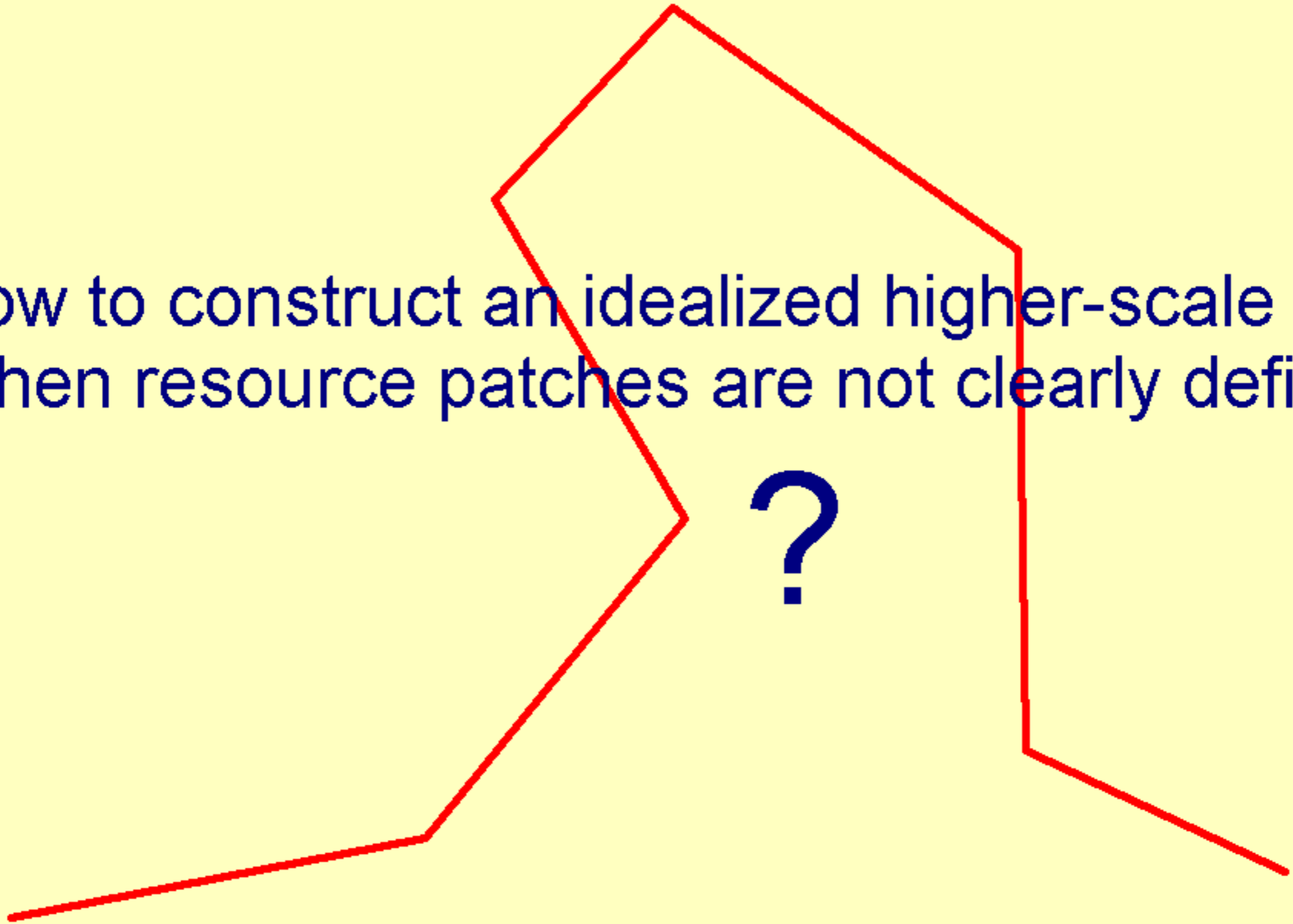
**AN IDEAL CASE FOR  
STUDYING MULTI-SCALE  
FORAGING MOVEMENTS**





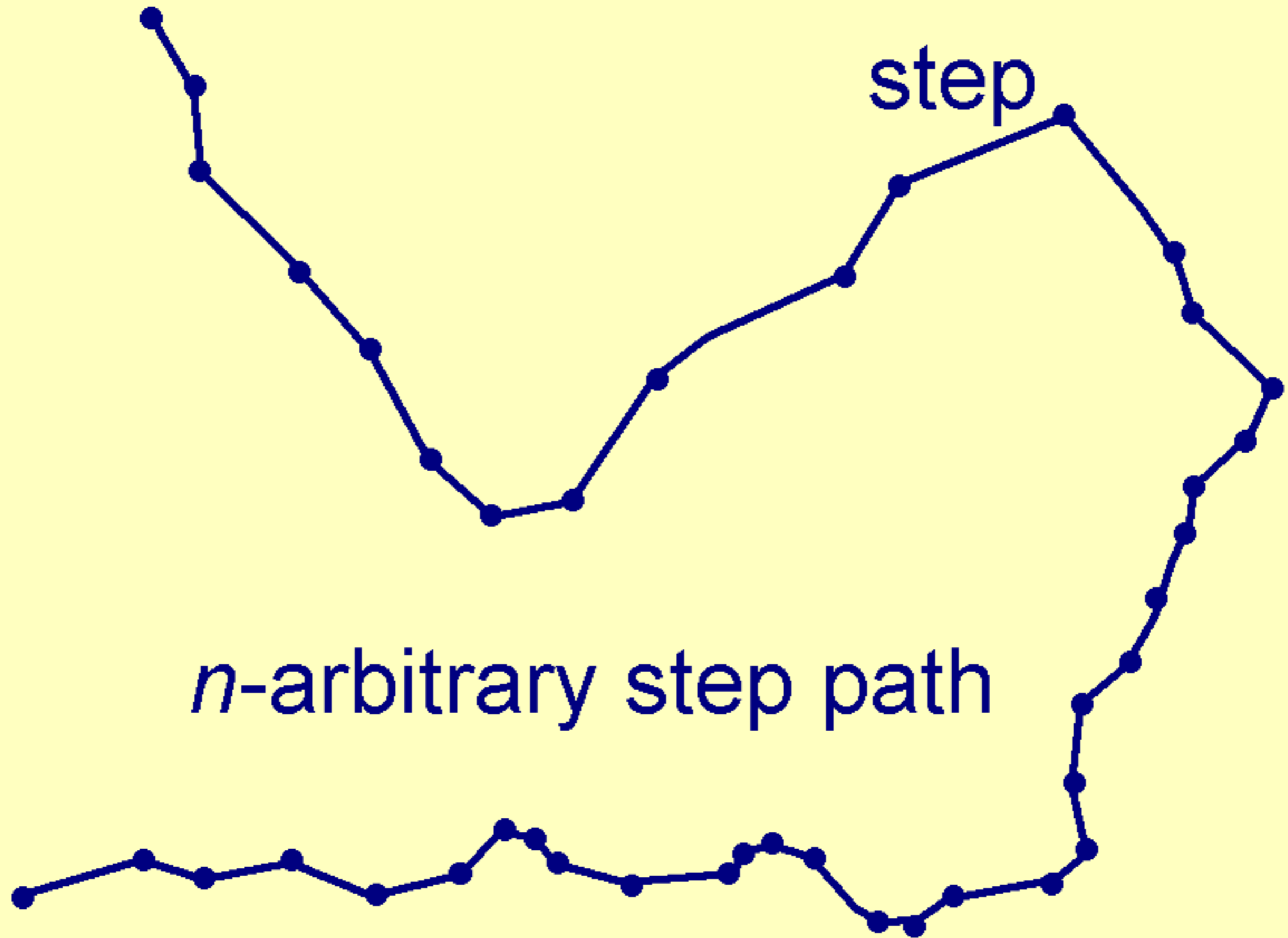


How to construct an idealized higher-scale path  
when resource patches are not clearly defined



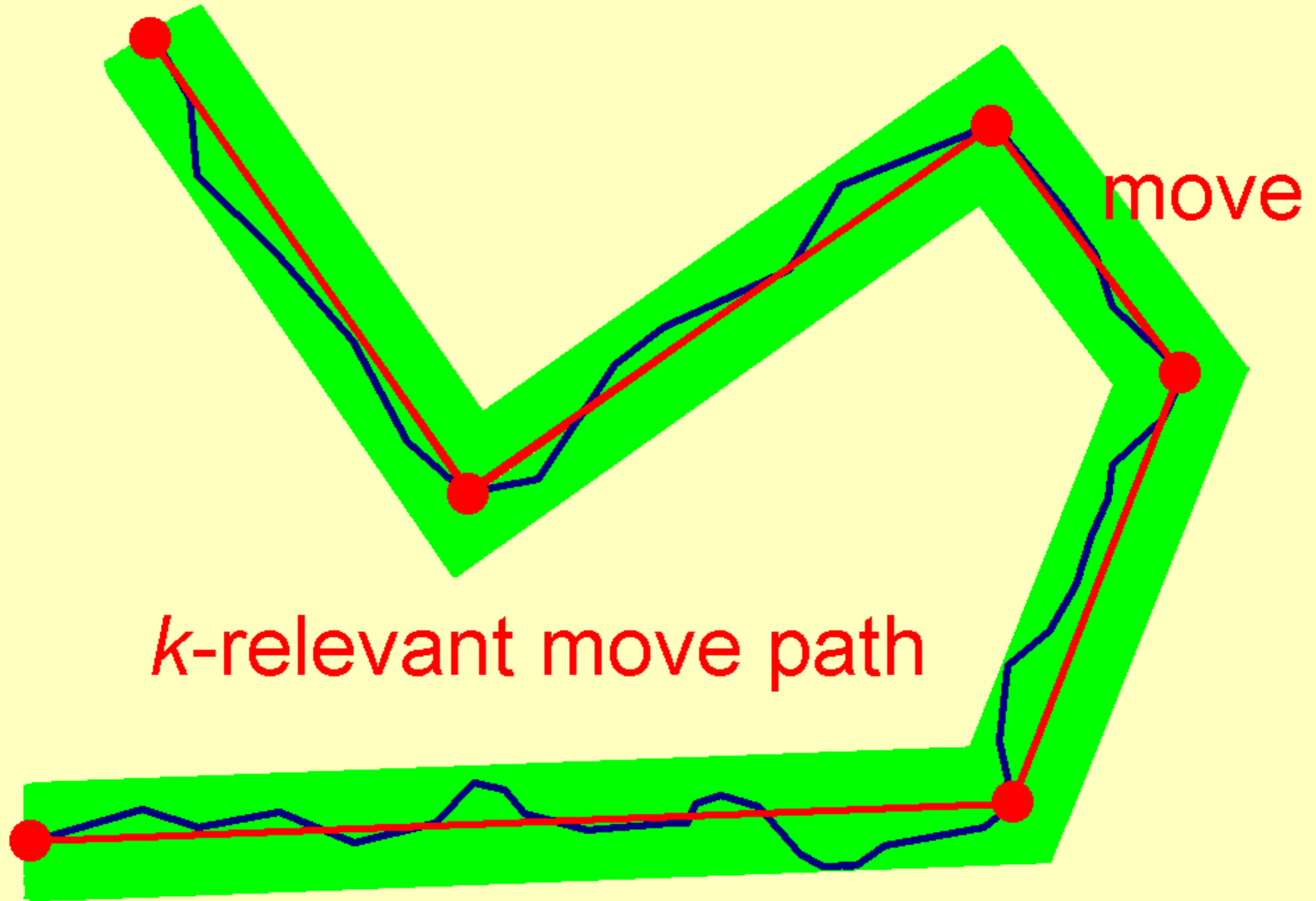
# STATISTICS AS AN ECOLOGICAL TRAP

# A naive way to construct an idealized path

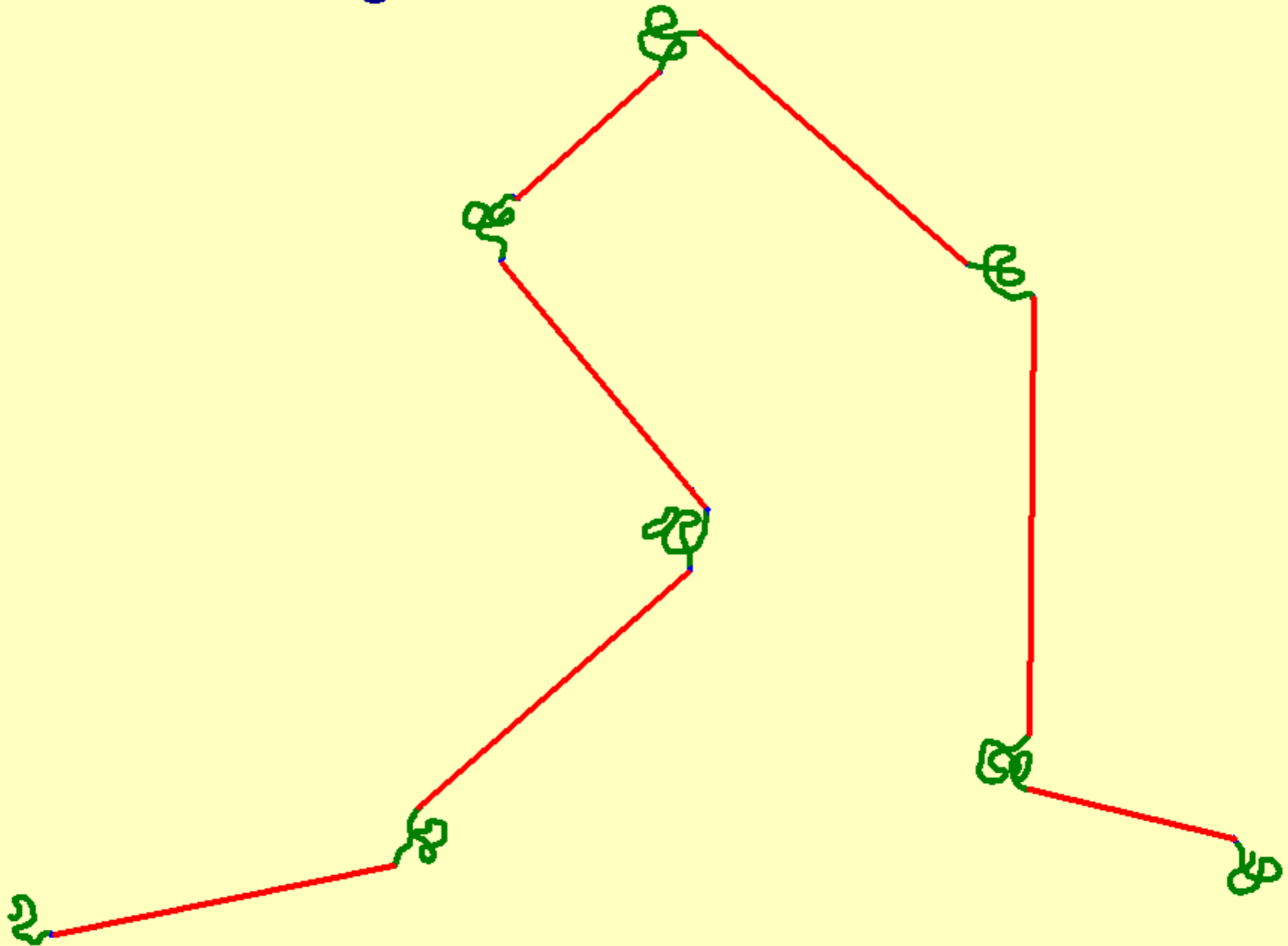




# A naive way to construct an idealized path

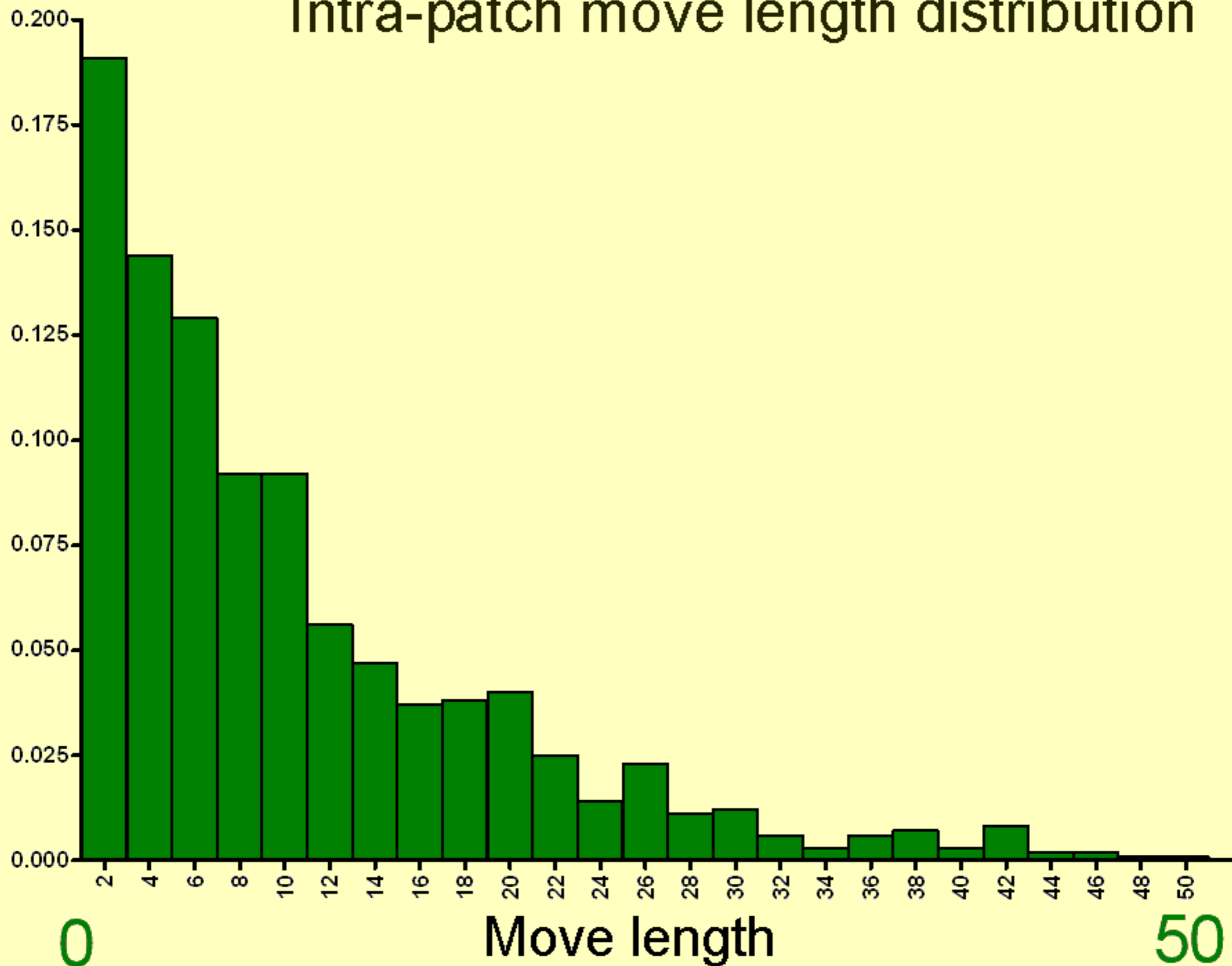


=> a strange two-mode two-scale mixture



# Intra-patch move length distribution

Relative frequency

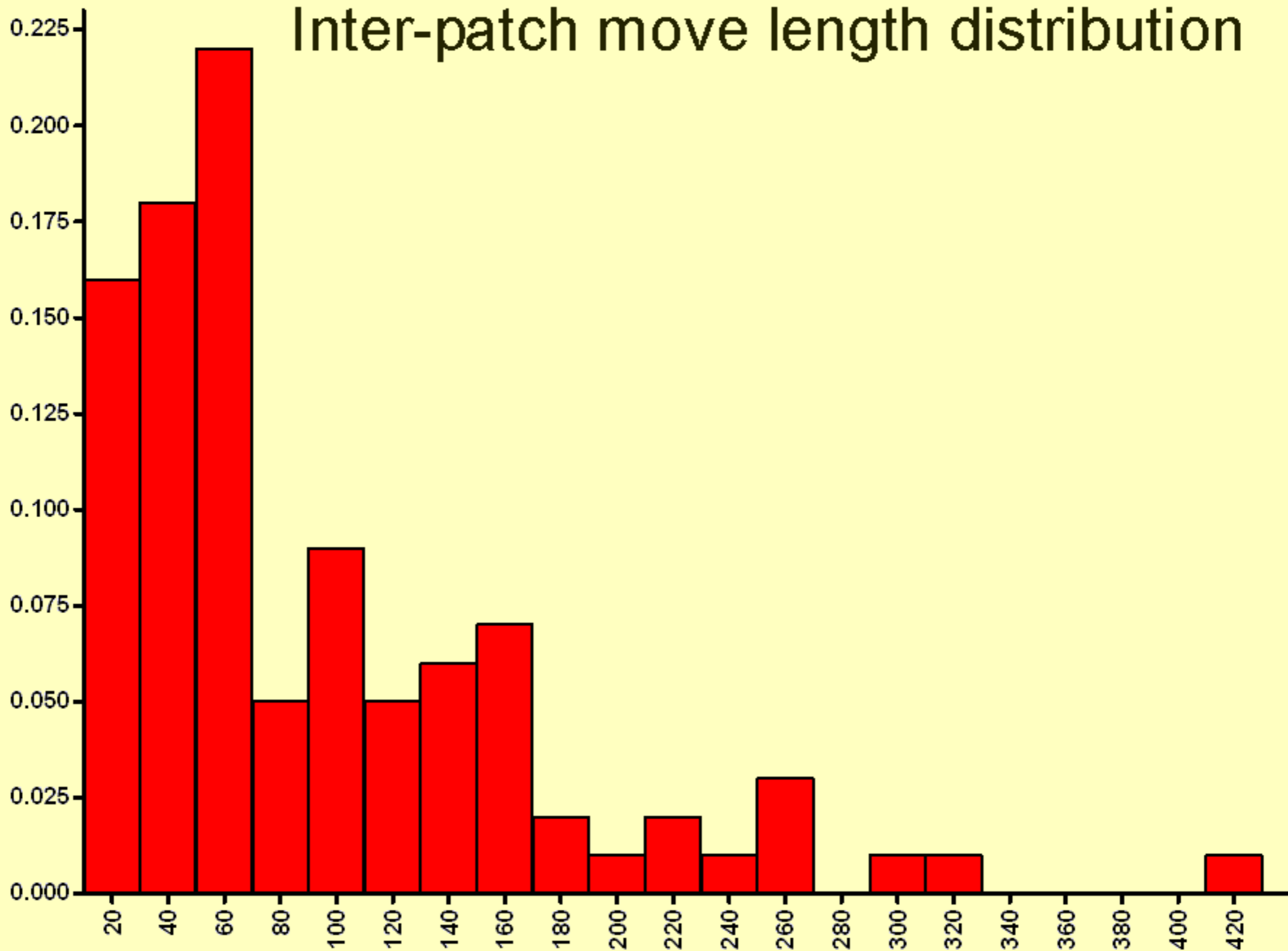


0

50

# Inter-patch move length distribution

Relative frequency

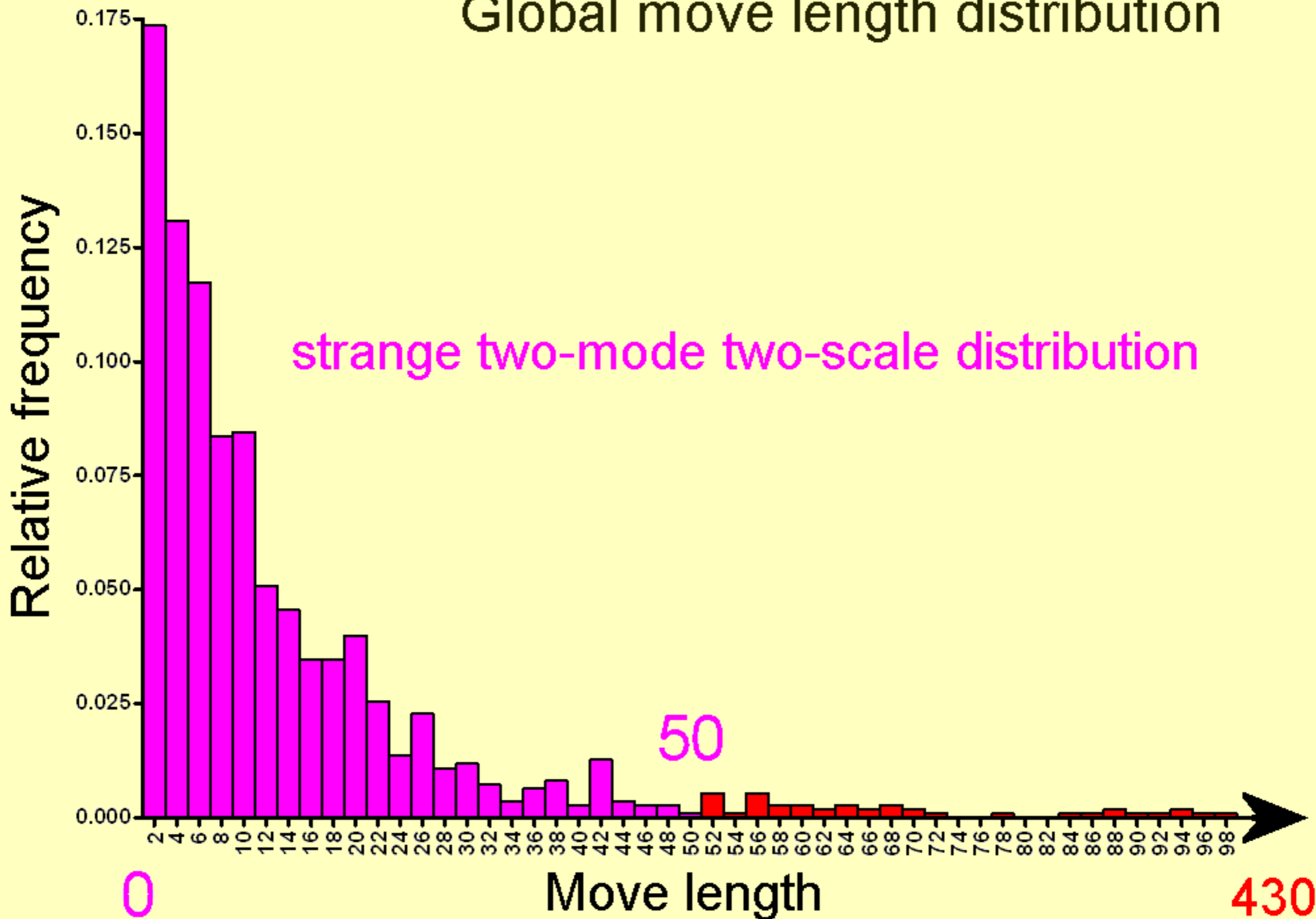


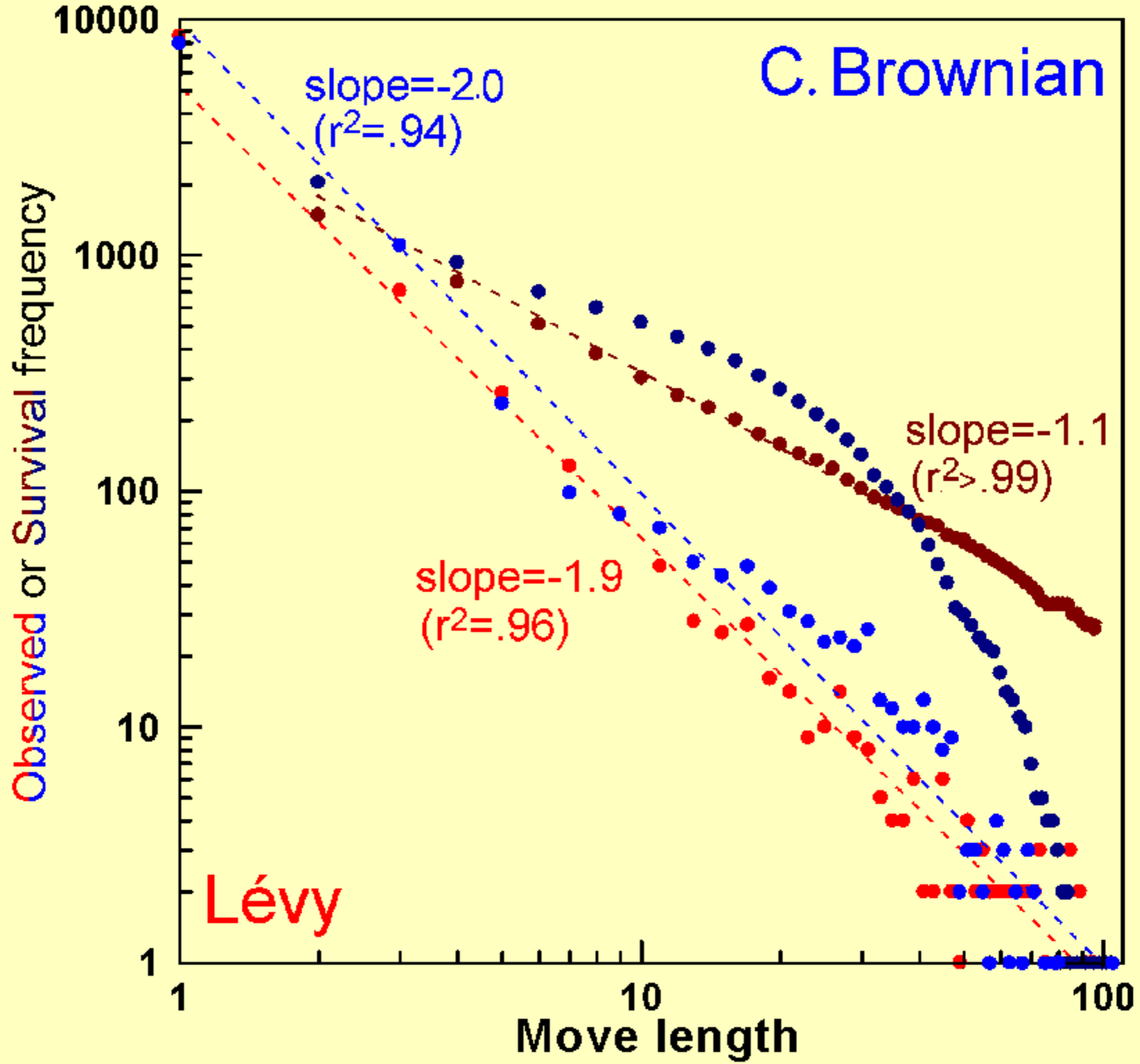
0

Move length

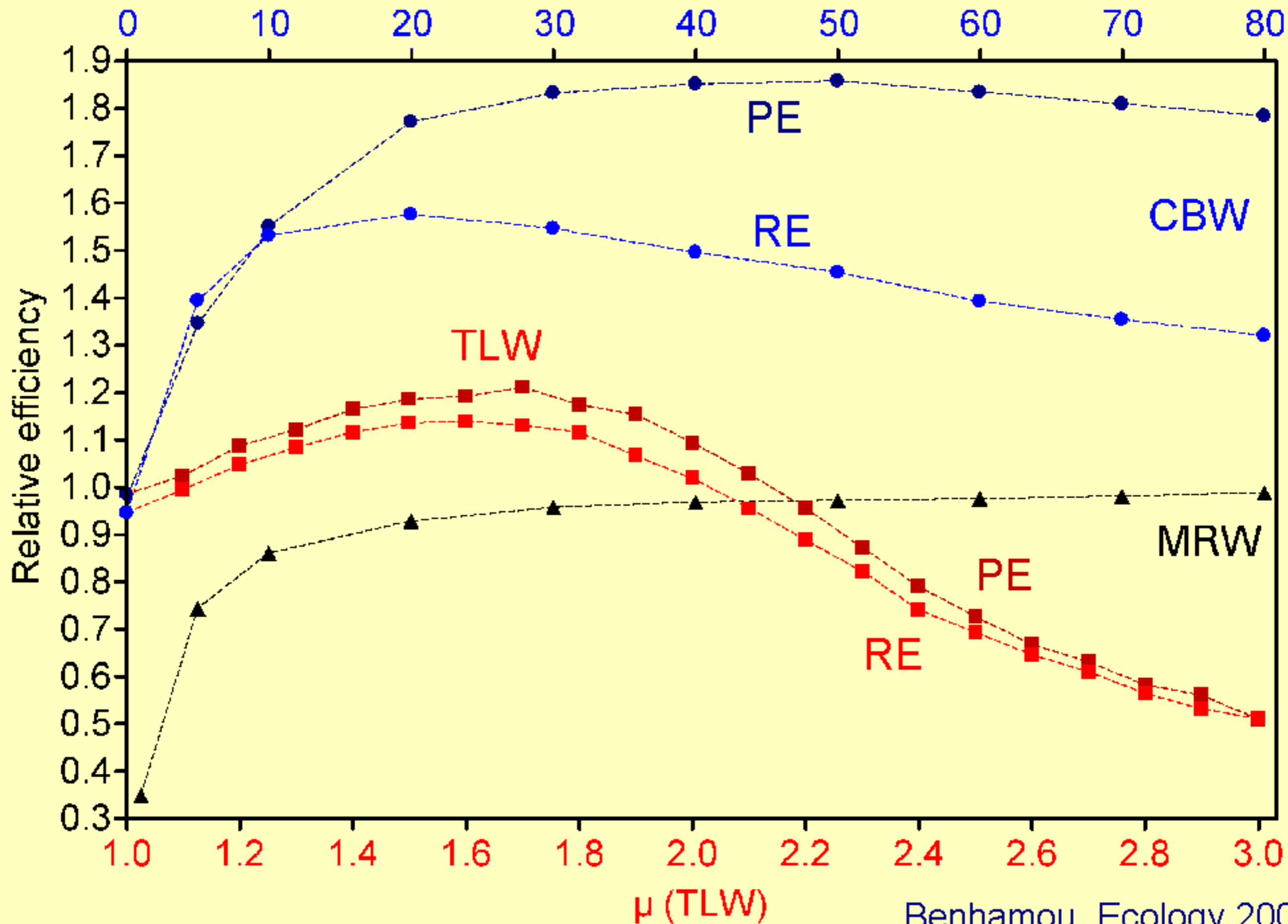
430

# Global move length distribution





Step length (MRW) or Giving-up length (CBW)



**STATISTICAL (PATTERN)**

**Vs.**

**BIOLOGICAL (PROCESS)**

**MOVEMENT MODELS**



# Statistic / Mixed / Biological Approaches

General statistical models (GLMMs, GAMs)

Model selection (AIC, BIC)

Resource Selection (Probability) Function

Lévy Walks / Fractional Brownian Motion

Location-based Kernel Density Estimation

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Composite Random Walks

Movement-based Kernel Density Estimation

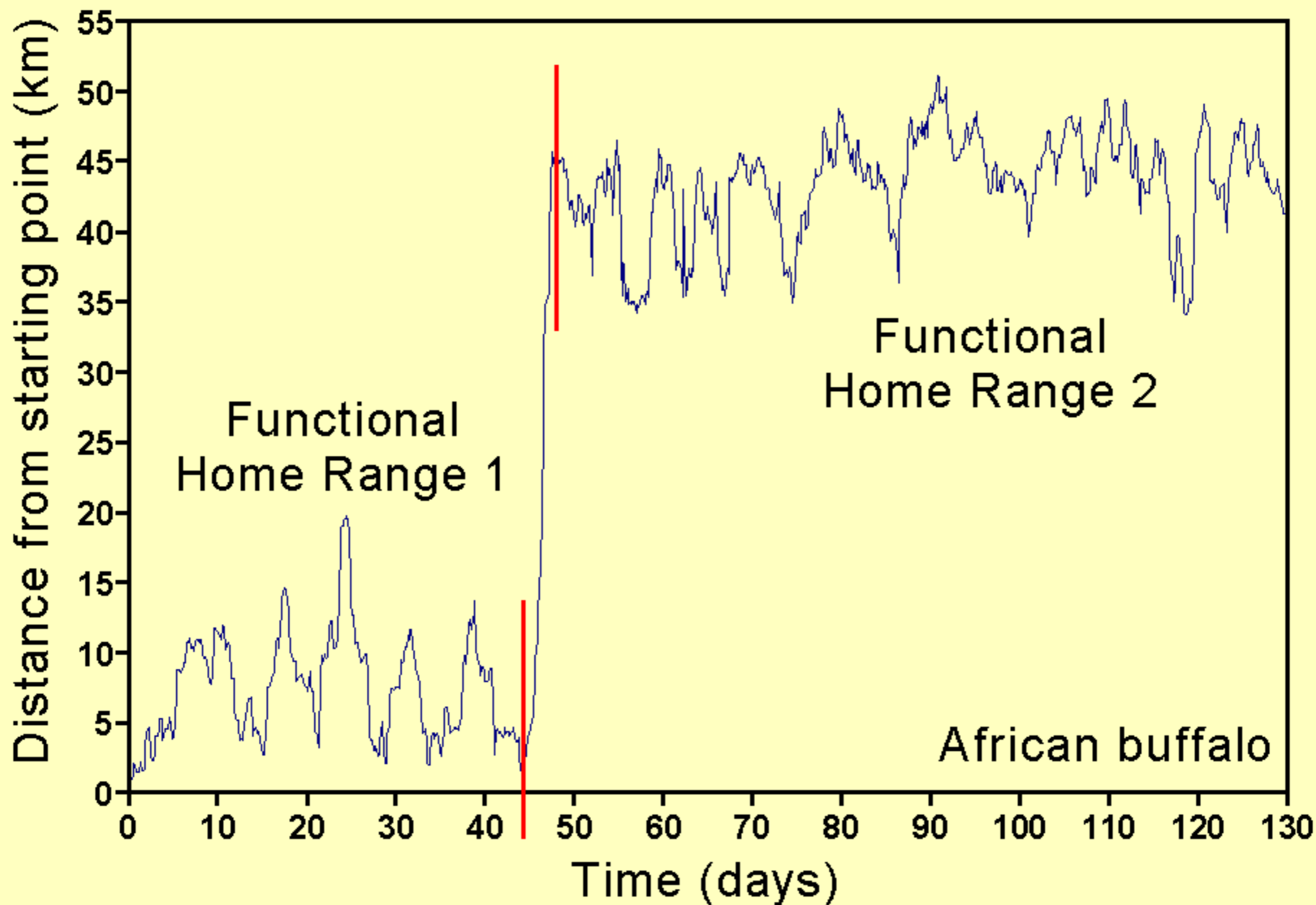
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Modelling: Multiscale Multimode BCRW

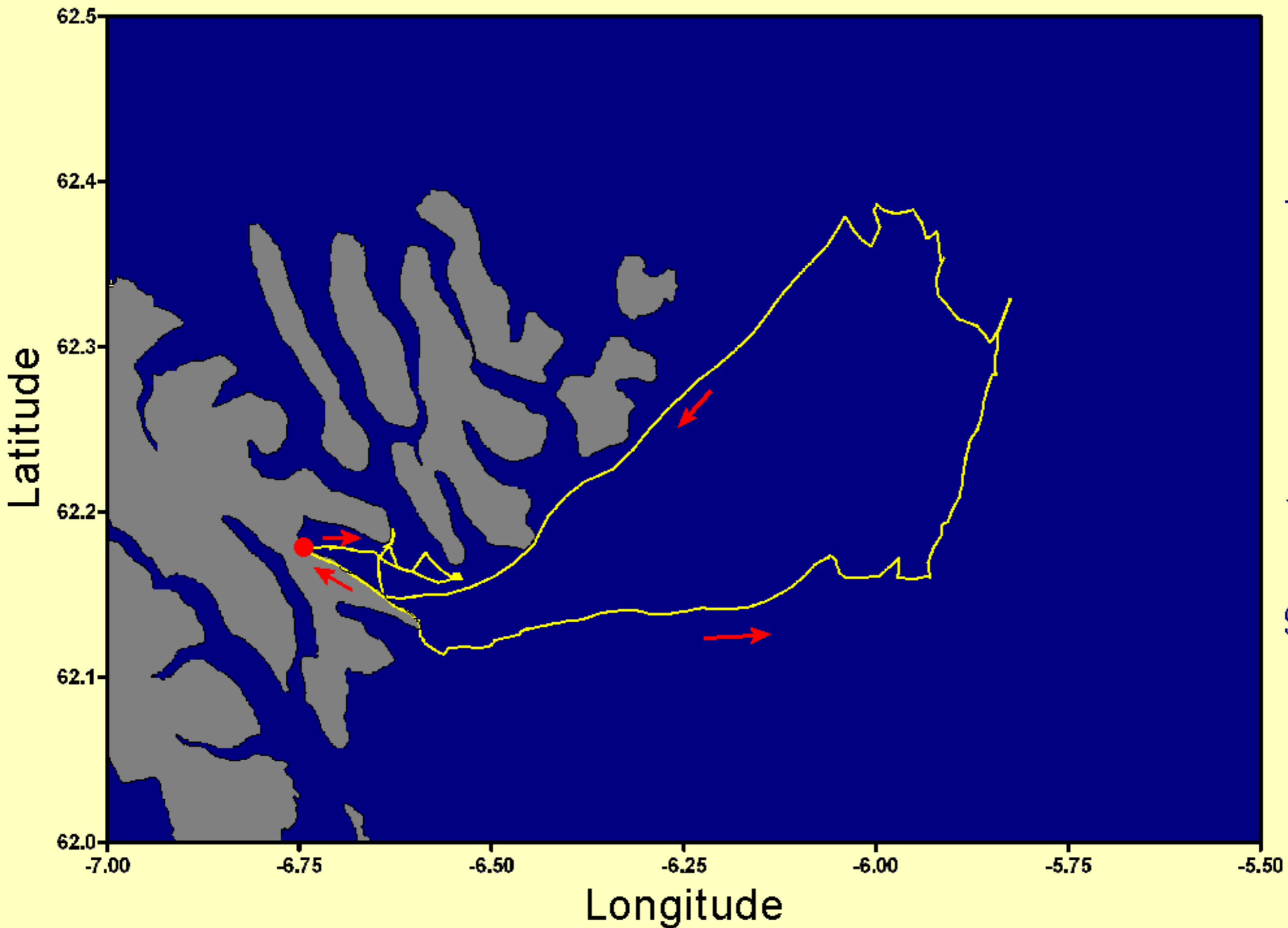
Analysis:

- + State Space / Hidden Markov Models
- + Segmentation / Clustering

# Location-based segmentation

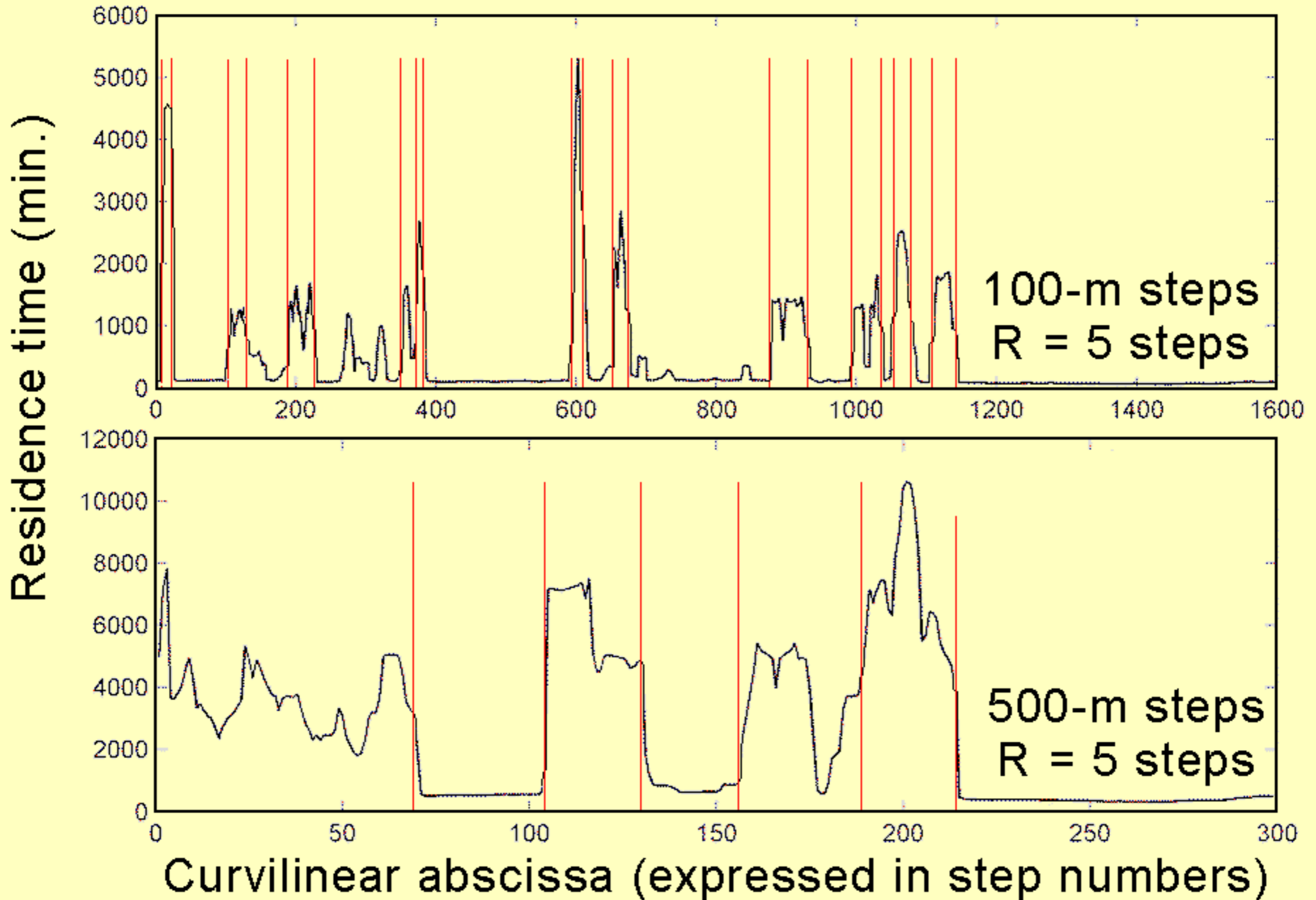


# Northern fulmar



# Residence time-based segmentation

## Northern fulmar



# CONCLUSION AND PERSPECTIVES

# Scale does matter

Animals use movement processes as key tools to adapt to scale-specific features of their environments. Scale-free measures (e.g. apparent fractal dimension) are usually not biologically relevant movement parameters. Scale-free random walks (e.g. Lévy walks) may sometimes be an easy means to represent multi-scale movement patterns but they are certainly not a reliable means to model movement processes.

## **Next challenges in animal movement studies:**

- (1) identifying the various environmental scales at which an animal specifically reacts (i.e. biologically relevant scales), and ...
- (2) determining to which extent these various scales are coupled or uncoupled (i.e. how a given scale affects other ones).

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- (2) determining to which extent these various scales are coupled or uncoupled (i.e. how a given scale affects other ones).

**Biologically relevant scales are those for which key process parameters are stationary**

# Eloge de la lenteur

"Assurons-nous bien du fait, avant que de nous inquiéter de la cause. Il est vrai que cette méthode est bien lente pour la plupart des gens qui courent naturellement à la cause, et passent par-dessus la vérité du fait ; mais enfin éviterons-nous le ridicule d'avoir trouvé la cause de ce qui n'est point."

Fontenelle, 1687  
Histoire des oracles



THAT'S

ALL

FOLKS

...thanks