

# From individual movement to landscape and population connectivity

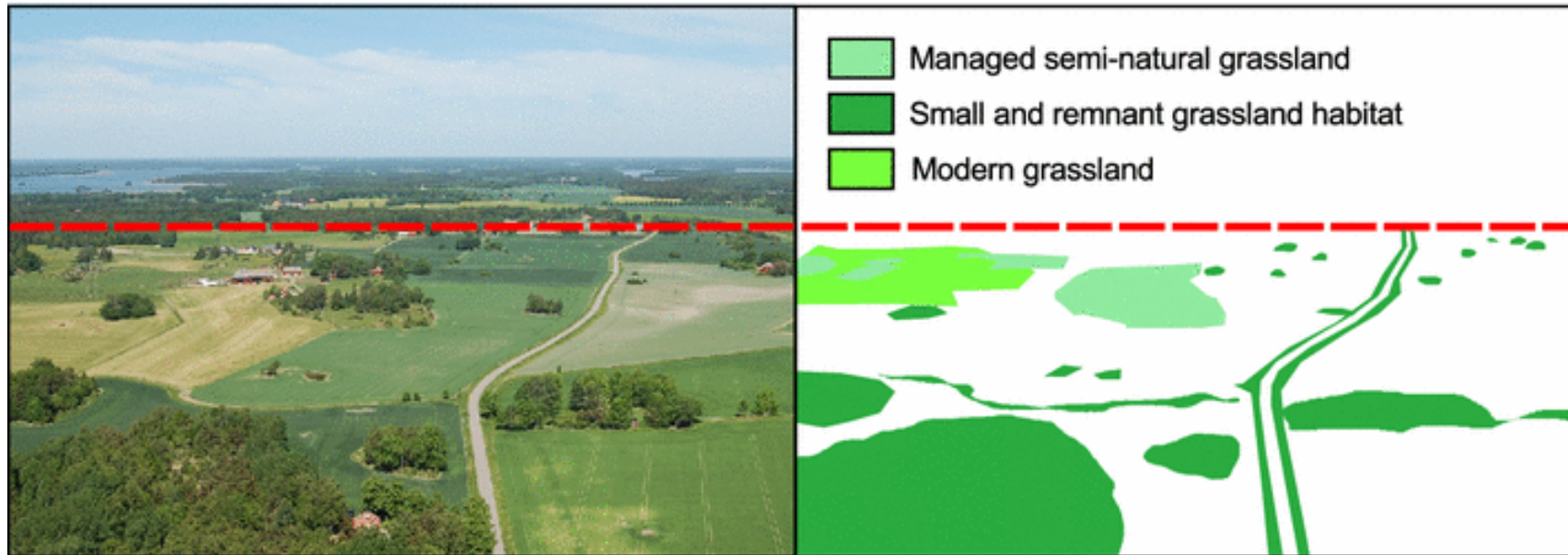
Bernardo Brandão Niebuhr  
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Animal Movement PhD-course, SLU  
Ekenäs Herrgård  
4-8 September, 2023

# Landscape connectivity

- Structural connectivity
- Functional connectivity



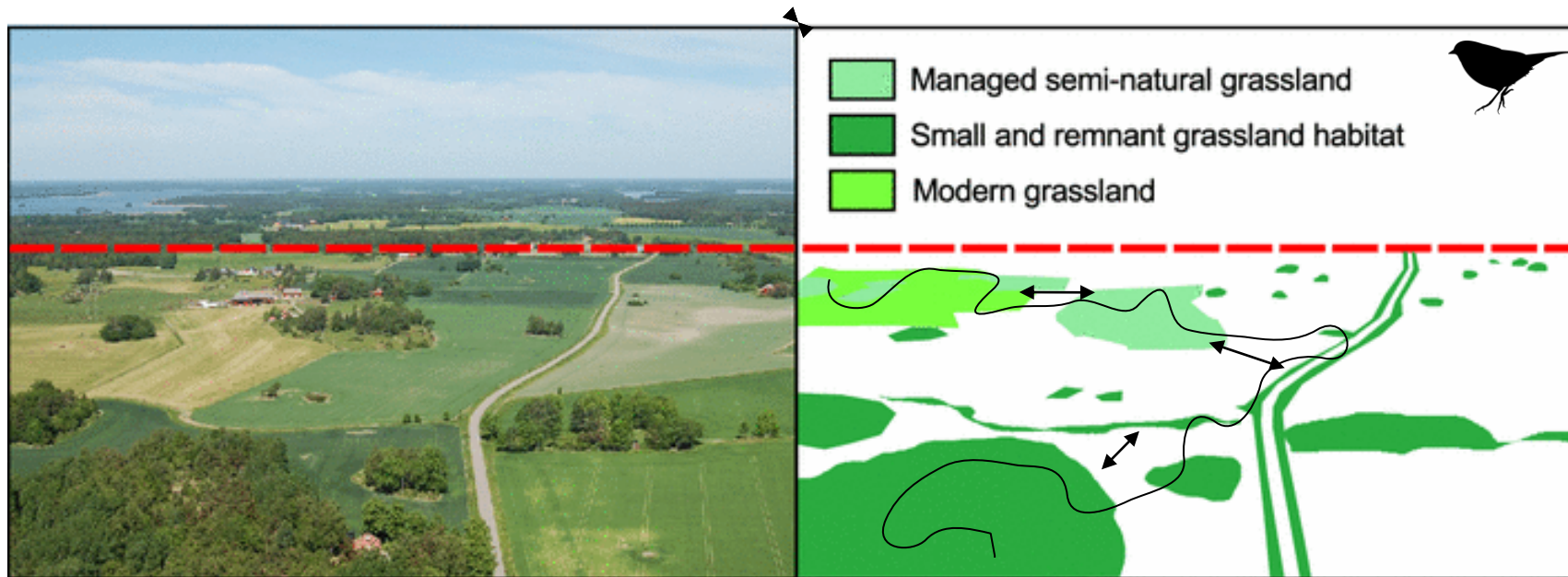
Auffret et al. 2015

# Landscape connectivity

- Structural connectivity
- Functional connectivity



Population  
dynamics



Auffret et al. 2015

# Movement ecology meets road ecology:

## Landscape connectivity in face of an expanding road network



www

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Andreia Moraes, Brenda Alexandre, Assis,  
Milene Alves-Eigenheer, Marcio de Moraes-Jr,  
Andreia Martins, Ademilson Oliveira, Elisamã Moraes,  
Maria Lucia Lorini, Carlos Ramon Ruiz-Miranda,  
Laurence Culot, Milton Cezar Ribeiro



# Golden Lion Tamarins

*Leontopithecus rosalia*

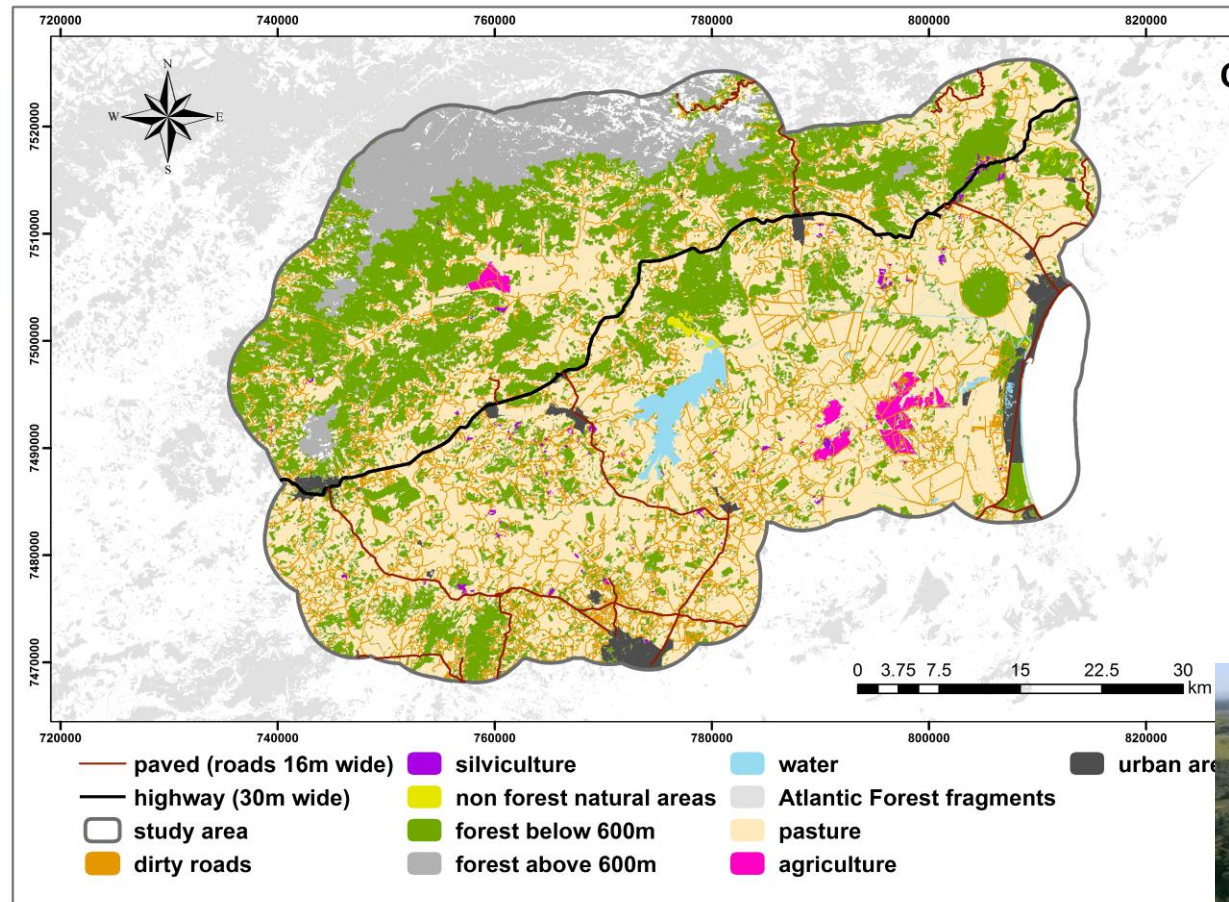
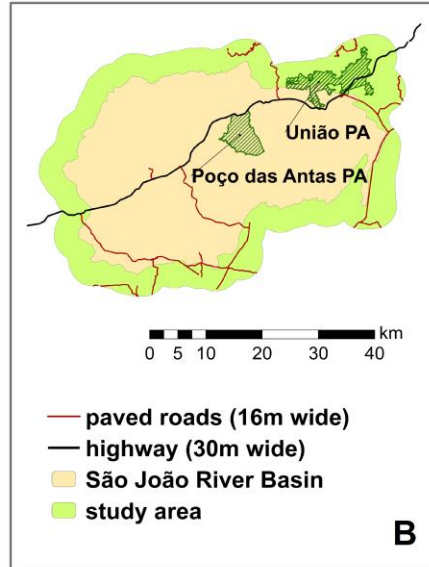
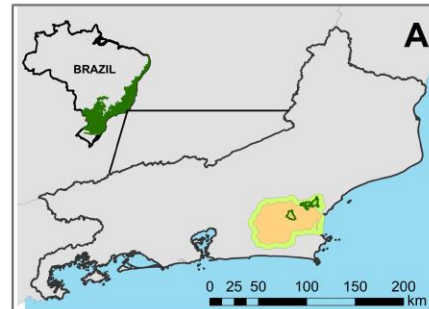


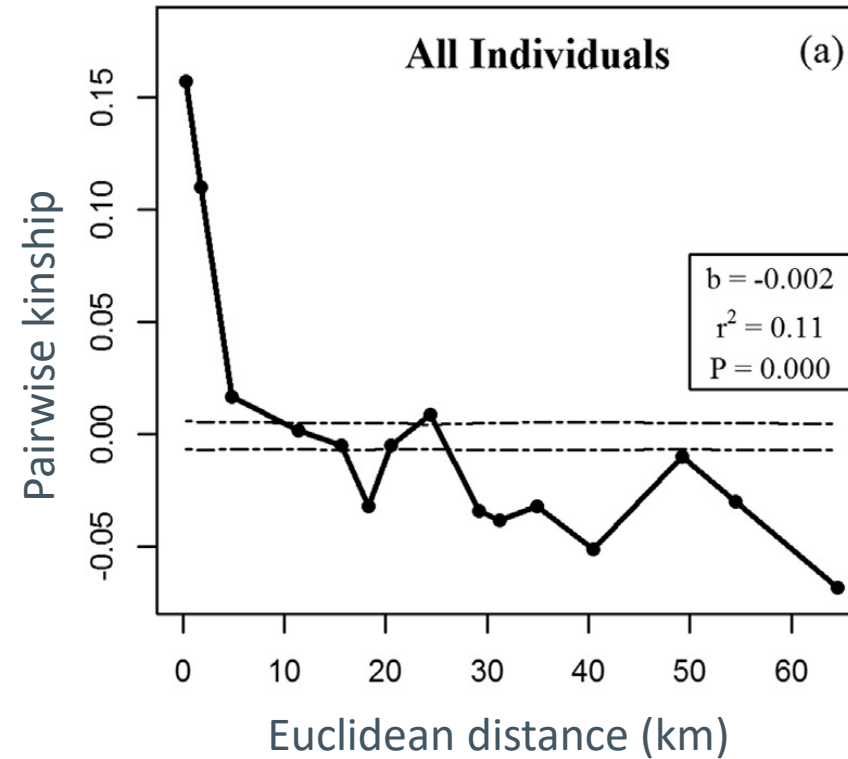
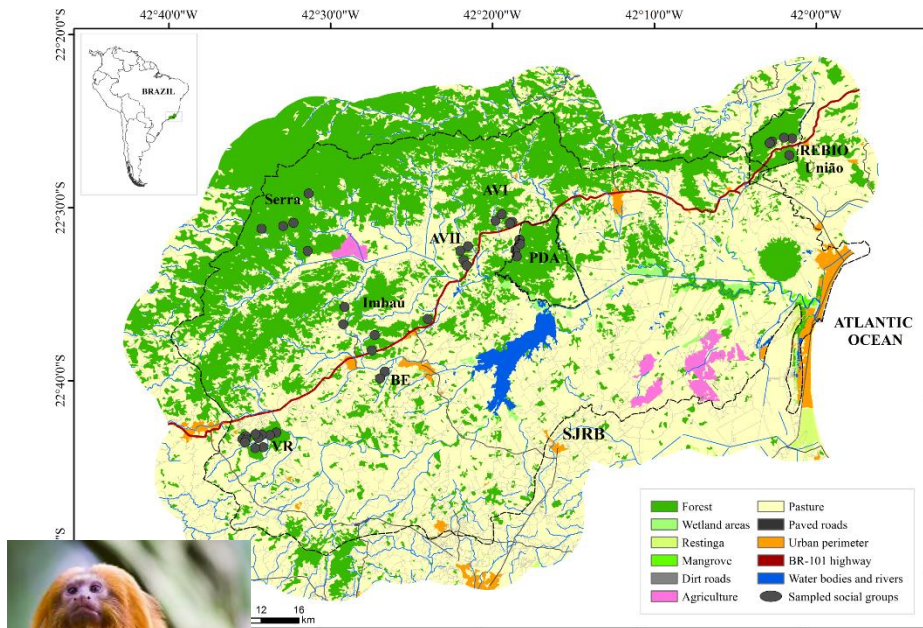
- Callitrichidae
- Monogamic and cohesive groups
- Arboreal
- Forest dependance
- Endangered
- 30 years of continuous research



# Golden Lion Tamarins

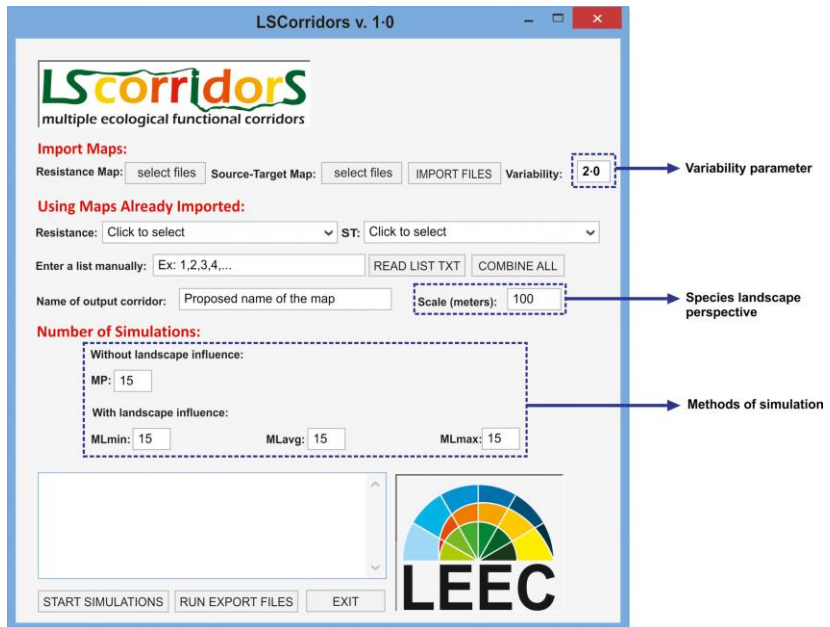
## *Leontopithecus rosalia*



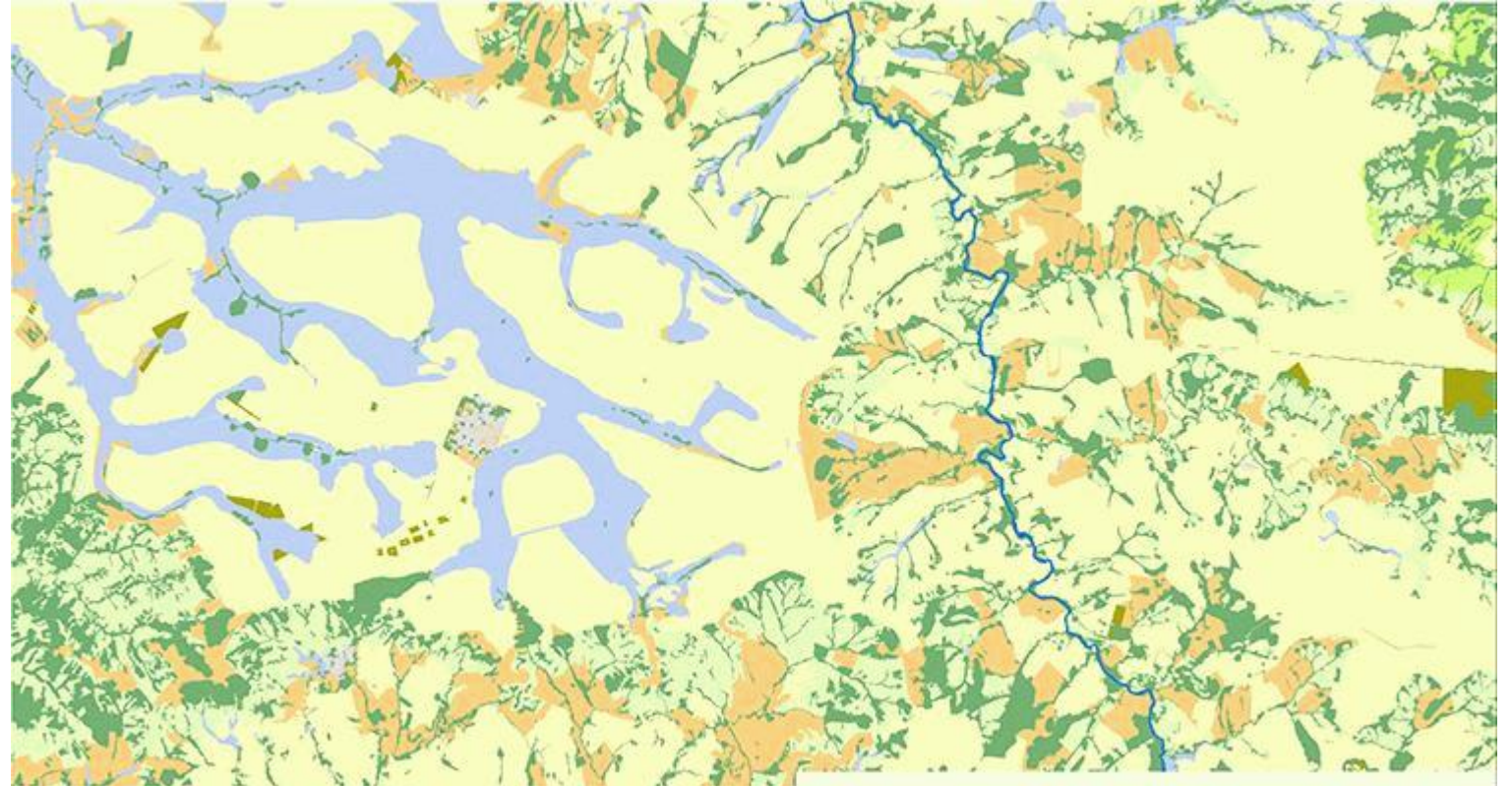


Moraes et al. 2018  
Landscape genetics of GLT



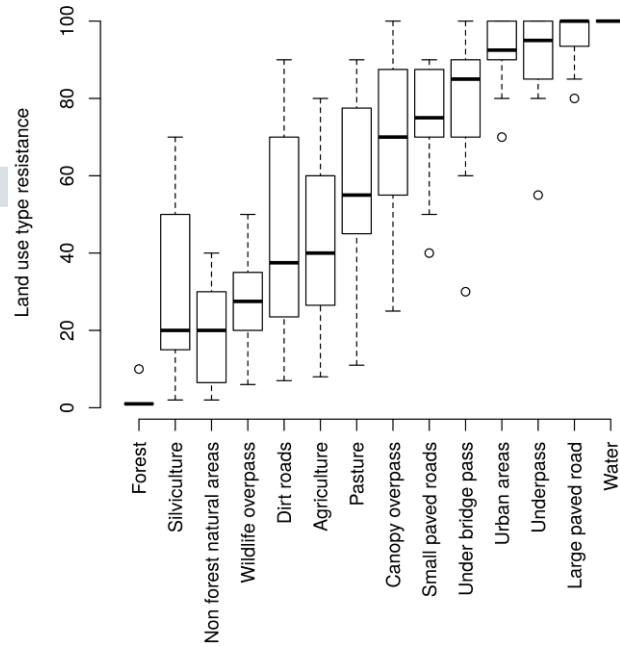


Ribeiro et al. 2017

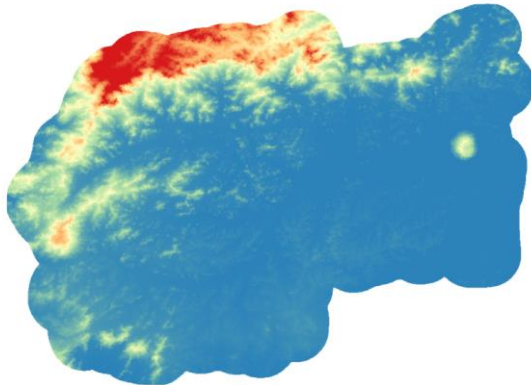




## Expert knowledge



Elevation +



## Movement meets roads



**LSCorridors v. 1-0**

**Import Maps:**  
 Resistance Map:  Source-Target Map:   Variability:  → Variability parameter

**Using Maps Already Imported:**  
 Resistance:  ST:   
 Enter a list manually:

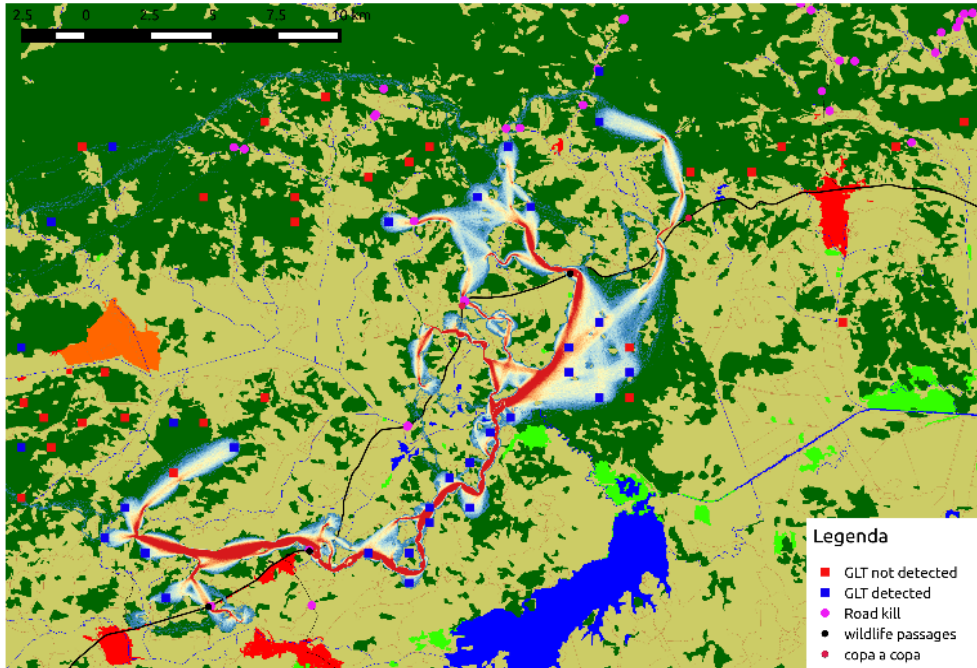
Name of output corridor:  Scale (meters):  → Species landscape perspective

**Number of Simulations:**

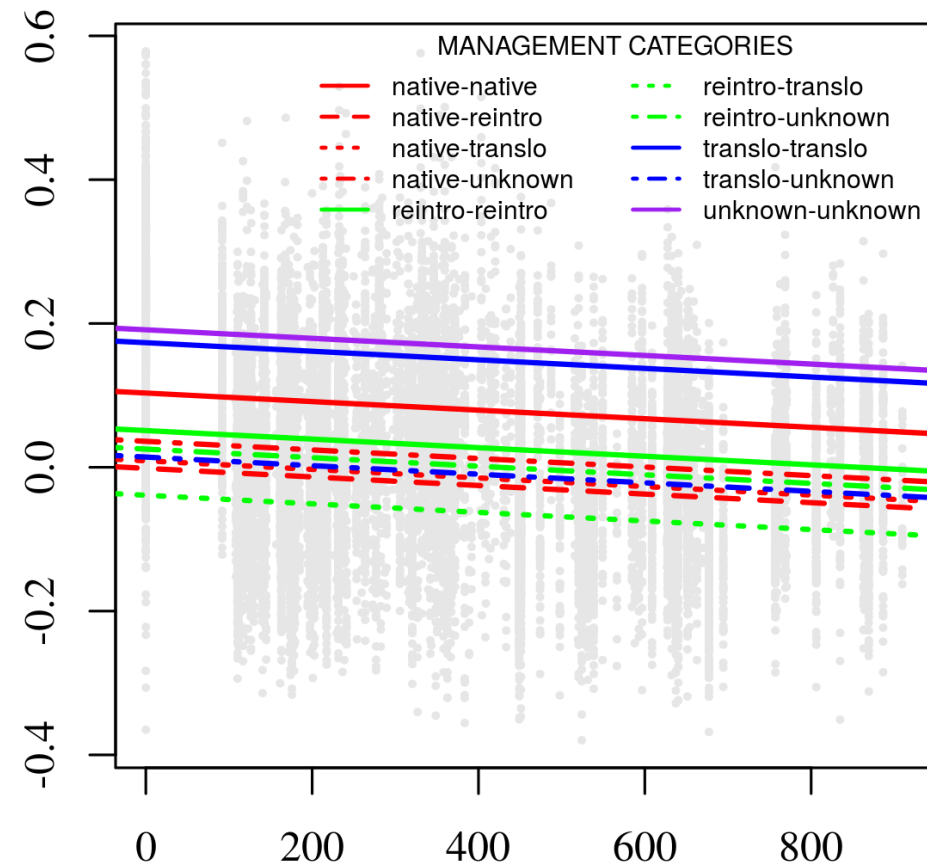
Without landscape influence:  
 MP:

With landscape influence:  
 MLmin:  MLavg:  MLmax:  → Methods of simulation

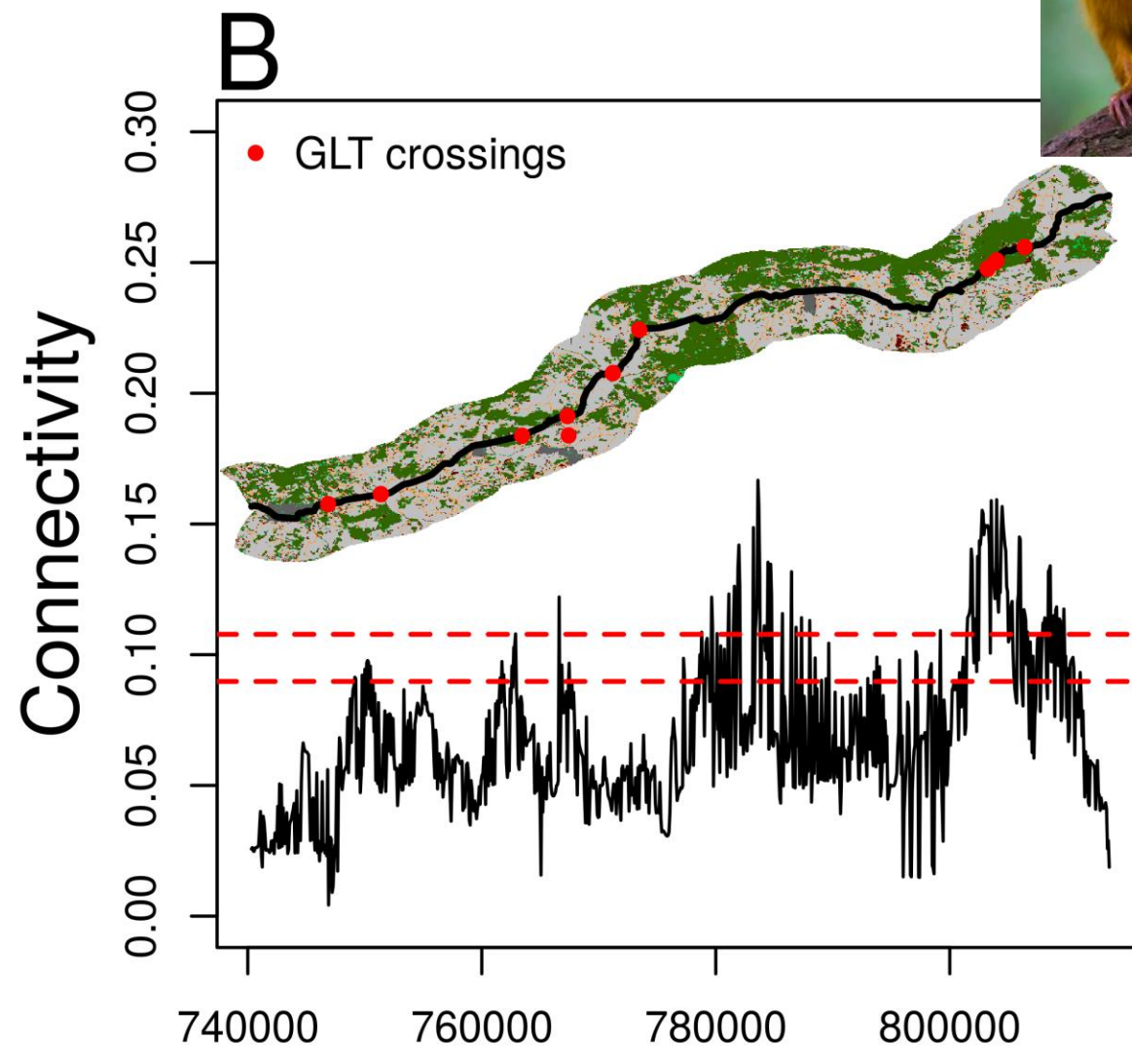
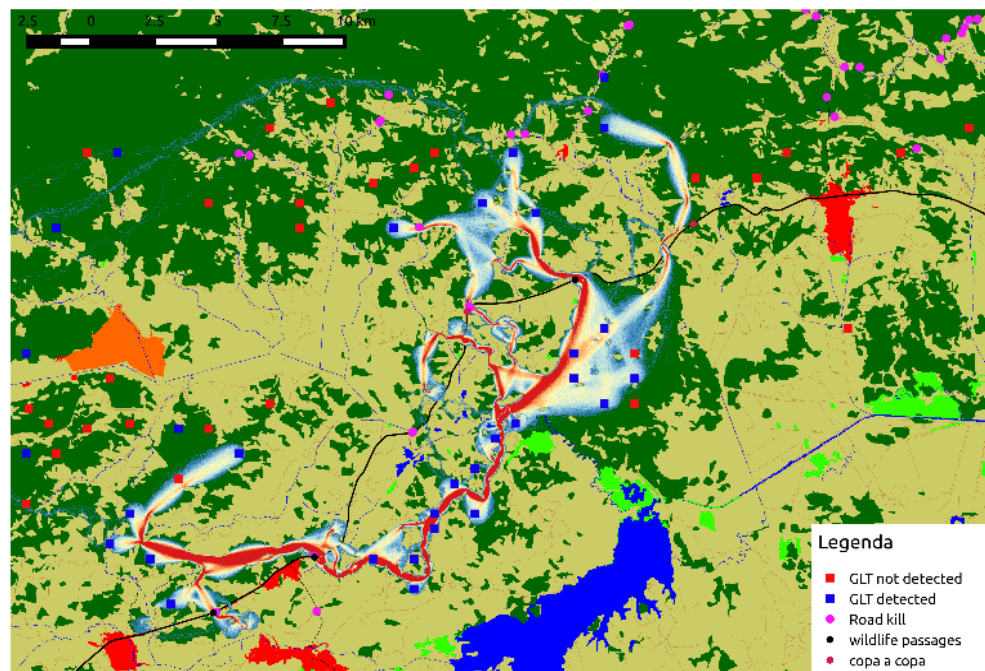
**LEEC**



Pairwise Kinship

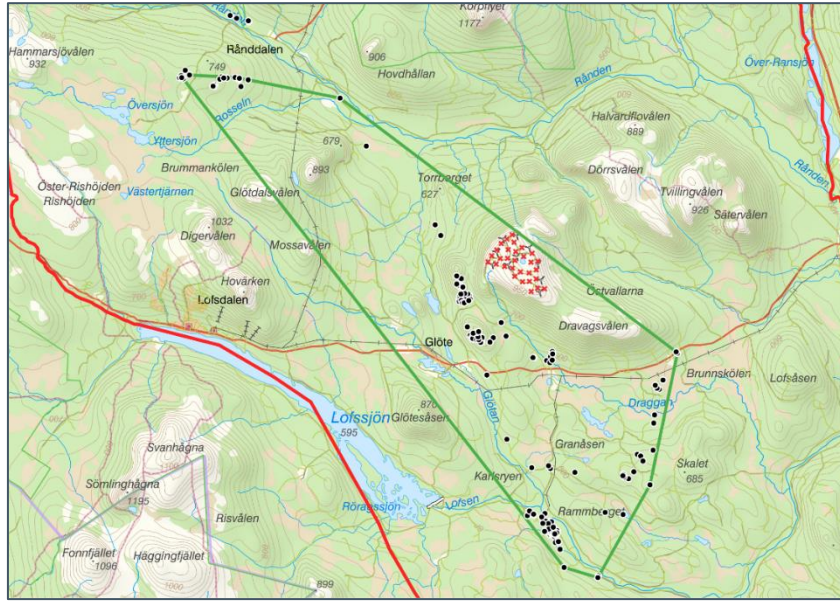


Moraes et al. 2018  
Landscape genetics of GLT

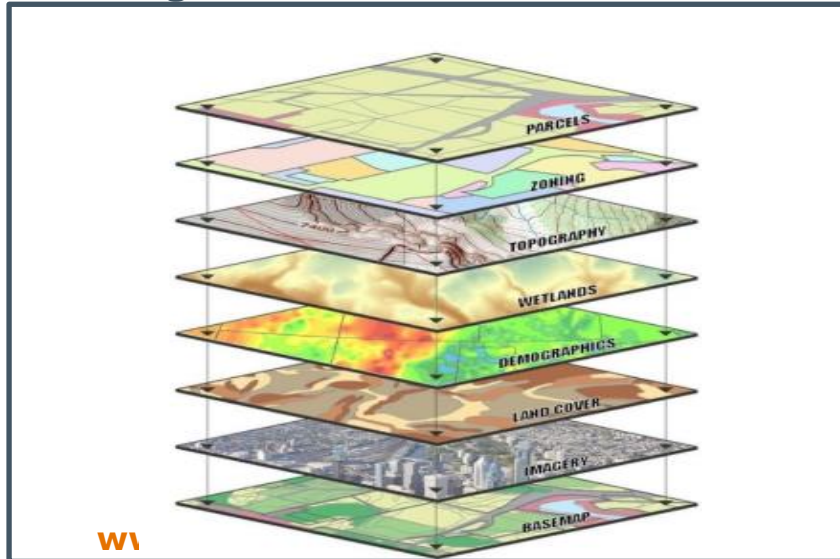




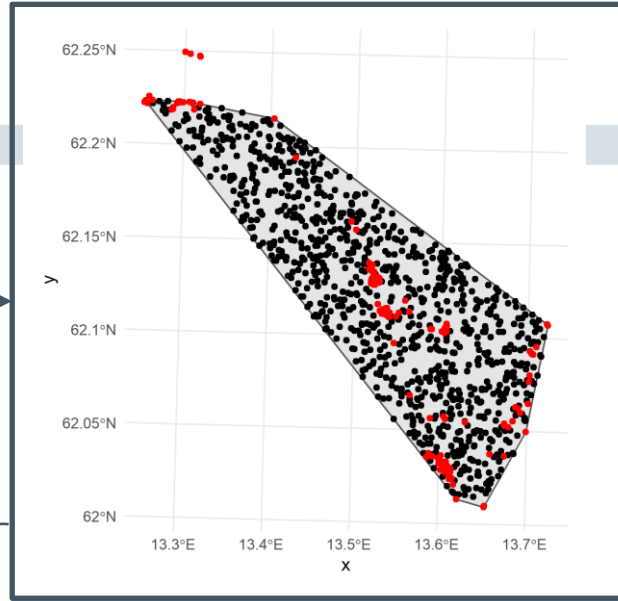
a. Animal movement (GPS) data



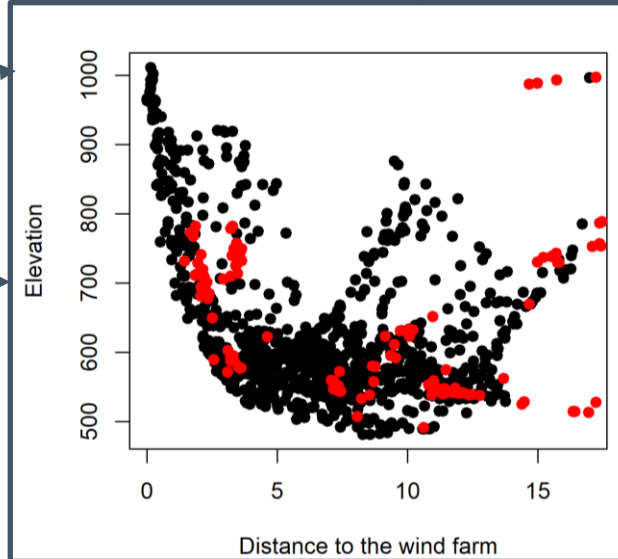
b. Background data



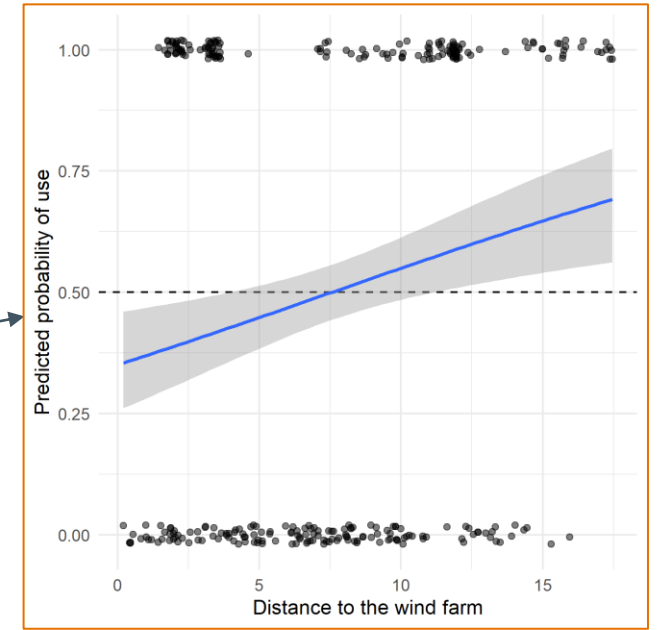
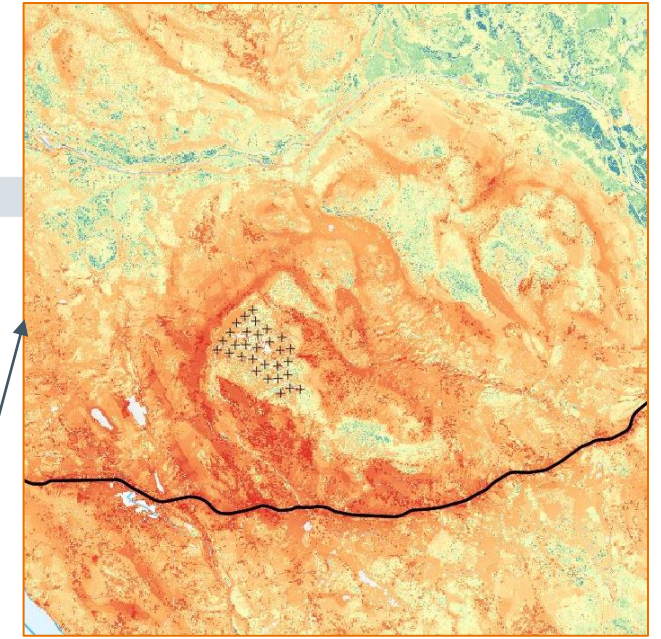
c. Use-availability design on geographical space

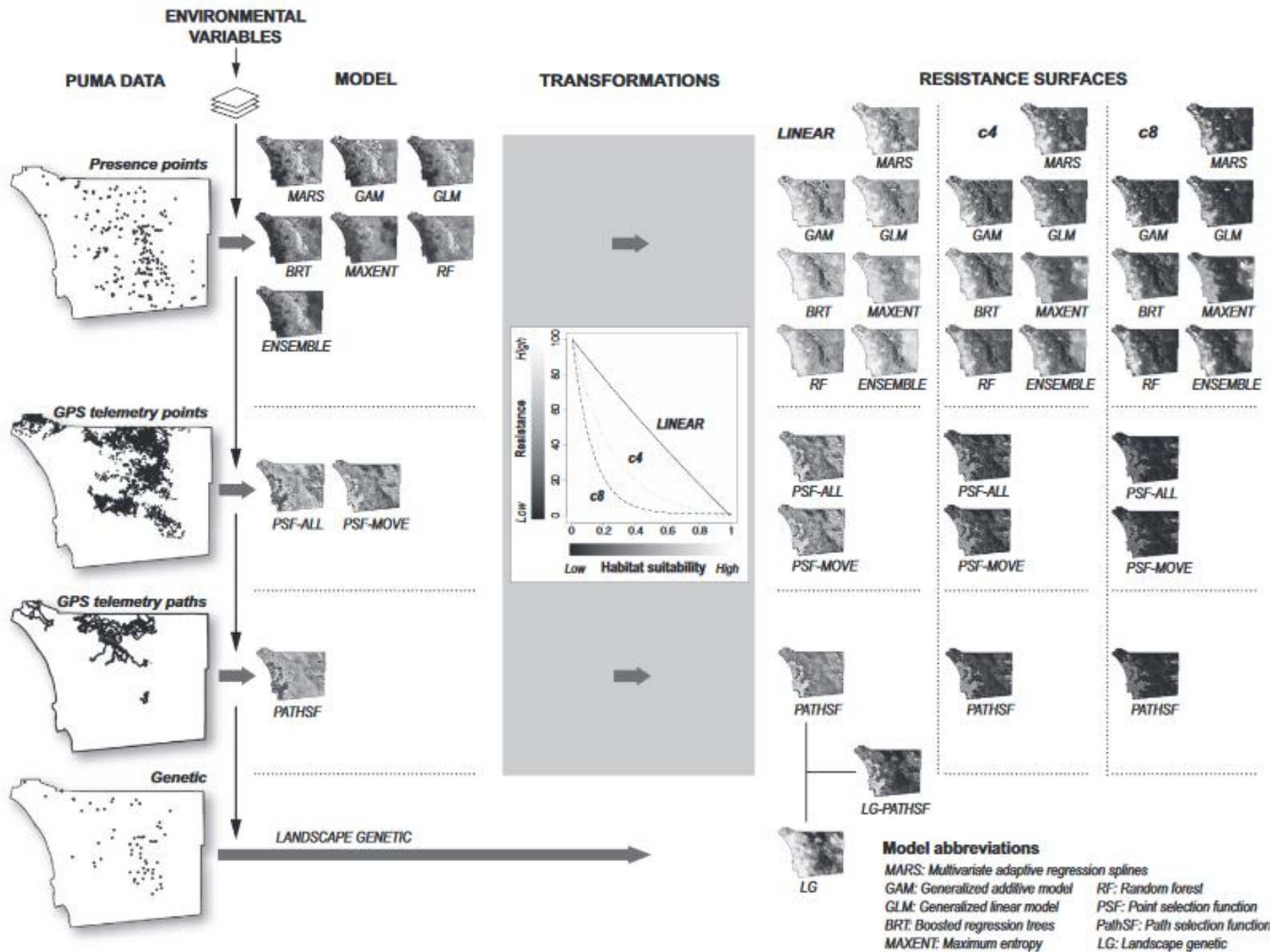


d. Environmental space



e. Predicted probability of use

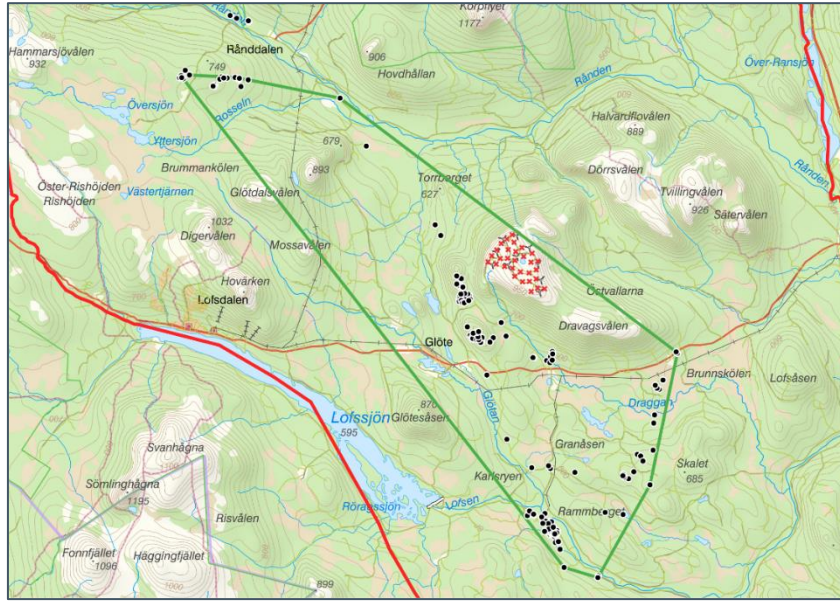




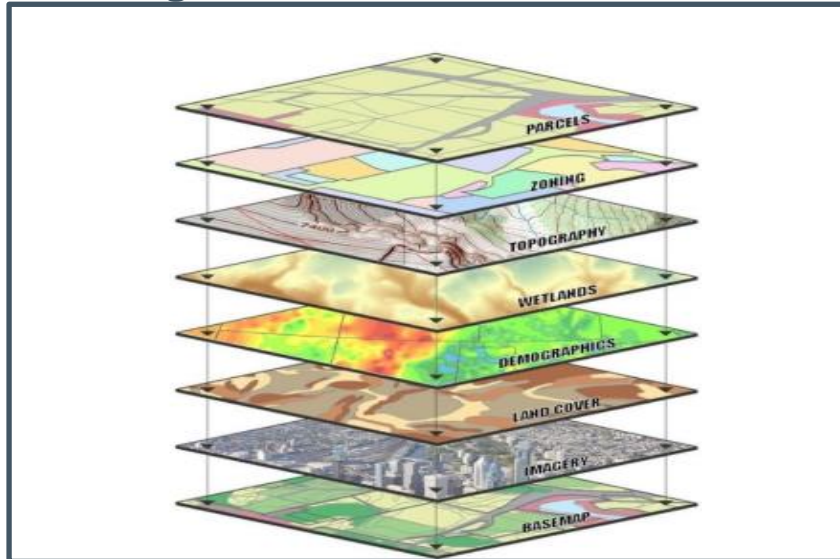
Zeller et al. 2018



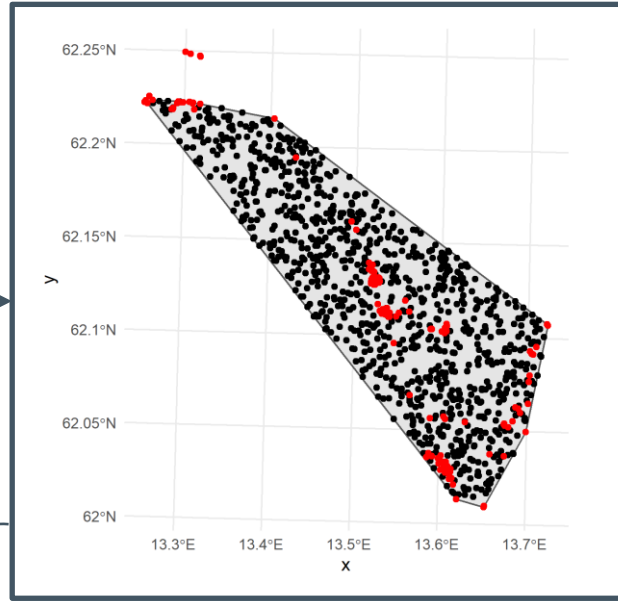
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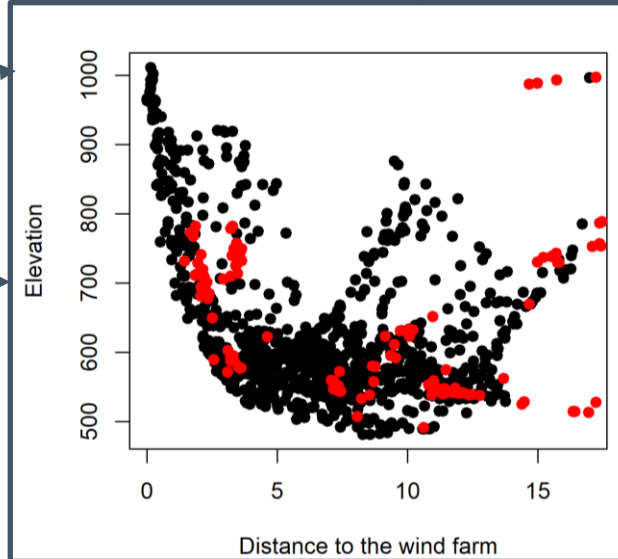
b. Background data



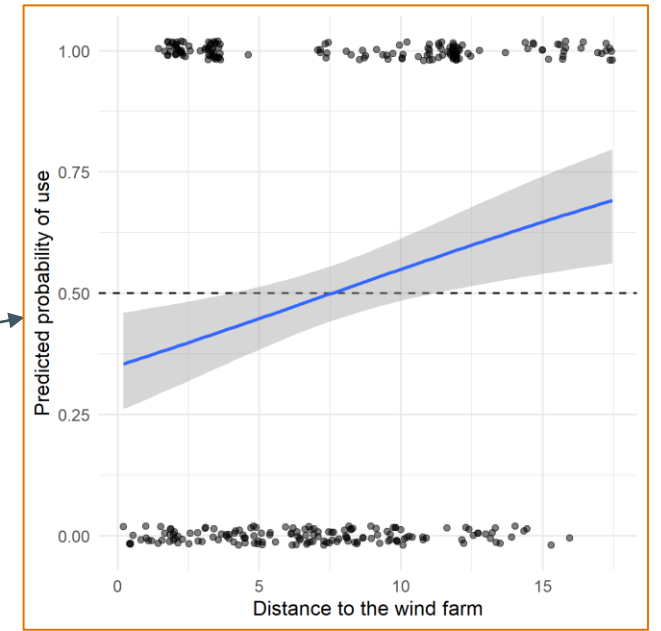
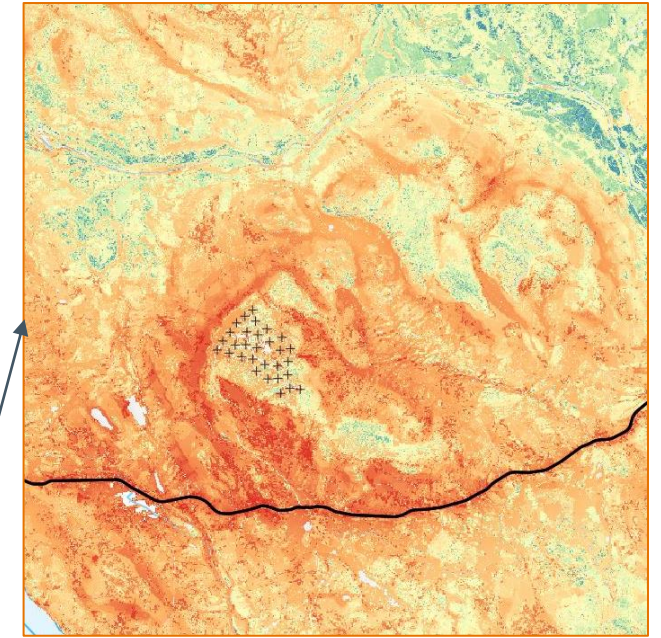
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d. Environmental space



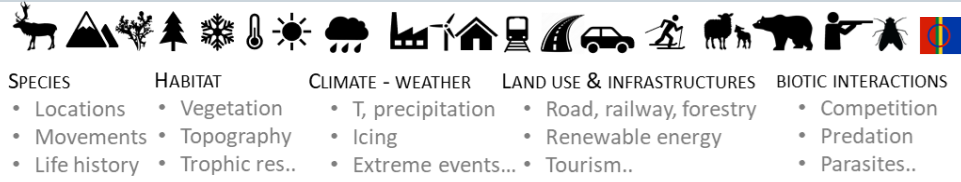
e. Predicted probability of use



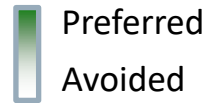


# HABITAT FUNCTIONALITY: BEYOND HABITAT SUITABILITY

## DATA



## HABITAT QUALITY



# HABITAT FUNCTIONALITY: BEYOND HABITAT SUITABILITY

PIXEL FOCUS  
(ENVIRONMENTAL SPACE)

## DATA



### SPECIES

- Locations
- Movements
- Life history

### HABITAT

- Vegetation
- Topography
- Trophic res..

### CLIMATE - WEATHER

- T, precipitation
- Icing
- Extreme events...

### LAND USE & INFRASTRUCTURES

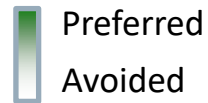
- Road, railway, forestry
- Renewable energy
- Tourism..

### BIOTIC INTERACTIONS

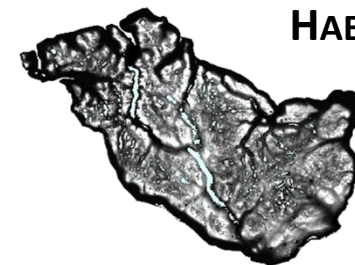
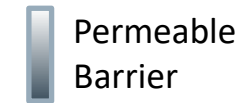
- Competition
- Predation
- Parasites..



## HABITAT QUALITY

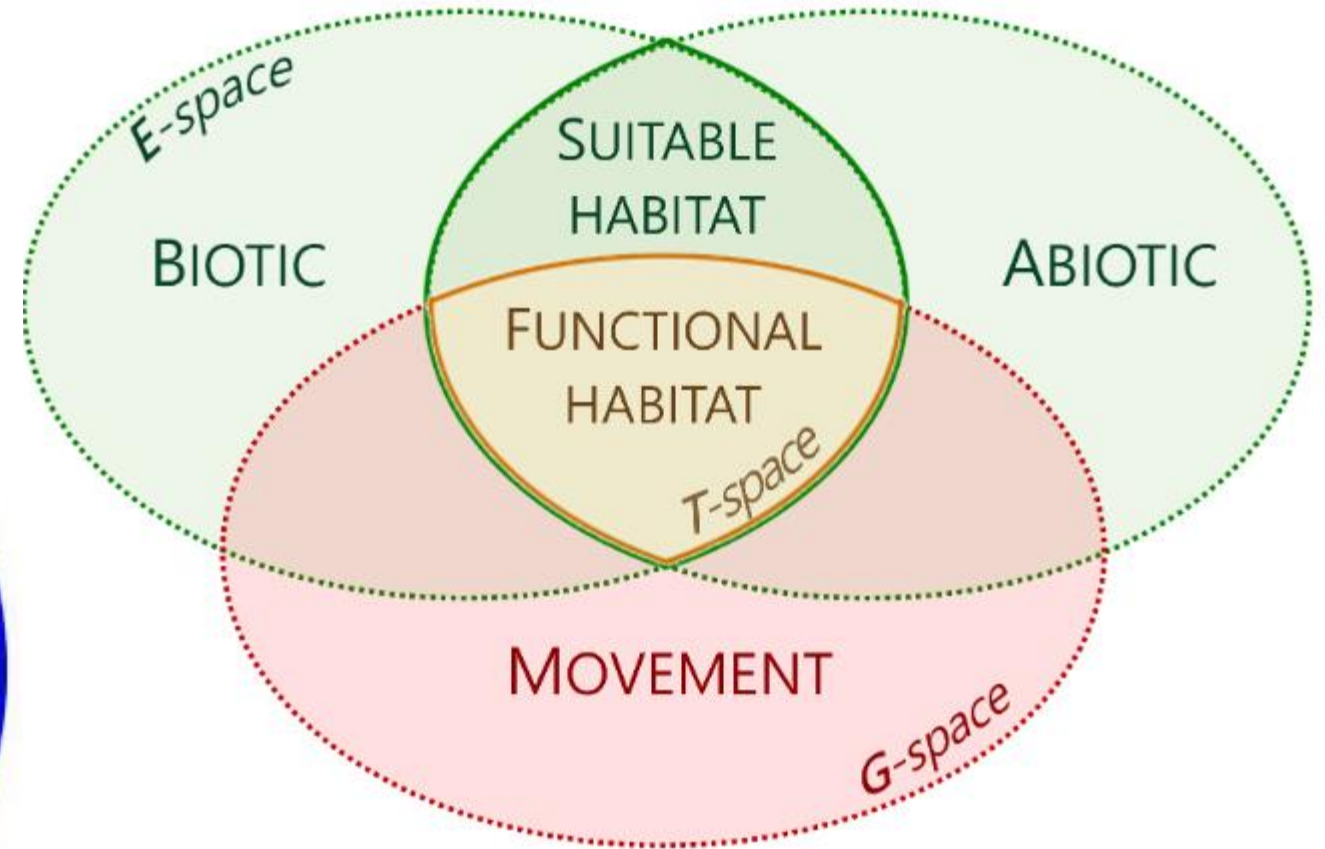
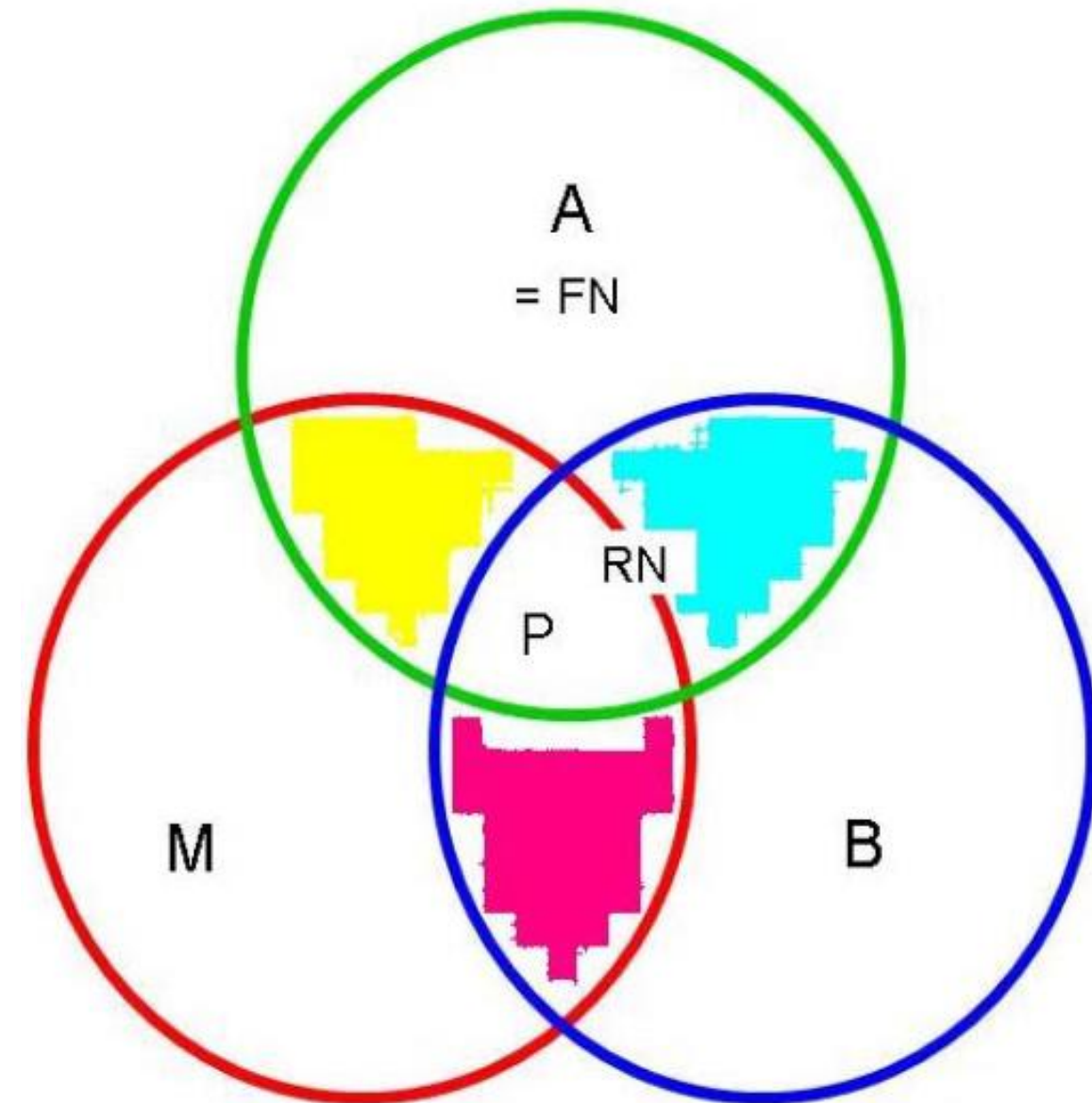


## HABITAT PERMEABILITY



Panzacchi et al 2022  
Van Moorter et al 2021  
Van Moorter et al 2023a,b

# HABITAT FUNCTIONALITY: BEYOND HABITAT SUITABILITY



Van Moorter et al 2023b



# HABITAT FUNCTIONALITY: BEYOND HABITAT SUITABILITY

DATA



SPECIES

- Locations
- Movements
- Life history

HABITAT

- Vegetation
- Topography
- Trophic res..

CLIMATE - WEATHER

- T, precipitation
- Icing
- Extreme events...

LAND USE & INFRASTRUCTURES

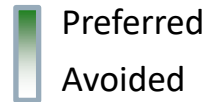
- Road, railway, forestry
- Renewable energy
- Tourism..

BIOTIC INTERACTIONS

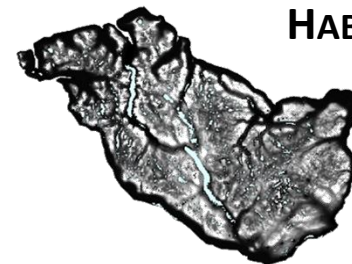
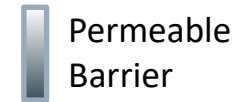
- Competition
- Predation
- Parasites..



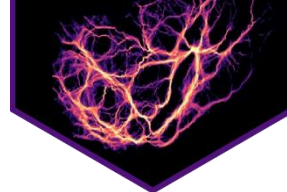
HABITAT QUALITY



HABITAT PERMEABILITY



ConScape

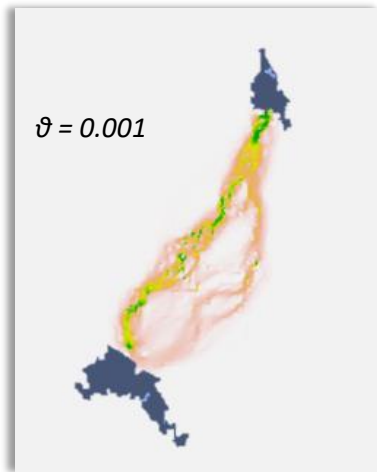


LEAST- COST PATH

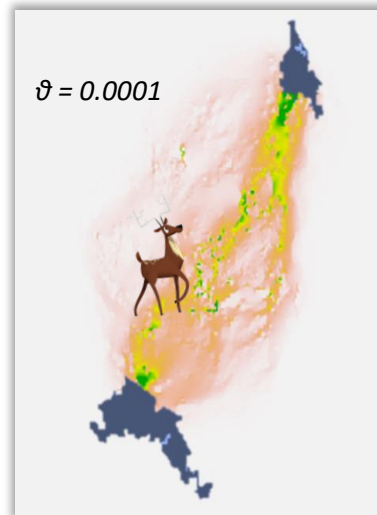
$\vartheta = 0.1$



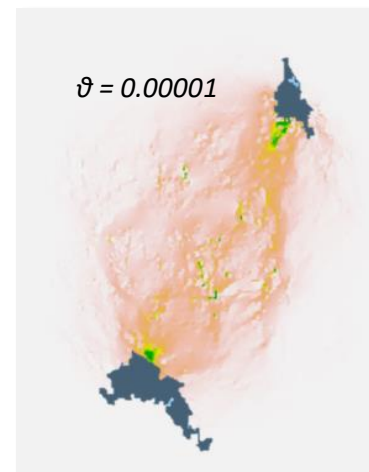
$\vartheta = 0.001$



$\vartheta = 0.0001$

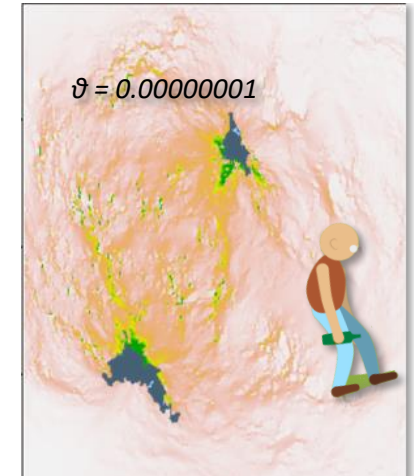


$\vartheta = 0.00001$



RANDOM WALK

$\vartheta = 0.00000001$

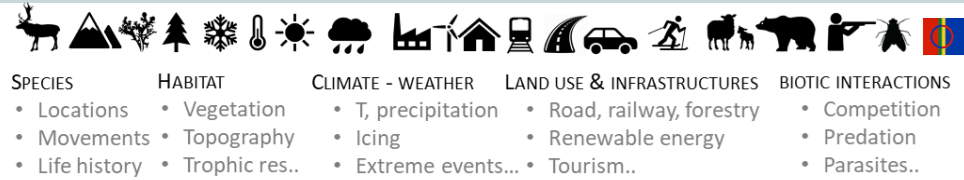


Panzacchi et al 2022  
Van Moorter et al 2021  
Van Moorter et al 2023a,b

# HABITAT FUNCTIONALITY: BEYOND HABITAT SUITABILITY

PIXEL FOCUS  
(ENVIRONMENTAL SPACE)

DATA



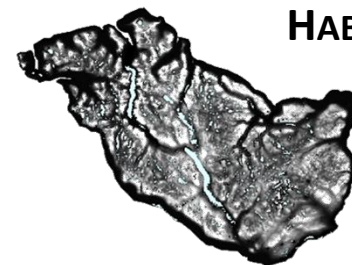
**HABITAT QUALITY**

Preferred  
Avoided



**HABITAT PERMEABILITY**

Permeable  
Barrier

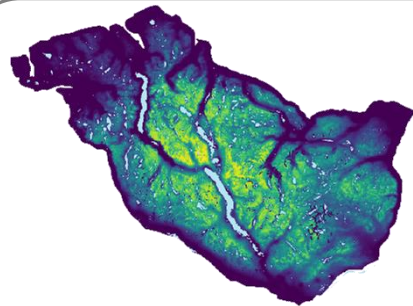


ConScape



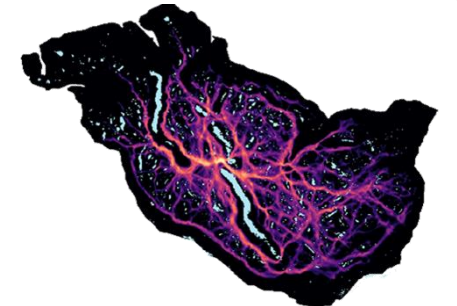
**HABITAT FUNCTIONALITY**

High (preferred and well connected)  
Low (low quality &/or inaccessible)



**MOVEMENT FLOW**

High (movement hub, "traffic-jam")  
Low



**AID SUSTAINABLE LAND PLANNING:**

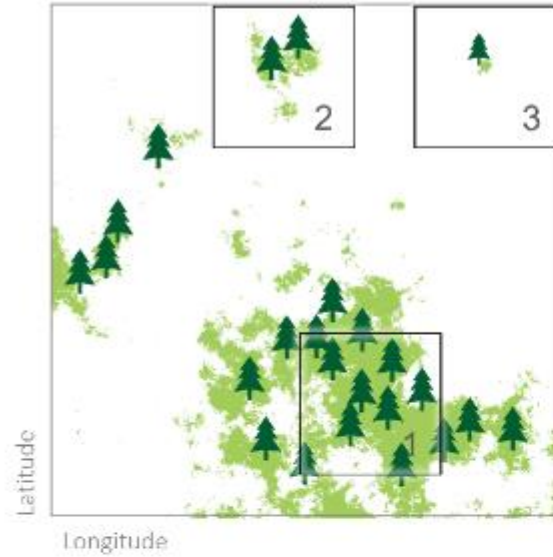
- *Scenario analyses:* quantify impact of changes in the landscape/climate
- Identify priority areas for conservation (zonation)

Panzacchi et al 2022  
Van Moorter et al 2021  
Van Moorter et al 2023a,b

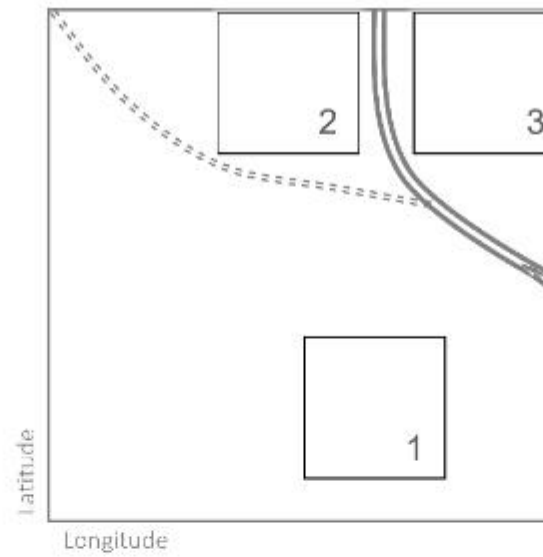
LANDSCAPE FOCUS  
(GEOGRAPHIC SPACE)

# HABITAT FUNCTIONALITY: BEYOND HABITAT SUITABILITY

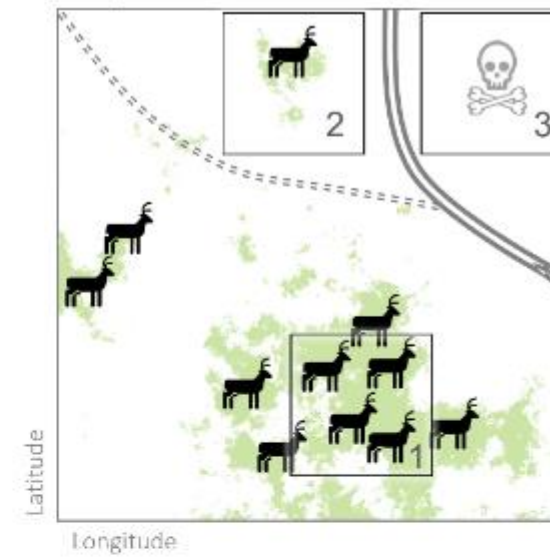
A Land cover (G-space)



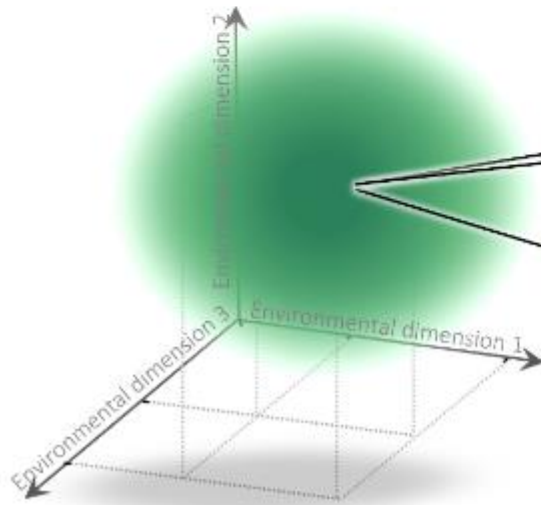
B Barriers



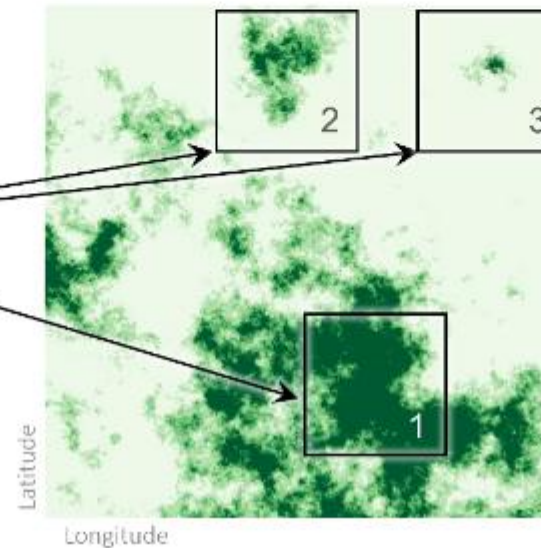
C Population distribution



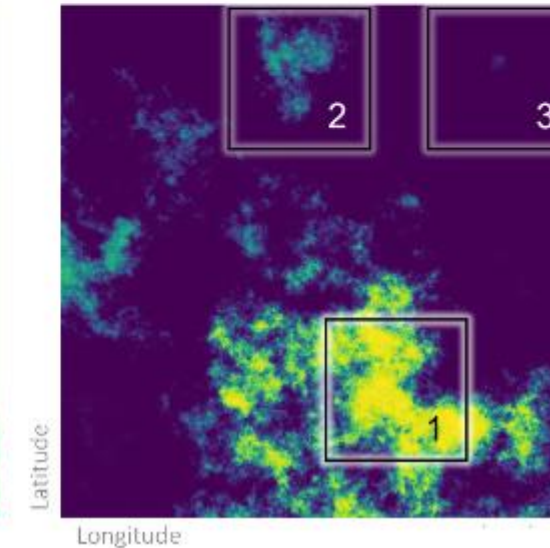
D Niche (E-space)



E Suitable habitat



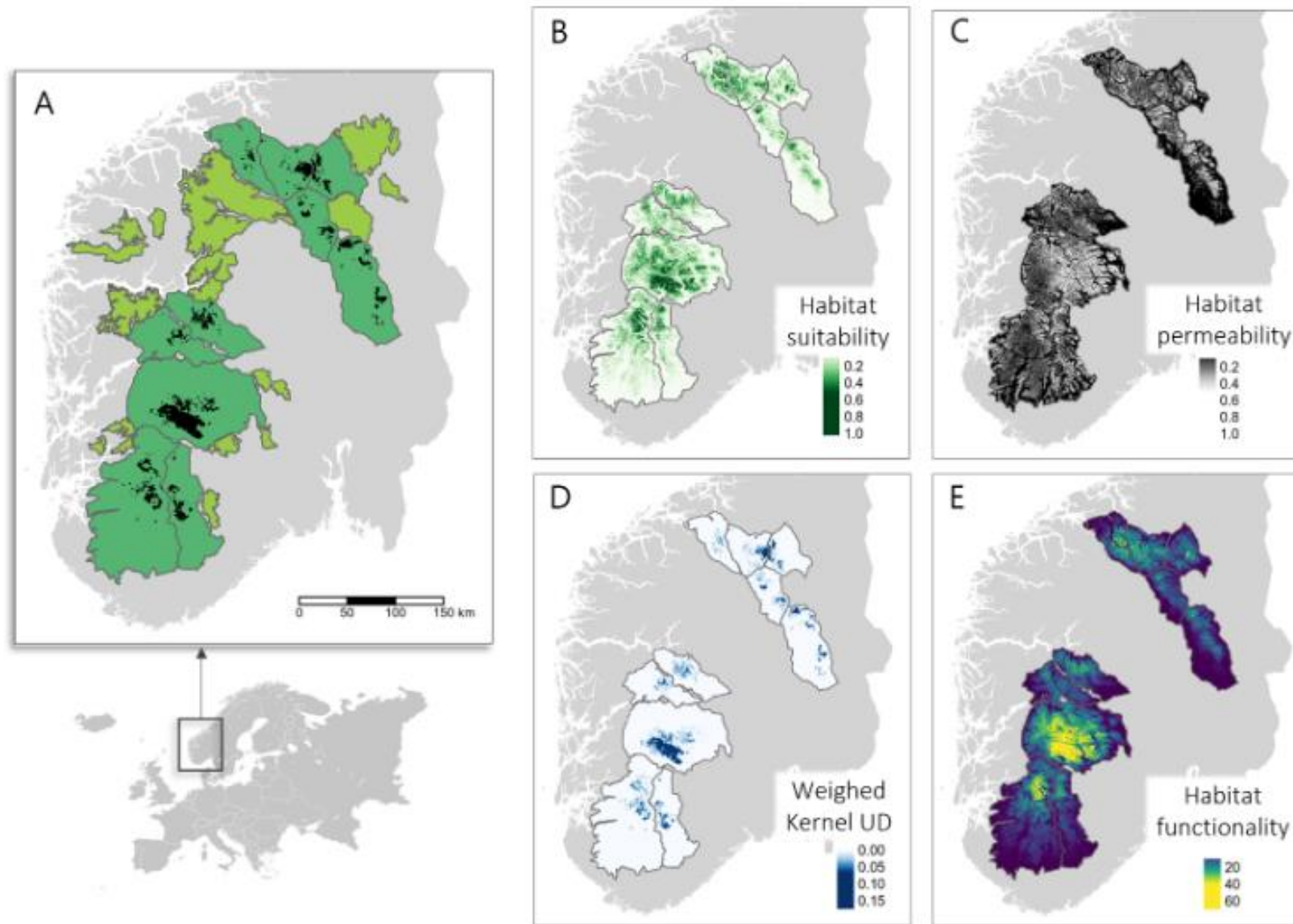
F Functional habitat



Van Moorter et al 2023b



# HABITAT FUNCTIONALITY: BEYOND HABITAT SUITABILITY



Van Moorter et al 2023b

# Connectivity modeling tools

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- R: [leastcostpath](#) package
- GRASS GIS/Python: [LSCorridors](#)
- Julia:
  - [Circuitscape](#)
  - [ConScape](#)

# Literature

- Auffret, A. G., Plue, J., & Cousins, S. A. O. (2015). The spatial and temporal components of functional connectivity in fragmented landscapes. *AMBIO*, 44(1), 51–59. <https://doi.org/10.1007/s13280-014-0588-6>
- Ribeiro, J. W., Silveira dos Santos, J., Dodonov, P., Martello, F., Brandão Niebuhr, B., & Ribeiro, M. C. (2017). LandScape Corridors (LSCorridors): A new software package for modelling ecological corridors based on landscape patterns and species requirements. *Methods in Ecology and Evolution*, 8(11), 1425–1432. <https://doi.org/10.1111/2041-210X.12750>
- Moraes, A. M., Ruiz-Miranda, C. R., Galetti Jr., P. M., Niebuhr, B. B., Alexandre, B. R., Muylaert, R. L., Grativol, A. D., Ribeiro, J. W., Ferreira, A. N., & Ribeiro, M. C. (2018). Landscape resistance influences effective dispersal of endangered golden lion tamarins within the Atlantic Forest. *Biological Conservation*, 224, 178–187. <https://doi.org/10.1016/j.biocon.2018.05.023>
- Zeller, K. A., Jennings, M. K., Vickers, T. W., Ernest, H. B., Cushman, S. A., & Boyce, W. M. (2018). Are all data types and connectivity models created equal? Validating common connectivity approaches with dispersal data. *Diversity and Distributions*, 24(7), 868–879. <https://doi.org/10.1111/ddi.12742>
- Van Moorter, B., Kivimäki, I., Panzacchi, M., & Saerens, M. (2021). Defining and quantifying effective connectivity of landscapes for species' movements. *Ecography*, 44(6), 870–884. <https://doi.org/10.1111/ecog.05351>
- Van Moorter, B., Kivimäki, I., Noack, A., Devooght, R., Panzacchi, M., Hall, K. R., Leleux, P., & Saerens, M. (2023). Accelerating advances in landscape connectivity modelling with the ConScape library. *Methods in Ecology and Evolution*, 14(1), 133–145. <https://doi.org/10.1111/2041-210X.13850>
- Van Moorter, B., Kivimäki, I., Panzacchi, M., Saura, S., Brandão Niebuhr, B., Strand, O., & Saerens, M. (2023). Habitat functionality: Integrating environmental and geographic space in niche modeling for conservation planning. *Ecology*, n/a(n/a), e4105. <https://doi.org/10.1002/ecy.4105>



# Cooperation and expertise for a sustainable future

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