## Pelagic Fisheries Research Program

http://www.soest.hawaii.edu/PFRP/

A mosaic of models for light-based geolocation:

How to choose, what to be careful about, and

future directions

Anders Nielsen & John Sibert

anders.nielsen@hawaii.edu























## Light based geolocation

- We got:
  - Light, depth, and temperature
  - Measured for instance every minute
  - From archival tags the entire record can be retrieved
  - From satellite transmitting tags only a summary
- We want:
  - A track of geographic positions (geolocations)
  - Some idea about the uncertainties
  - Perhaps some quantitative movement parameters
- Problems:
  - Indirect measurements: Light  $\rightarrow$  solar altitude  $\rightarrow$  geolocation
  - High and correlated uncertainties from changing weather and incomplete depth corrections



















#### This talk

- Will talk about:
  - Raw geolocations
  - Kftrack
  - Kfsst/ukfsst
  - Trackit (with and without SST)
- Will not talk about:
  - Satellite methods
  - Tidal location models
  - Sunrise/sunset times models
  - SST matching algorithms
  - EASy-FishTracker
  - **—** ...





















#### Similarities of kftrack, kfsst, ukfsst, and trackit

- Underlying movement model
  - Assume the same random walk model
  - Includes drift and diffusion
- At any given position the observation model
  - Predicts the observation
  - Describes the observation error
- All model parameters are maximum likelihood estimated
- Any point on the most probable track is a weighted average of:
  - What is learned from the current observation
  - What is learned from the entire track



















#### The differences are

- What they take as data
  - Raw geolocations (lon,lat) used by kftrack
  - Raw geolocations and SST (lon,lat,SST) used by kfsst and ukfsst
  - Light readings and SST used by trackit
- Technical details in handling non-linearities
  - Extended Kalman filter used by kftrack and kfsst
  - Unscented Kalman filter used by ukfsst and trackit

	(lon,lat)	$\mathbf{SST}$	$\mathbf{Light}$	EKF	UKF
kftrack	X			X	
$\mathbf{kfsst}$	X	X		X	
${f ukfsst}$	X	X			X
${ m trackit}$		X	X		X

If possible, running more than one can often be very instructive ...





















- Algorithms (partly) proprietary, but in essence:
  - Associate a certain light level crossing with a solar angle (problematic)
  - Calculate position from two of those
- These raw geolocations are often imprecise and biased
- Especially latitude around equinox

































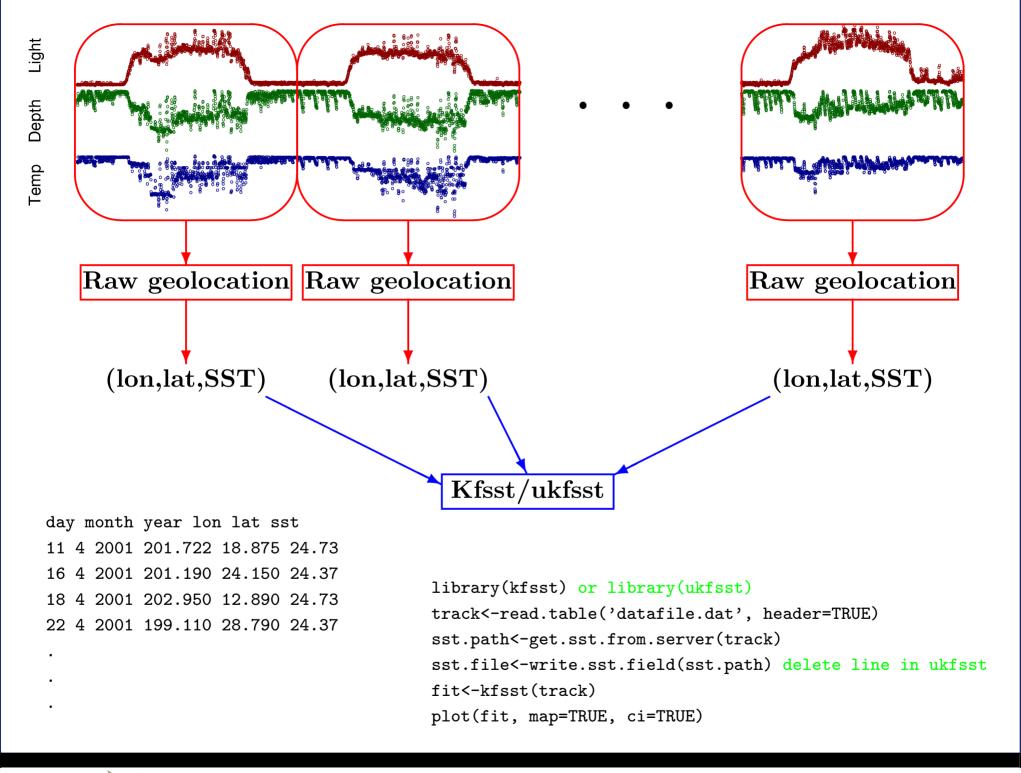
























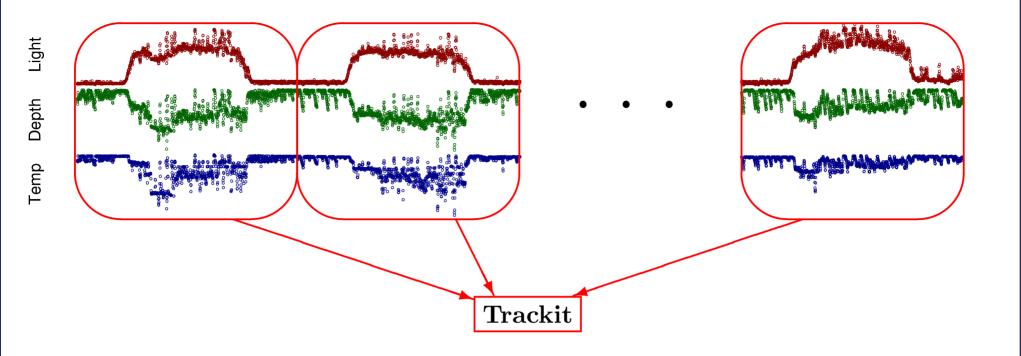












```
2002 9 11 15 35 53 15.5 69 21.1
2002 9 11 15 36 53 15.0 75 21.1
                                                     library(trackit)
2002 9 11 15 37 53 16.0 85 21.3
                                                     track<-read.table('datafile.dat', header=TRUE)</pre>
                                                     sst<-read.table('sstdatafile.dat', header=TRUE)</pre>
                                                     sst.path<-get.sst.from.server(track, 150, 250, 0, 40)
                                                     prep.track<-prepit(track, sst=sst,</pre>
                                                         fix.first=c(198.55,22.85,2002,9,10,0,0,0),
year month day hour min sec sst
                                                         fix.last=c(200.13,21.95,2003,5,21,0,0,0))
2002 9 15 3 0 0 22.4
                                                     fit<-trackit(prep.track)</pre>
2002 9 17 2 0 0 23.1
                                                     plot(fit)
2002 9 21 5 0 0 22.9
                                                     fitmap(fit)
```



year month day hour min sec depth light temp













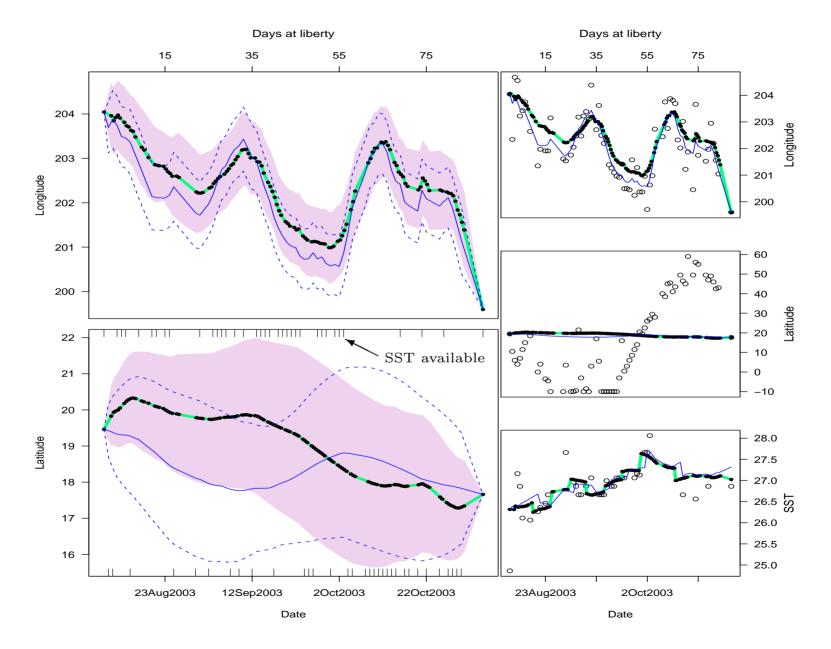








## Be careful about trusting raw geolocations

















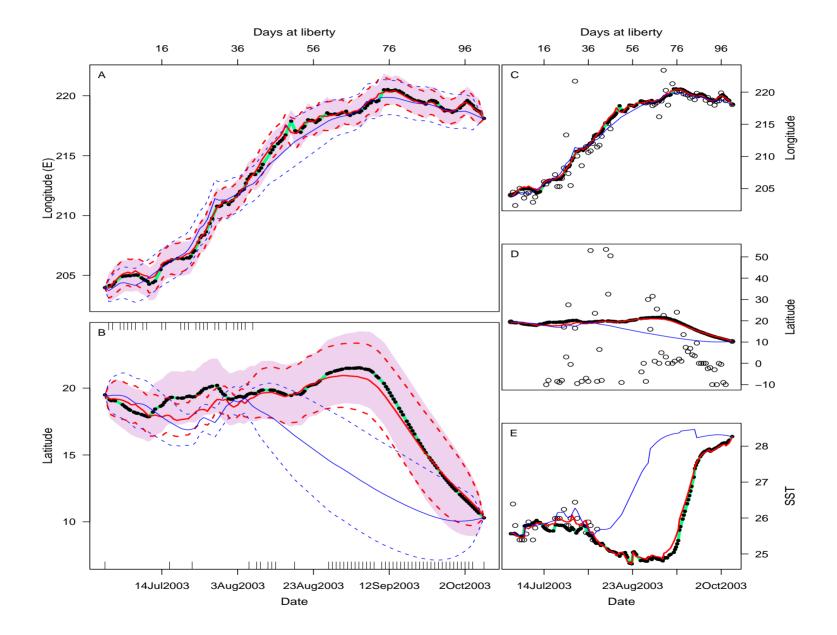








#### Be careful about trusting raw geolocations - 2























#### Be careful about convergence

```
#R-KFtrack fit
#Mon Nov 12 16:22:14 2007
#Number of observations: 76
#Negative log likelihood: 322.056
#The convergence criteria was met
```

- Convergence should be obtained
- Ways to help the optimizer if a track is problematic
  - Simplify model (especially for short tracks)
     (e.g. fit<-kftrack(track, bx.a=FALSE, by.a=FALSE))</li>
  - Supply better initial values(e.g. fit<-kftrack(track, D.i=500))</li>
  - Remove extreme outliers
     (e.g. track<-track[abs(track\$lat)<90,])</pre>
  - A combination
  - Also check data























## Be careful about selecting satellite SST data

- In open ocean coarse resolution is fine
- Near the coast a fine resolution is needed
- In areas with frequent cloud cover consider the blended source
- See the options in the documentation

```
?get.sst.from.server
?get.blended.sst
```

# Remember to report back

- Like to hear when it is working
- Need to hear when it is not























#### **Future directions**

- Grid based methods interesting
  - allows other distributions than Gaussian
  - allows strong non-linearities (land areas)
  - very computational demanding
- Numerous tracks in one model
  - The right thing to do if some (or all) parameters are common
  - More confidence in estimated parameters
  - Possible to allow more flexible movement patterns
- Conventional tracks and archival tags in one model
  - First step in using all tagging data in fish stock assessment models
- All packages can be downloaded from:

http://www.soest.hawaii.edu/tag-data/software/

Thank you for listening!

















# Combining individual and population based models

#### An appealing idea

- The parameters are the same (drift and diffusion)
- All tagged fish from the same population should be equal representatives, no matter what type of tag
- Might get better individual tracks when parameter estimates get better
- How much more is learned from an (expensive) archival tag

#### **Simulation study**

- 100 data sets are simulated each with 5100 simulated individuals
- 5000 with conventional tags 100 with archival tags (randomly assigned)
- Realistic effort pattern, fishing mortality, and natural mortality are applied

#### Parameter estimation

- A-D-R model is used for the conventional tags
- The Kalman filter likelihood was extended to include survival and recapture probabilities, and the individuals that were not recaptured











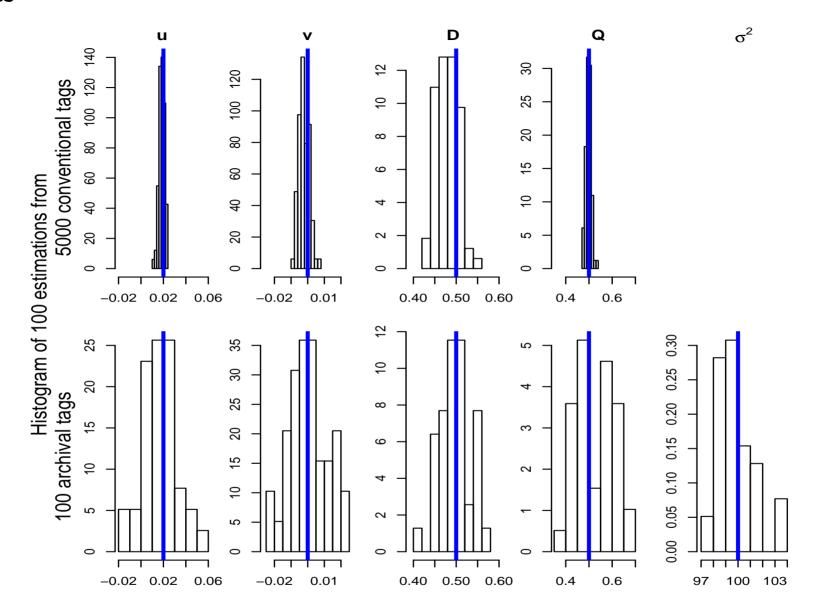








#### Results























Parameter	True	Conventi	Conventional tags		Archival tags		All tags	
name	value	bias	std. dev.	bias	std. dev.	bias	std. dev.	
$\overline{u}$	0.02	-0.00143	0.00259	-0.00364	0.01467	-0.00188	0.00182	
v	0.00	-0.00232	0.00302	0.00059	0.01150	-0.00134	0.00299	
D	0.50	-0.02078	0.02403	-0.00244	0.03733	-0.01695	0.01640	
Q	0.50	-0.00228	0.01221	0.02835	0.08274	-0.00011	0.01164	
$\sigma^2$	100.00			-0.13608	1.52063	0.09419	1.34204	

- Best results from combined model
- In this setting we get almost the same amount of information about drift (u, v)' from one conventional tag as from one archival tag. This will likely change in a more complex setting.
- Archival tags provide more information per tag about diffusion  ${\cal D}$  than conventional tags

















