# Analyzing spatio-temporal patterns in animal behavior through movement path recursions

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## Why do animals return?



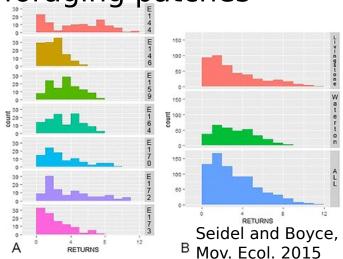




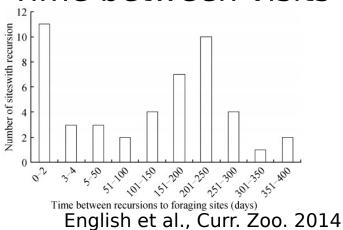


#### What can we learn studying recursions?

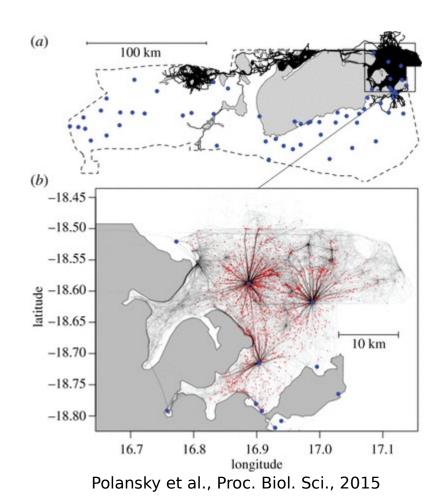
## Return frequency to foraging patches



#### Time between visits



#### Evidence for spatial memory



## Are recursions understudied?

**esa** ECOSPHERE

#### SYNTHESIS & INTEGRATION

Recursive movement patterns: review and synthesis across species

Oded Berger-Tal<sup>1,2,</sup>† and Shirli Bar-David<sup>3</sup>

"Recursive movement pattern, i.e., returns to previously visited areas, is a widespread phenomenon in the animal kingdom...
Nevertheless, the wide scope and generality of this phenomenon may be still considerably underestimated by the scientific community."

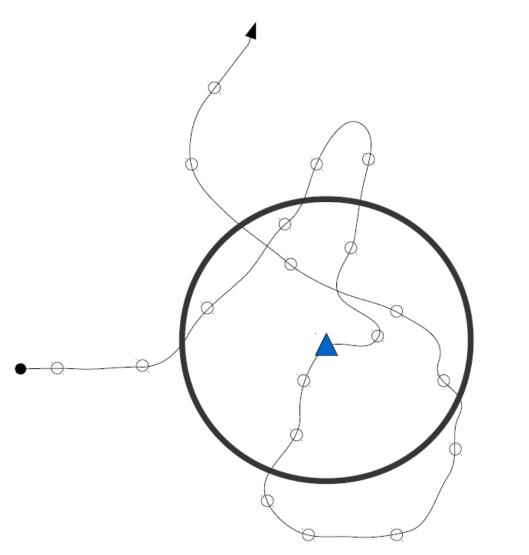
### recurse package

R package available on CRAN

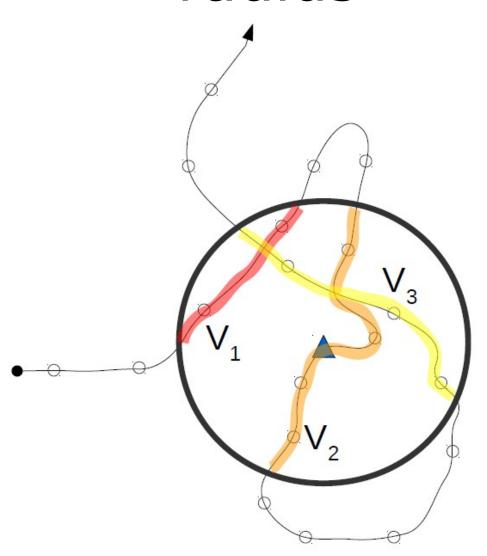
 Calculates the number of recursions within a specified radius from a movement trajectory

 Other metrics like residence time, time between visits, entrance and exit times

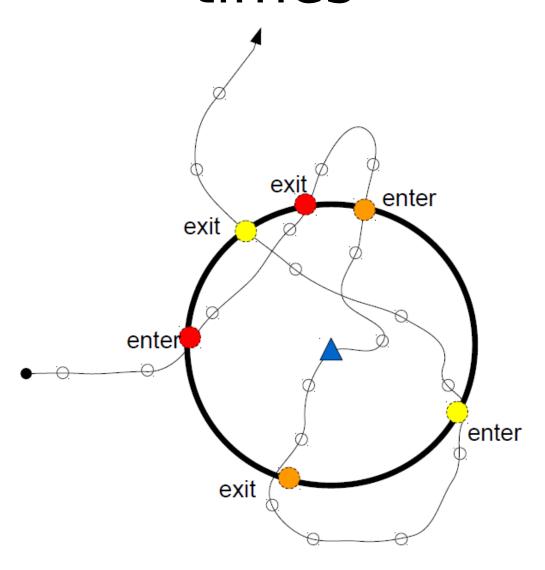
#### How does it work?



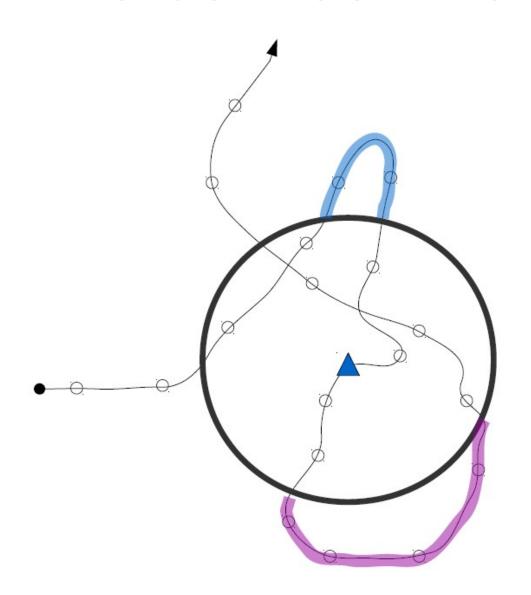
# Select segments inside radius



# Interpolate entrance/exit times



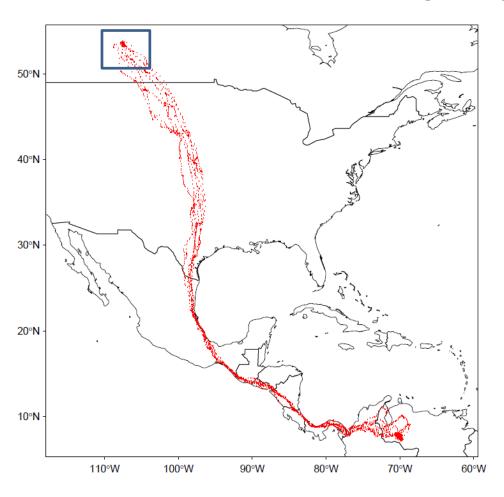
#### Time between visits



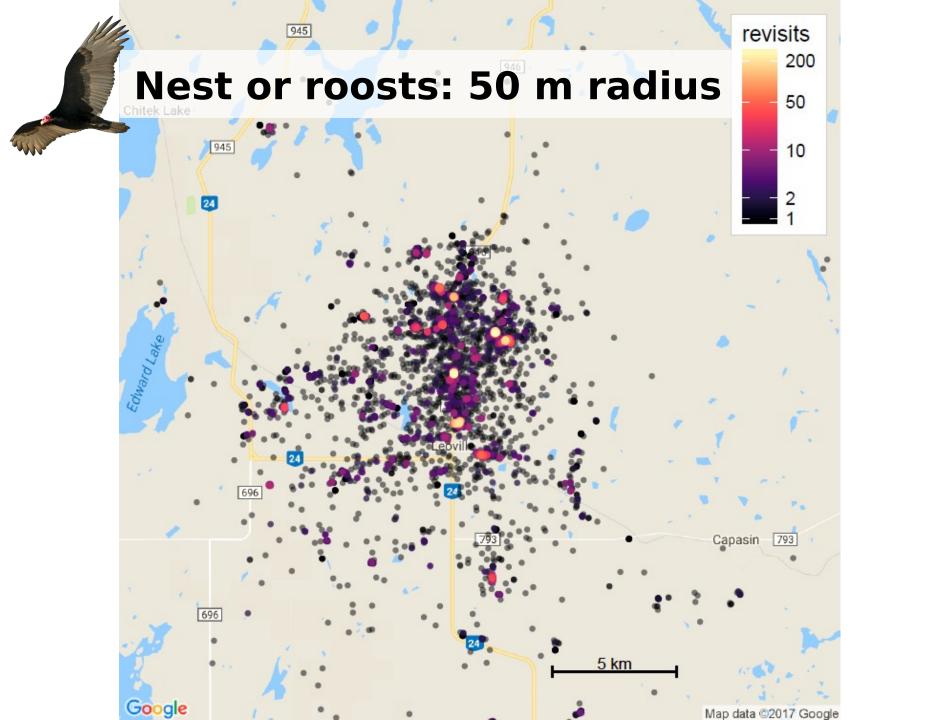
## Analyses possible with **recurse** package

- Identify frequently-used locations across one or multiple individuals
- Pre-specify locations of interest or examine all trajectory locations
- Visit-level analysis of time of day, duration, time since last visit, etc. and combine with other information (e.g, behavioral segmentation)
- Spatially/temporally coincident *visit covariates* (e.g., NDVI, temperature, snow etc.)
- Intervisit interval consistency at and across locations
- Visits to user-specified polygon (protected area, foraging ground)
- Residence time during user-specified intervals (seasonal, etc.)

# Example: Leo the Turkey Vulture



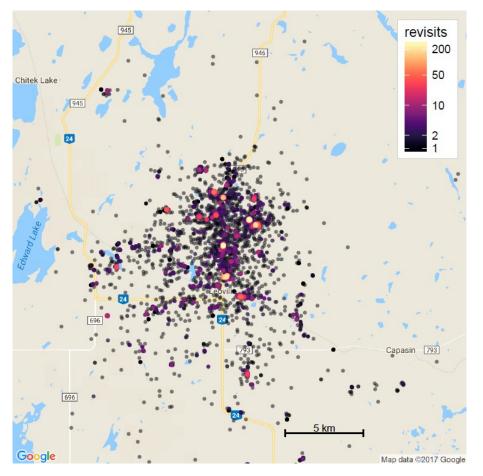


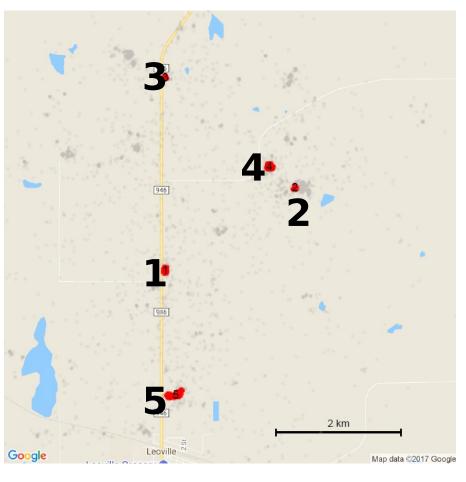


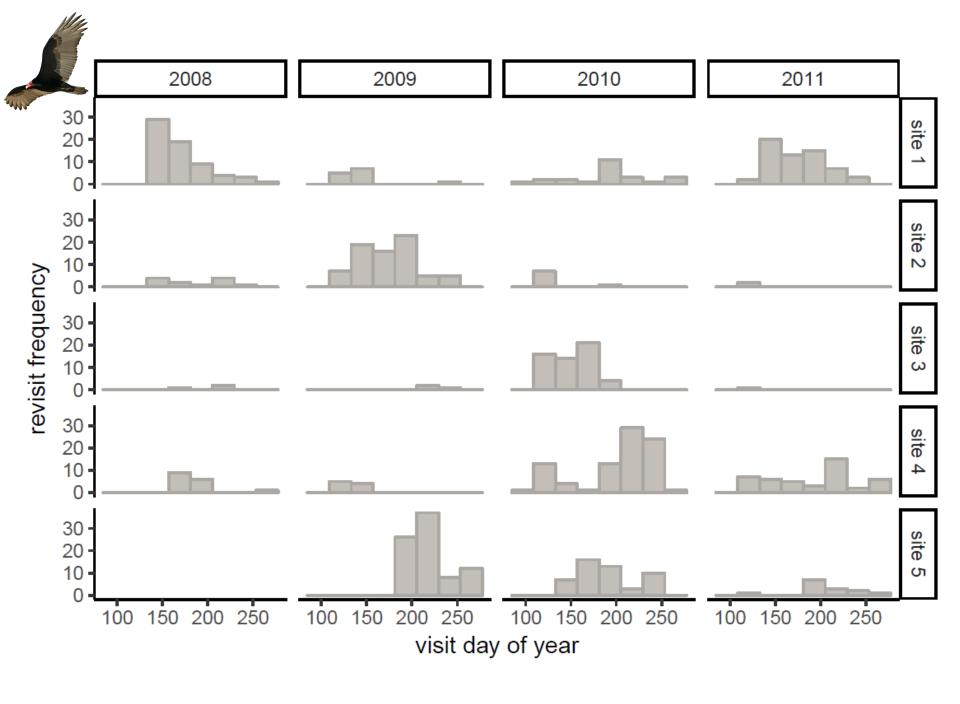


# Clustering: find highly revisted sites

Look at sites with > 75 visits, i.e. nests or roosts: **5 sites** 

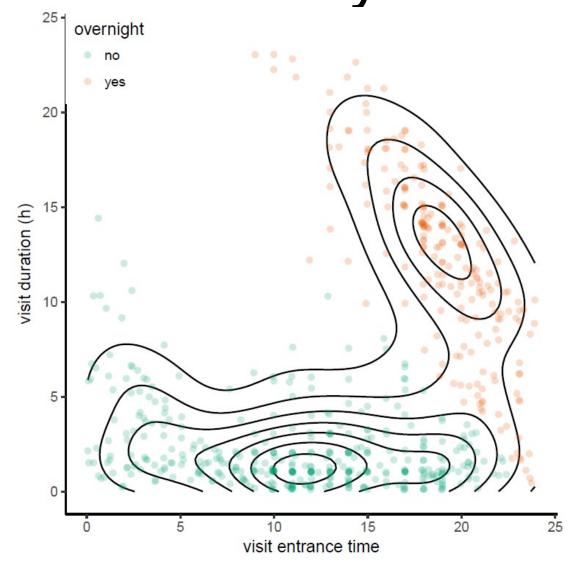




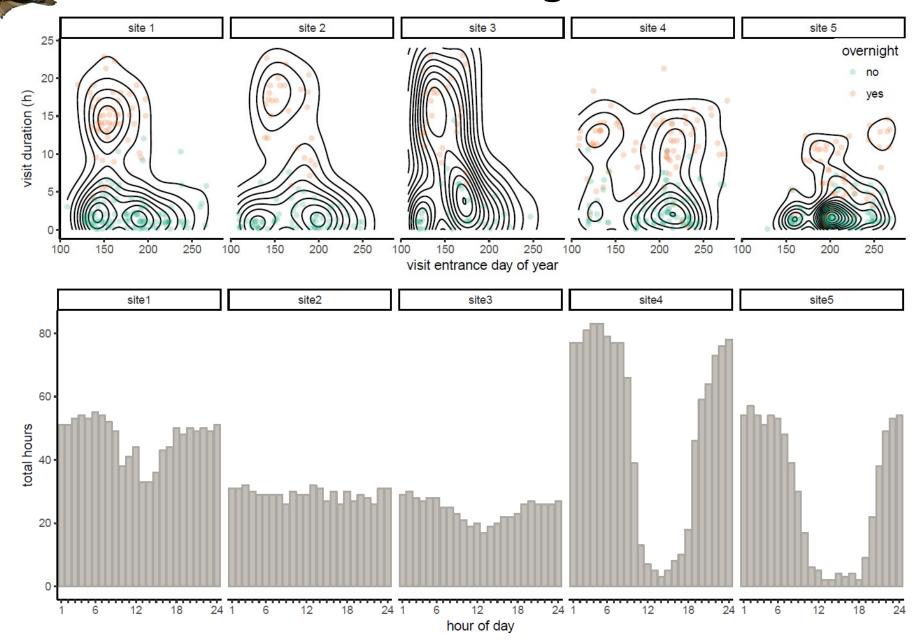


Visit duration varies by time of day





#### Patterns of visit timing and duration



## What have we learned about Leo?

- Identified 5 frequently used sites (nests/roosts)
- Temporal pattern of visitation, seasonally and among years
- Partitioned visits: short non-overnight and longer overnight with dawn departure
- Partitioned sites 1-3 vs 4-5: visit time of day and overnight visit seasonal pattern

#### Resources for recurse package

CRAN: recurse vignette
 https://cran.r-project.org/web/packages/recurse/vignettes/recurse.html

 Bracis, C., Bildstein, K. L., & Mueller, T. (2018). Revisitation analysis uncovers spatio-temporal patterns in animal movement data. Ecography, 41(11), 1801-1811.

Source code in supplemental material