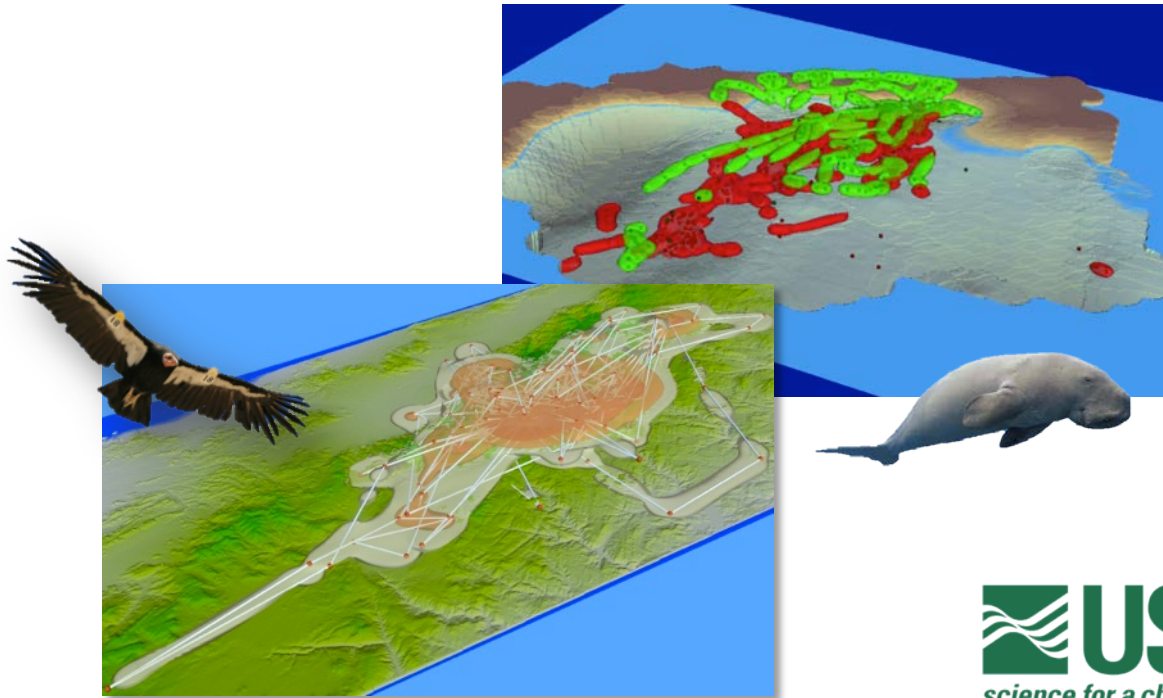


# *Biotelemetry revolution - estimating animal space use in 3D to avoid costly environmental impacts*

*Robert Sinkovits*

*SDSC IPP Webinar Series – August 20, 2014*



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# Overview

- Describe animal space use prediction in three dimensions, computational challenges and its applicability to carrying out an accurate environmental impact study
- Present a case study involving industry, government and non-profit organizations to address the impact of a proposed wind farm on the California Condor
- Highlight the impact that SDSC expertise can have on your project

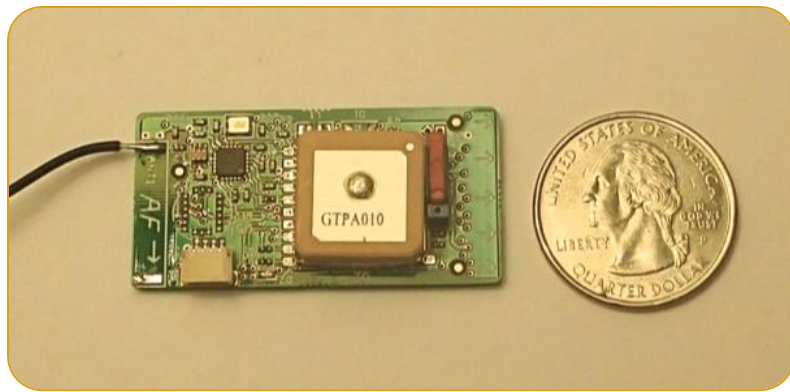
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# *Understanding environmental impact*

- All new infrastructure projects (buildings, roads, power plants, pipelines, dams, airports) need to undergo an environmental impact study
- Even though the project may pass the study, faulty predictions can have a devastating impact on both the environment and on a company's bottom line (e.g. imagine trying to move a wind farm)
- Accurate modeling of animal space use in three dimensions can reduce the likelihood of false positives and negatives

# *Biotelemetry revolution*

- Increasing sophistication and miniaturization of digital biotelemetry devices, e.g. GPS
- Enabling detailed information to be collected on the spatial behaviors of wildlife difficult to observe directly



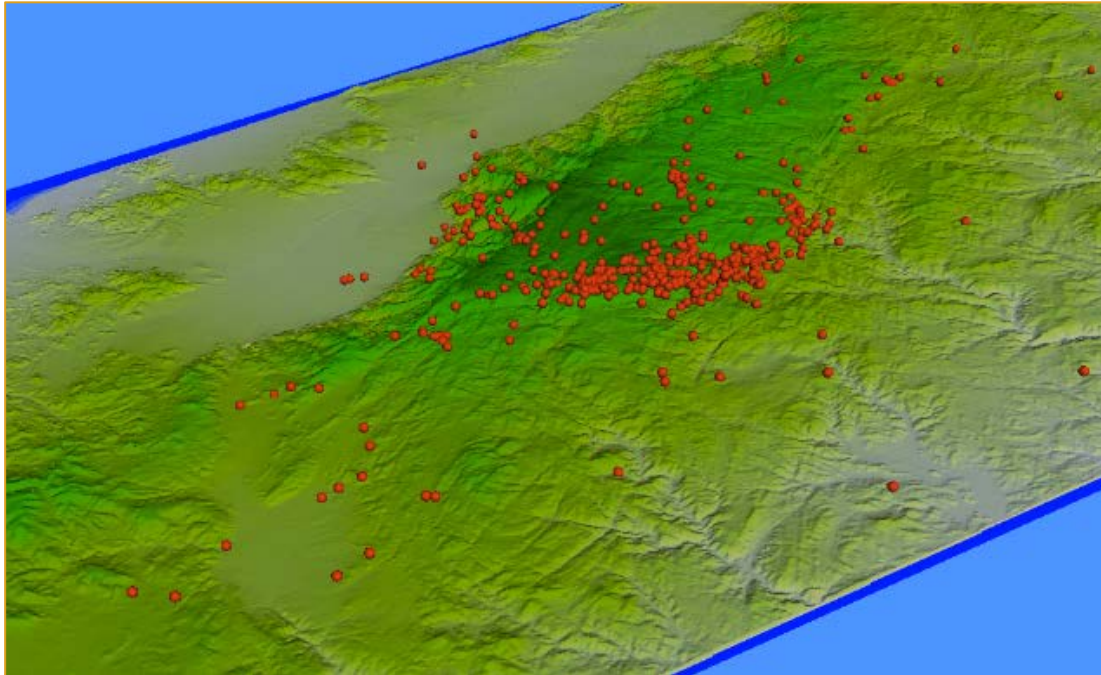
# Biotelemetry revolution

Crowded marketplace of vendors offering higher resolution longer-term trackers for smaller species.

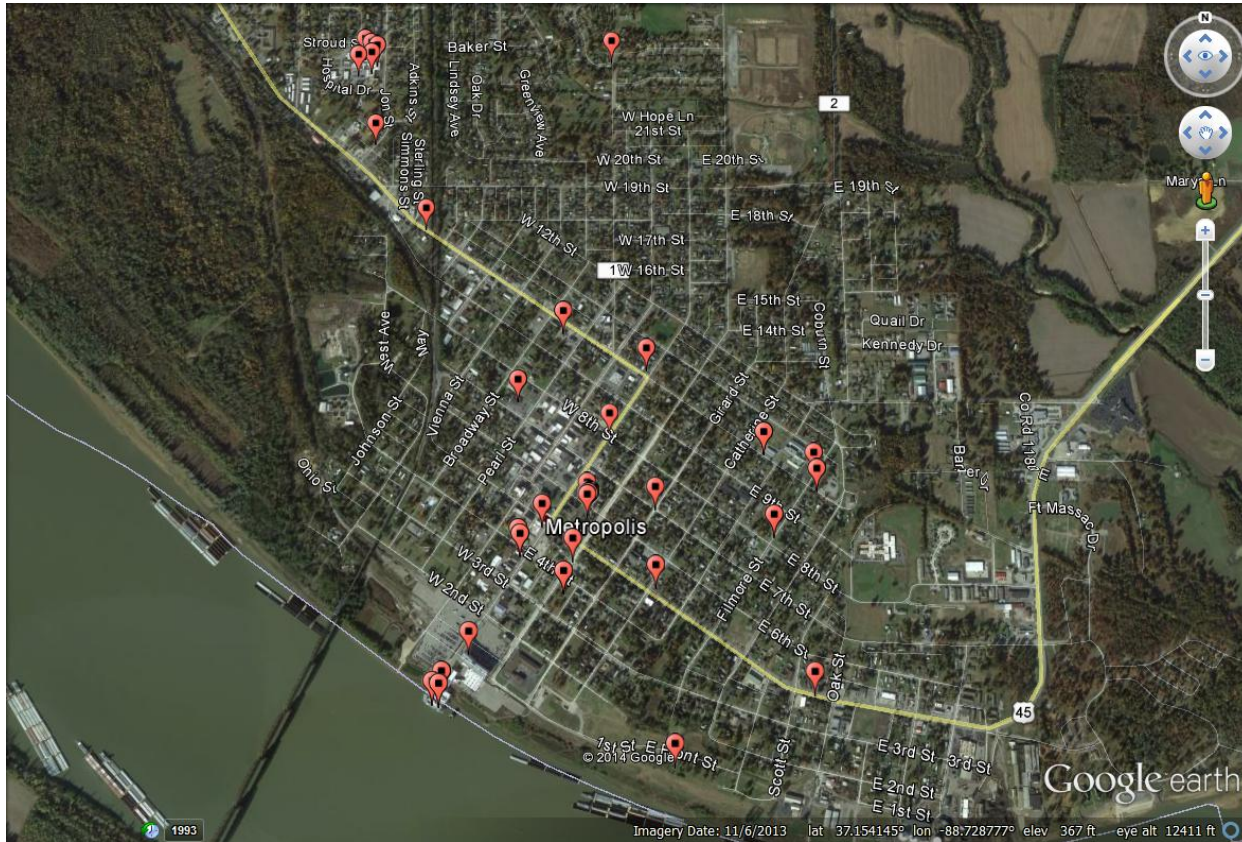


# *Turning discrete observations into home ranges*

Biotelemetry devices give us discrete readings (x,y,z coordinates), typically spaced an hour apart. Need to turn this raw data into home ranges, fairly well defined areas where the animal spends its time.



# 2D home range estimation



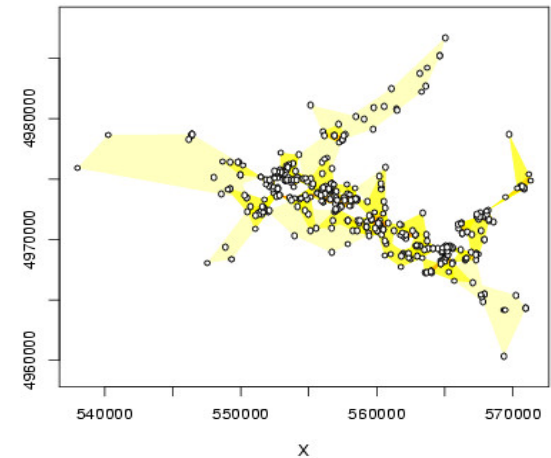
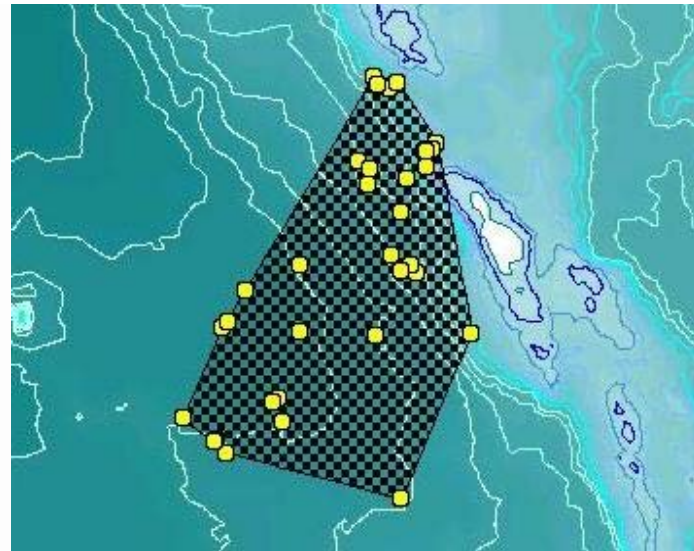
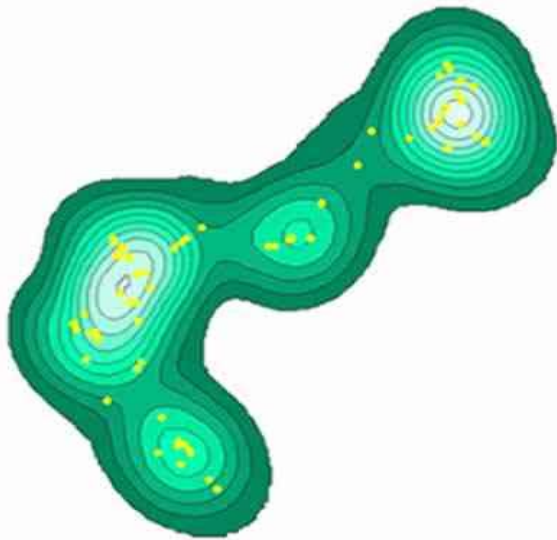
# 2D home range estimation





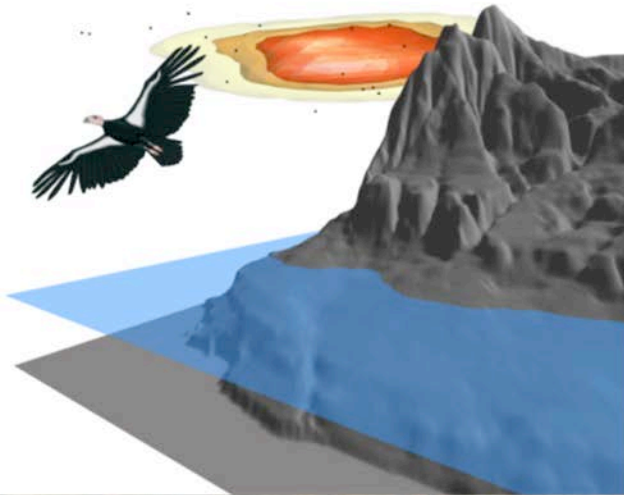
## From 2D to 3D

Previous home range estimators constrain models of animal space use to a biologically unrealistic 2D flatland. The current work extends this into 3D using a Movement-Based Kernel Density Estimator (MKDE)

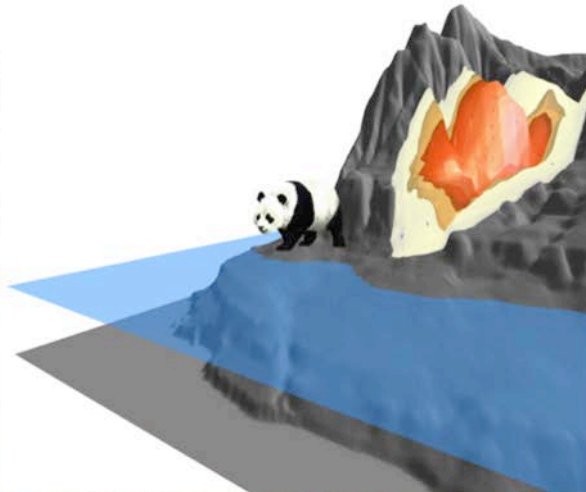


# *3D space use model important for animals with a large vertical component to their movement*

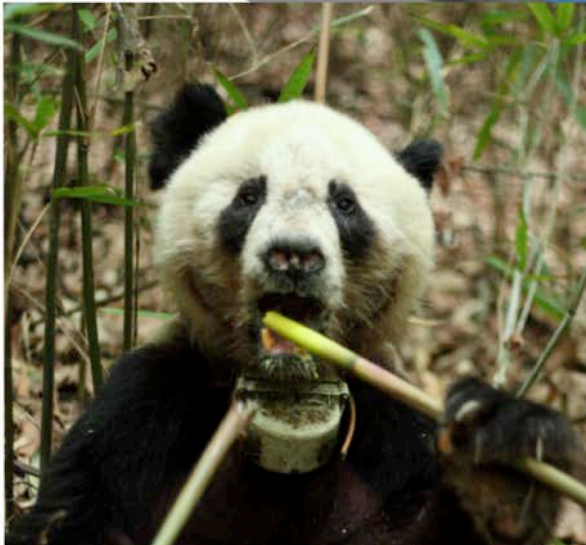
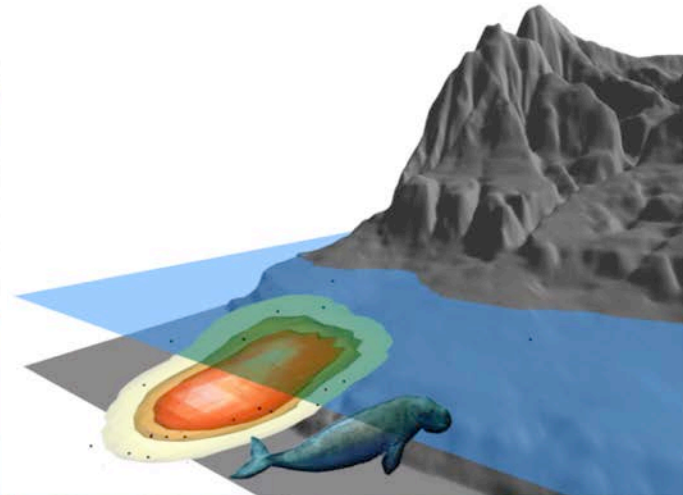
**AVIAN**



**TERRESTRIAL**

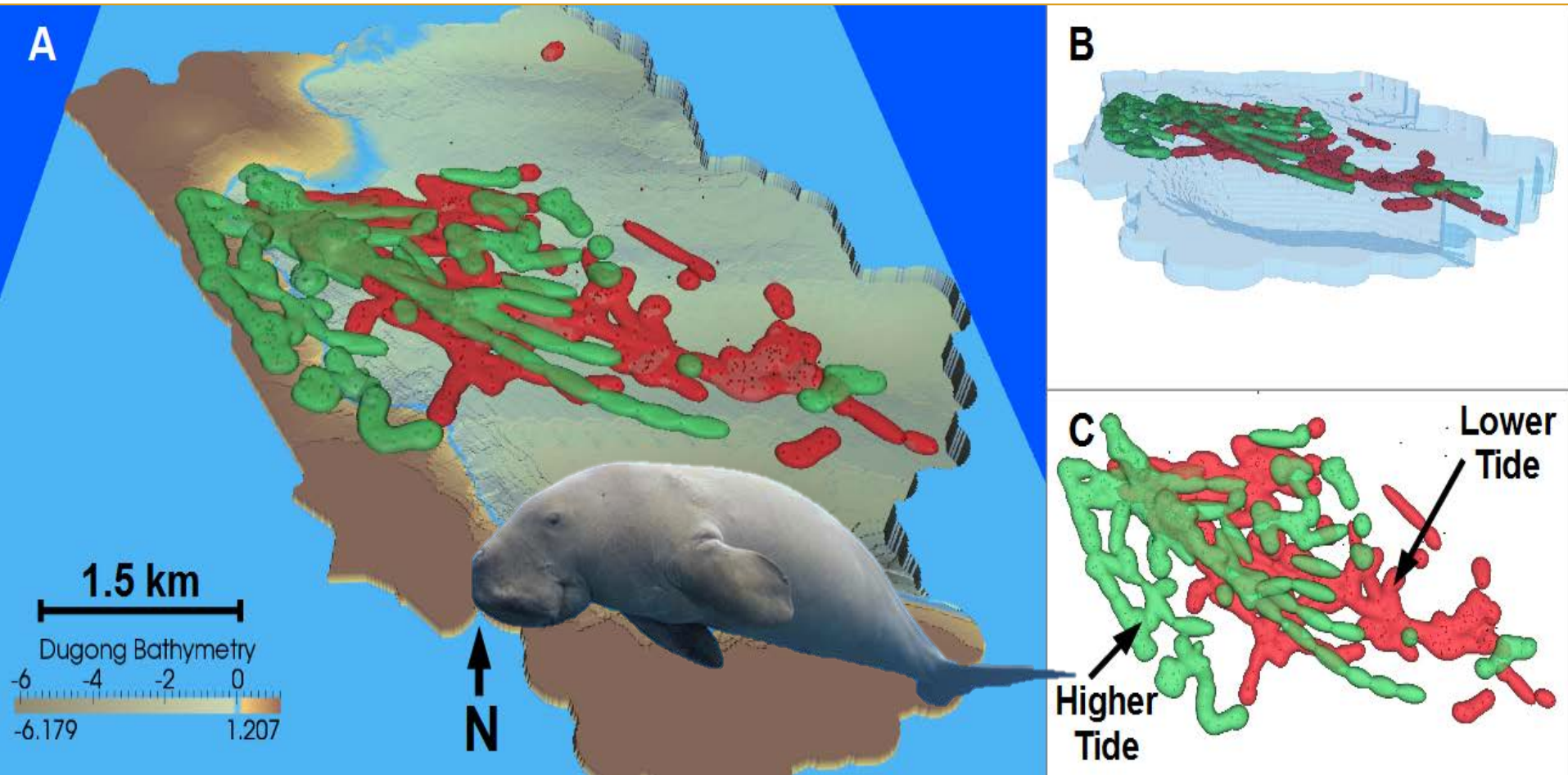


**AQUATIC**



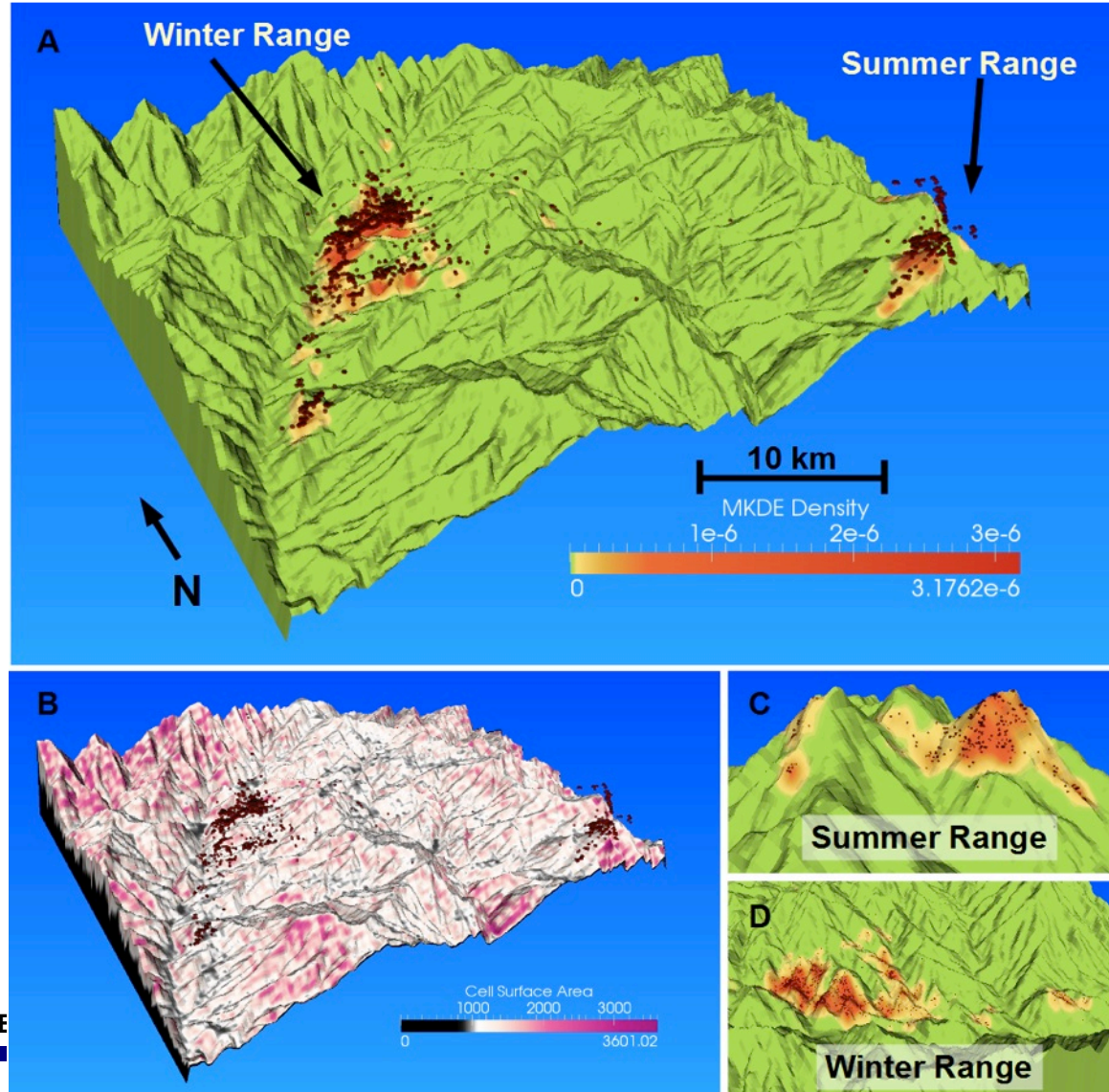
# Aquatic 3D MKDE

Low to median tide = **red** volumes  
Median to high tide = **green** volumes



# Terrestrial 2.5D MKDE

Surface area based on 2.5D showed a 31-56% increase in home range over 2D MKDE estimates



PUTE

- Critically endangered species
- All 22 remaining wild condors captured in 1987
- Reintroduction into wild in 1991
- Total population now up to 435 (237 wild, 198 captive)



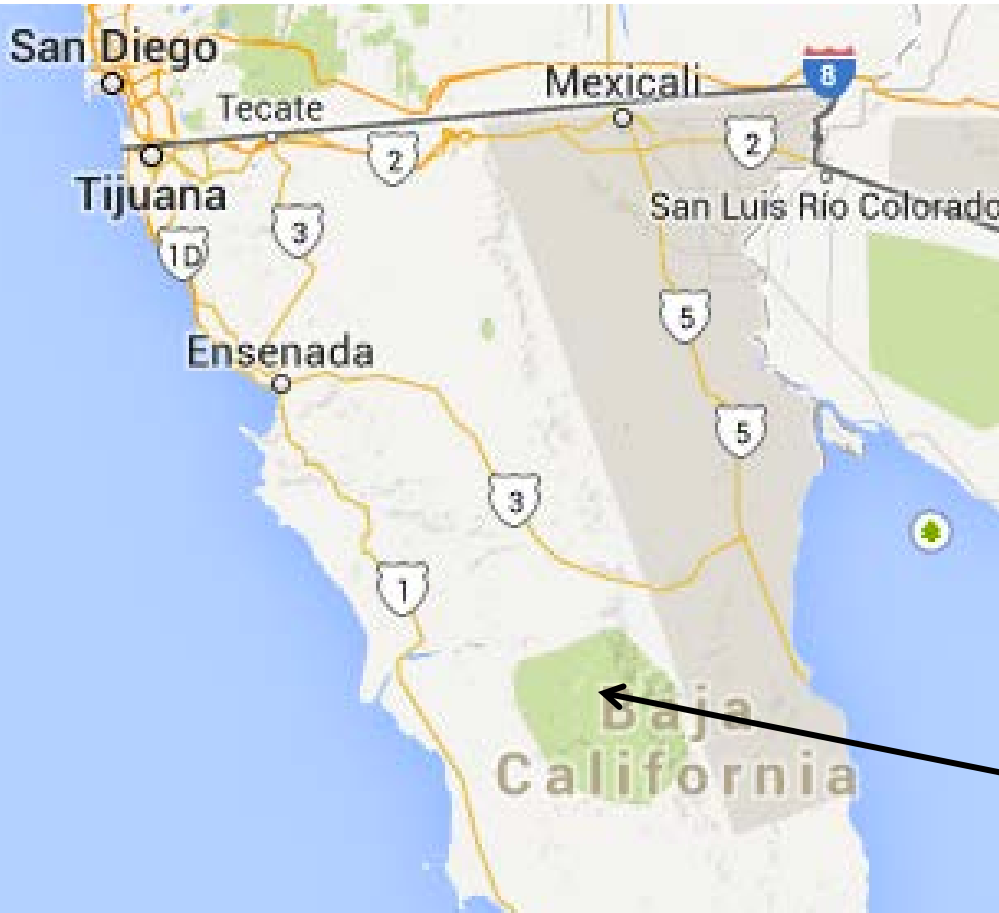
**CA condor – major vertical component to movements**

# Example conservation application

3D vector models of wind turbines based on industry specs used to generate a hypothetical wind farm

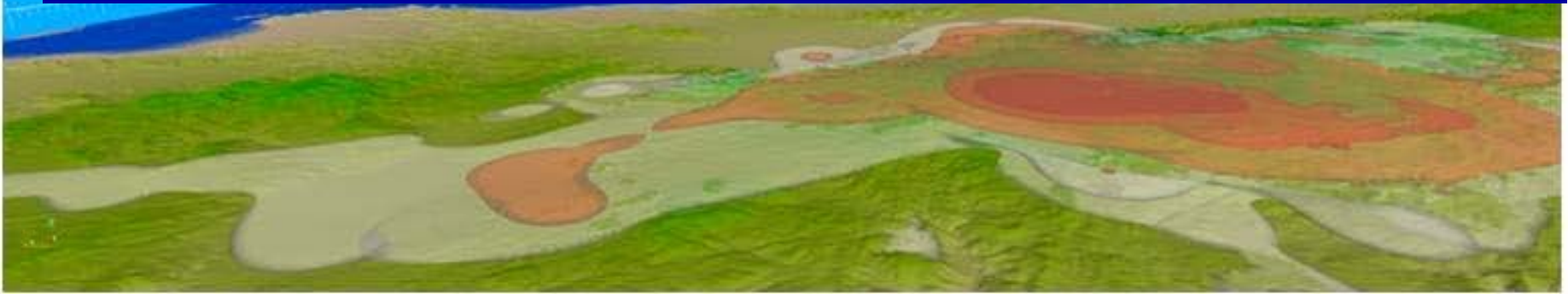


# *Example conservation application*



**Sierra de San Pedro Mártir  
National Park, San Diego Zoo  
Global California condor  
reintroduction site**

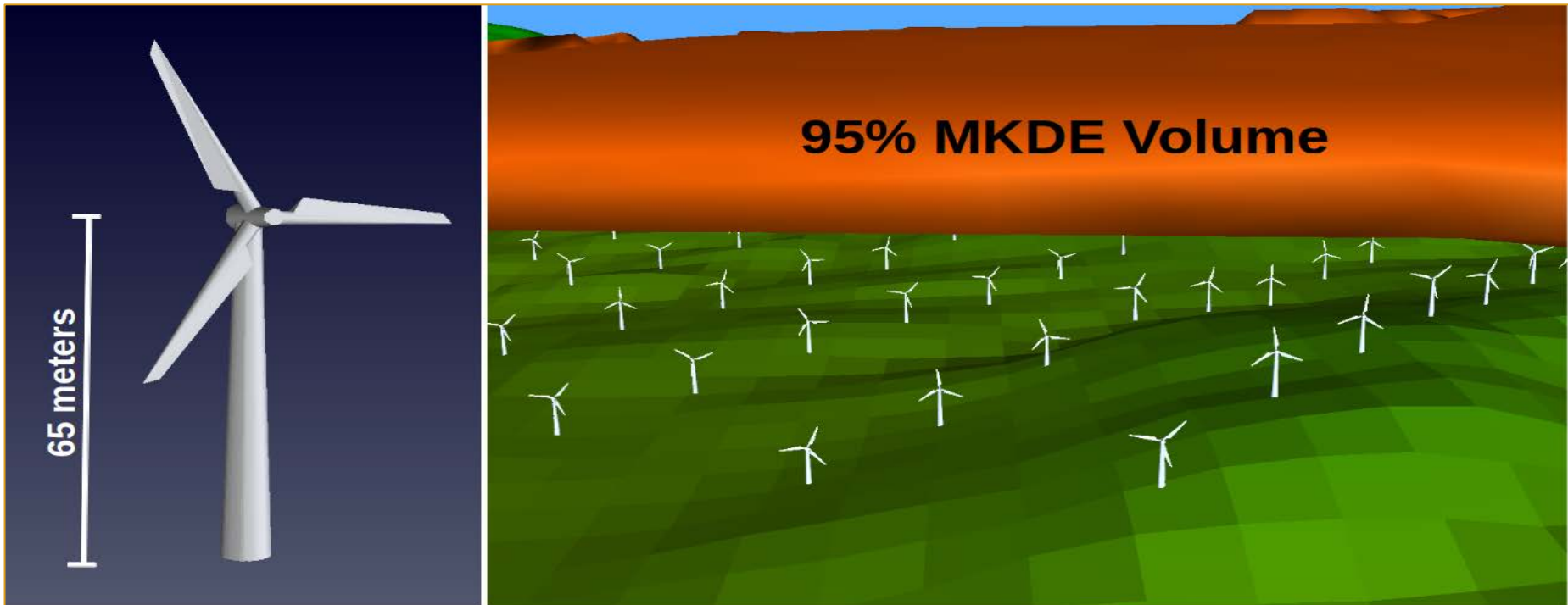
**Wind farm visualized in relation to the condor 3D MKDE 95% volume.**



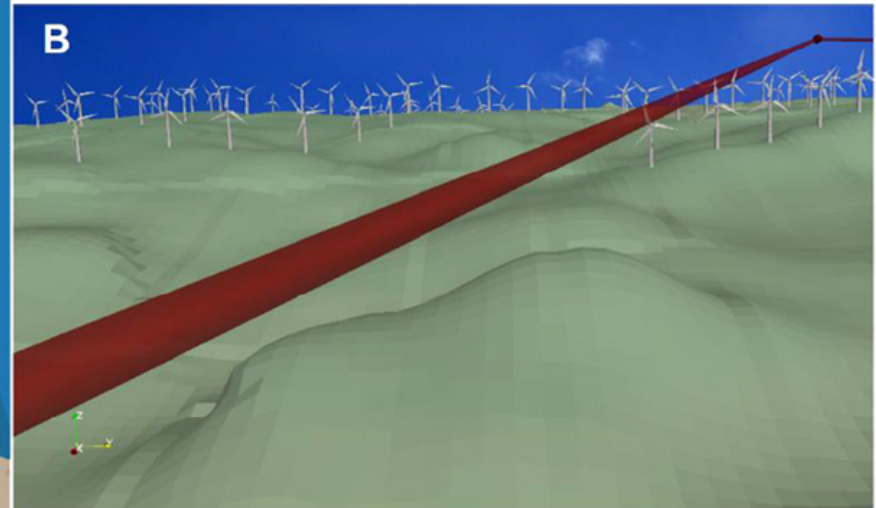
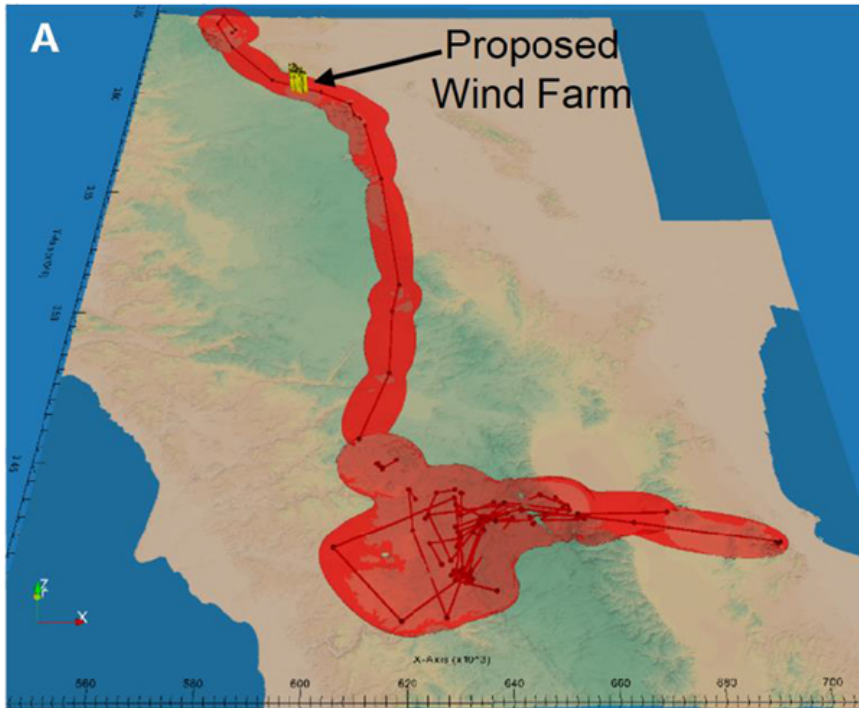


## *Example conservation application*

- *Many turbines fall beneath the volume & don't intersect it.*
- *2D MKDE would suggest otherwise.*



# *Example conservation application*



## *Challenges with 3D MKDE*

3D space use models are obviously superior to 2D models, especially when animals make extensive use of the 3<sup>rd</sup> dimension via flying, climbing or swimming.

The drawback to the 3D model is the computational expense. Need to evaluate a more complex function over a larger number of voxels.

$$O(N^2) \rightarrow O(N^3)$$

## ***SDSC Contribution – code optimization***

*337 observations of single Condor 10/2010, Timings from single Gordon node*

<b>version</b>	<b>t(s)</b>	<b>speedup</b>
Original	1829	1.0
Optimized	42.5	43.0
Opt w/ d=100	3.87	472
Opt w/ d=60	1.67	1095
Opt w/ d=50	1.25	1463
Opt w/ d=40	0.87	2102
Opt w/ d=30	0.67	2729
Opt w/ d=20	0.46	3976

*Original version of code took ~ 30 minutes to process data for single bird month. Processing complete data sets is a supercomputing problem*

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*Optimization of software, but no changes to algorithm or results. Run time reduced to under a minute*

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*Very generous cutoff applied for distance from kernel origin where contributions are made to the voxel density. Run time is a few seconds*

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*Tighter cutoff results in very small numerical differences, probably still more than good enough for quick answer. May be ideal for field work.*

## *OK, so the code runs a lot faster ...*

The current problems (e.g. dozens of condors tracked for several years) no longer need supercomputers. Can probably run on your laptop in under an hour.

BUT ...

We can now shift our attention to much more difficult problems involving more animals and observations per animal. Tough problems become easy, insanely hard problems become doable.

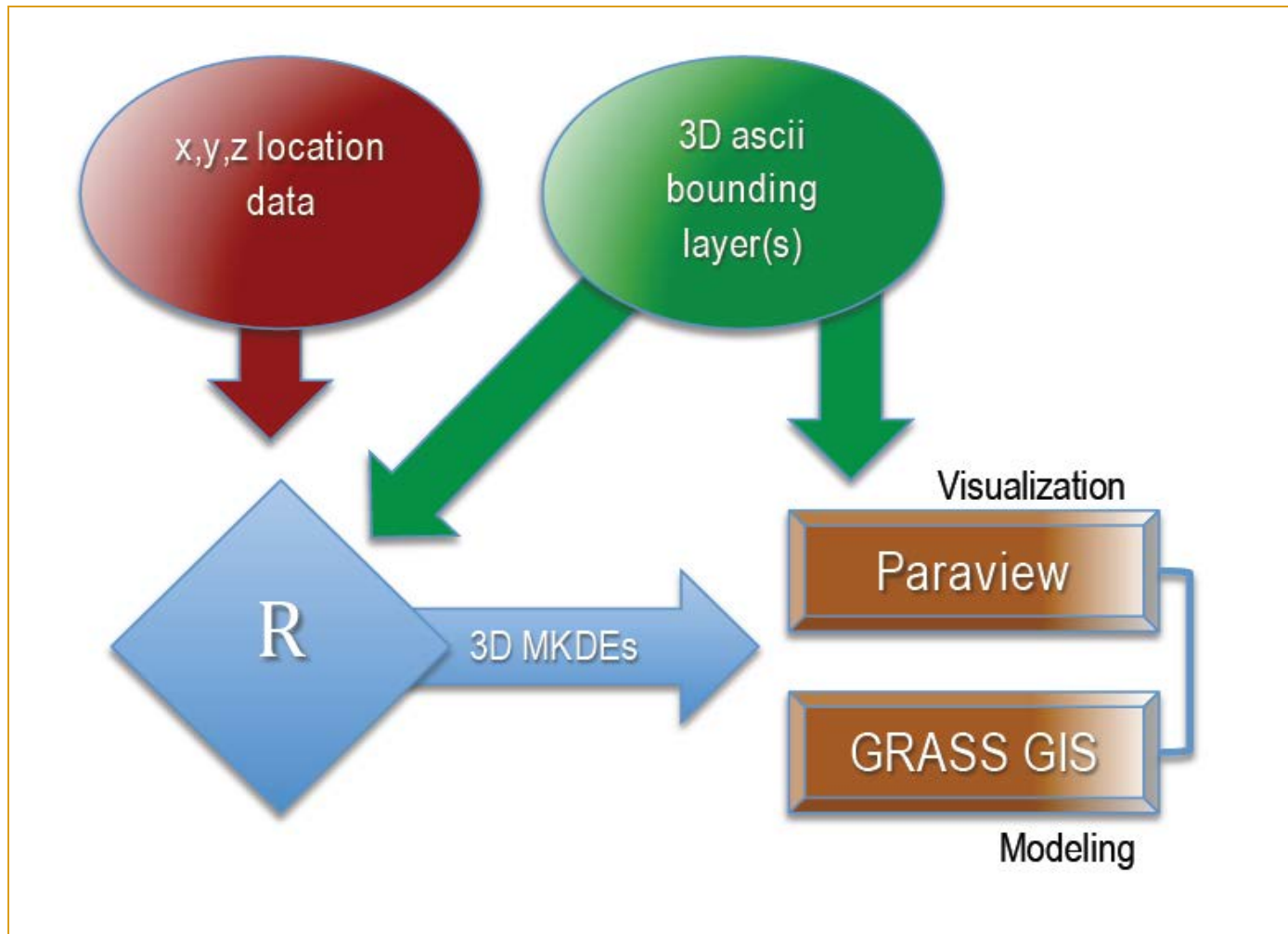


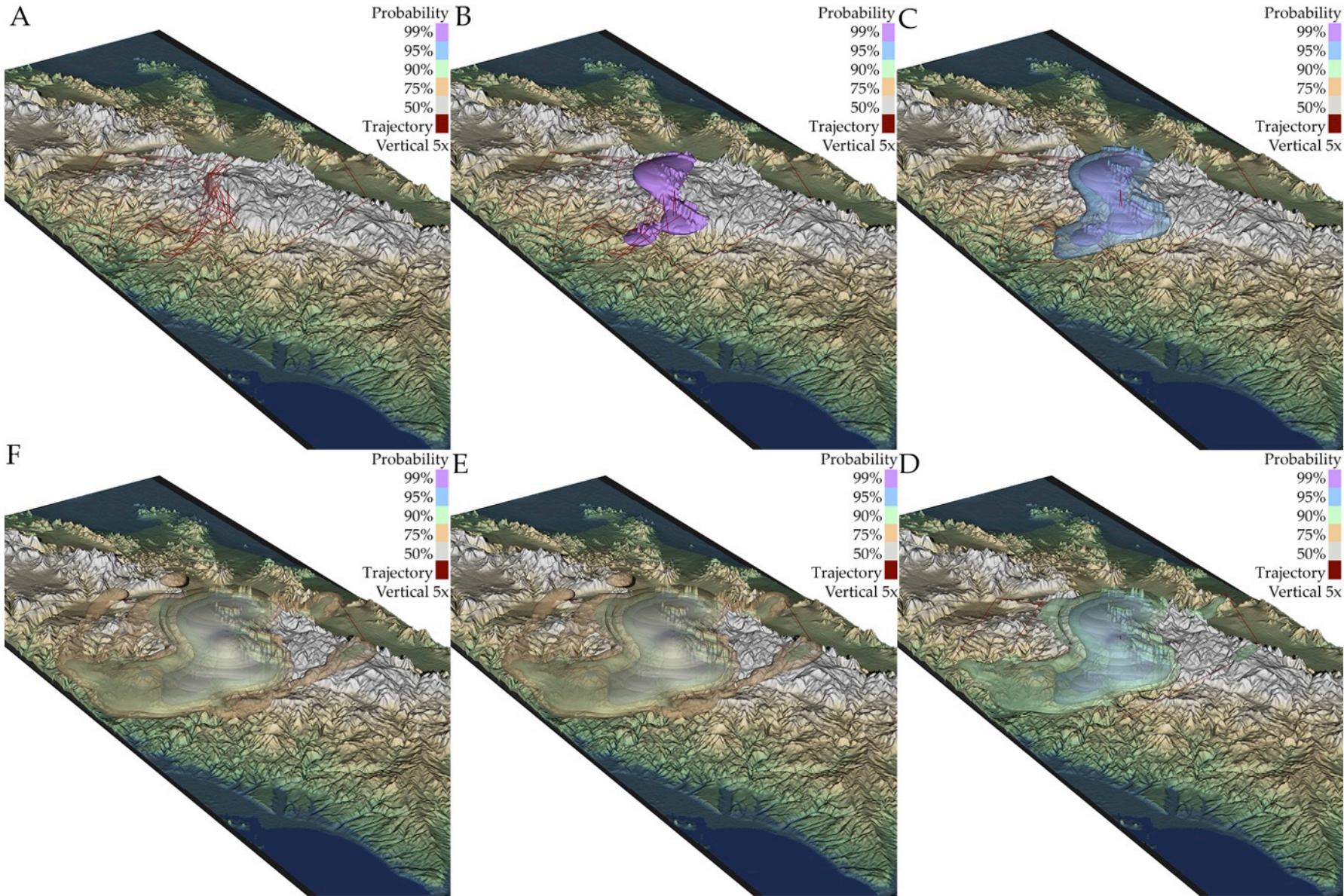
← fewer animals/observations ..... more animals/observations →



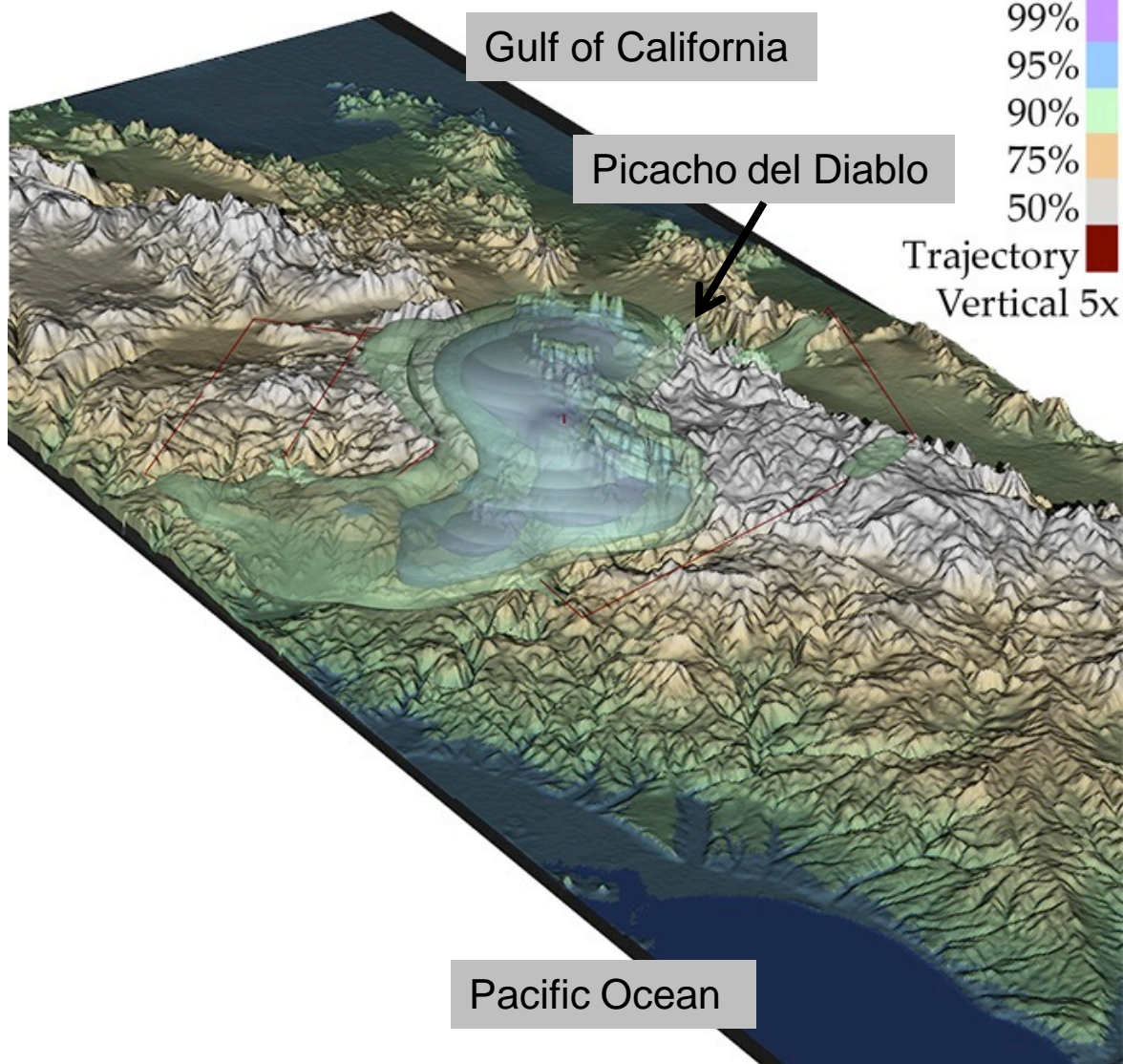


## *SDSC contribution - visualization*





# Vis meets HPC



As an example of a challenging problem that is now much more easily doable, we constructed a movie from 949 MKDEs of a breeding pair using a sliding window two days in width and at 1-day increments

This would have taken more than 1000 Gordon core hours, not accounting for errors, false starts, parameter exploration, etc.

# BREEDING PAIR: CONDORS 261 & 217

MALE

FEMALE

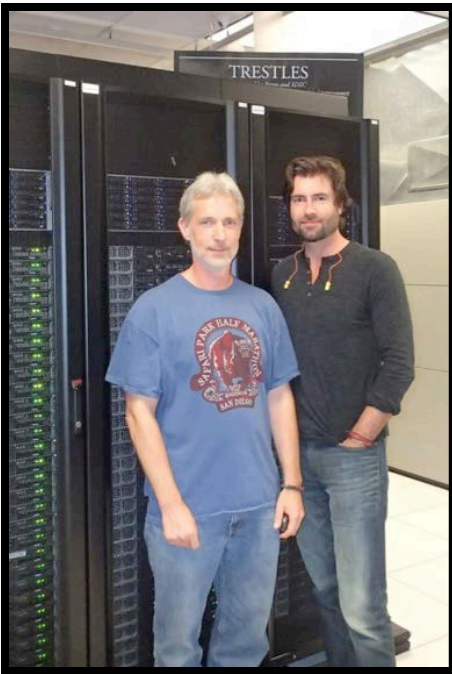


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# Summary

- Biotelemetry revolution makes it possible to track a wider range of species over longer periods of time
- Modeling animal space use in 3D can lead to more accurate environmental impact studies, saving infrastructure projects many potential headaches.
- SDSC can work with you in multiple ways
  - Access to storage and compute resources
  - Expertise in software optimization, visualization, parallel computing, predictive analytics, large scale data bases, workflows
  - Training in a wide range of topics

# Acknowledgments



James Sheppard (SDZ)  
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## SDSC



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Chourasia



Glenn  
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