

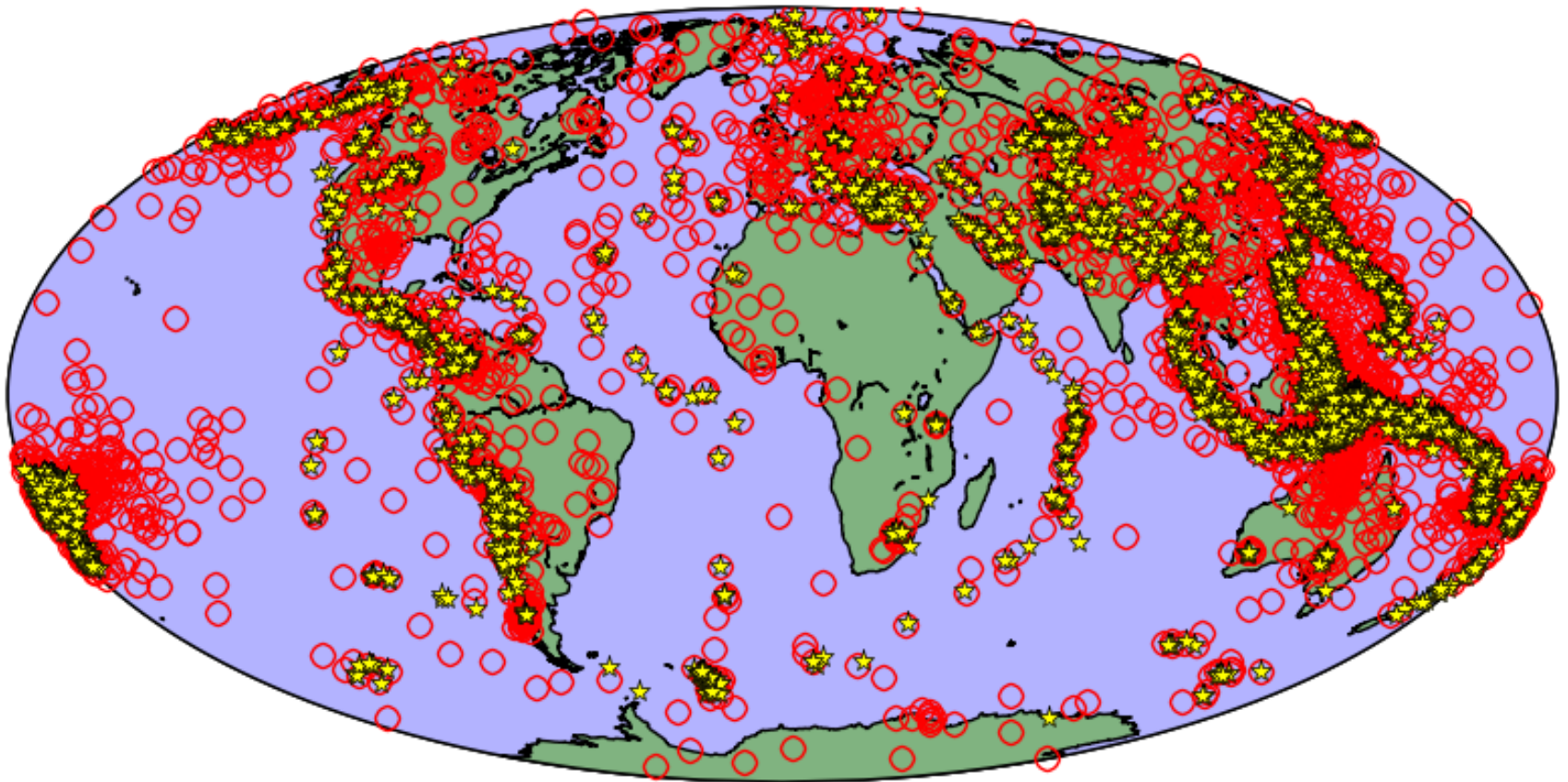
# NET-VISA



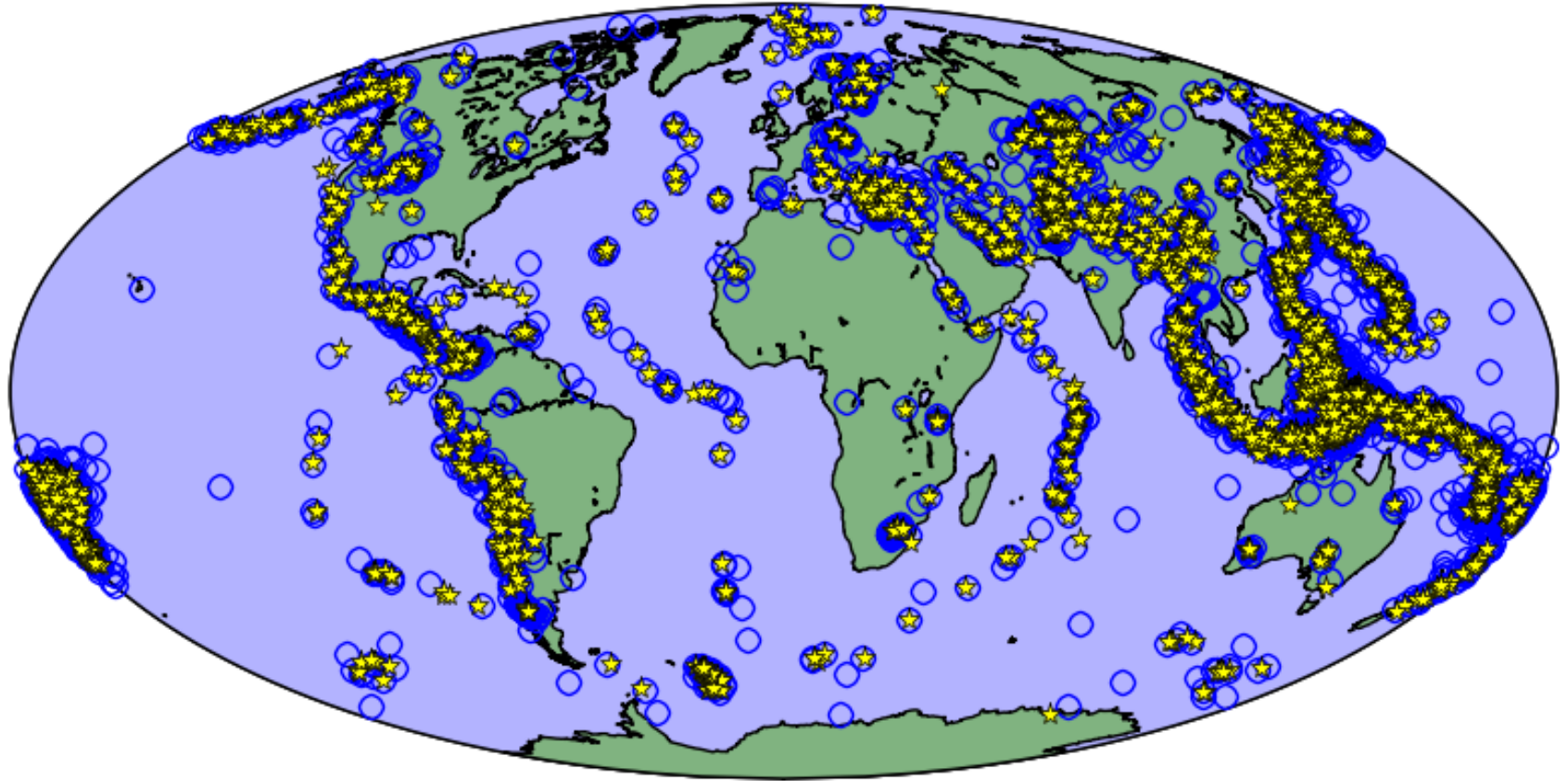
Nimar S. Arora  
Bayesian Logic, Inc.

Sponsored by the CTBTO  
Collaborators: Stuart Russell, Ronan Le Bras, Heidi Kuzma

Reference Bulletin: LEB. Time Range: 2009/1/1 - 2009/2/1



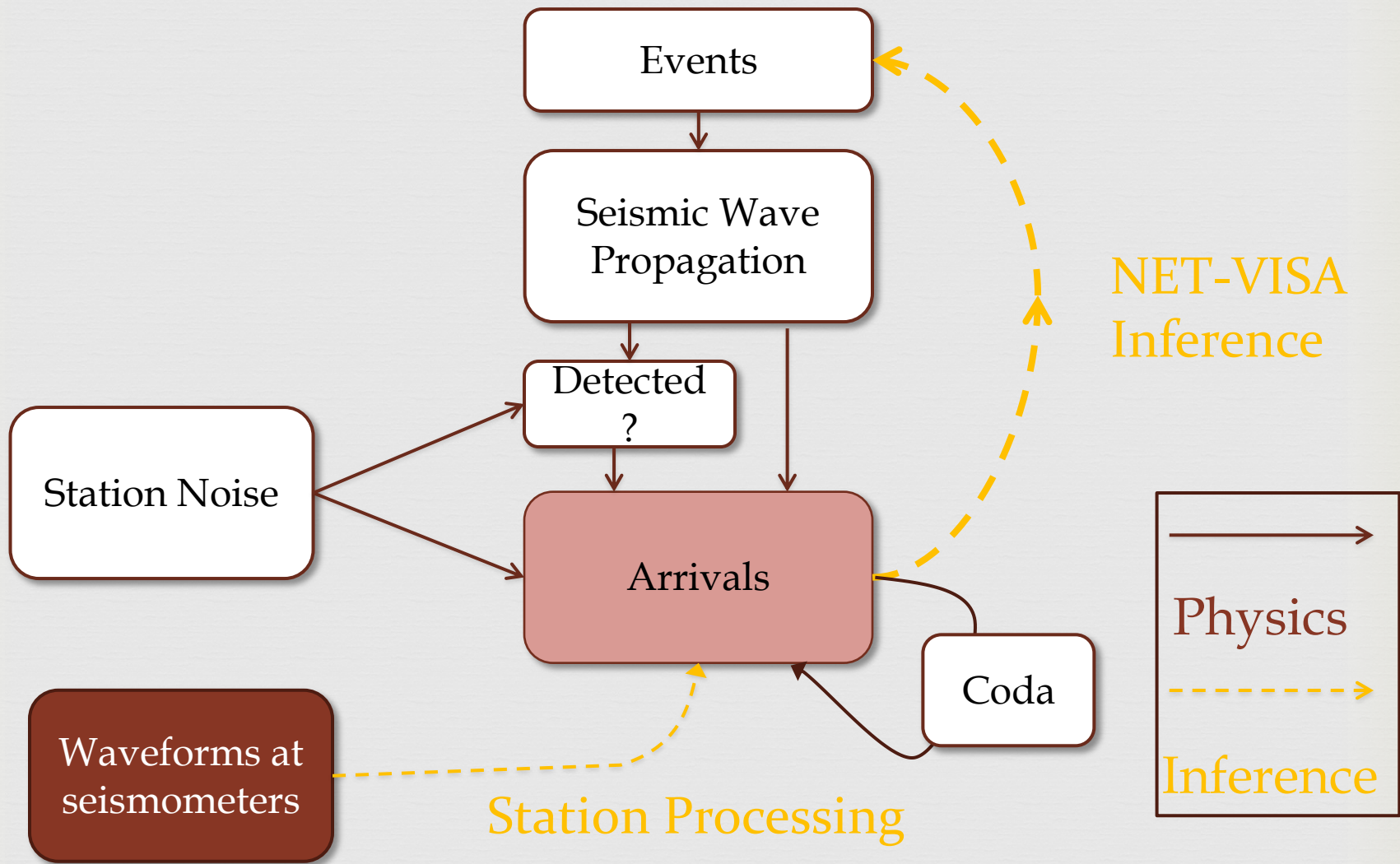
Reference Bulletin: LEB. Time Range: 2009/1/1 - 2009/2/1

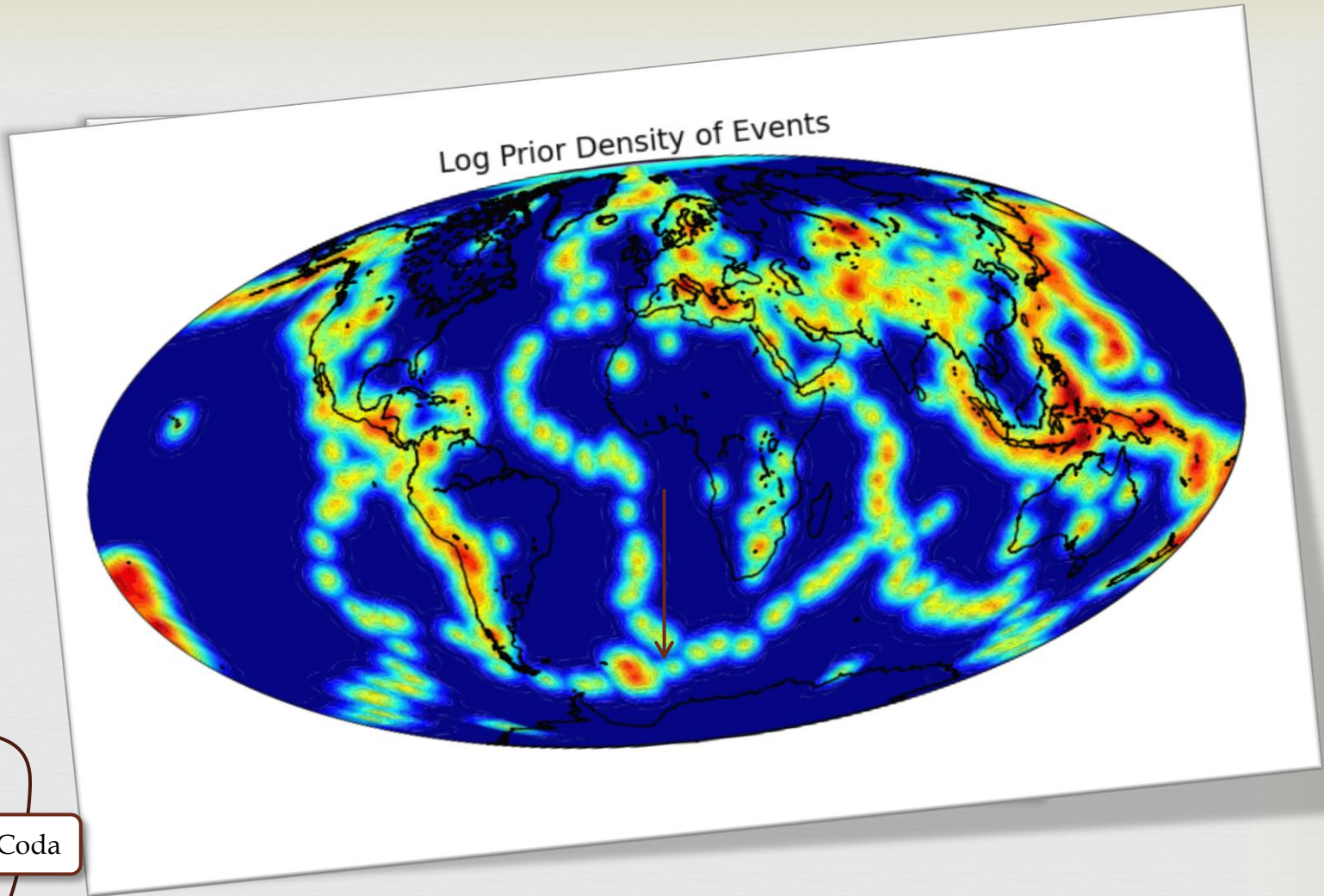
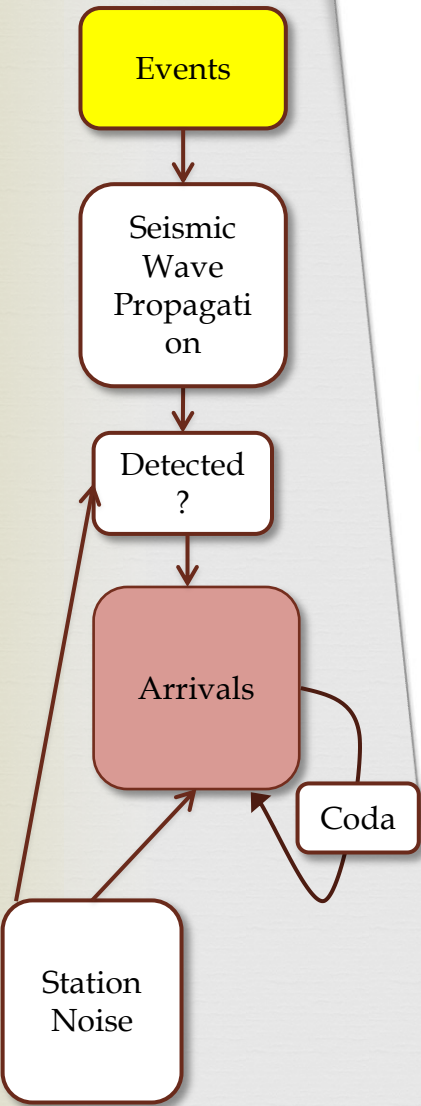


# Overview

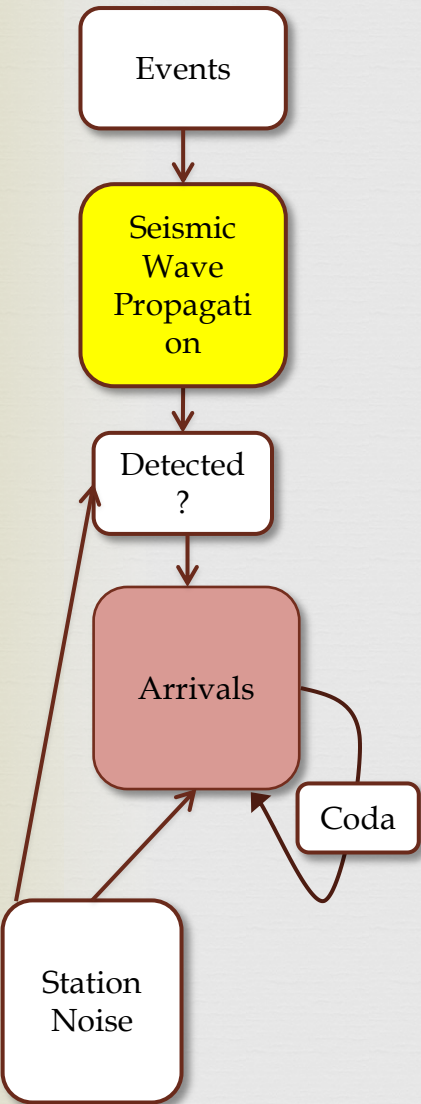


- ⌘ Generative Probabilistic Model
- ⌘ Inference
- ⌘ Normal events
- ⌘ Large aftershock sequences
- ⌘ Future Improvements





## Seismic Event Location Prior



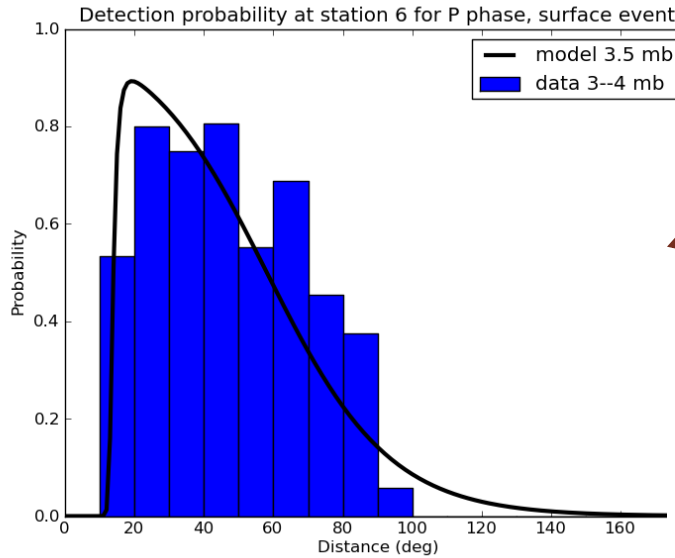
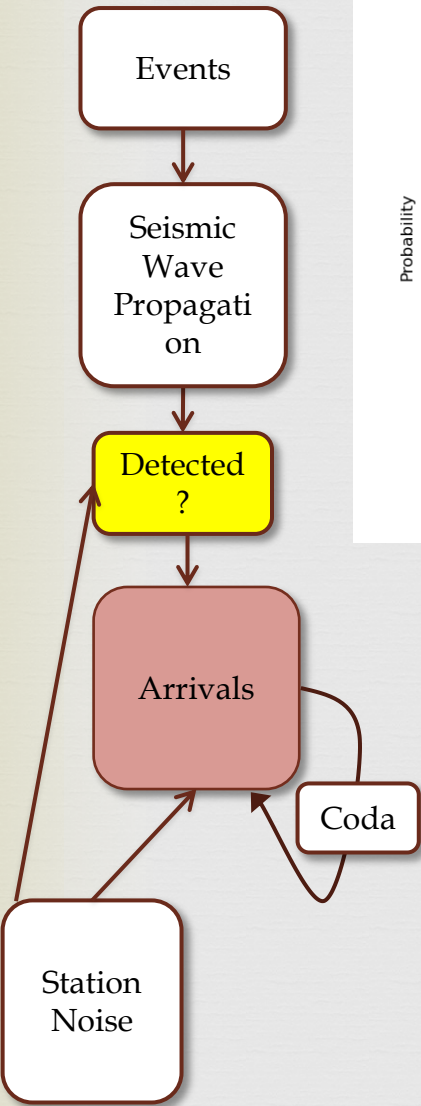
## IASPEI

- Travel Time
- Slowness
- Azimuth

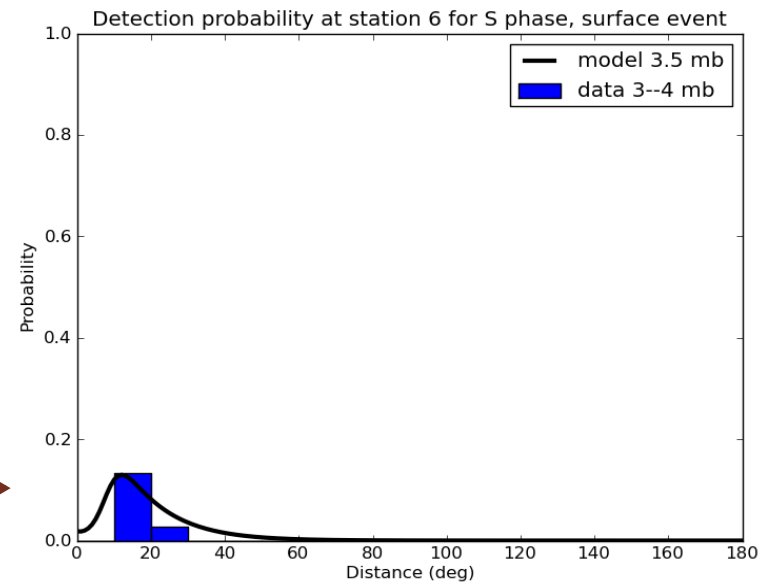
## Phase Relative Order

- P before S
- P has higher slowness than S
- etc.

# Seismic Wave Propagation



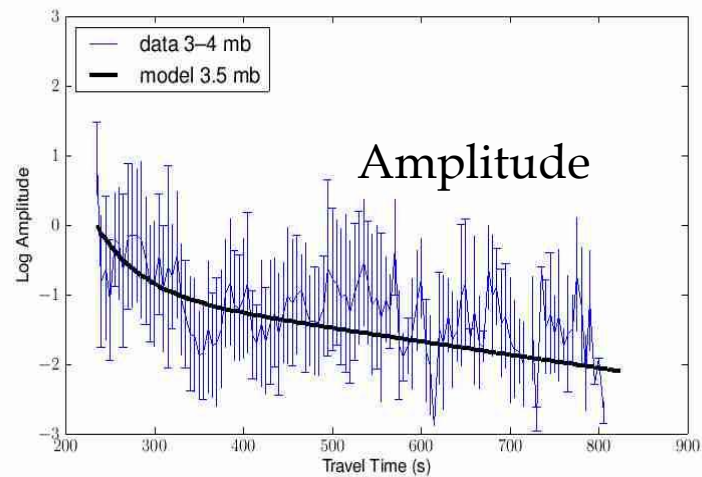
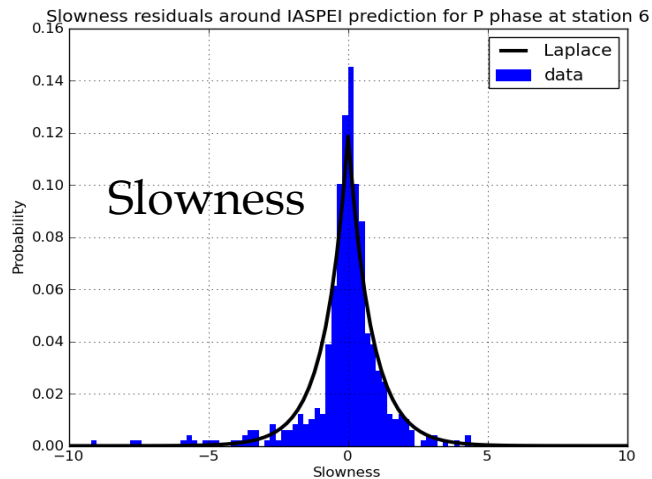
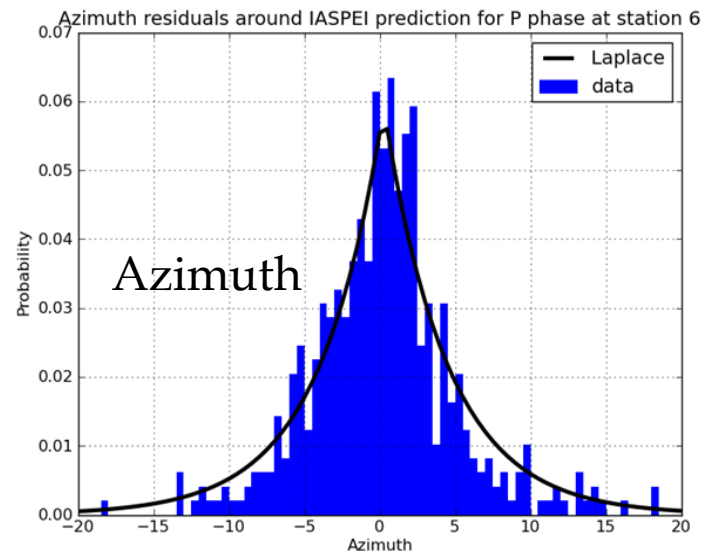
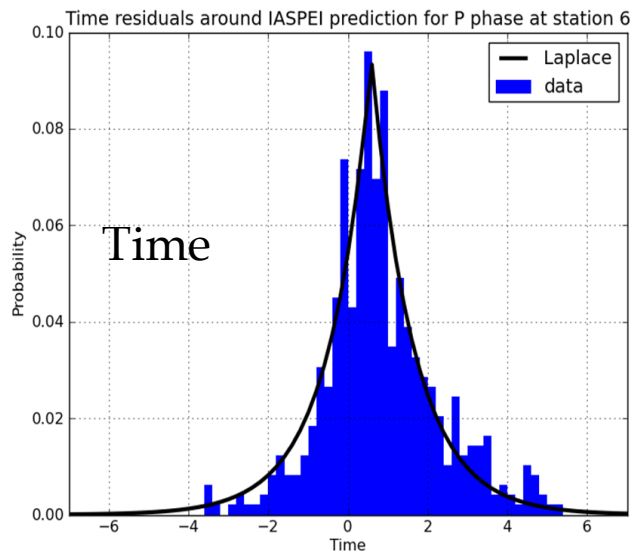
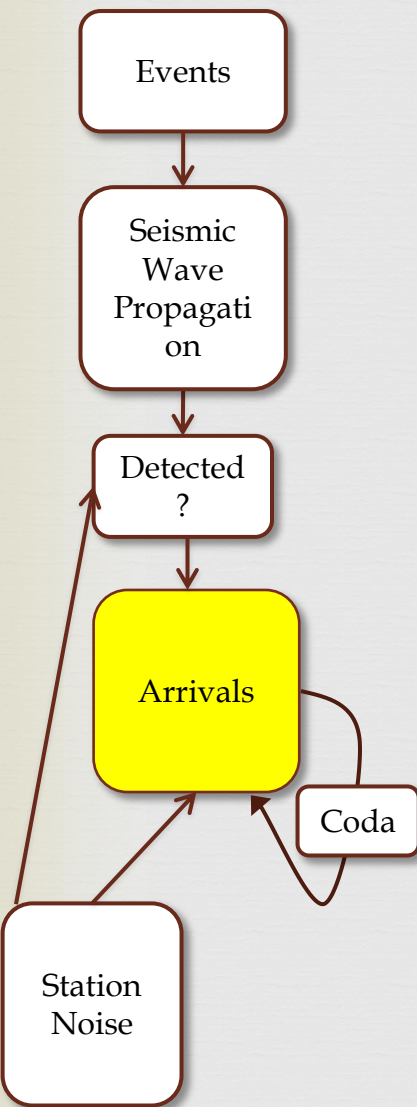
P Phase for surface event  
3.5 mb



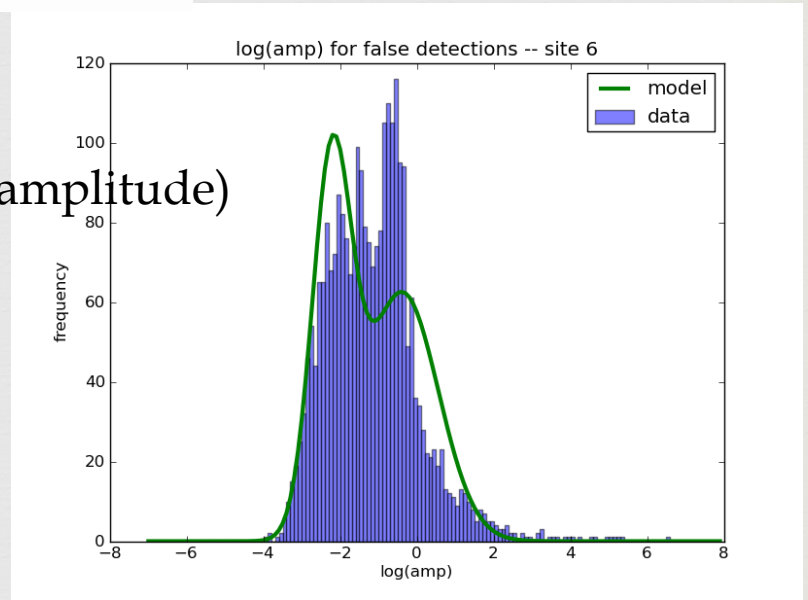
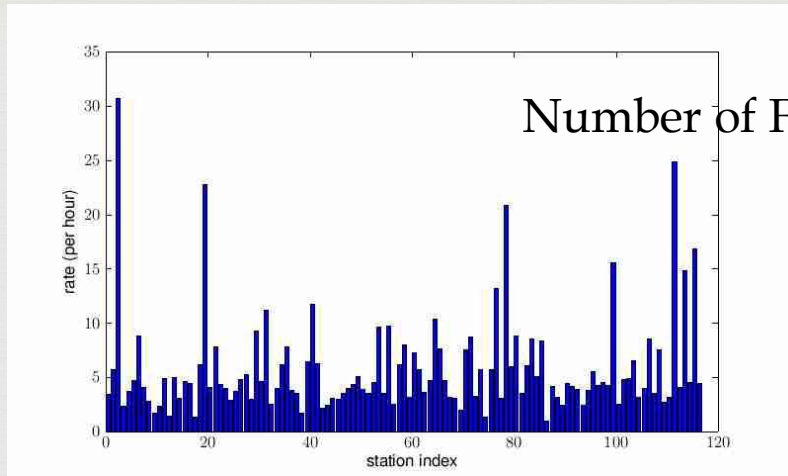
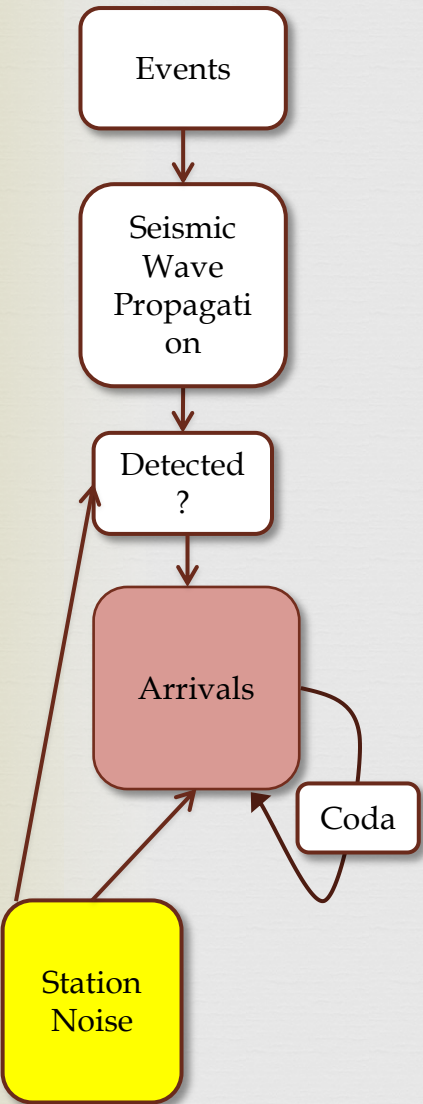
S Phase for surface event  
3.5 mb

# Phase Detection Probability

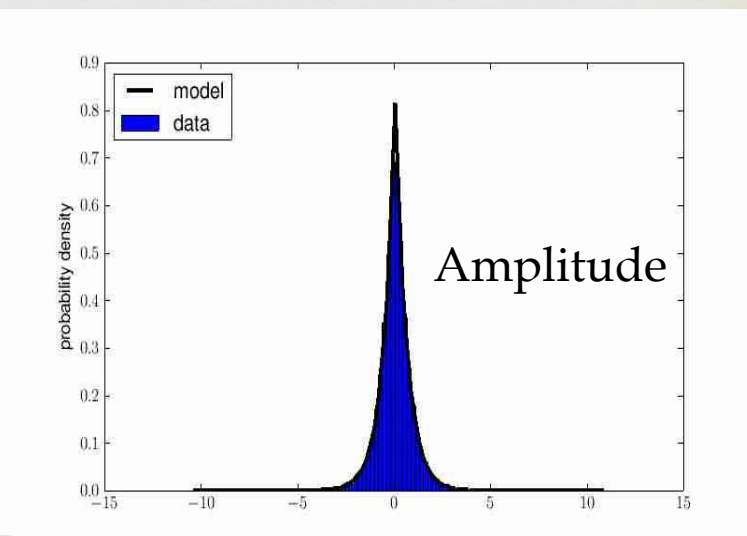
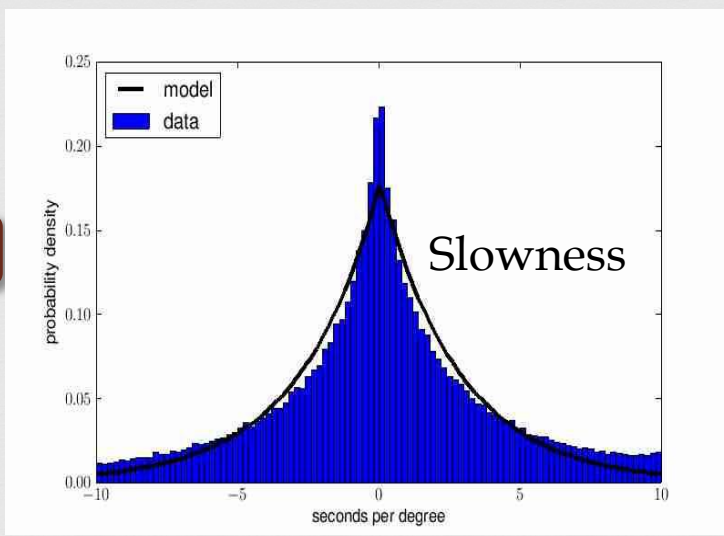
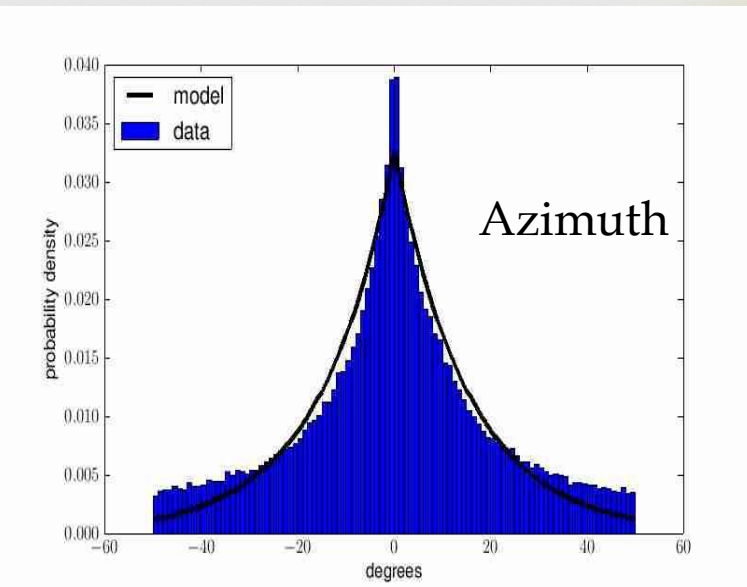
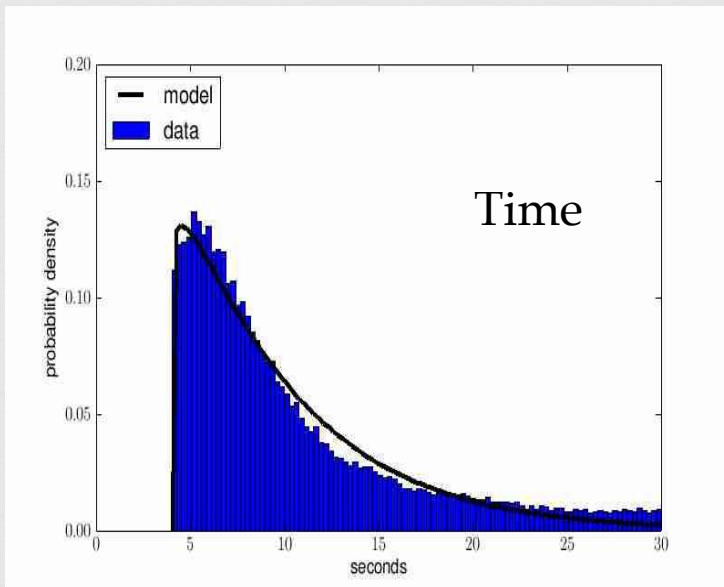
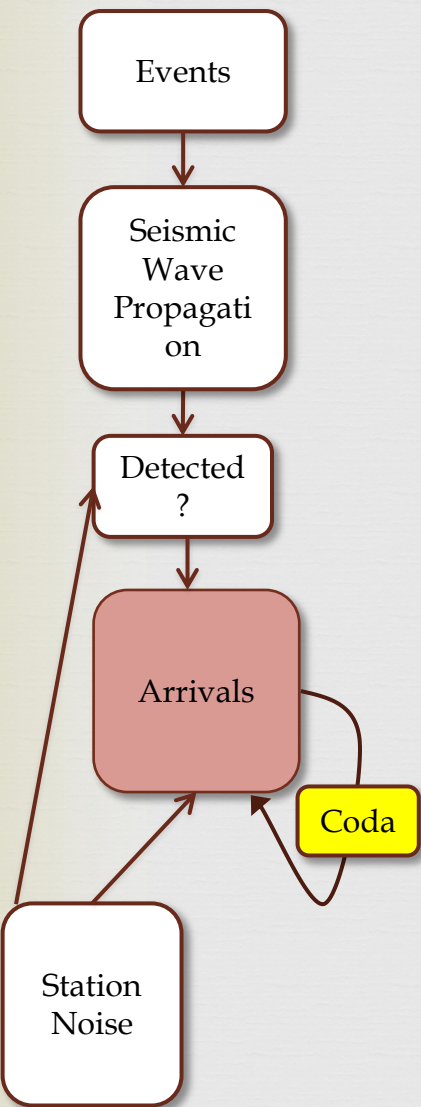




# Arrival Parameters



Station Noise



## Coda (Relative) Attributes

# Calibration



- ⌘ P(Events, Arrivals, False Arrivals, Coda Arrivals)
  - ⌘ P(Events)
    - ⌘ A complete LEB would help train this better.
  - ⌘ P(Arrivals | Events)
    - ⌘ This part can be trained with whatever events are in LEB
  - ⌘ P(False Arrivals)
  - ⌘ P(Coda Arrivals)
    - ⌘ These two could sub-models could be mistaking true arrivals for false arrivals
    - ⌘ Smoothing to avoid overtraining.

# Inference Moves

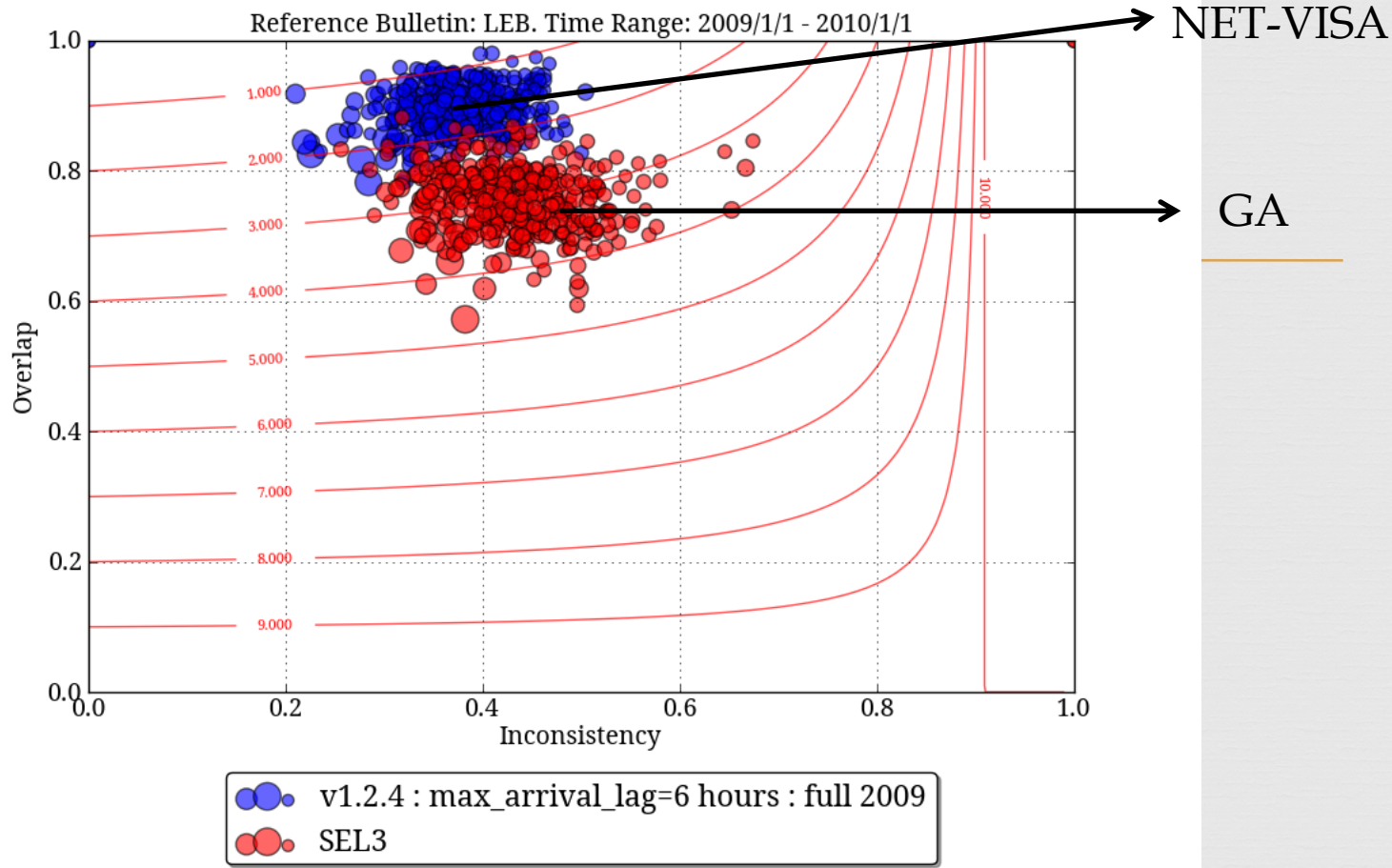


- ❧ Birth Move
  - ❧ Invert individual arrivals to get candidate locations
  - ❧ Validate candidates by associating with the best set of arrivals
- ❧ Re-Associate Move
  - ❧ Associate each arrival to the best event
- ❧ Re-Locate Move
  - ❧ Locate the event given its current associated arrivals
- ❧ Death Move
  - ❧ Kill Events whose loss improves the hypothesis

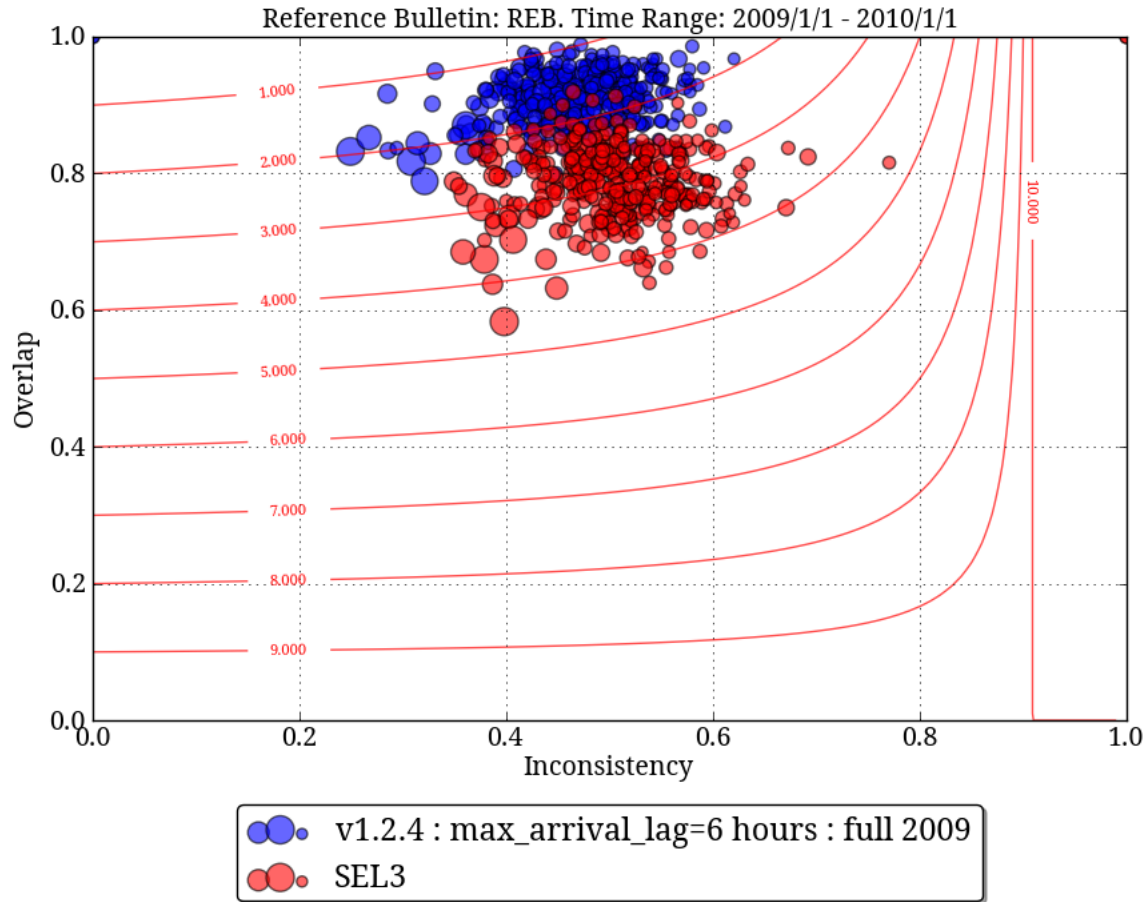
# Evaluating Results



- ❧ *Mark Prior* introduced the following terminology:
- ❧ **Overlap** : percentage of reference events that match with test events
- ❧ **Inconsistency** : percentage of test events that don't match any reference event
- ❧ **Solution Cost** : 10 times missed events plus inconsistent events normalized by number of reference events (or use 20 times etc.)
- ❧ Events match if they share two arrivals with similar phase



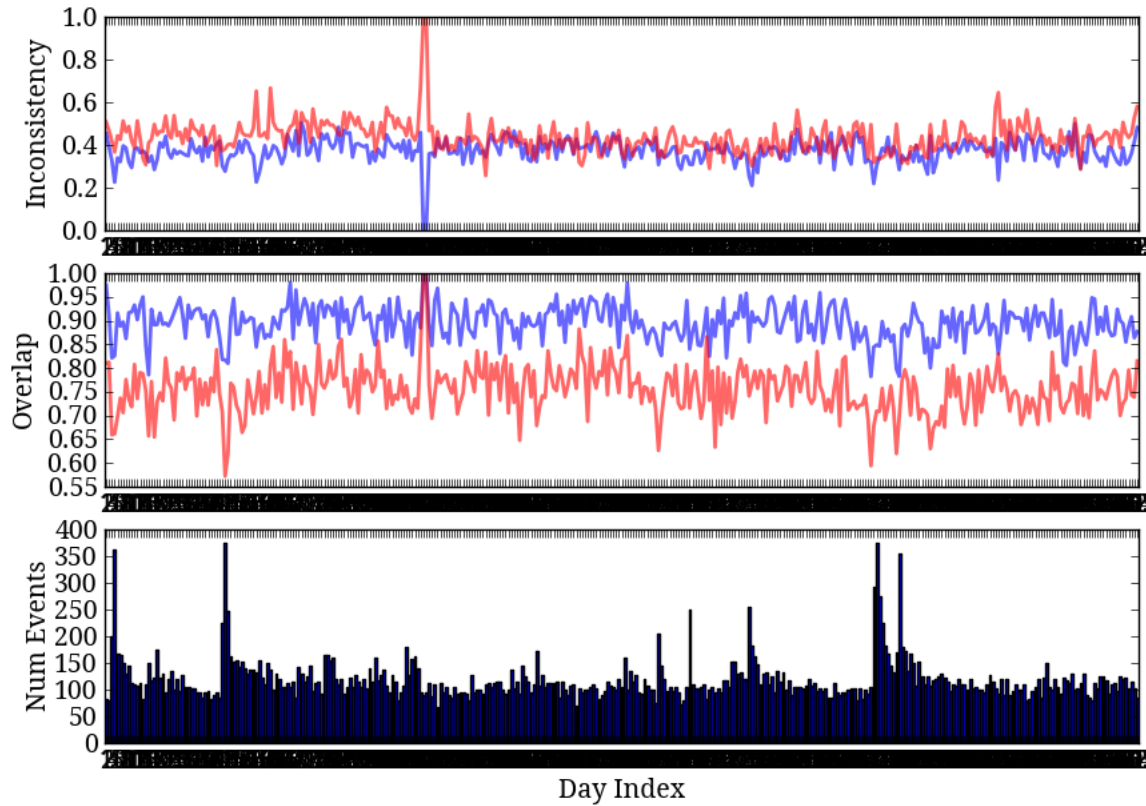
# Cost Visualization



REB as reference

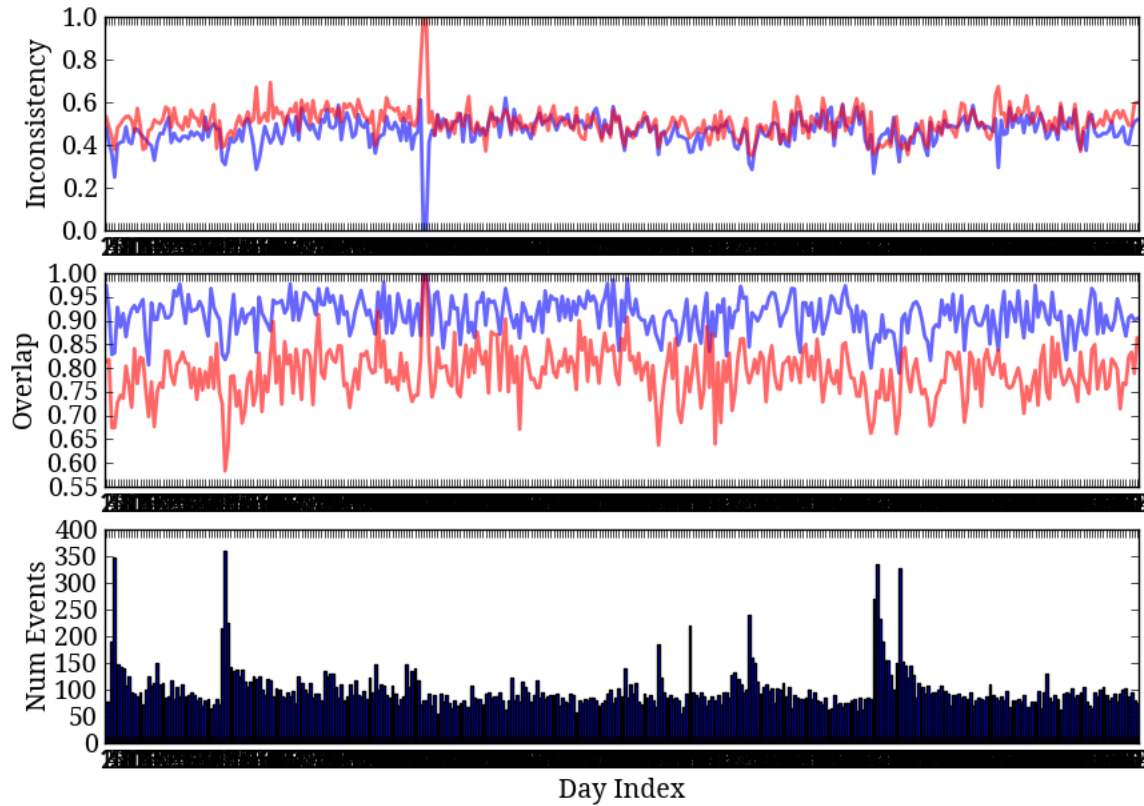


Reference Bulletin: LEB. Time Range: 2009/1/1 - 2010/1/1



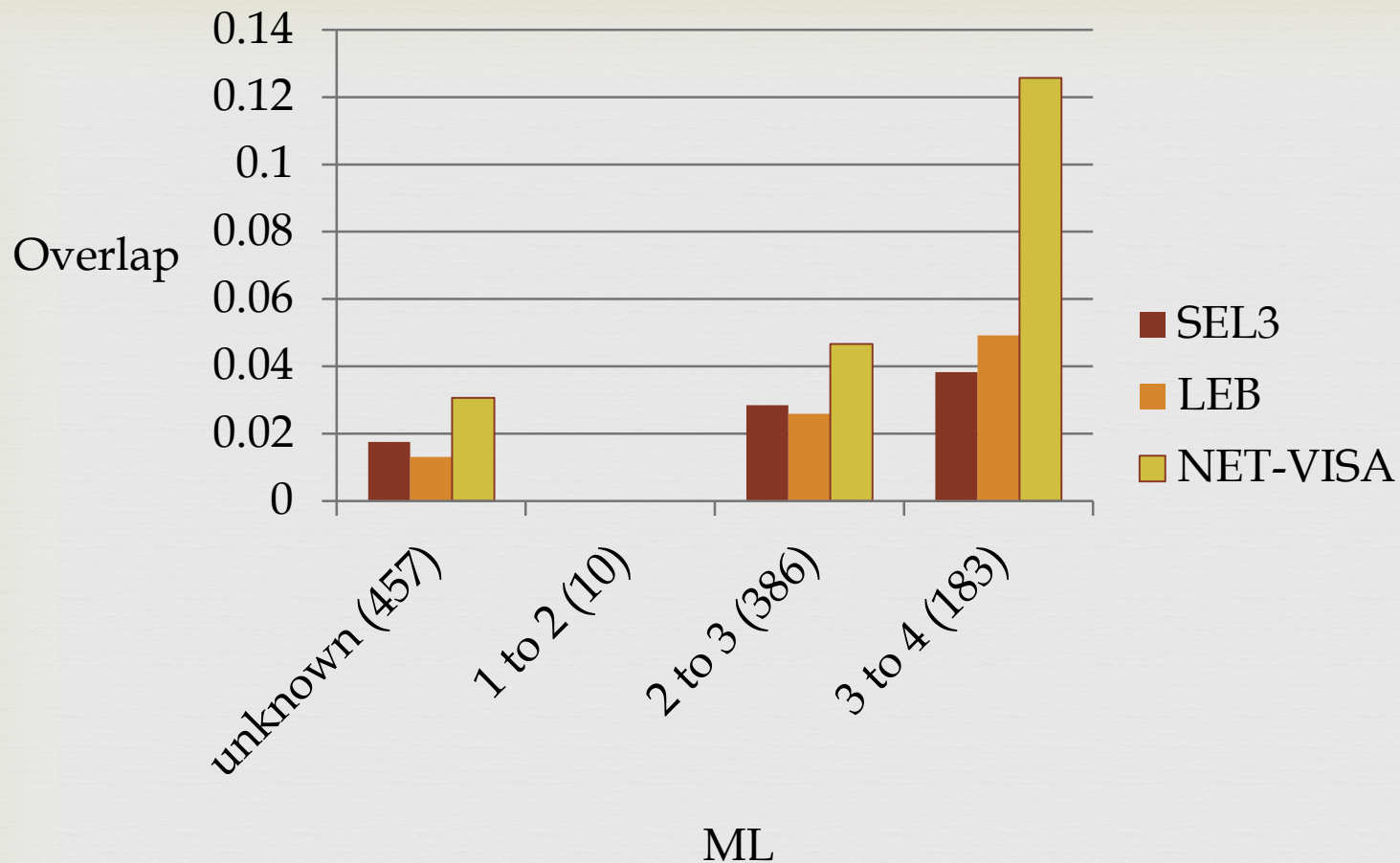
# Daily Results

Reference Bulletin: REB. Time Range: 2009/1/1 - 2010/1/1



— v1.2.4 : max\_arrival\_lag=6 hours : full 2009  
— SEL3

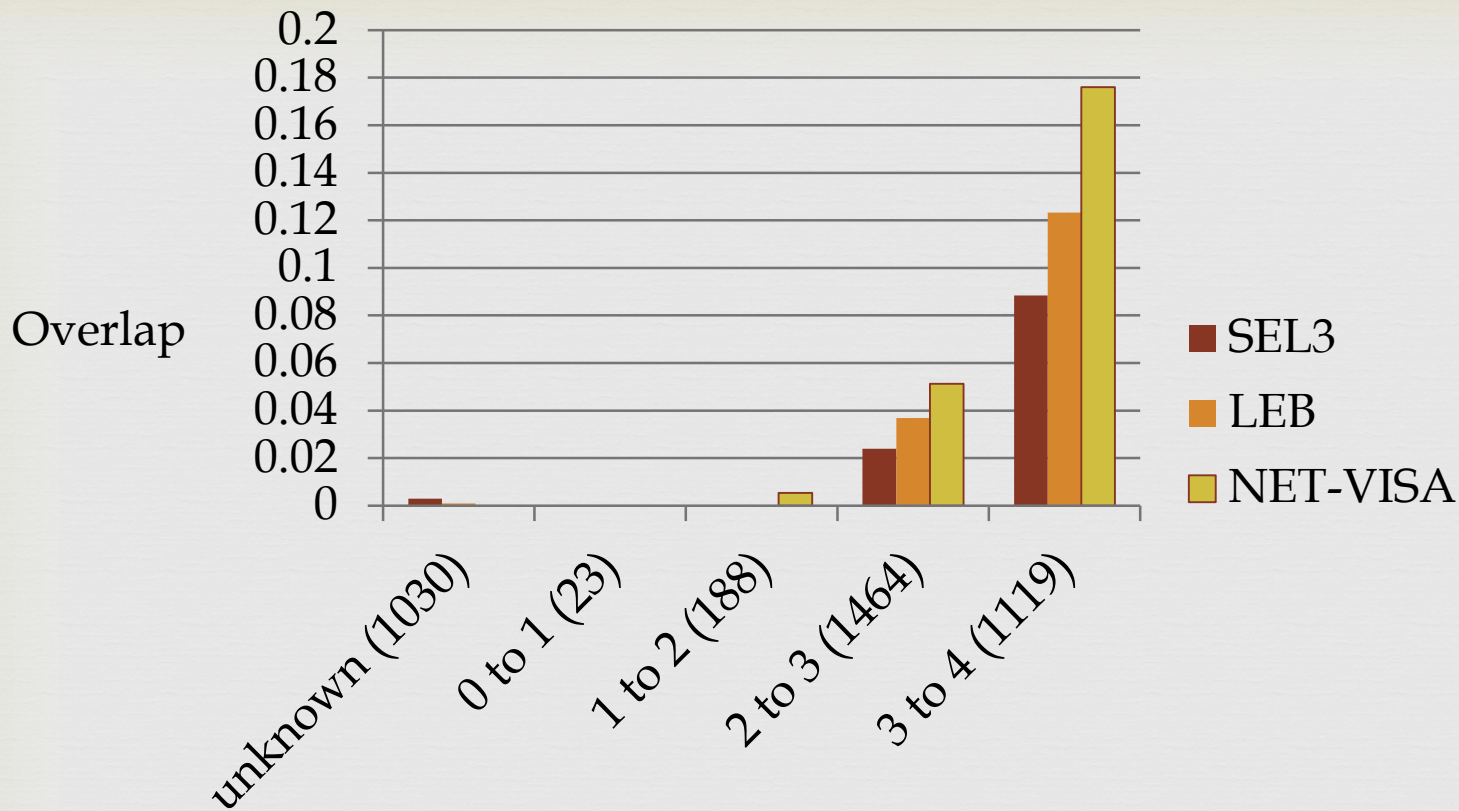
# REB as reference



## Comparison with NEIC over continental US

2009

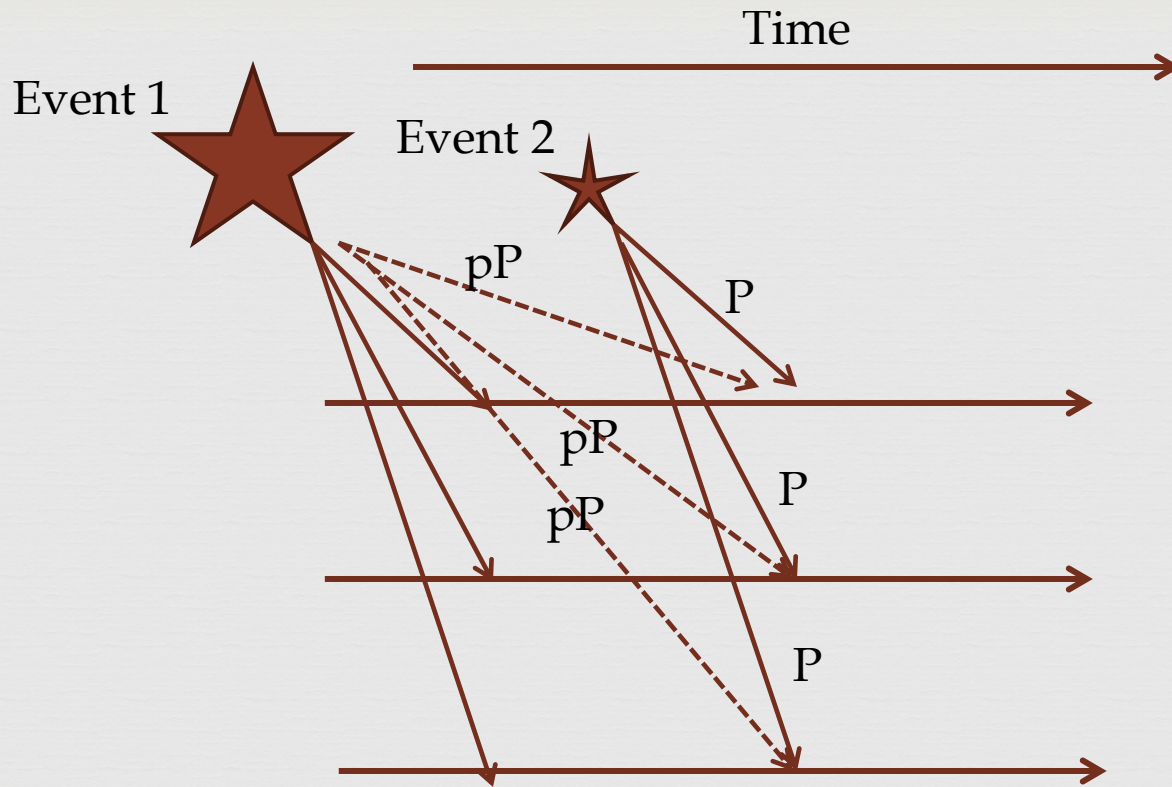
*Data made available from ISC (International Seismological Center)*



ML  
 Comparison with NNC (Kazakhstan) over  
 Central Asia (events less than ML 4)

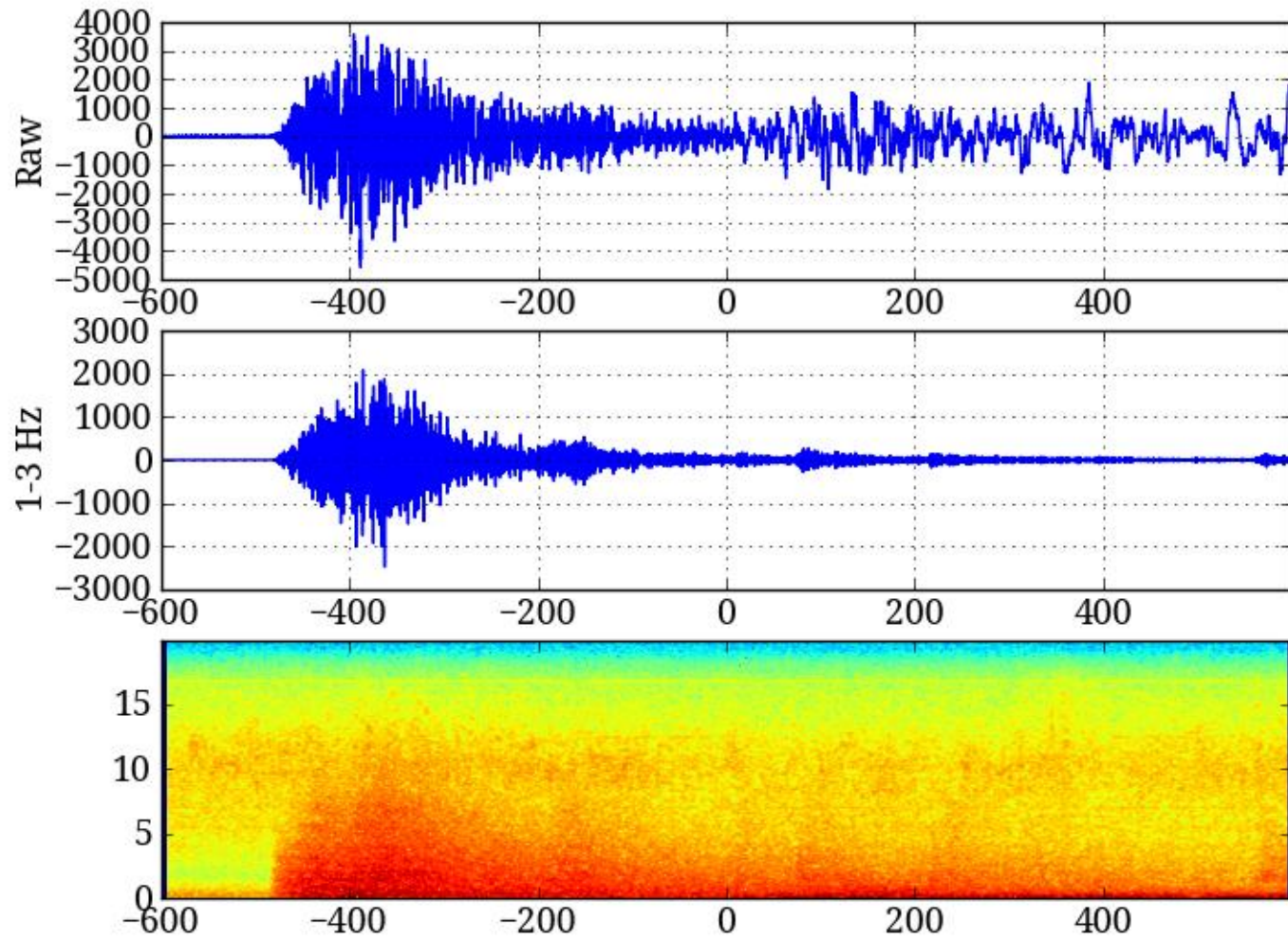
2009

*Data made available from ISC (International Seismological Center)*

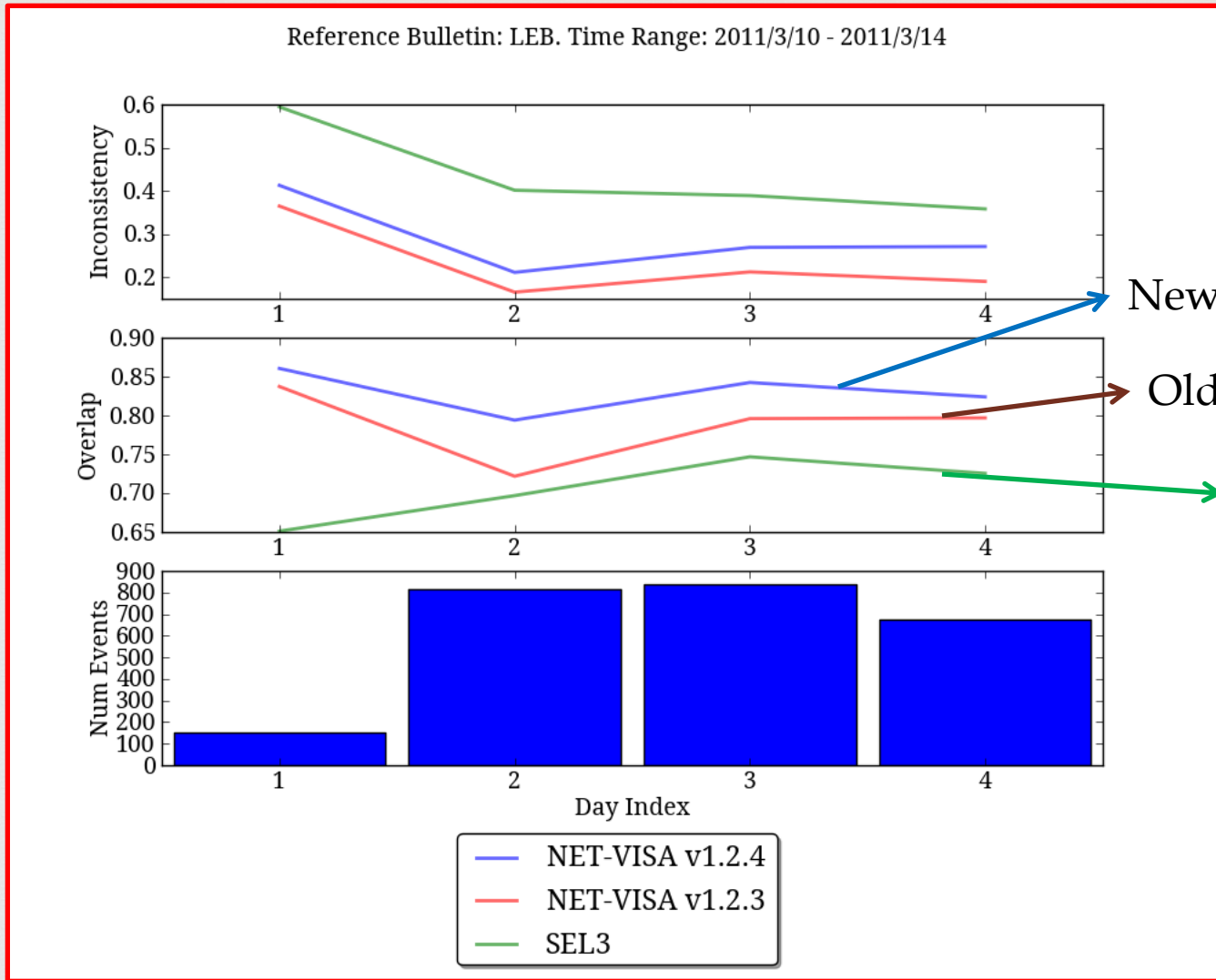


Challenges with Large Aftershocks (phase confusion)

ASAR -- BHZ -- 1299823484.0

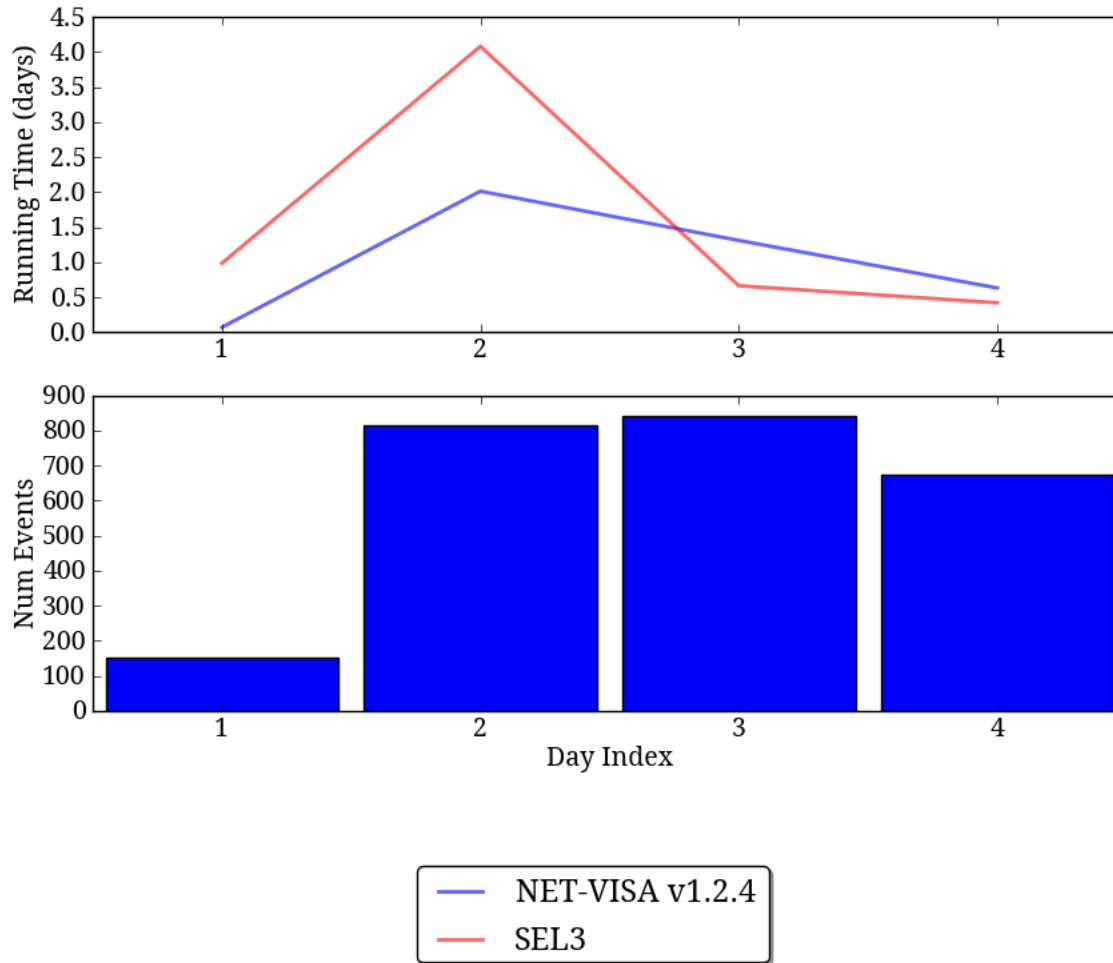


Missed Events Due to Missed Detections



Accuracy Improvement on Tohoku (day 2, 5:46)

Reference Bulletin: LEB. Time Range: 2011/3/10 - 2011/3/14



Running on Tohoku (day 2, 5:46)



# Conclusion



- ❧ Generative probabilistic model of global-scale physics.
  - ❧ Motivated by physics and calibrated by empirical observations
- ❧ More accurate results
  - ❧ Better overlap with REB and LEB than GA/SEL3
  - ❧ Better overlap with regional bulletins
- ❧ Improved accuracy on large aftershocks
- ❧ Fast, Parallel inference