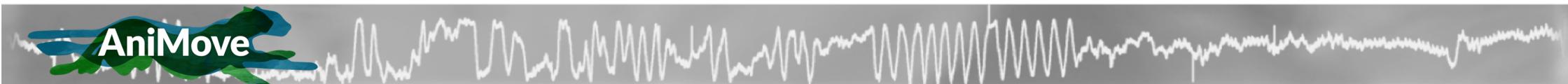
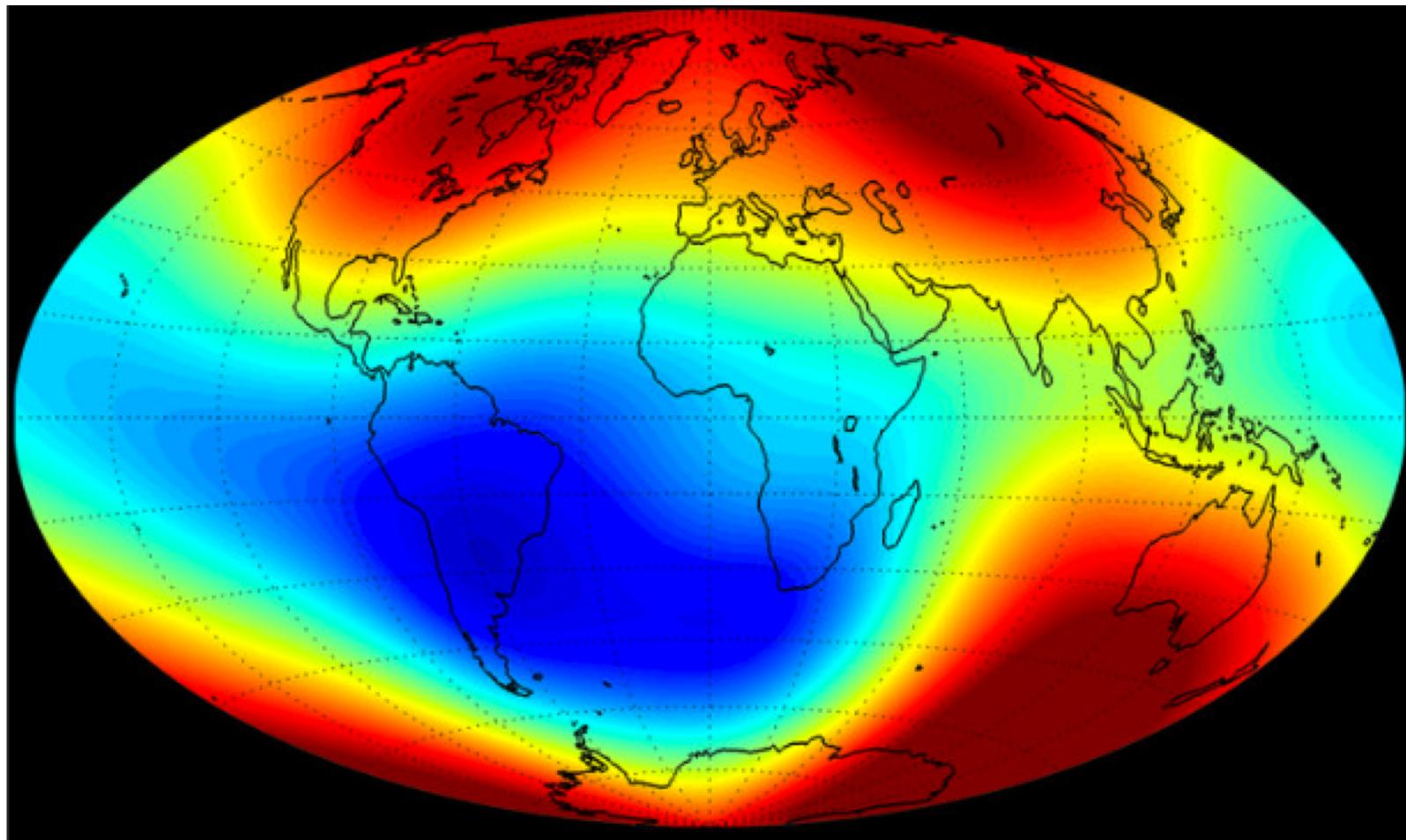
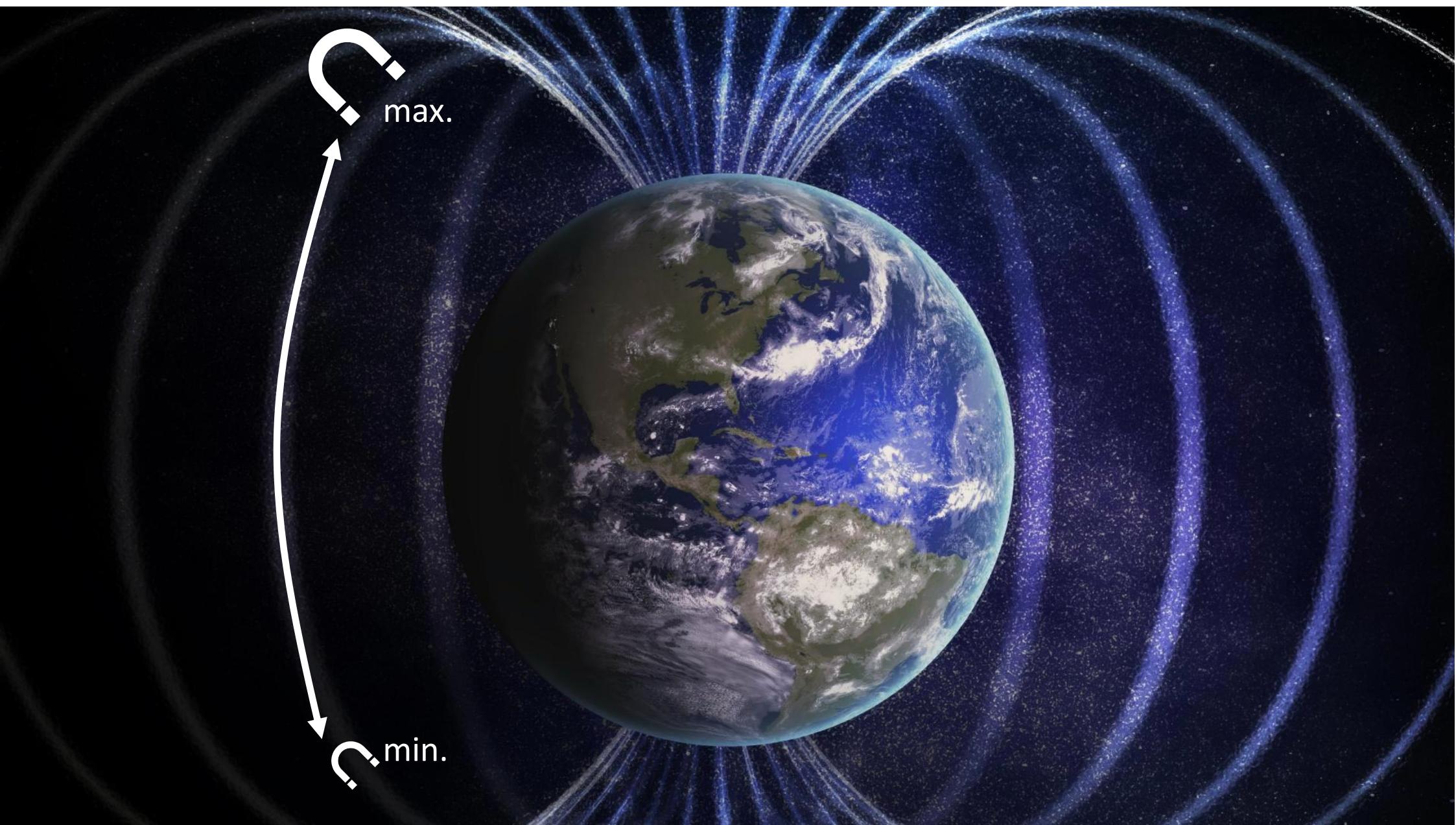


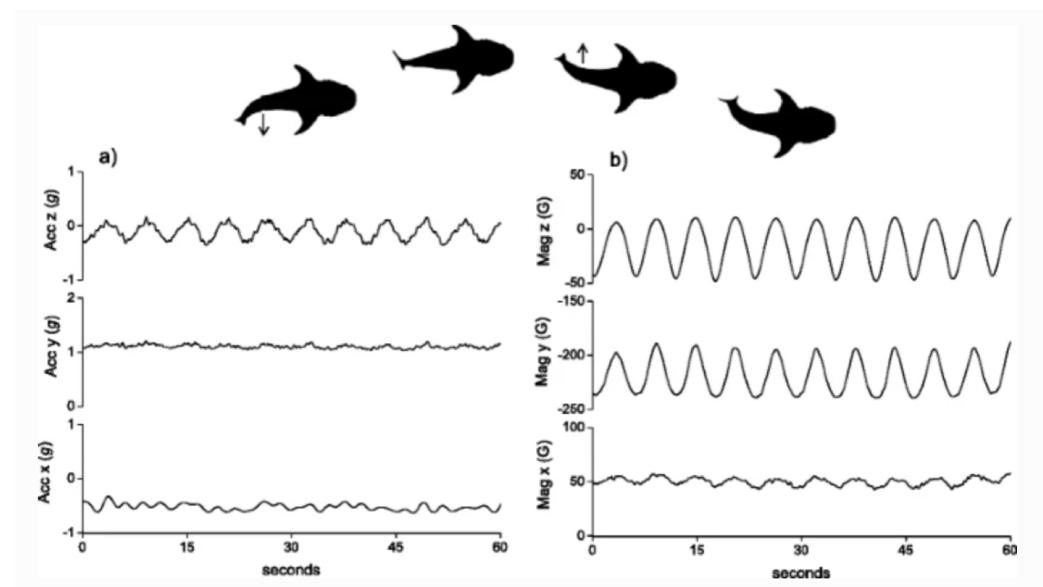
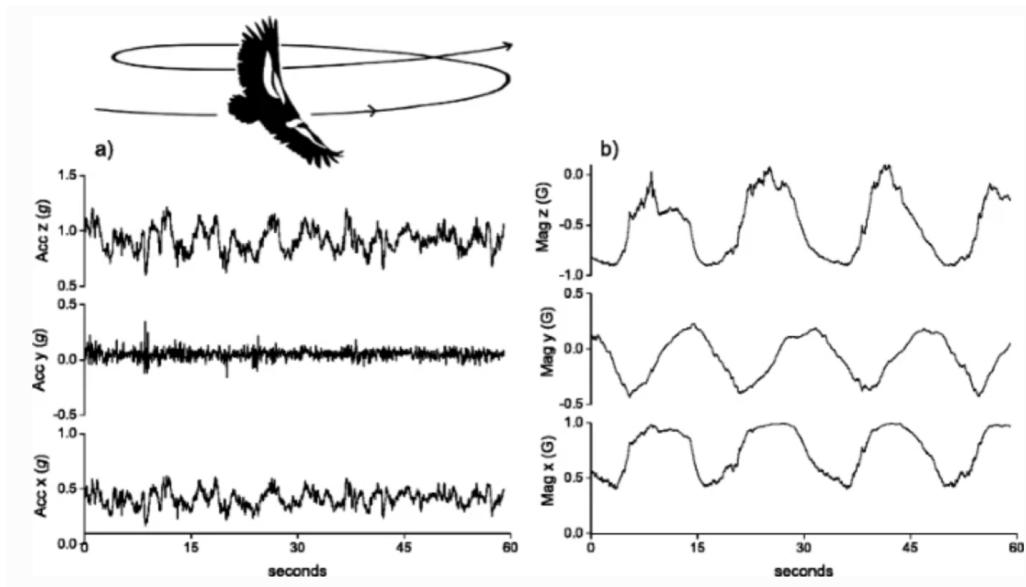
# Tri-axial MAGNETOMETER



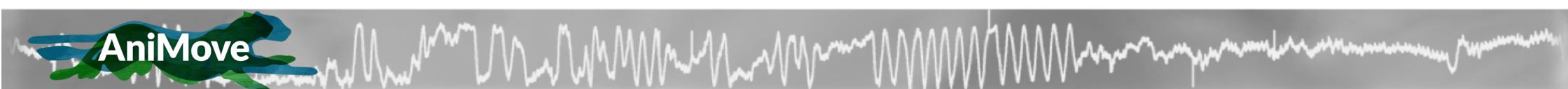


## Angular rotation → Orientation

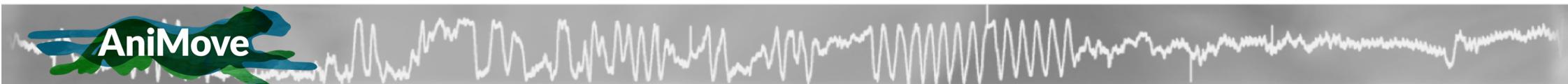
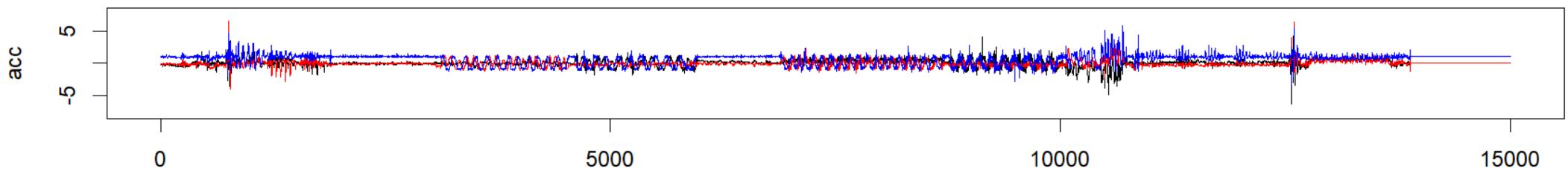
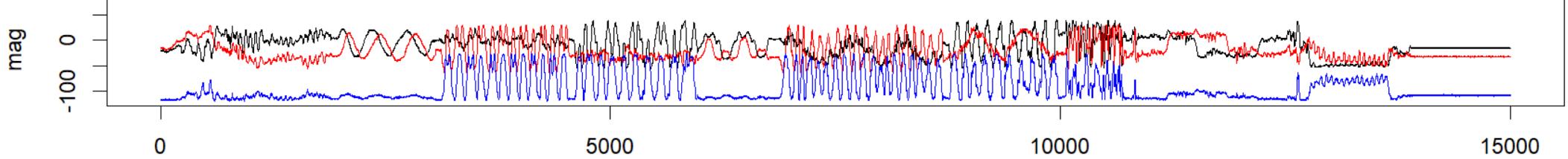
- tri-axial sensors that are capable of recording orientation in relation to the Earth's magnetic field (Gauss)
- Given this sensitivity, there is great potential for such systems to help elucidate animal behaviour based on angular rotation.



Williams et al (2017) Movement Ecology

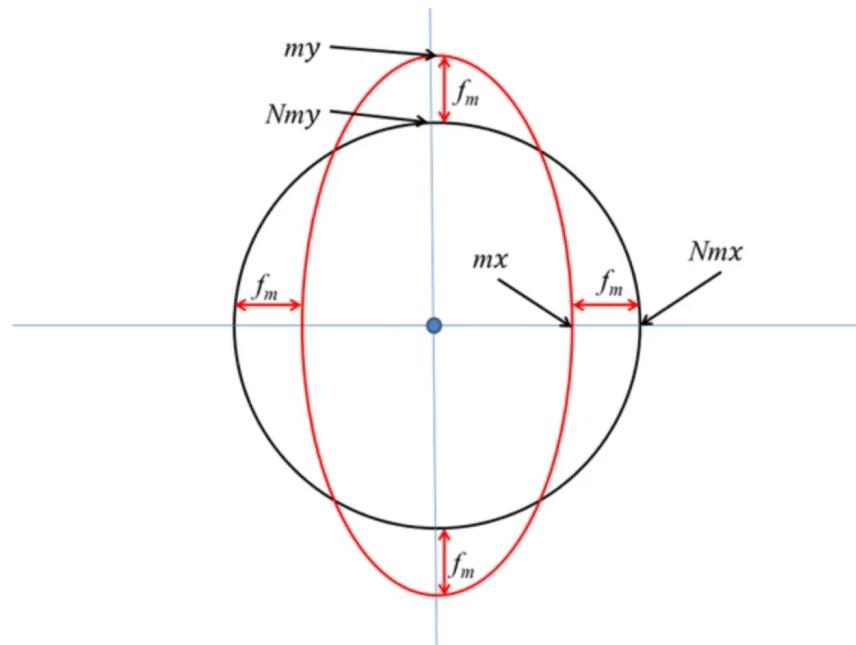


## Resolving orientation with magnetic and configuration calibrations

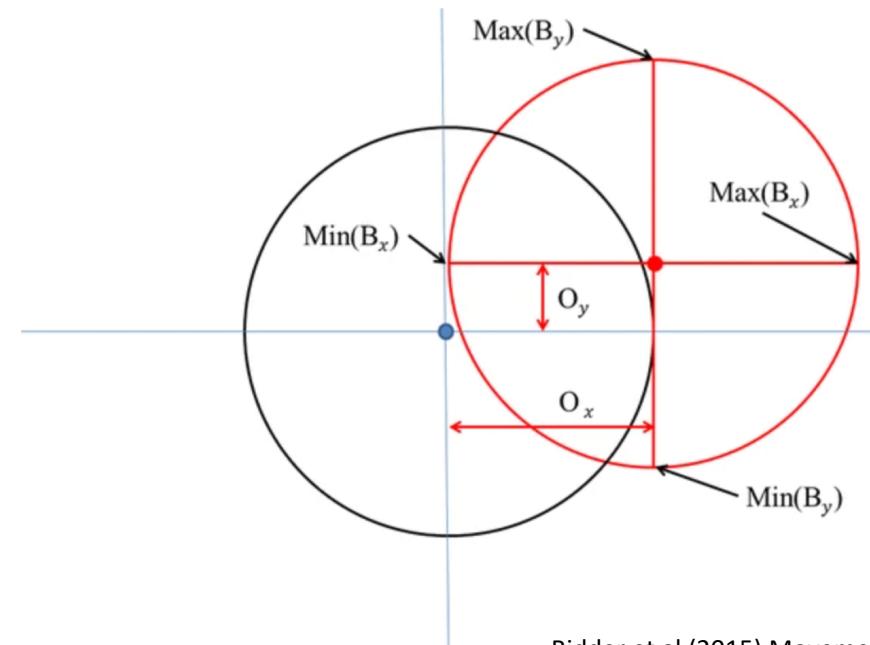


## Resolving orientation with magnetic and configuration calibrations

Soft iron

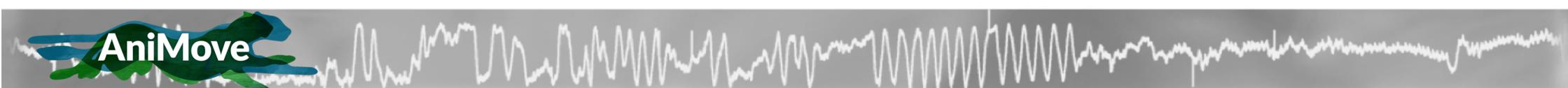


Hard iron

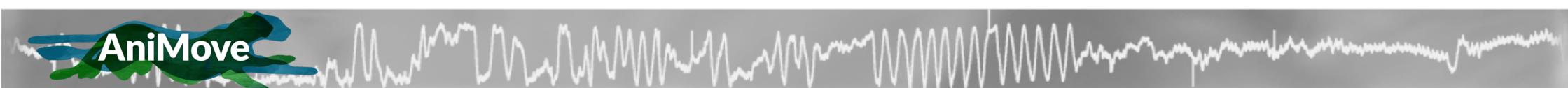
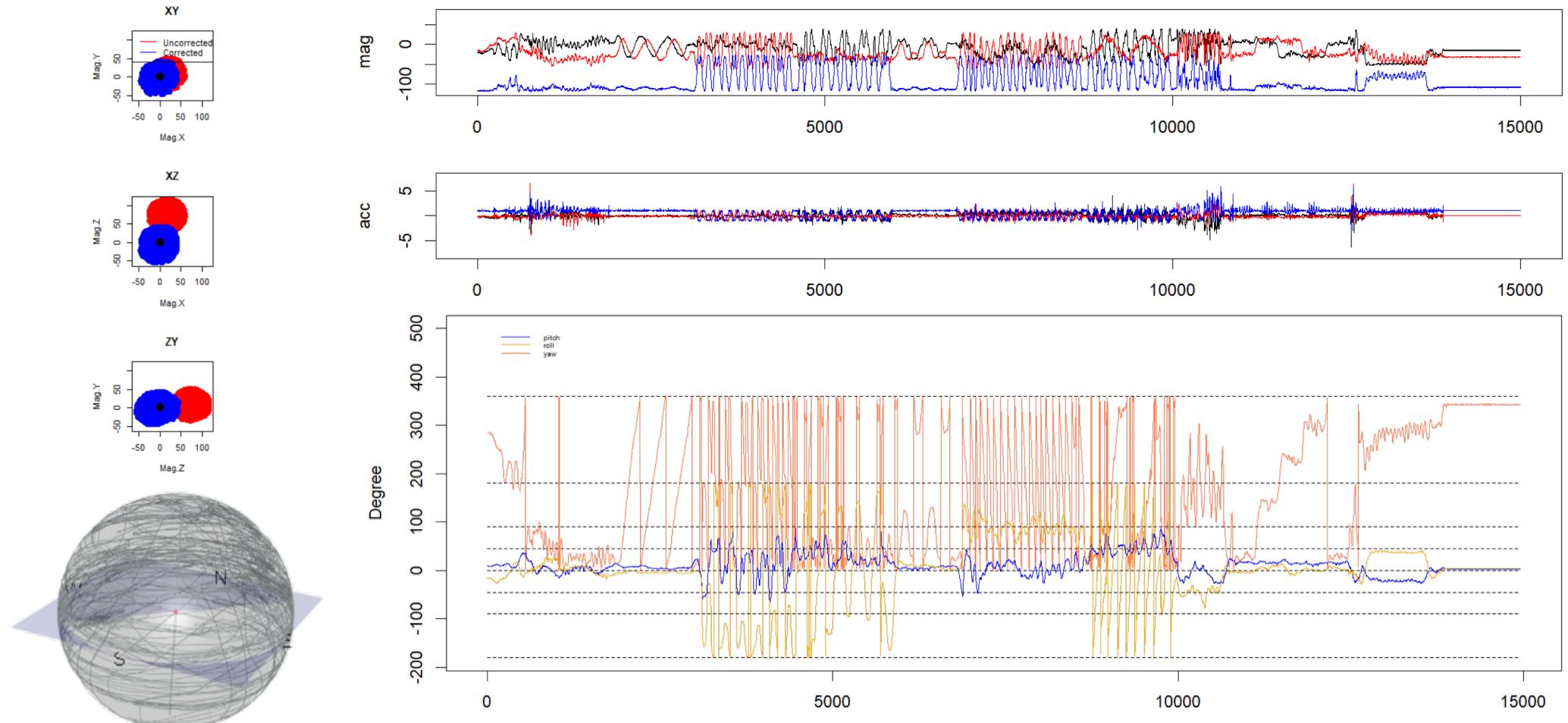


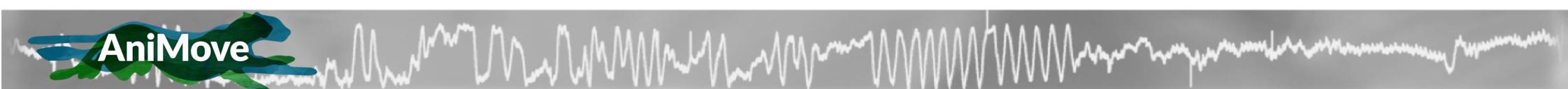
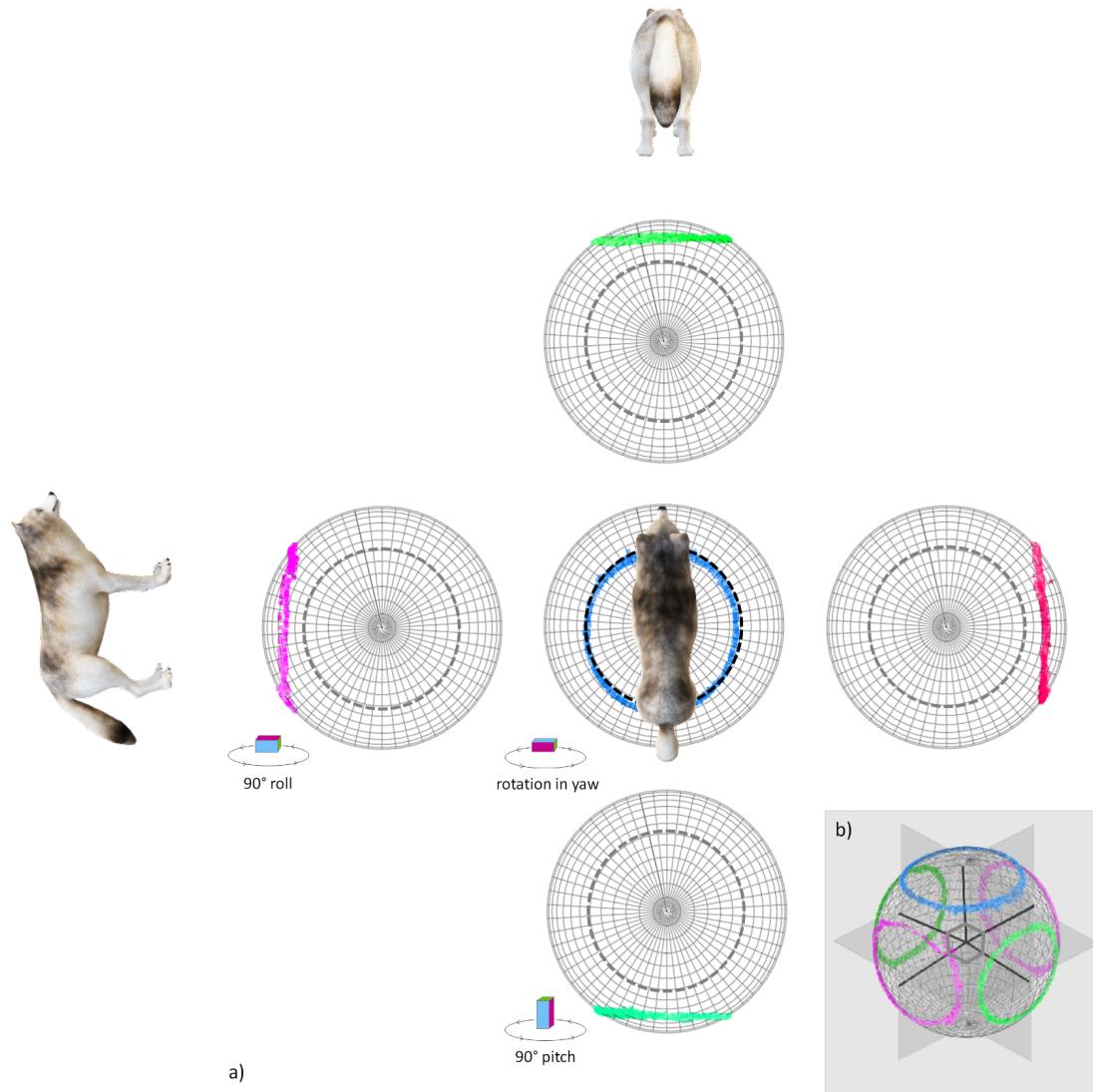
Bidder et al (2015) Movement Ecology

```
Gundog.compass = function(mag.x, mag.y, mag.z, acc.x, acc.y, acc.z, ME,  
pitch.offset = 0, roll.offset = 0, yaw.offset = 0, method = 3, plot=TRUE)
```



## Resolving orientation with magnetic and configuration calibrations

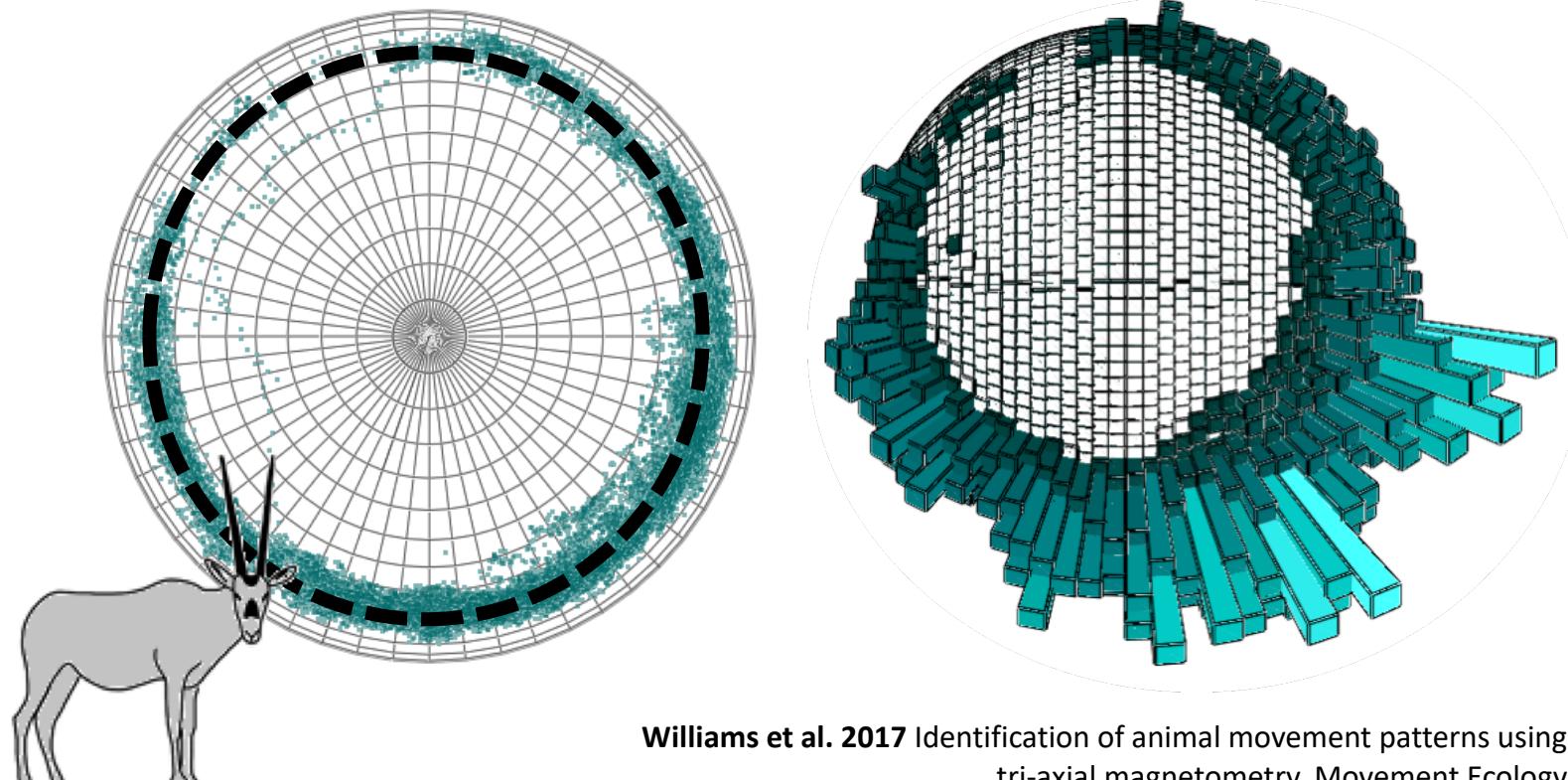




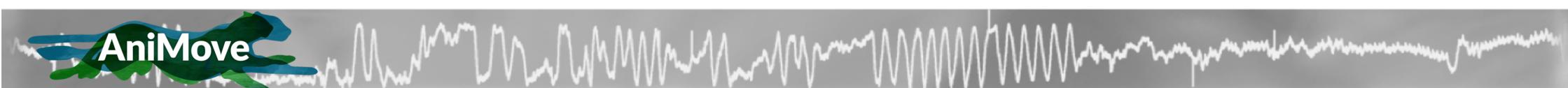
AniMove

## Normal Operational Plane

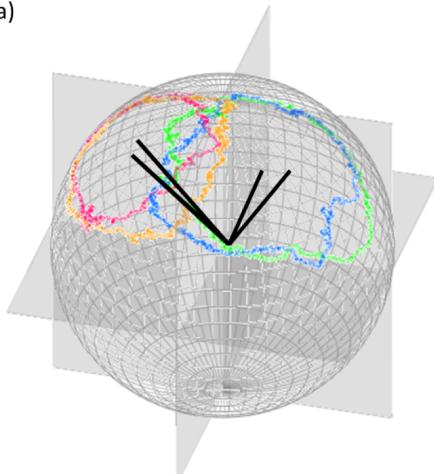
Adds directionality to behaviour to examine interactions, vigilance and responsiveness



**Williams et al. 2017** Identification of animal movement patterns using tri-axial magnetometry. Movement Ecology



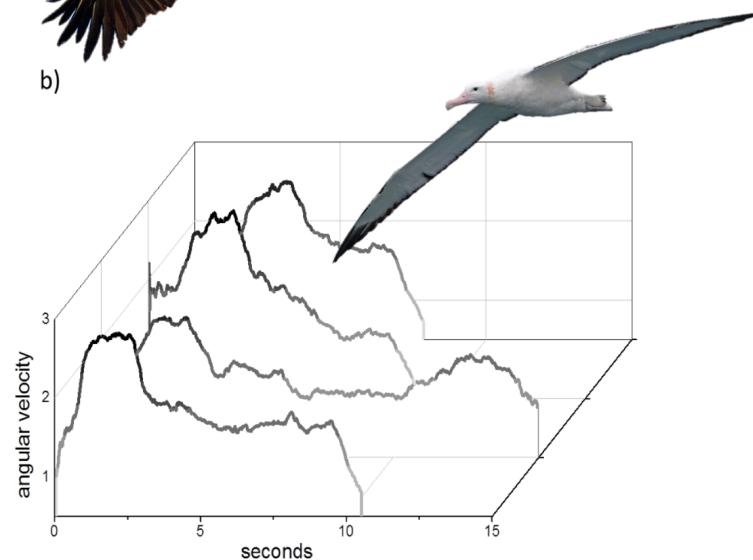
a)



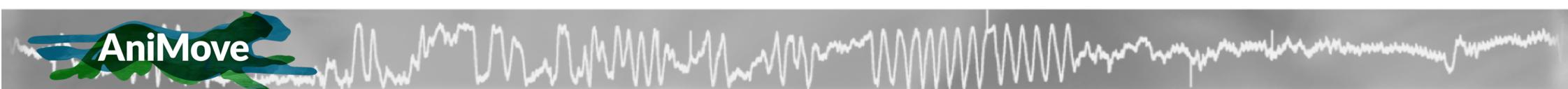
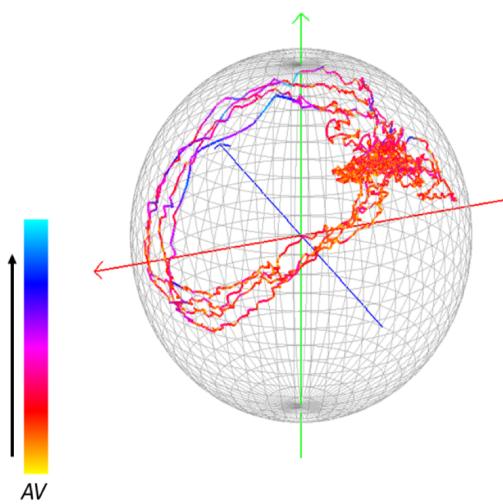
'M-prints' to define behaviour!



b)



a)



# Posture, Activity, Behaviour from IMU

Detailed metadata

- detailed metadata on the attachment type and position on the animal of the loggers, as otherwise, establishing a close relationship between the output from sensor data (such as tri-axial accelerometer) and the heading and posture of the animal will be near impossible.

Partition static and dynamic

- Partition the static and dynamic components

Convert to DBA

- then converted to DBA (ideally correlated with energy or oxygen in lab)

Magnetometry corrections

- Magnetometry corrections

Preprocessing & subsampling

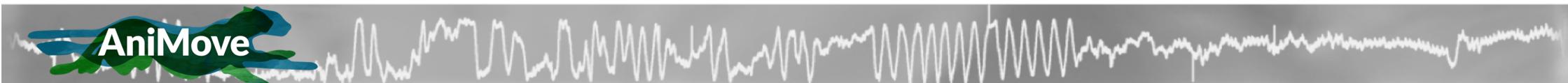
- Pre-processing should be performed before subsampling (in the case of autocorrelation)

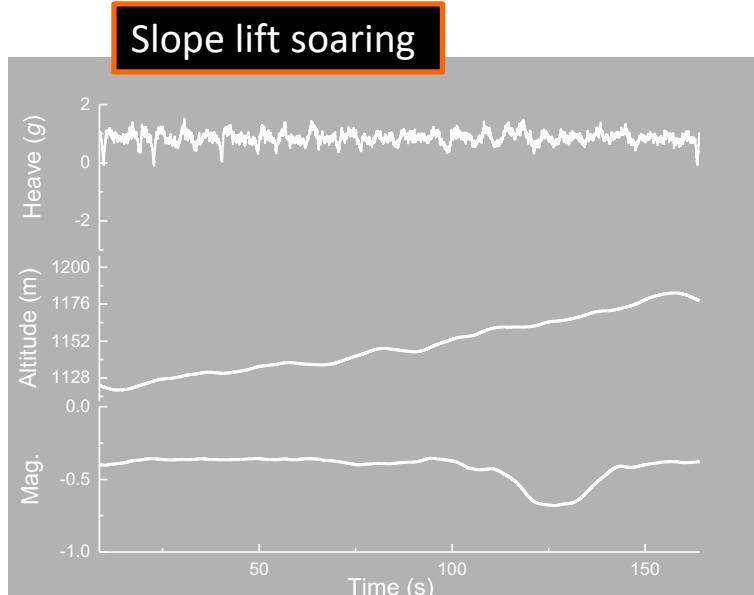
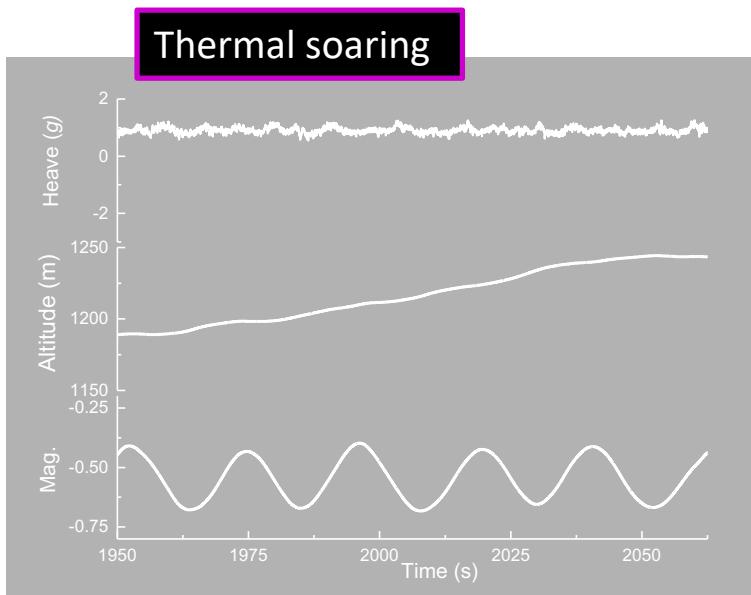
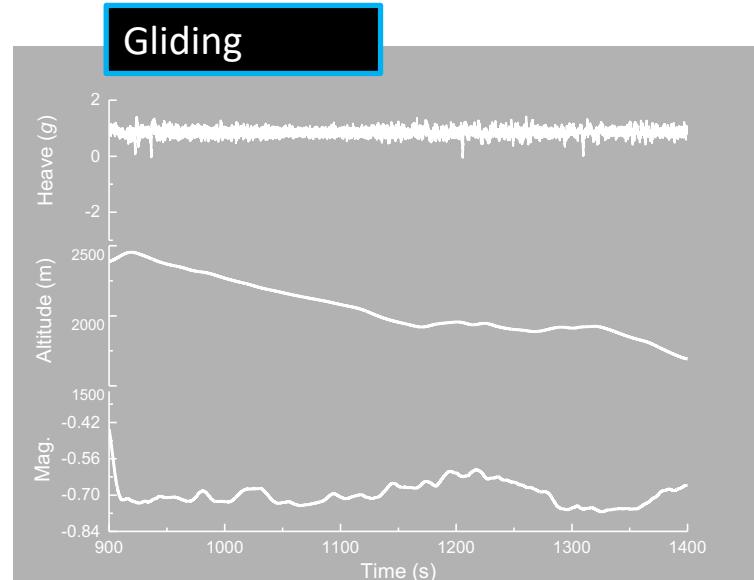
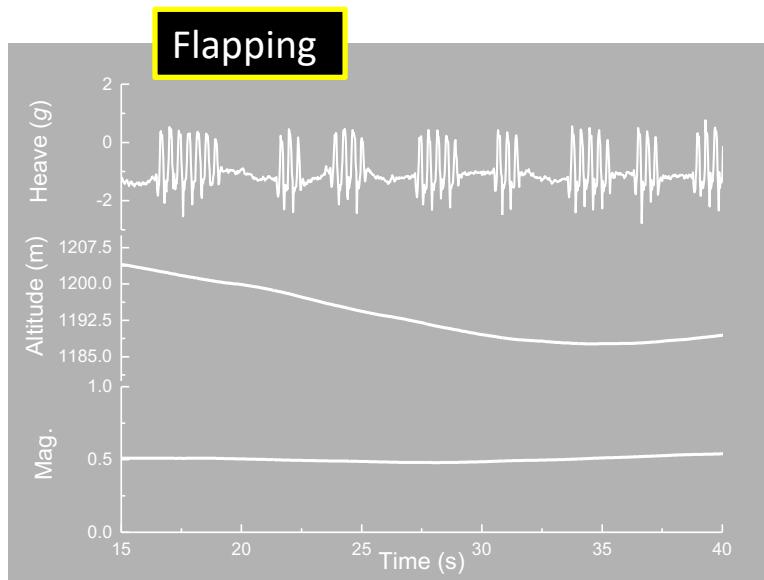
Visualise

- visualize and display quantitative information

Behavioural classification

Dead-reckoning





# Behavioural Classification

## Behaviour-linked thresholds

such as an increase in pressure to indicate diving, but more commonly will involve consideration of multiple data streams

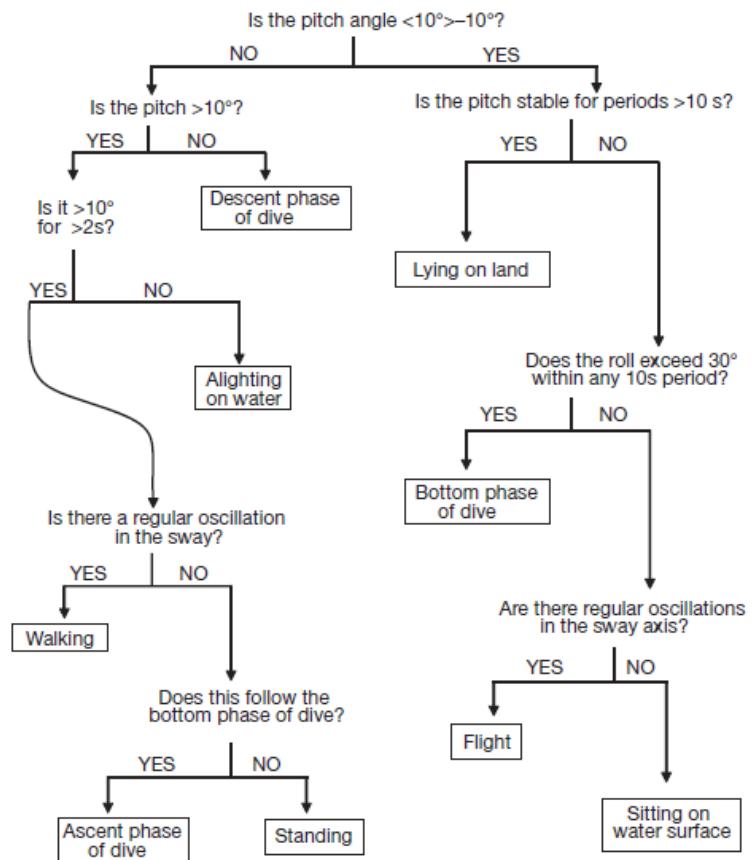
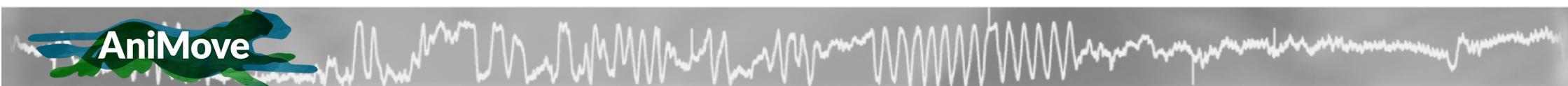


Fig. 6. *Phalacrocorax atriceps*. Simplistic diagram to show how behaviour of an imperial cormorant (cf. Fig. 5) can be resolved using data from a tri-axial accelerometer

Wilson et al (2020) JAE



# Behavioural Classification

## Behaviour-linked thresholds

such as an increase in pressure to indicate diving, but more commonly will involve consideration of multiple data streams

## Machine-learning algorithms:

- K-nearest neighbour [KNN]
- support vector machines [SVMs]
- classification and regression trees [CART]
- artificial neural networks [ANNs])
- hidden Markov models (HMMs)

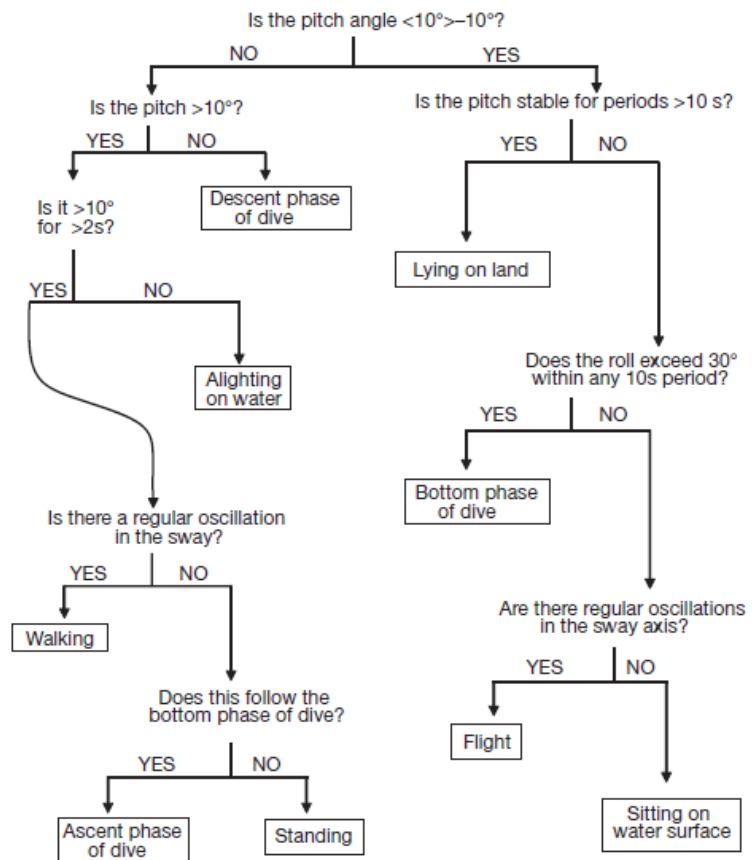
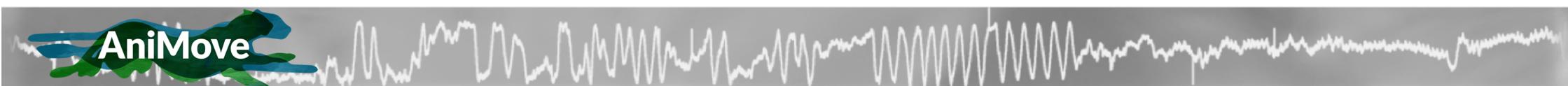


Fig. 6. *Phalacrocorax atriceps*. Simplistic diagram to show how behaviour of an imperial cormorant (cf. Fig. 5) can be resolved using data from a tri-axial accelerometer

Wilson et al (2020) JAE



# Behavioural Classification

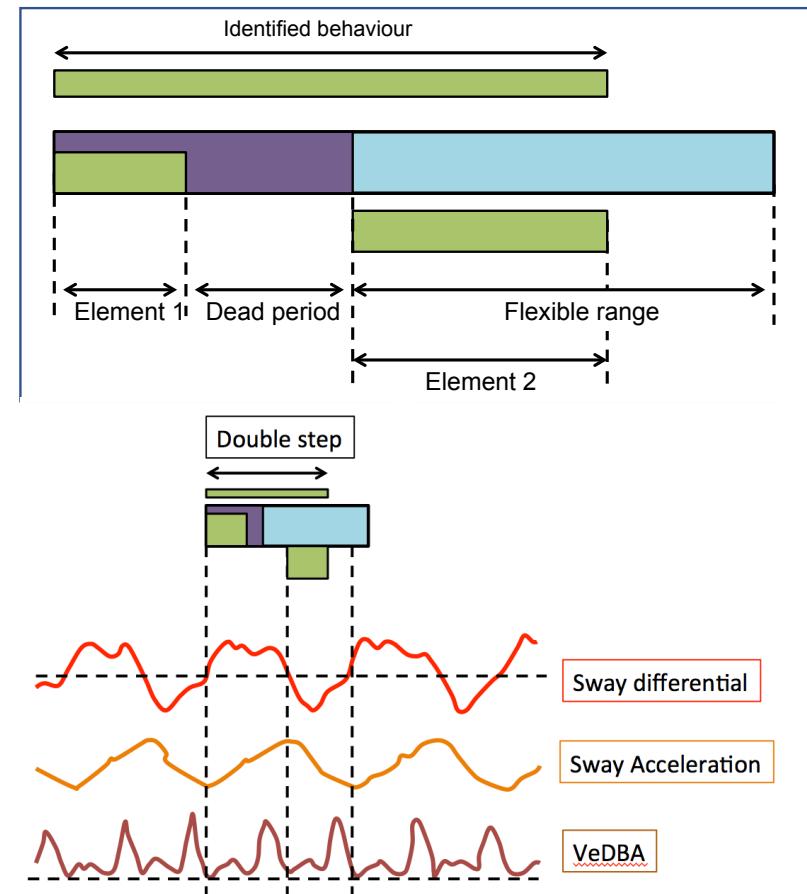
## Behaviour-linked thresholds

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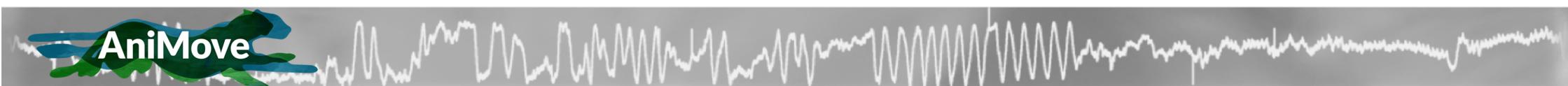
## Machine-learning algorithms:

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- classification and regression trees [CART]
- artificial neural networks [ANNs])
- hidden Markov models (HMMs)

Boolean framework and requires that the researchers have enough specialist knowledge to be able to pick out a sequence of features in behaviours

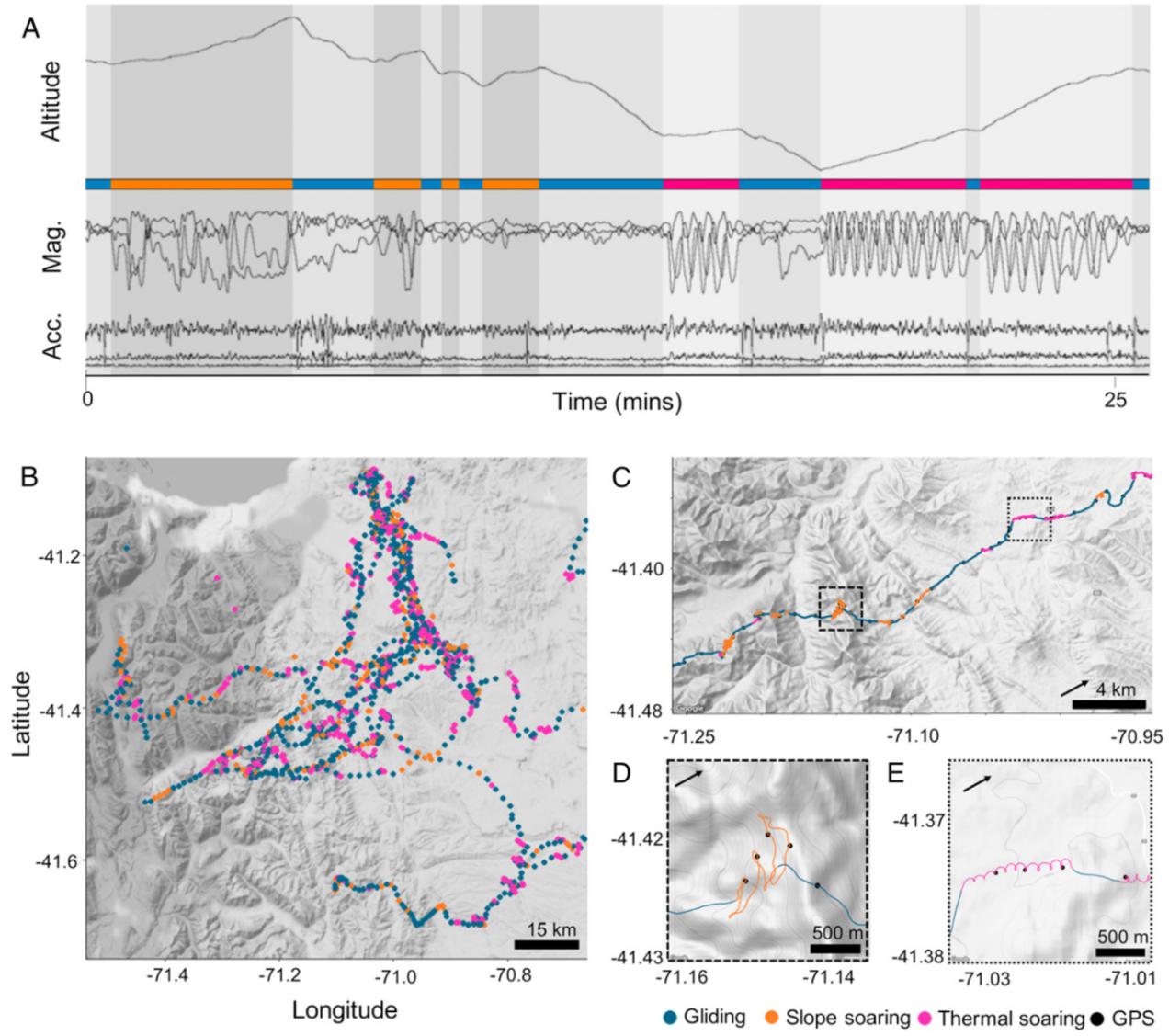
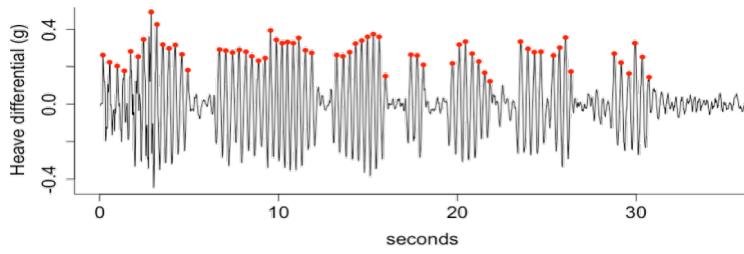


Wilson et al (2020) JAE



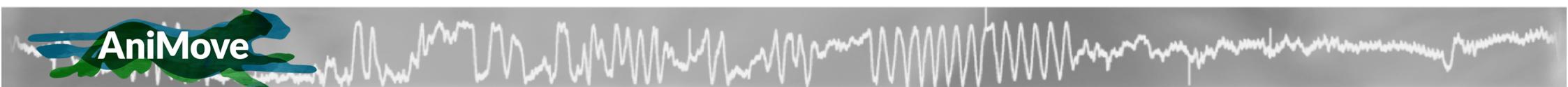
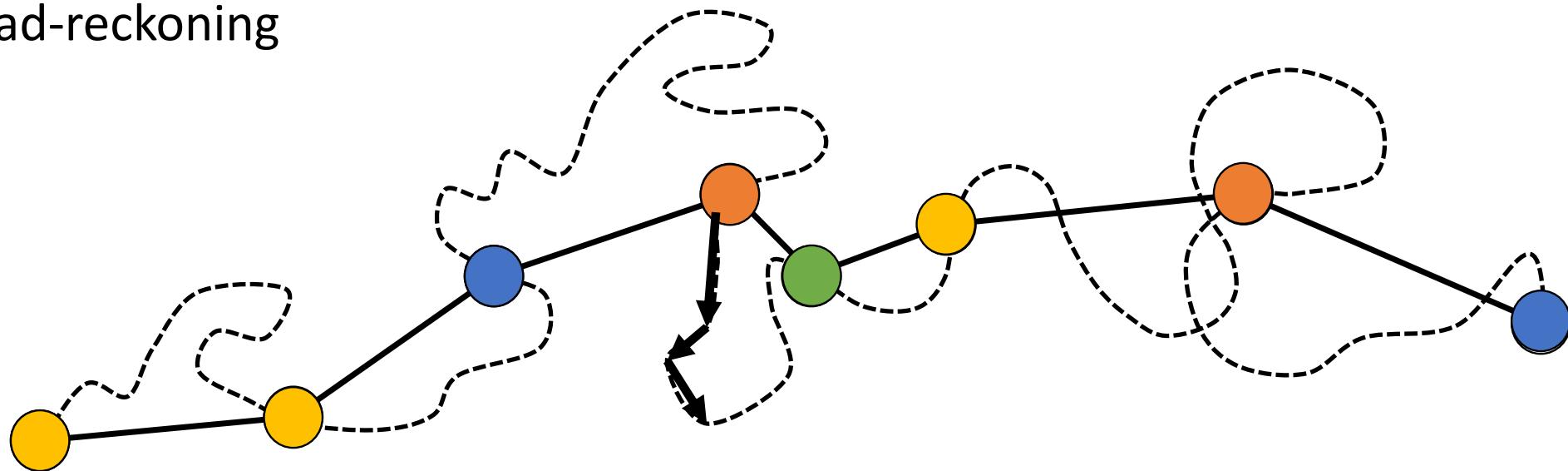


Andean Condors (*Vultur gryphus*)  
Bariloche, Argentina, 2013-2018  
8 Juveniles  
9.5-13.9 kg  
freely flying for 8 days of data collection  
DD 40 Hz, GPS 0.1 Hz

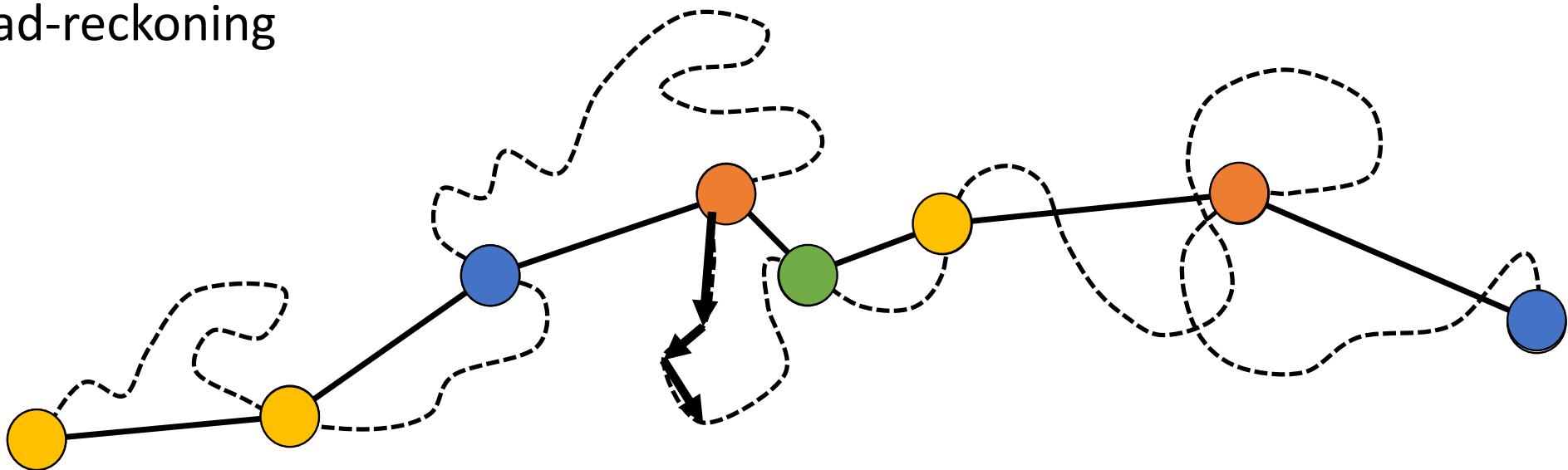


Williams & Shepard et al (2021)

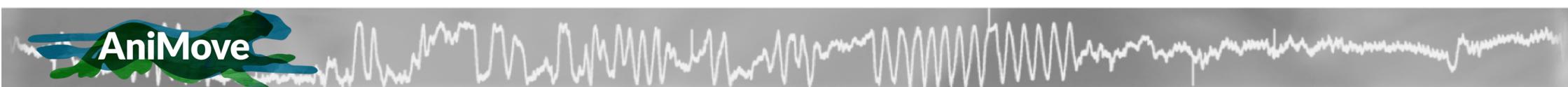
## Dead-reckoning



## Dead-reckoning



- ✓ Limitations of telemetry devices
- ✓ Properly identify true turn-points in the data
- ✓ Connect behaviour to landscape ecology and population dynamics with increased confidence
- ✓ embrace optimality approach - incorporate the energetic costs and benefits derived from detailed biologging data
- ✓ the bio-energetic reasons behind animal movement choices, rather than simply describing landscape aspects that covary with animal movement



# Dead-reckoning

**DBA speed proxy**

- More recently, dynamic body acceleration has been validated as a linear proxy of speed for terrestrial animal (such as from treadmill tests or using GPS- derived speed)

**Peak periodicity distance proxy**

- peak periodicity (and amplitude) may be used as a proxy of distance moved by providing a distance per step estimate

**Linear drift correction vector**

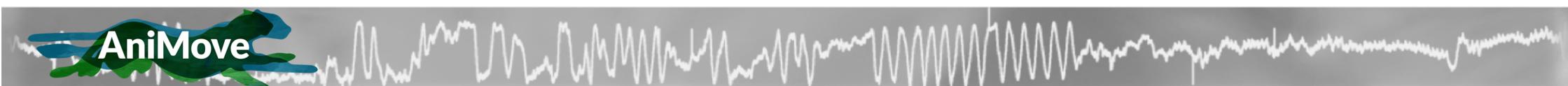
- Ground-truthing dead-reckoned tracks typically involves the linear drift correction method to provide a correction vector that is applied linearly between time point one and time point two

**Correction coefficients**

- correction coefficients for both heading and distance are calculated
- Verified position correction

**VPC**

<https://github.com/Richard6195/Dead-reckoning-animal-movements-in-R>





## Dead-Reckoning procedure

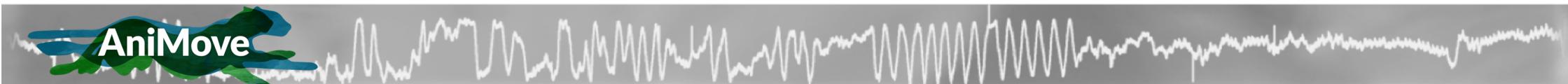
Device orientation is expressed in terms of a sequence of Euler angle [roll ( $\phi$ ), pitch ( $\theta$ ), yaw ( $\psi$ )] rotations about the x-, y- and z-axes, respectively, relative to the (inertial) Earth's fixed frame of reference

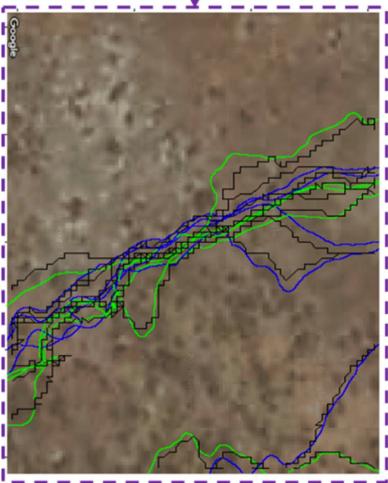
For the correct computation of heading, these two channels need to be aligned parallel to  
To the Earth's surface

Taken together then, in R, pitch and roll are computed according to, ( $R_{24:25}$ ) with outputs  
within the range of  $-90^\circ$  to  $+90^\circ$  for pitch and  $-180^\circ$  to  $+180^\circ$  for roll, and this is the  
formula we use in the tilt-compensated method

```
Pitch = atan2(-NGbx, sqrt(NGby^2 + NGbz^2)) * 180/pi  
Roll = atan2(NGby, sign * sqrt(NGbz^2 + mu * NGbx^2)) * 180/pi
```

Gunner et al 2021



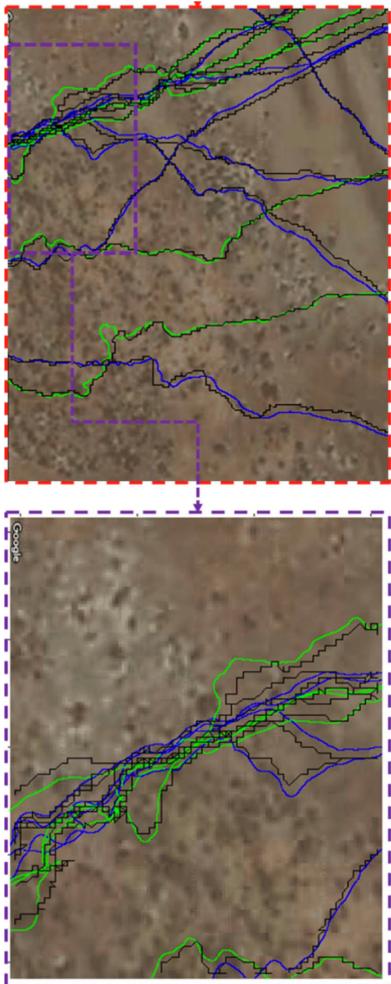


## Dead-Reckoning procedure

1. Magnetometer calibration, rotation correction and deriving of yaw
2. The magnetic vector of the device is then de-rotated to the Earth frame (tilt-corrected) by pre-multiplying by the product of the inverse roll multiplied by inverse pitch rotation matrix
3. Speed estimate e.g. VedBA, DBA, step frequency - distance per step
4. Convert speed to distance
5. Compute coordinates
6. Integrate current vectors

Gunner et al 2021

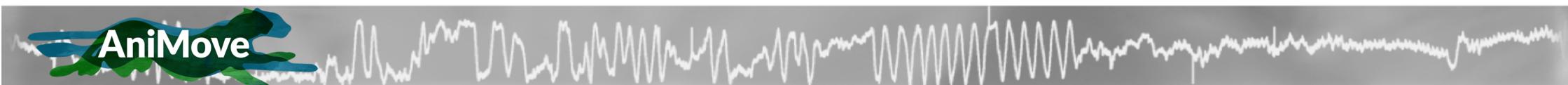


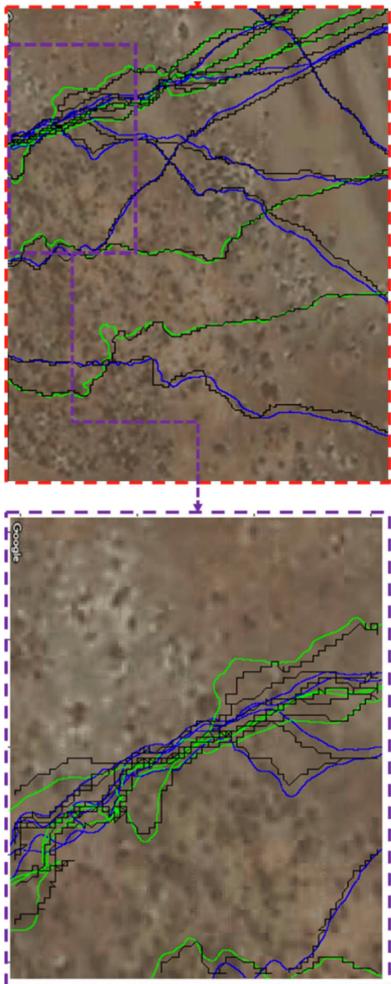


## Verified Position Correction (VPC ) procedure

- ✓ Reconstruct continuous, fine-scale 2-/3-D movement paths, irrespective of the environment and at higher resolution than any VP system
- ✓ Reduces the recording frequency of GPS locations, extending battery life and/or reducing deployment bulk/weight.
- ✓ Limits positional noise ('jitter') of 'high-res' (e.g.,  $\geq 1$  Hz) GPS datasets, which is most apparent during non-moving behaviours such as rest and in highly heterogenous environments where radio signal can be easily obstructed

Gunner et al 2021



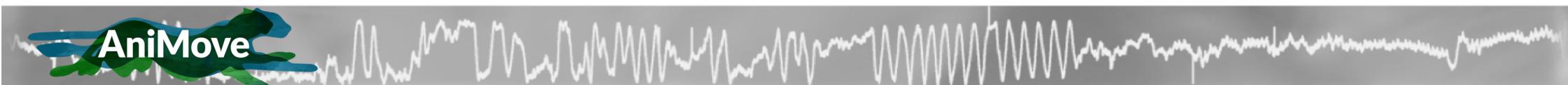


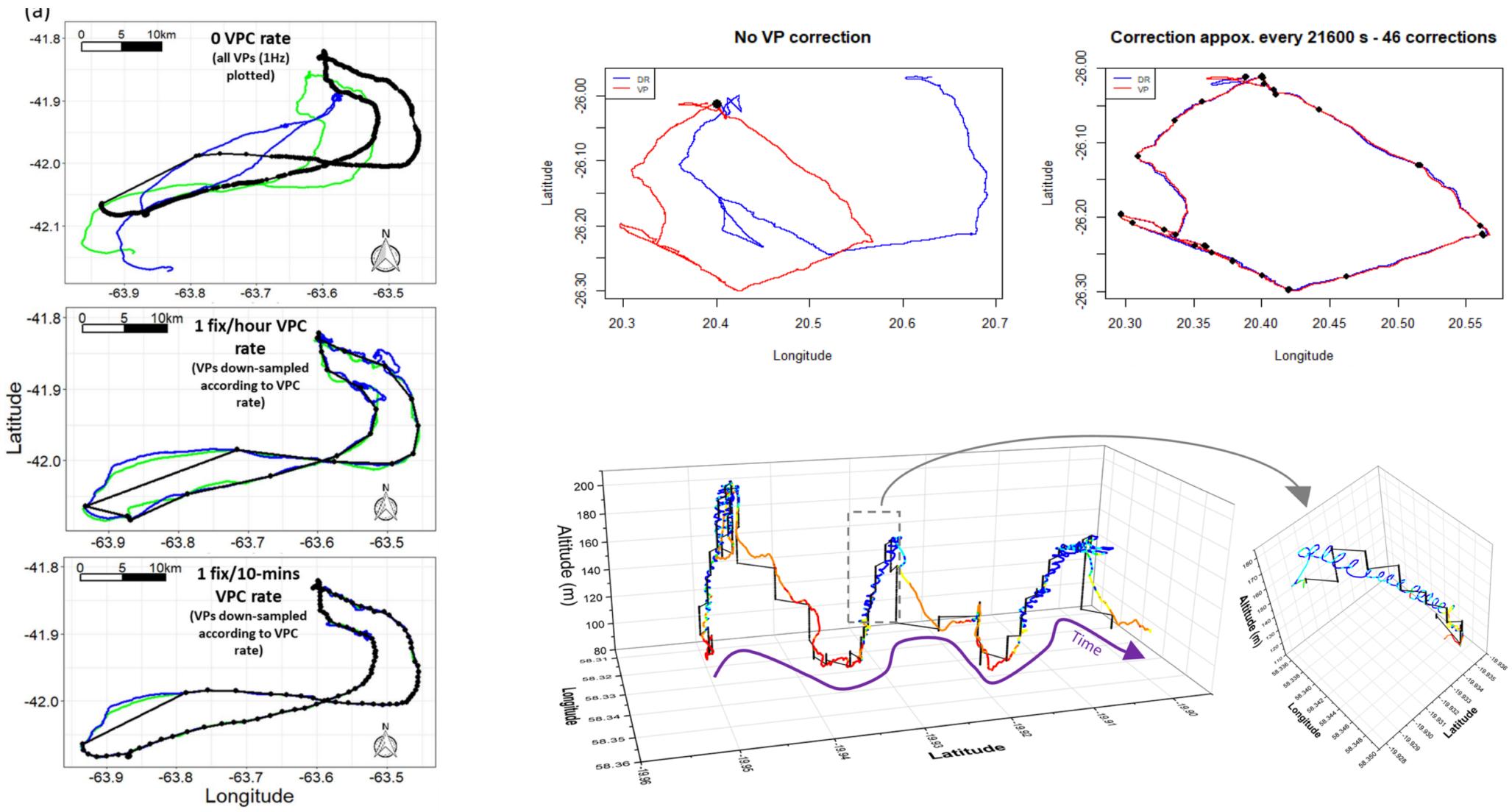
## Verified Position Correction (VPC ) procedure

Haversine distance (net error; great-circle distance) and bearing (from true North; great circular bearing) between consecutive VPs and the corresponding time-matched dead-reckoned track positions.

1. Index row number with NA for non-VPs
2. Under sampled data frame time-matched DR tracks
3. Distance correction factor = VP distance / DR distance
4. Heading correction factor = VP head - DR head
5. Merged back to the main data frame
6. Updated coefficients are substituted into DR formular and process repeated iteratively

Gunner et al 2021





## Barometric pressure sensor

$$\text{Altitude(m)} = 44,330 \times \left[ 1 - \left( \frac{P}{P_o} \right)^{\frac{1}{5.255}} \right]$$

where  $P$  is the smoothed pressure and  $P_o$  is a daily constant pressure at sea level.

## PLOS ONE

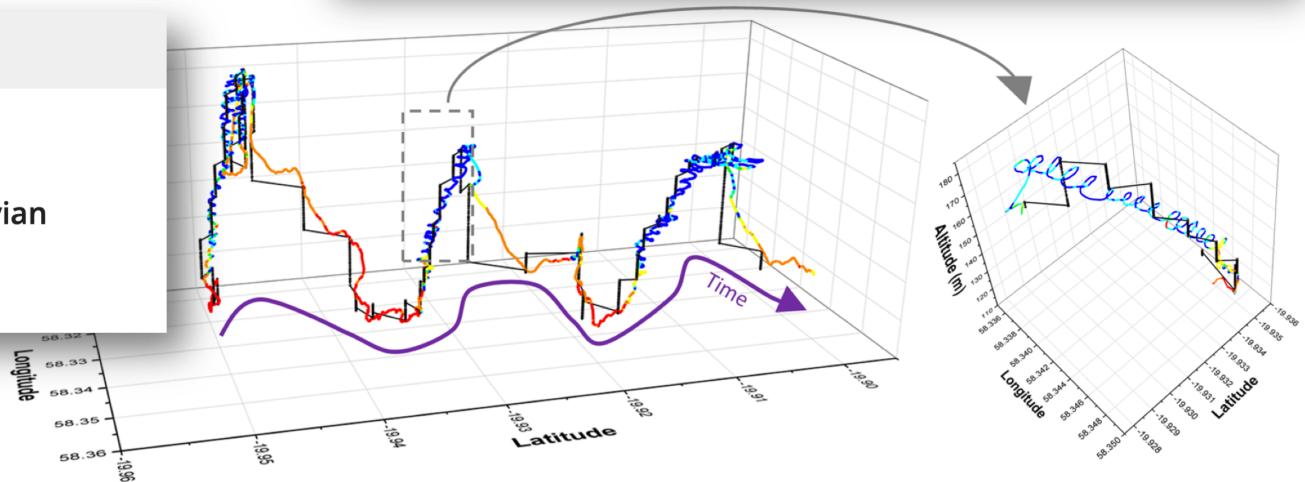
OPEN ACCESS PEER-REVIEWED

RESEARCH ARTICLE

### Assessing the accuracy of altitude estimates in avian biologging devices

Kimberly A. Lato, Julia E. F. Stepanuk, Eleanor I. Heywood, Melinda G. Conners, Lesley H. Thorne

Published: October 26, 2022 • <https://doi.org/10.1371/journal.pone.0276098>



Home > Animal Biotelemetry > Article

## How to improve the accuracy of height data from bird tracking devices? An assessment of high-frequency GPS tracking and barometric altimetry in field conditions

Methodology | Open access | Published: 04 August 2023

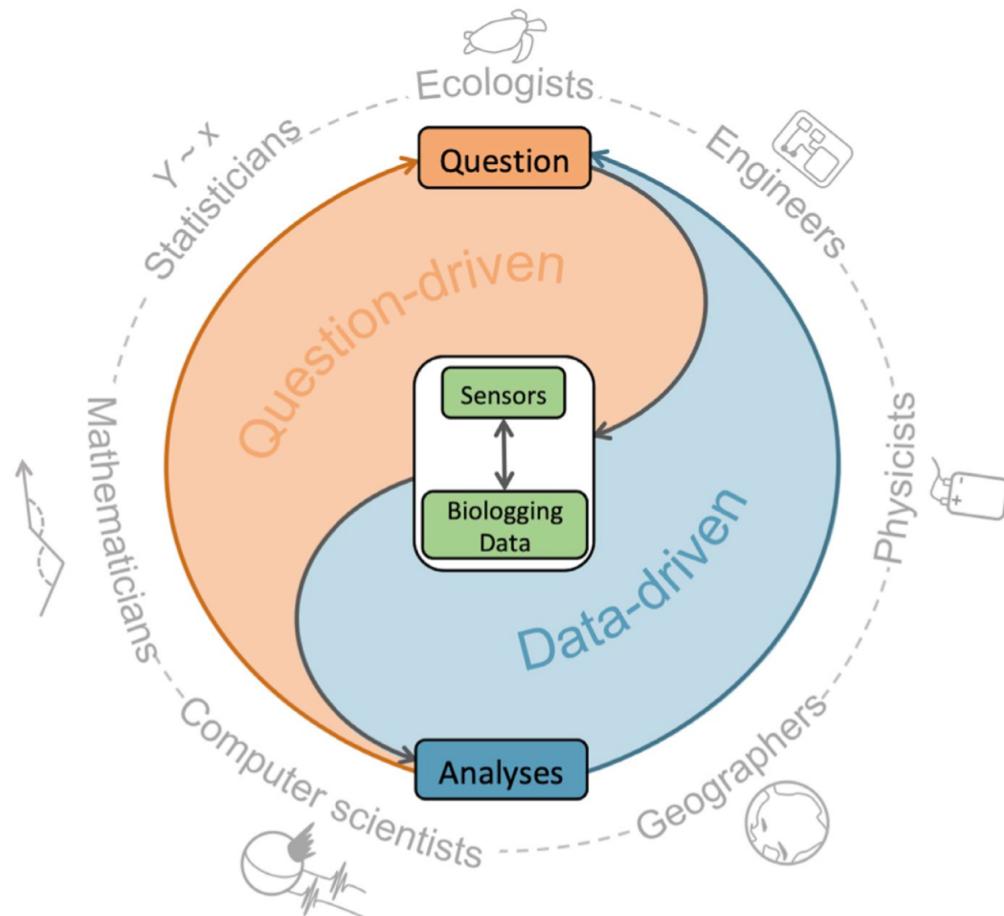
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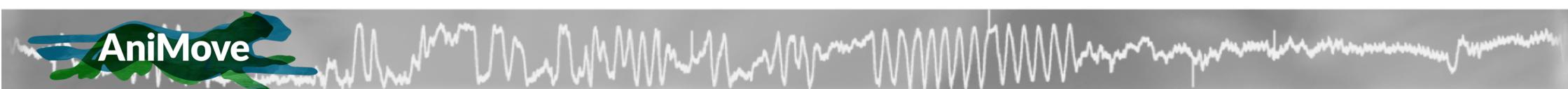
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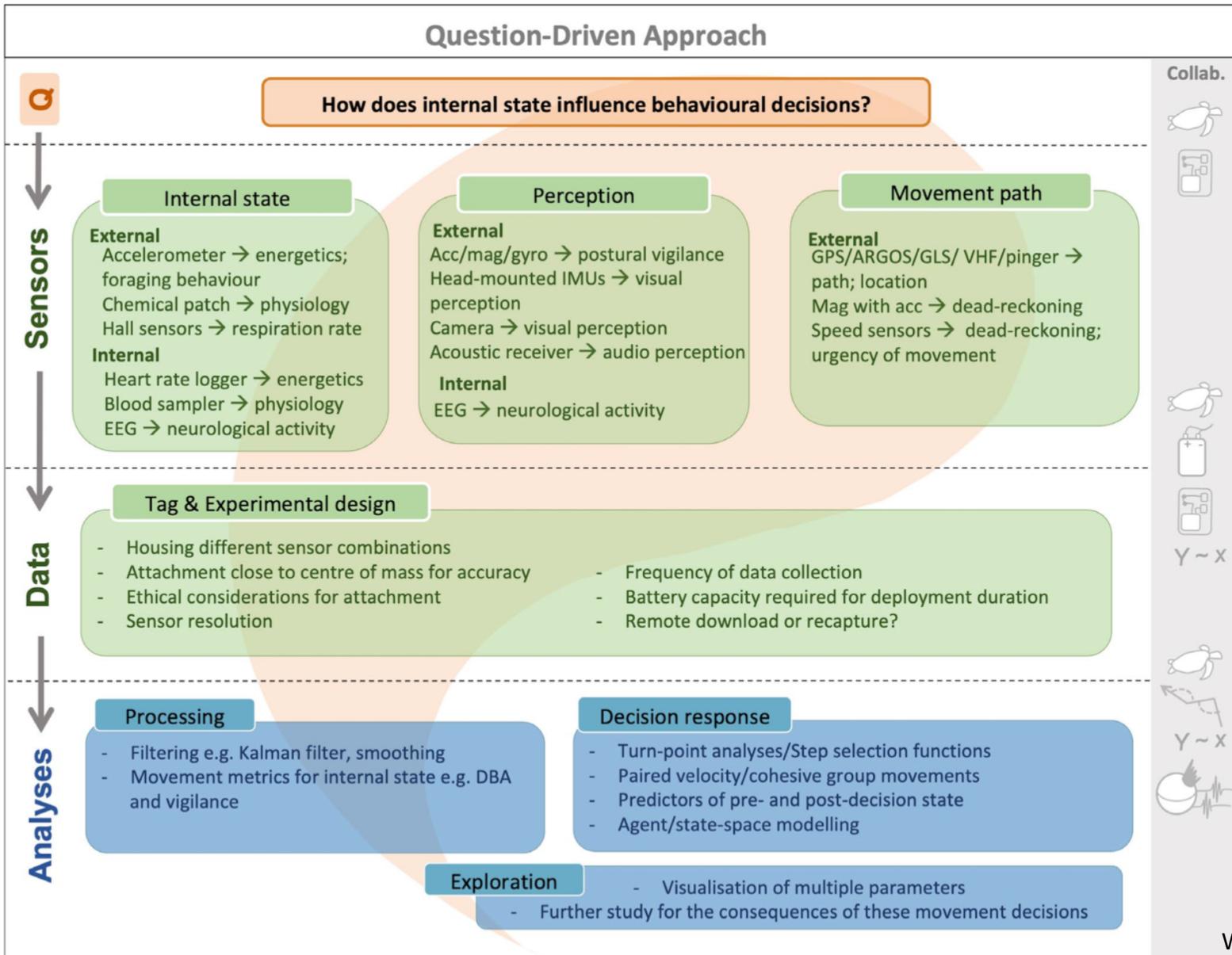
Tonio Schaub, Alexandre Millon, Caroline De Zutter, Ralph Buij, Joël Chadoeuf, Simon Lee, Aymeric Mionnet & Raymond Hendrikus Gerardus Klaassen

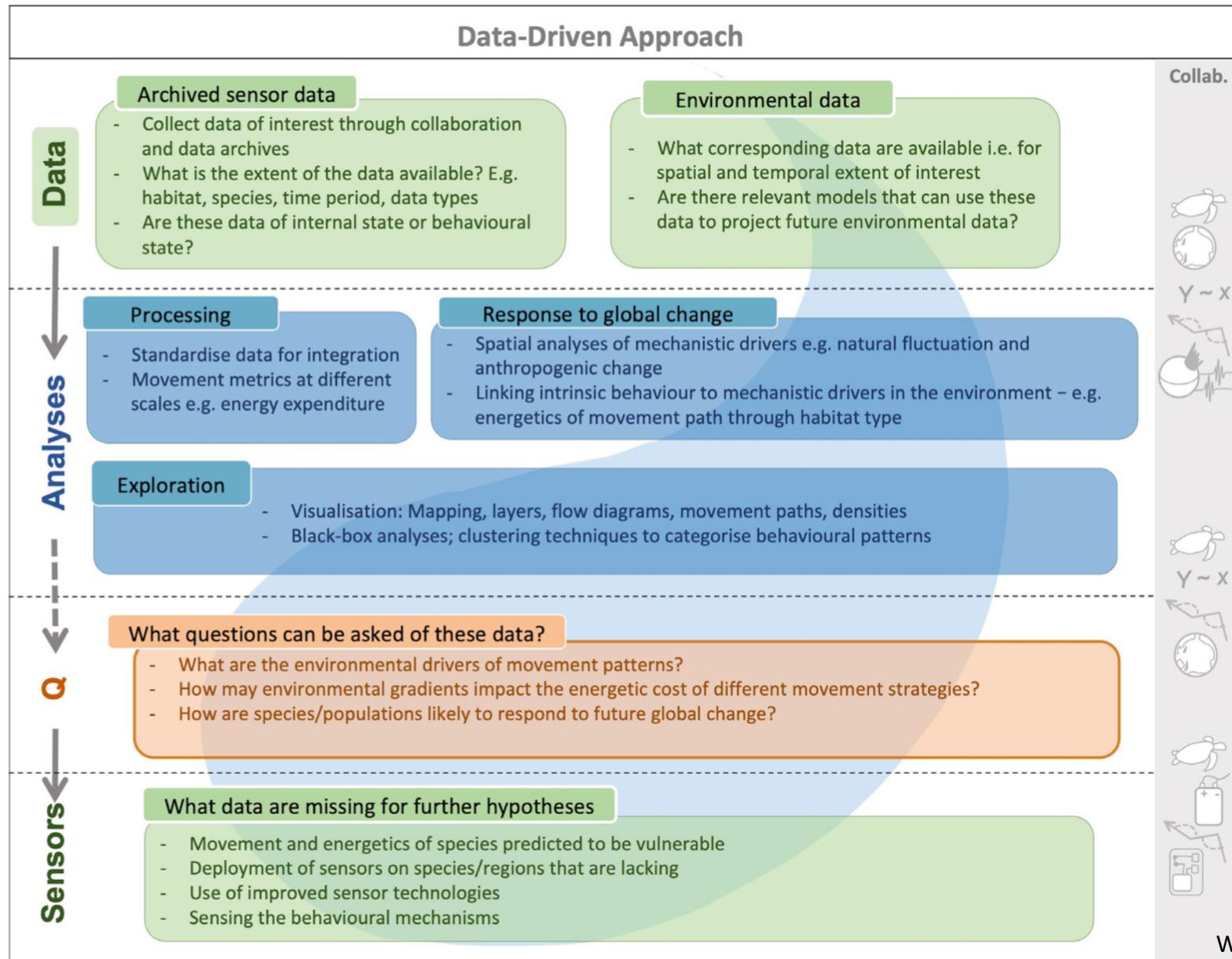
# Optimising use of multisensory bio-loggers



Williams et al (2020) JAE

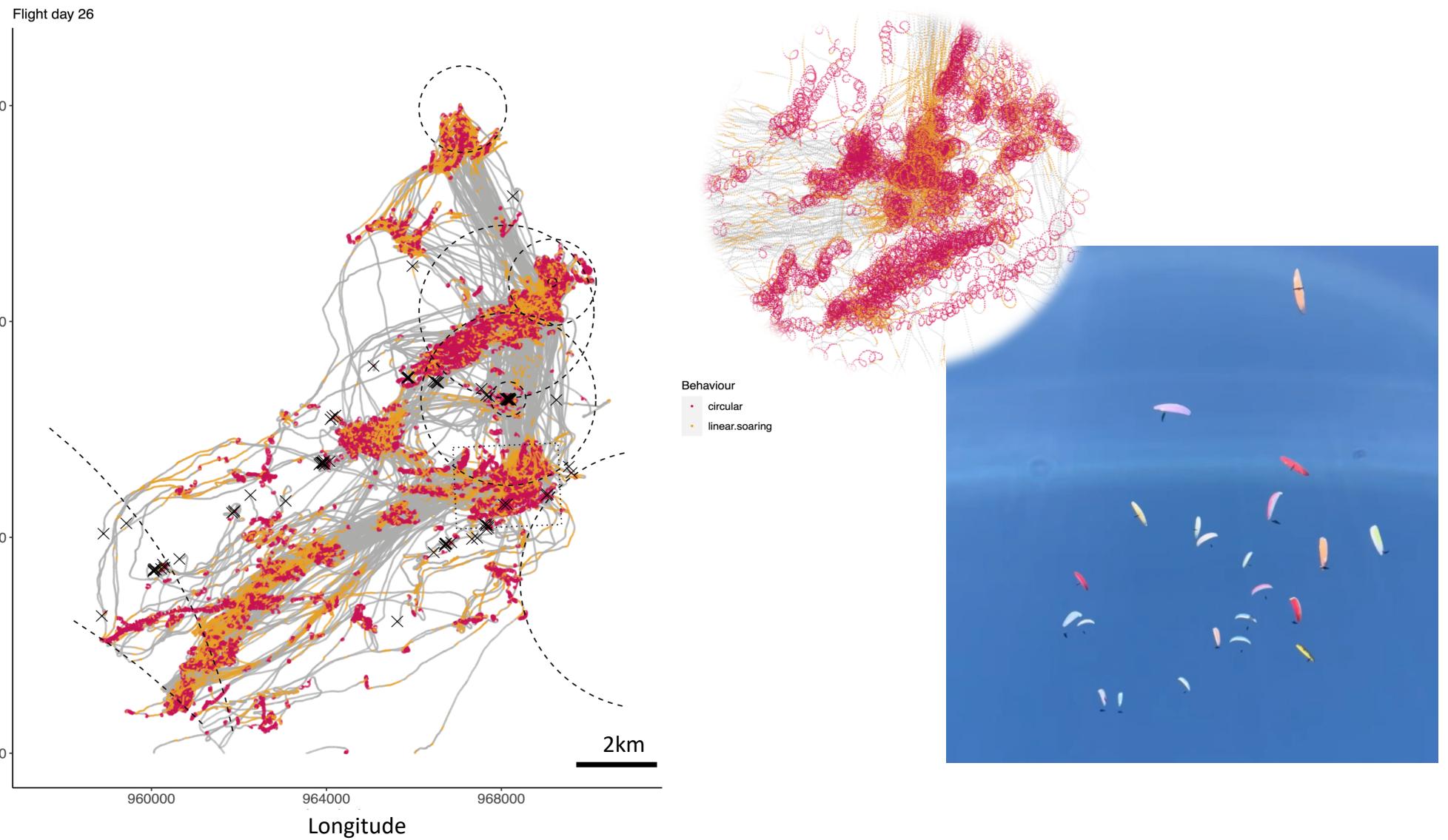


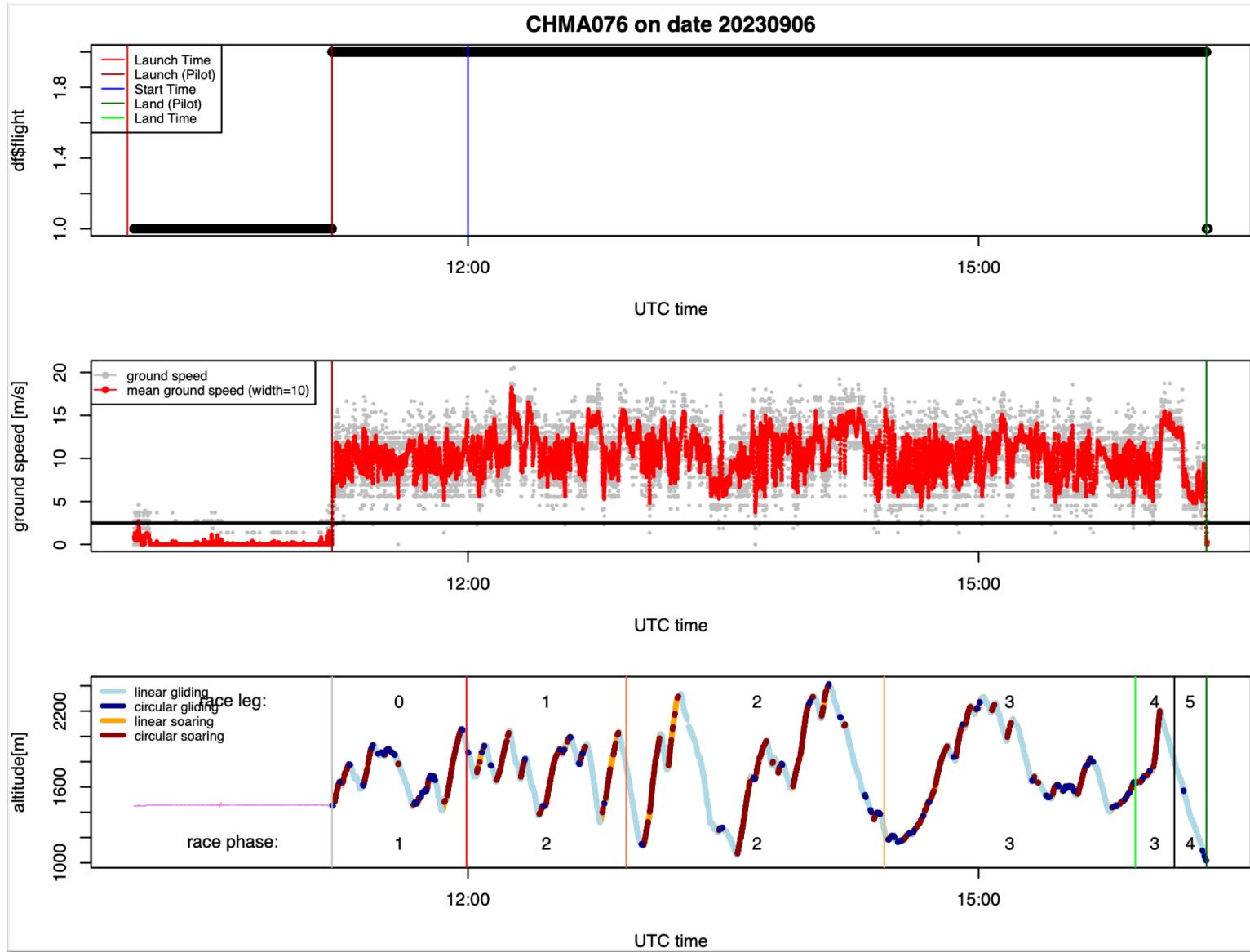


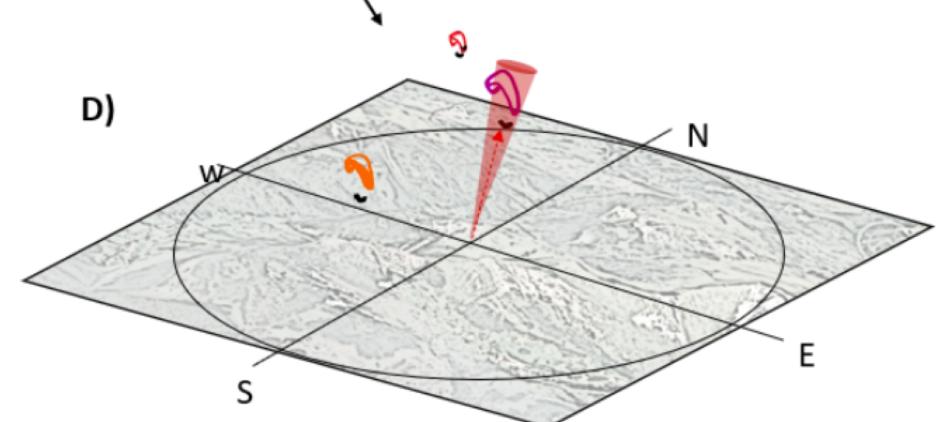
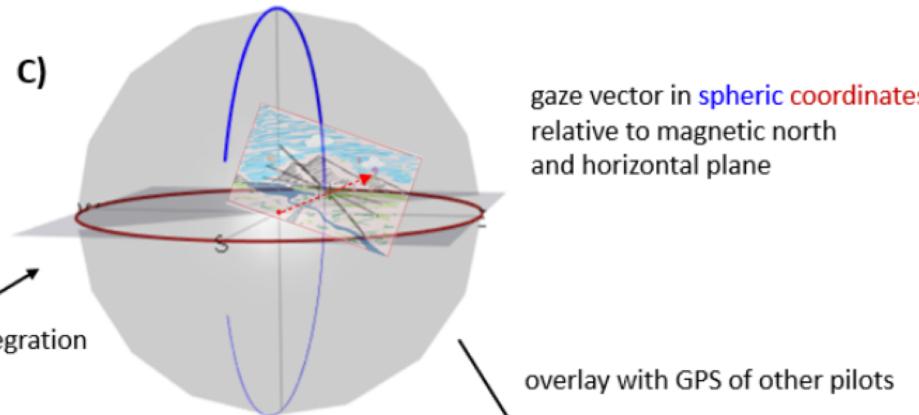
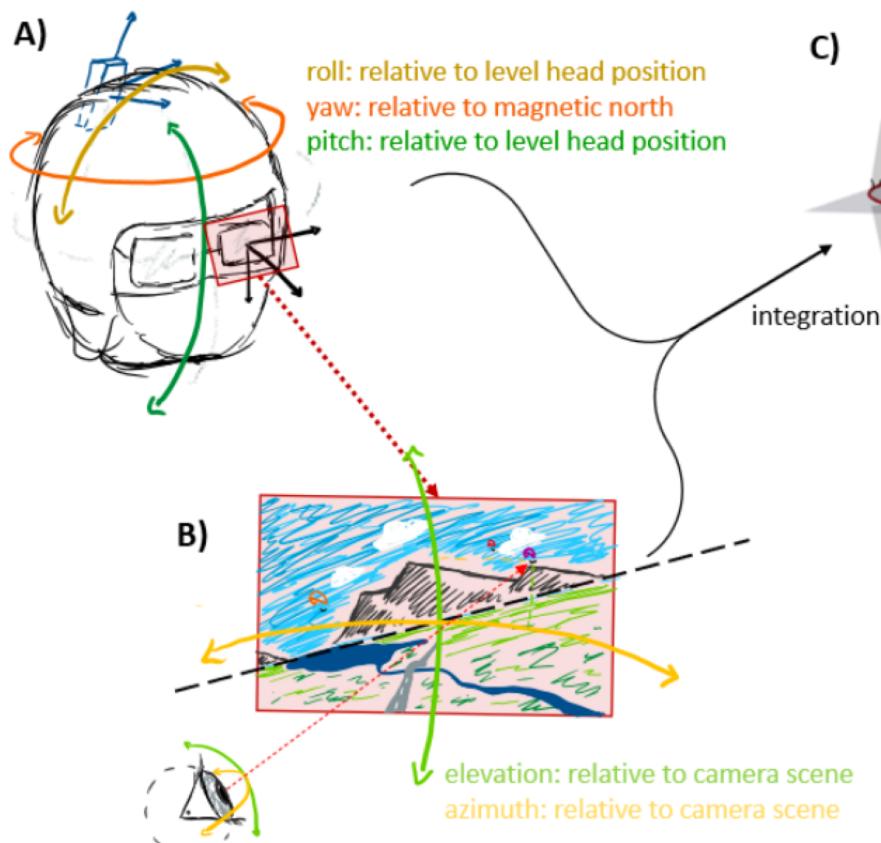


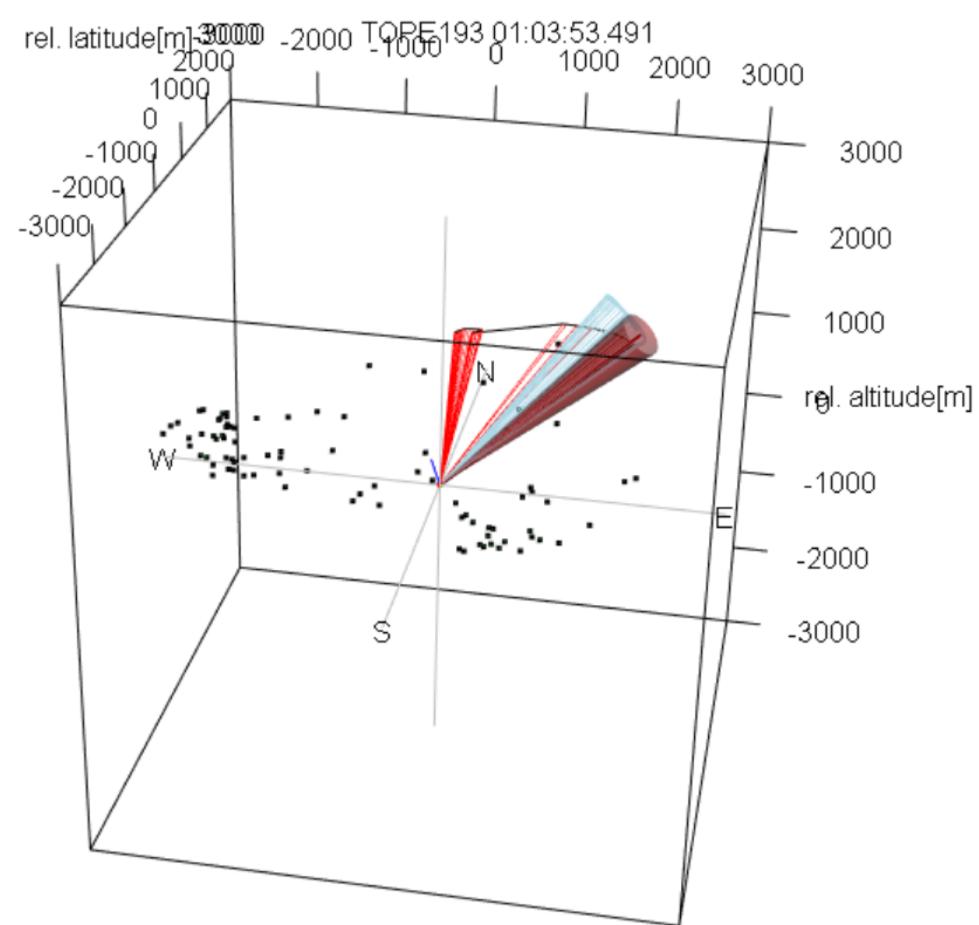
# A Case Study: soaring flight













# Resolving behavior with auxiliary sensors

