### Using ISC data to image Earth's Interior



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# The ISC collects and distributes the largest set of P-wave travel time arrivals

### Data is collected from over 130 agencies worldwide

- ISC bulletin constitutes an enormous human effort.
- Measurements are contributed by analysts working at agencies across the globe.
- Contributed arrival-time measurements are associated to seismic events.
- Bulletin locations and arrival data are manually reviewed.
- The bulletin contains a wealth of information.



# The ISC Ground True database provides a benchmark for location and travel time studies

Global database of over 7,400 events with well-characterized event locations and associated arrival-time measurements

- The ISC GT database consists of contributed information that is vetted by community experts.
- Does not provide sufficient data coverage for tomographic imaging.





# ISC data must be carefully reworked for use in tomography

- > Locations can be biased due to travel time prediction errors.
- Outlier travel time measurement can also lead to large location errors.
- Biased locations map to erroneous features in tomographic images.
- Engdahl, van der Hilst, and Buland (EHB, BSSA 1998) demonstrate the that the ISC bulletin can be improved by post processing.
  - Manual assessment of outliers beyond the efforts of ISC analysts

# "Patch" travel-time corrections reduce event location bias



Use of statistical distributions to identify phases





# LLNL developed a semi-automated method to simultaneously relocate events and assess data

Joint Probability function spanning

- Event locations
- Travel times
- Measurement precision
- Phase labels

#### Statistical model

$$p(o, x, T, W, \sigma, V, \tau \,|\, a, d, w)$$

Samples drawn using Markov-Chain Monte Carlo Method

- *o* = origin times
- x = locations
- T = phase travel times
- W = phase labels

τ

d

- $\sigma$  = measurement precisions (pick)
- V = measurement precisions (diff)
  - = travel time corrections
- *a* = arrival times (picks)
  - = differential arrival times
- w = input phase labels

# Relocation shifts epicenters by 6.8 km (median)

Epicenter shift distribution Epicenter shifts are not random! 200 Epicenter bias is particularly 180 20 problematic for tomography Epicenter shifts < N (km) 160 18 Epicenter shifts < N (km) studies. 16 140 14 Epicenter shifts are generally less than 12 120 10 10 km 100 8 6 Large epicenter shifts are most common 80 60 in subduction zones. 40 2000 4000 6000 8000 10000 12000 Event Number (ordered by epicenter shift) 20 0 60 6000 8000 10,0000 12,000 2000 4000 0 Event Number (ordered by epicenter shift) **30**° 0° Mean depth shifts 5.5 km Median origin time shift -30 -0.67 seconds 20km



# Bayesloc processing reduces residuals standard deviation by 21% (37% variance reduction)

Bayesloc processing:

- ~3% of data found to be outliers
- Standard deviation is reduced by 21% compared to single-event location
- Large regional-distance residuals remain

Tomography

- Further reduces residuals by 24%.
- Large reduction in regional-distance residuals



### Bayesloc processing results in smoother model and improved data fit



Example of differences between tomographic images using data sets for which event locations were determined using multiple-event and single-event (arrival times are identical)

Multiple-Event Location Tomography (LLNL-G3Dv3)



#### **Single-Event Location Tomography**



# Identifying new structures?

Tomography based on data set combining Bayesloc-processed P-wave data and S-wave data from U. Texas group



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## Summary

- > The ISC provides a valuable service to the seismic community.
  - Arrivals for some regional networks are only available to the general seismological community via the ISC.
  - Association of arrival-time observations with events is a painstaking process that most researchers are happy to have done at the ISC (modern algorithms may improve efficiency, e.g. NetVISA).
- ➢ ISC data is greatly enhanced by post-processing (e.g. EHB, Bayesloc).
  - Tomographic models using are smoother and data fit is improved when ISC events are relocated using Bayesloc.
  - ISC should consider transitioning post-processing procedures into routine processing.

