## From the earthquake cycle to mantle structure current and future uses of dense GPS

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## PY09: GNSS-derived Troposphere Delays \& Applications of IGS Products for Geodesy and Geophysics Research



## From the earthquake cycle to mantle structure current and future uses of dense GPS

- Using data from $\mathrm{O}\left(10^{3}\right)$ sites in Japan for inter-/co-/ post-seismic deformation associated with the 2011 Mw 9 Tohoku-oki, Japan earthquake
- Using Earthscope/PBO to image aseismic transients and their relationship to tremor
- Using dense networks to measure the response to ocean tidal loads and thus constrain depth variations in elastic and density parameters in the upper mantle.



## Seismogenic Behavior of Subduction Megathrusts

A sampling of important intertwined questions

- Do major seismogenic "asperities" only slip seismically?
$\frac{\mathbb{0}}{\boldsymbol{\omega}}$ - Do creeping segments only creep?
- Role of conditional stability (e.g., near trench)?
- What are the relationships between post-seismic creep, transients, tremor and seismicity (rate, repeat intervals, location...)?



1 sample/sec GPS observations - sidereally filtered


## 2011 Tohoku-Oki, Japan

 Co-seismic slip:- 1sec GPS, DART, seafloor geodesy
- 80 m peak slip over a small region
- M7. 8 aftershock


## Post-seismic afterslip:

- Total time $=1.5$ years
- Negligible overlap of co-/postseismic
- Post-seismic pattern ~constant


## Post-seismic (1.5 yrs)



## Inter-seismic


F. Ortega, Ph.D. thesis

## Slip transients and Tremor: Cascadia





## Finding Transients

- With no a priori information on the physical mechanisms responsible for transients, we cannot only assume time functions corresponding to specific physical descriptions, i.e. exponential or logarithmic decay
- Use a flexible time parameterization using functions that resemble our expectation of transients (over-complete dictionary of "behaviors")
- Secular and periodic components + integrated 3rd-order B-splines of different scales and center times (not orthogonal)
$\mathbf{G}_{\mathrm{NxP}}$

$\mathrm{m}_{\mathrm{Px} 1}$
$\mathbf{d}_{N \times 1}$

$$
\left[\begin{array}{c}
m_{0} \\
m_{1} \\
\vdots \\
m_{P-1}
\end{array}\right]=\left[\begin{array}{c}
d_{0} \\
d_{1} \\
\vdots \\
d_{N-1}
\end{array}\right]
$$

Penalize the \# of non-zero coefficients in $\mathbf{m}: \mathbf{m}=\operatorname{argmin}\|\mathbf{d}-\mathbf{G m}\|_{2}^{2}+\lambda\|\mathbf{m}\|_{0}$

## Sparsity-Promoting Regularization

- Penalize the number of non-zero coefficients in $\mathbf{m}$ :

$$
\mathbf{m}=\underset{\mathbf{m}}{\operatorname{argmin}}\|\mathbf{d}-\mathbf{G m}\|_{2}^{2}+\lambda\|\mathbf{m}\|_{0}
$$

where $\|\cdot\|_{0}=L_{0}$-pseudo-norm, or the "counting norm"

- Sparse-compression: represent time series by a small set of Bi-splines
- But using the Lo-pseudo-norm is a hard combinatorial problem
- Use $L_{1}$-norm relaxation (iterative reweighting) to make problem convex (Candes et al., 2007):

$$
\begin{aligned}
\mathbf{m} & =\underset{\mathbf{m}}{\operatorname{argmin}}\|\mathbf{d}-\mathbf{G m}\|_{2}^{2}+\lambda\|\mathbf{m}\|_{1} \\
\|\mathbf{m}\|_{1} & =\sum_{i}\left|m_{i}\right|
\end{aligned}
$$

## Slip transients and Tremor: Cascadia





## Spatial Sparsity Weighting for Cascadia




## ALBH GPS Time Series

- Use sparsity-promoting regularization to fit time series and determine elements of $\mathbf{m}$ with the largest amplitudes (effectively we are compressing the data)
- Form reduced $\mathbf{G}$ and estimate reduced $\mathbf{m}$ using standard least squares:

$$
\tilde{\mathbf{m}}=\left(\tilde{\mathbf{G}}^{\top} \mathbf{C}_{d}^{-1} \tilde{\mathbf{G}}\right)^{-1} \tilde{\mathbf{G}}^{\top} \mathbf{C}_{d}^{-1} \mathbf{d}
$$


$\leftarrow$ Episodic SSE reconstruction with only 6 Bi-splines
$\leftarrow$ Bi-spline scalogram: Localized, high amplitudes for short duration Bi-splines

## Posterior Uncertainties

- Standard least squares formulation allows for estimation of posterior covariances for Bi-spline coefficients:

$$
\tilde{\mathbf{C}}_{m}=\left(\tilde{\mathbf{G}}^{\top} \mathbf{C}_{d}^{-1} \tilde{\mathbf{G}}\right)^{-1}
$$

- Extend to posterior covariances for data fit:

$$
\tilde{\mathbf{C}}_{d}=\tilde{\mathbf{G}} \tilde{\mathbf{C}}_{m} \tilde{\mathbf{G}}^{\top}
$$



$\leftarrow$ Posterior data covariance matrix for modeled transient displacement

## Cascadia 2010 SSE: Slip rate + tremor



Analysis and models: Bryan Riel

## Issues (not addressed today)

- Controls on location and temporal evolution? Role of fluids? Ubiquitous, yes/no/why?
- Relationship to regions of big EQ and eventual post-seismic deformation?
部 Relationship to forearc/slab structure?


## Approach

- Detect/reconstruct/model transient ground deformation in GPS time series due to SSE using sparsity-based approaches
- Time-dependent slip using Network Inversion Filter: Segall and Matthews (1997)
- Slab interface: McCrory et al. (2004)
- Tremor epicenter locations: Pacific Northwest Seismic Network (http://www.pnsn.org/tremor)


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## Measuring OTL response with dense GPS networks

0.00 hours


## OTL response as an opportunity: Constraining properties of the upper mantle



## Next

- Confirm with much longer time series
- Improve estimates of positions
- Explore sensitivity to:
- Newer OTL models
- Approach to removing solid earth tides
- Improve geodynamical interpretation
- Explore other regions (1D)
- Go to 3D

For each cGPS site, we should establish empirical tidal corrections and use to improve transient detection

Ito \& Simons, 2011

M2 Tide Predictions 0.00 hours


# M2 Tide Observations 0.00 hours 



## Observations

## Forward Model

## Residuals

## PREM \& FES2012





## Goal: Elastic and density structure of a craton

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- Tohoku-oki
- Relatively constant pattern of post-seismic after slip (with notable exceptions)
- Lack of overlap between co-seismic/post-seismic distribution of fault slip
- Consistency of co-seismic and inter-seismic
- Consistency of co-seismic and post-seismic
- Importance of high-rate GPS (and in near real time)
- Cascadia aseismic transients
- New rigorous methods for automatic transient detection based on sparsity and overcomplete dictionaries.
- Slip transients and tremor co-located in space and time
- OTL load response to probe upper mantle structure
- Ability to separate depth variation of density and elastic moduli.
- Needs careful analysis of sensitivity to processing approach


