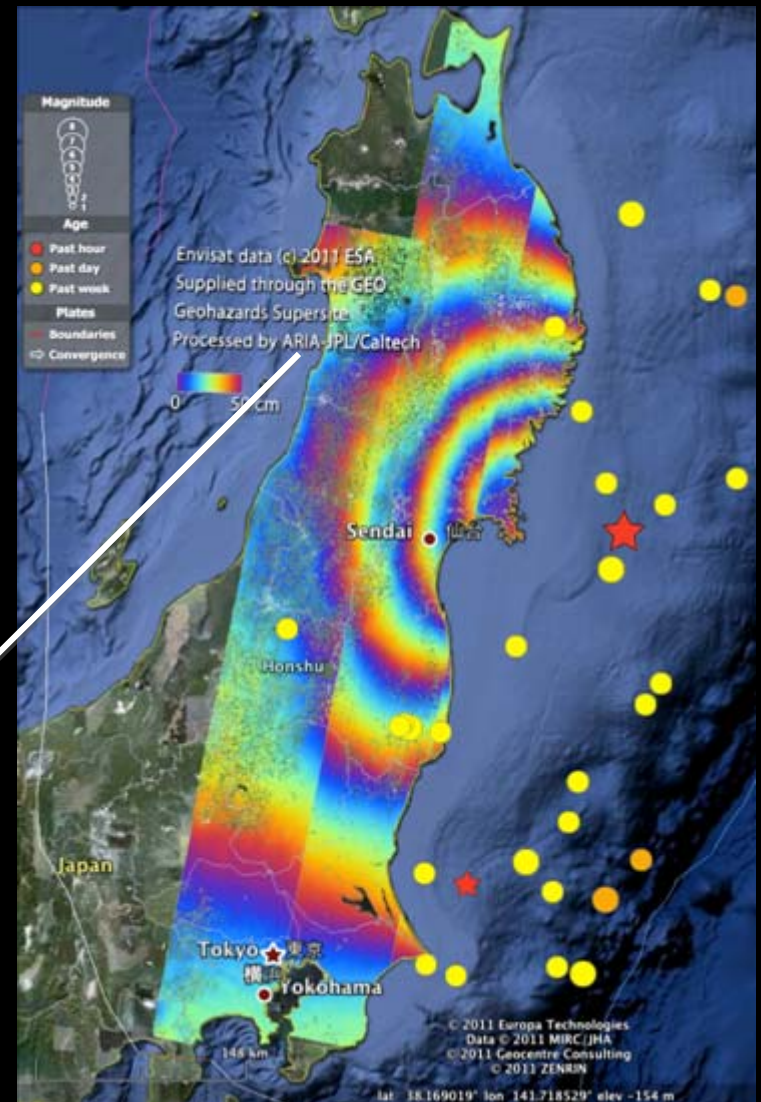


Damage Proxy Map of February 2011 M6.3 Christchurch Earthquake using InSAR Coherence

Sang-Ho Yun¹, Eric Fielding¹, Mark Simons², Piyush Agram², Paul Rosen¹, Susan Owen¹, Frank Webb¹

1. Jet Propulsion Laboratory
2. California Institute of Technology

ARIA (Advanced Rapid Imaging Analysis) project at JPL and Caltech



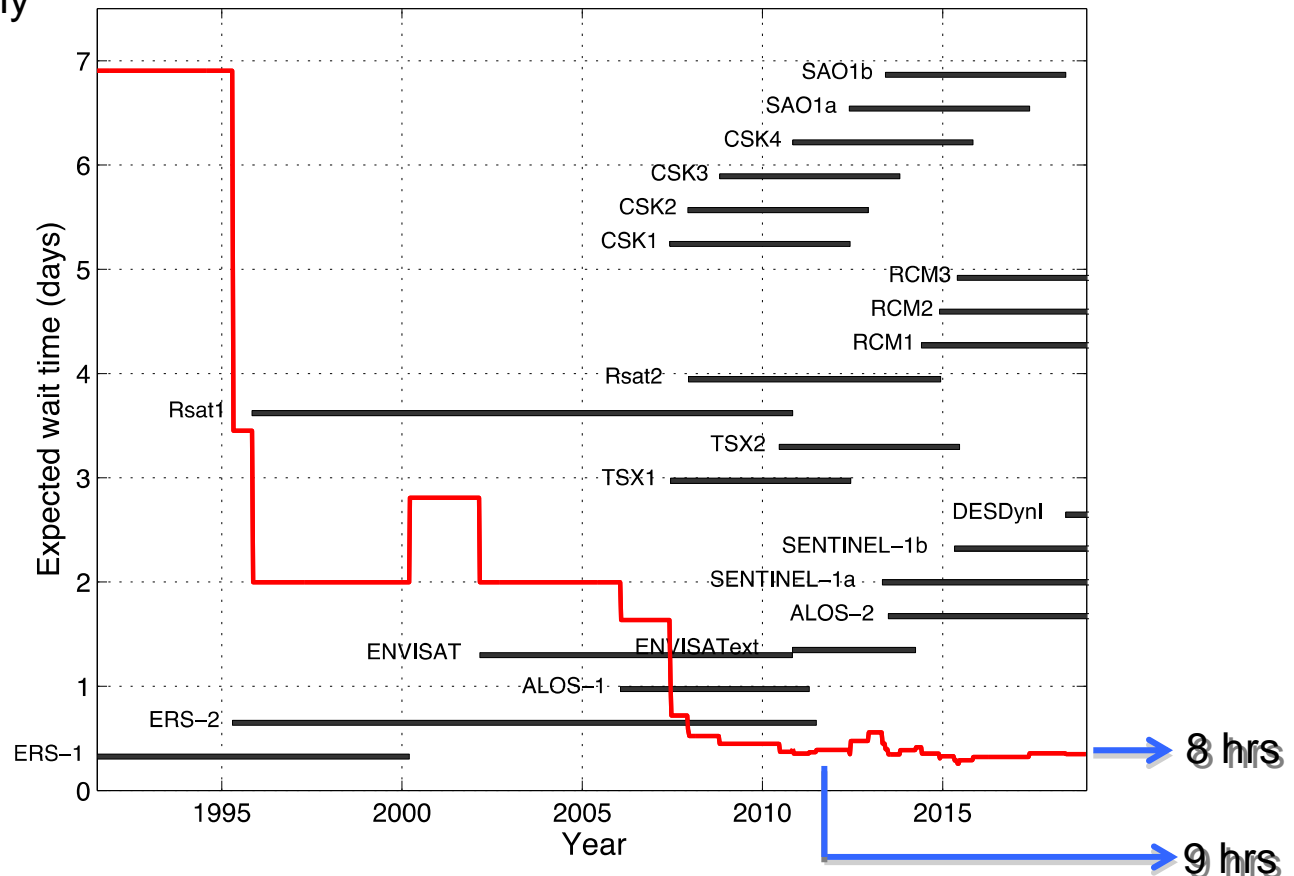
National Aeronautics and
Space Administration

Jet Propulsion Laboratory
California Institute of Technology



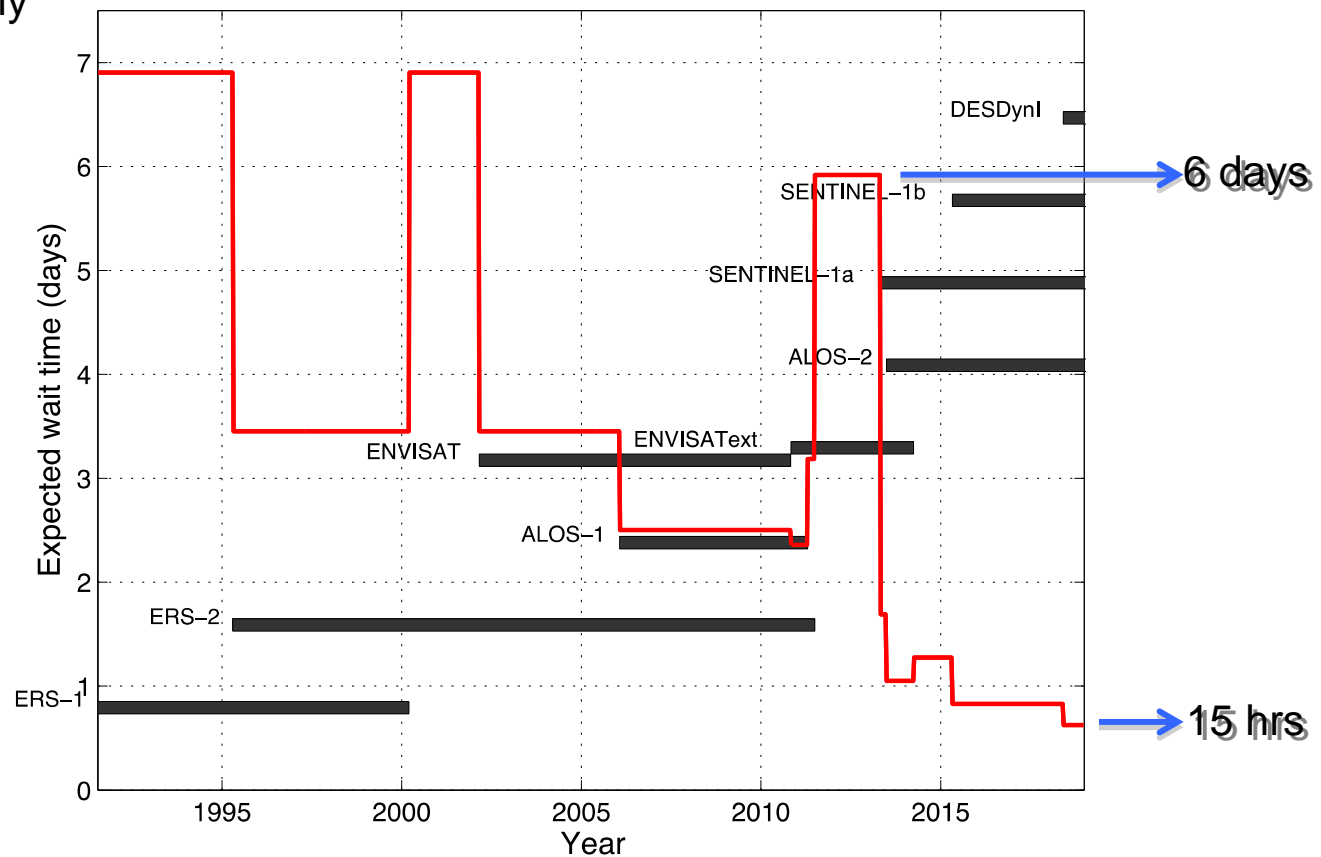
Expected Wait Time for the first SAR satellite to visit after an event

- Ascending + Descending
- Right-looking only
- At 38° N



Expected Wait Time for the first SAR satellite to visit after an event

- Ascending + Descending
- Right-looking only
- At 38° N



Damage Proxy Map of February 2011 M6.3 Christchurch Earthquake using InSAR Coherence

Outline

History and Concept

Algorithm Test: Pasadena Demolition (IEEE TGRS, in prep)

Application: Christchurch EQ

Conclusions and Future Work



History

Zebker and Villasenor, “Decorrelation in Interferometric Radar Echoes,” IEEE TGRS, 1992. → Cited by 764 papers

Zebker et al., “Analysis of active lava flows on Kilauea volcano, Hawaii, using SIR-C radar correlation measurements,” Geology, 1996.

Fielding et al., “Surface ruptures and building damage of the 2003 Bam, Iran, earthquake mapped by satellite synthetic aperture radar interferometric correlation,” JGR, 2005.

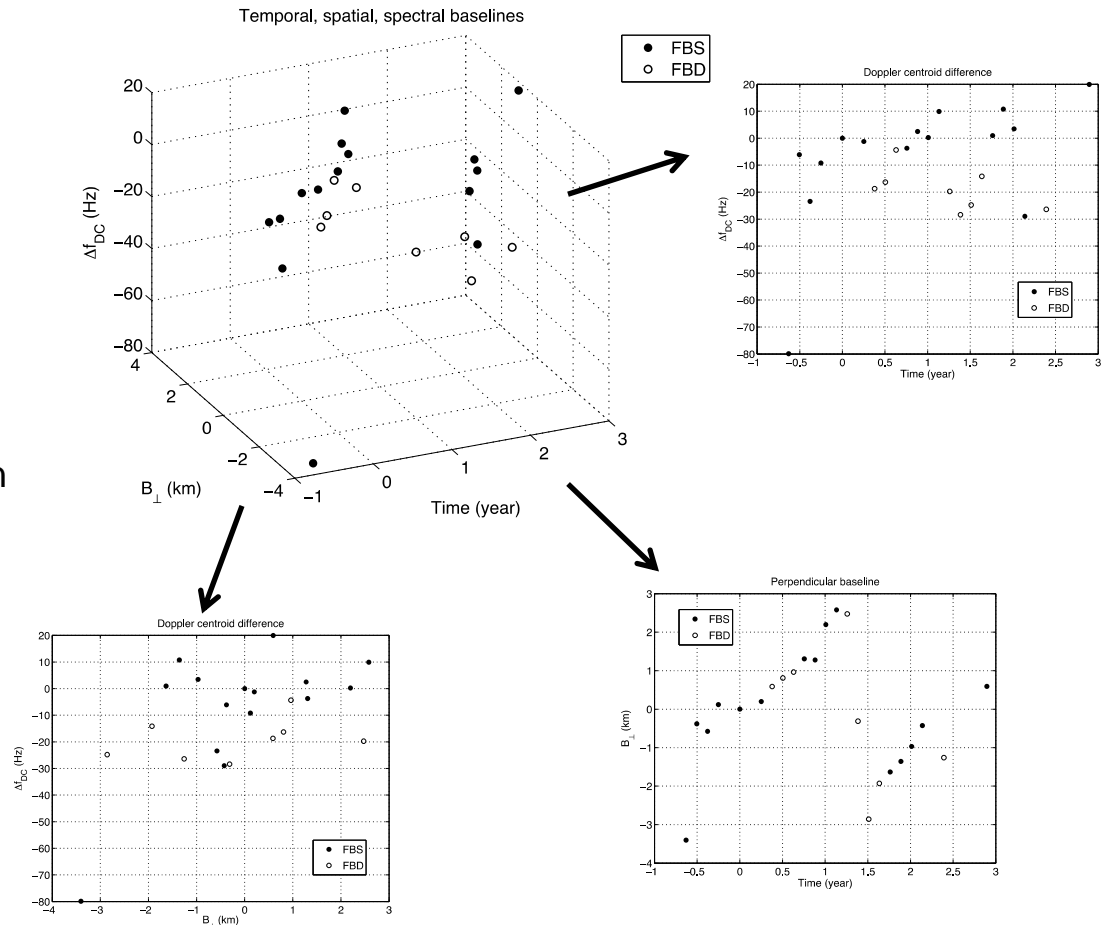
Hoffmann, “Mapping damage during the Bam (Iran) earthquake using interferometric coherence,” IJRS, 2007.

Controlling Parameters

Interferometric coherence

$$\gamma = \frac{|\langle c_1 c_2^* \rangle|}{\sqrt{\langle c_1 c_1^* \rangle \langle c_2 c_2^* \rangle}}, \quad 0 \leq \gamma \leq 1$$

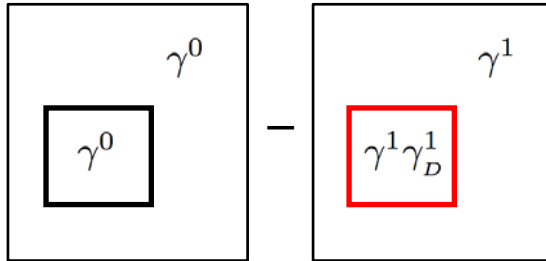
$$\gamma = \underbrace{\gamma_{B_p} \gamma_{B_t} \gamma_{B_f}}_{\text{baselines}} \underbrace{\gamma_V}_{\text{volume scattering}} \underbrace{\gamma_K}_{\text{thermal noise}} \underbrace{\gamma_P}_{\text{processing}}$$



Concept: Damage Decorrelation

Damage coherence: γ_D

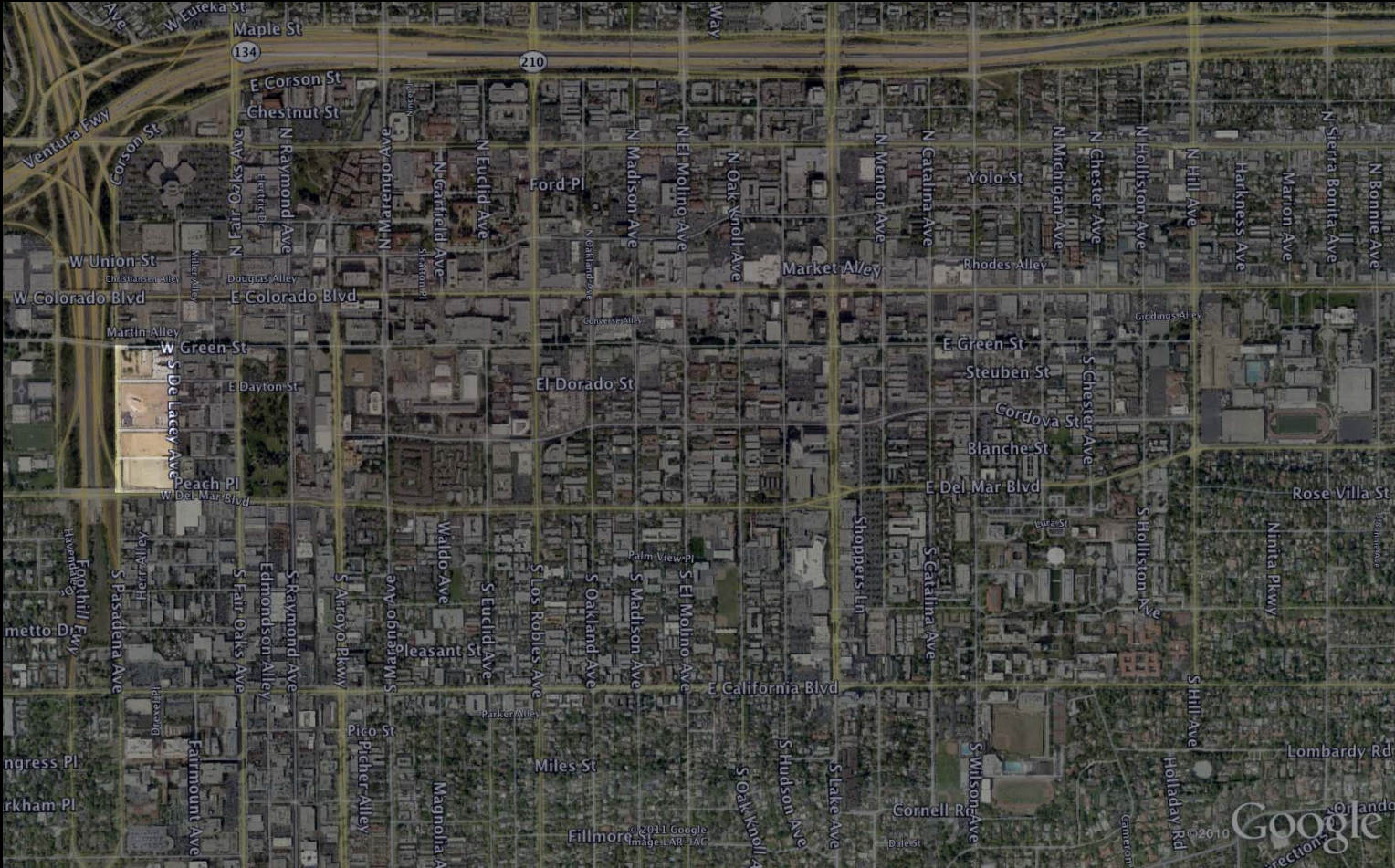
Damage decorrelation: $1 - \gamma_D$



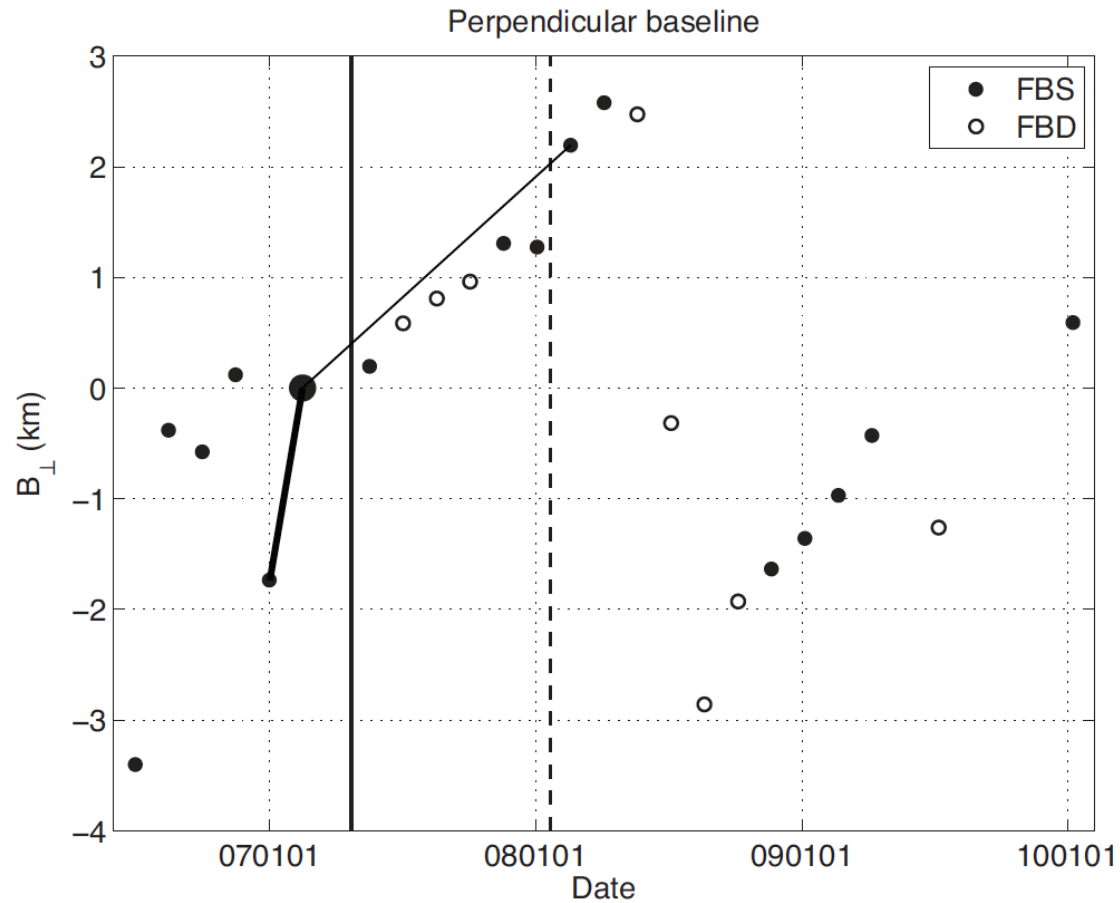
$$\begin{aligned}\Delta\gamma &= \gamma^0 - \gamma^1 \gamma_D^1 \\ &= (1 - \gamma_D^1) \gamma^0 + (\gamma^0 - \gamma^1) \gamma_D^1\end{aligned}$$

Objective: Spatially isolate damage decorrelation for automatic detection

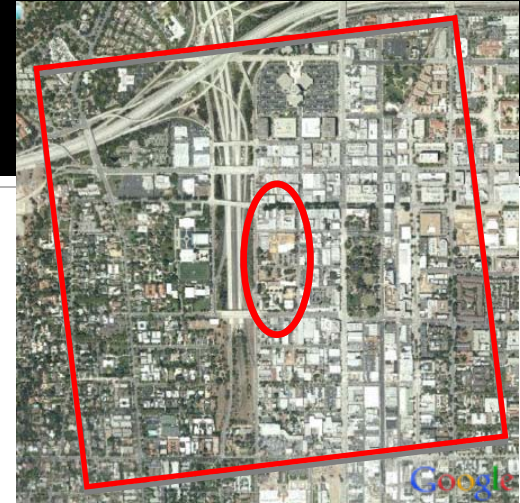
Algorithm Test: Pasadena Building Demolition Project (IEEE TGRS, in prep)



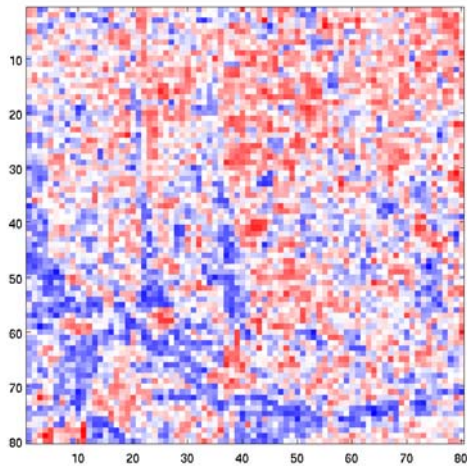
Data: ALOS PALSAR



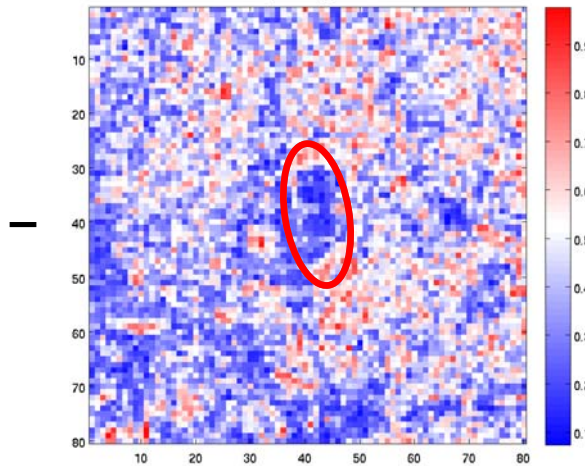
Simple Difference



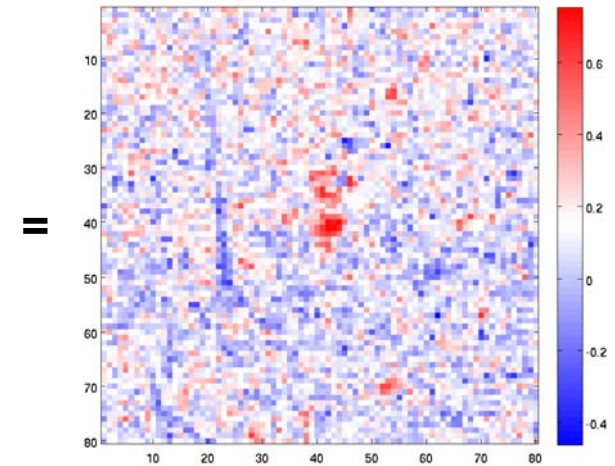
Correlation before the demolition



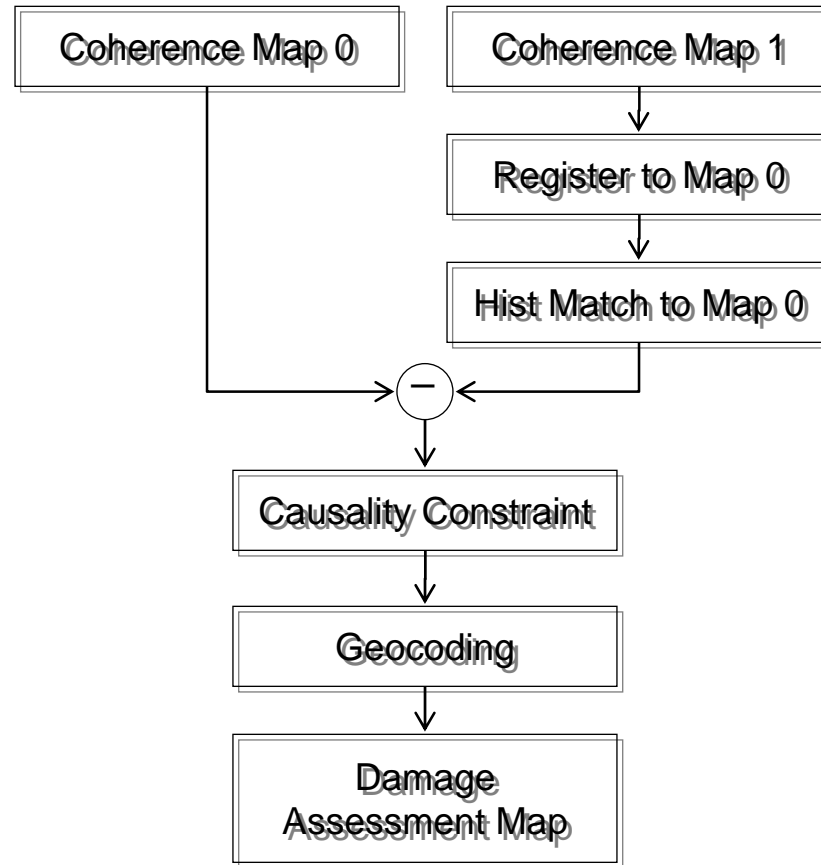
Correlation spanning the demolition



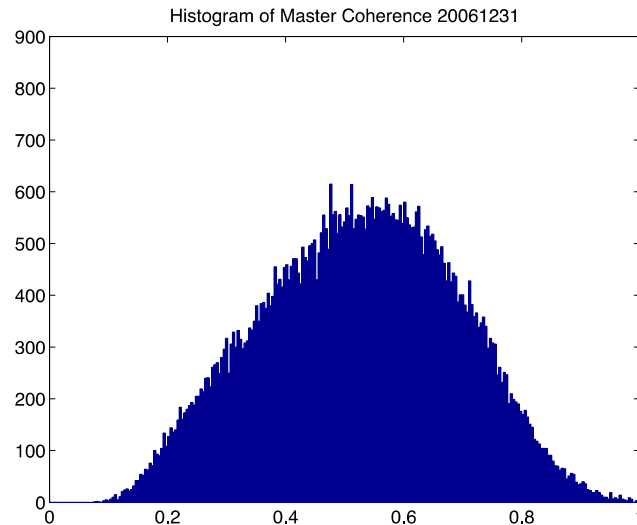
Decorrelation of the demolition site



Workflow



Histogram Matching (Coltuc et al., IEEE TIP 2006)



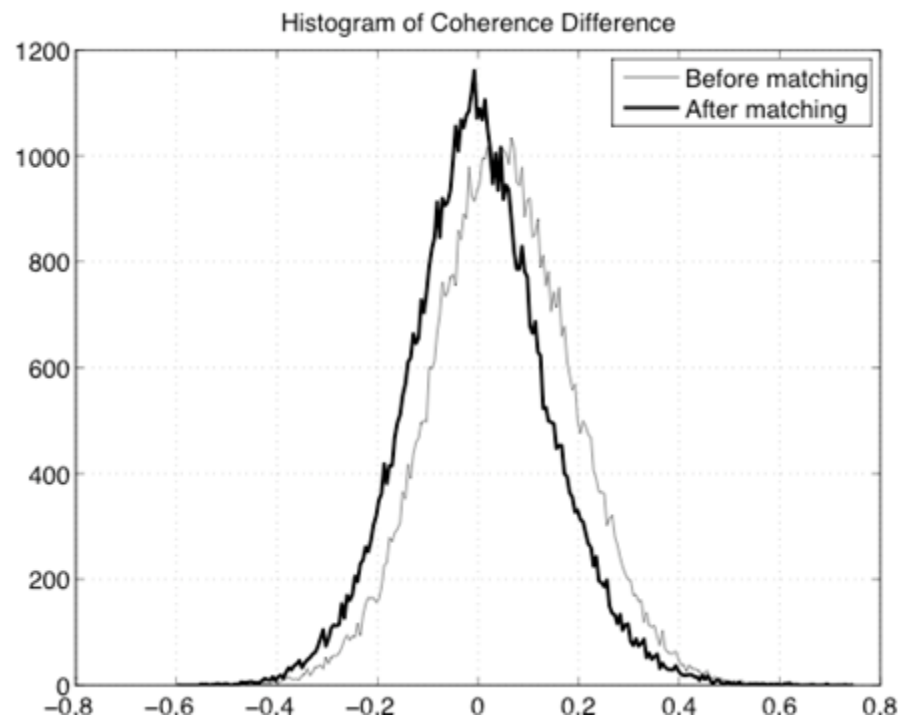
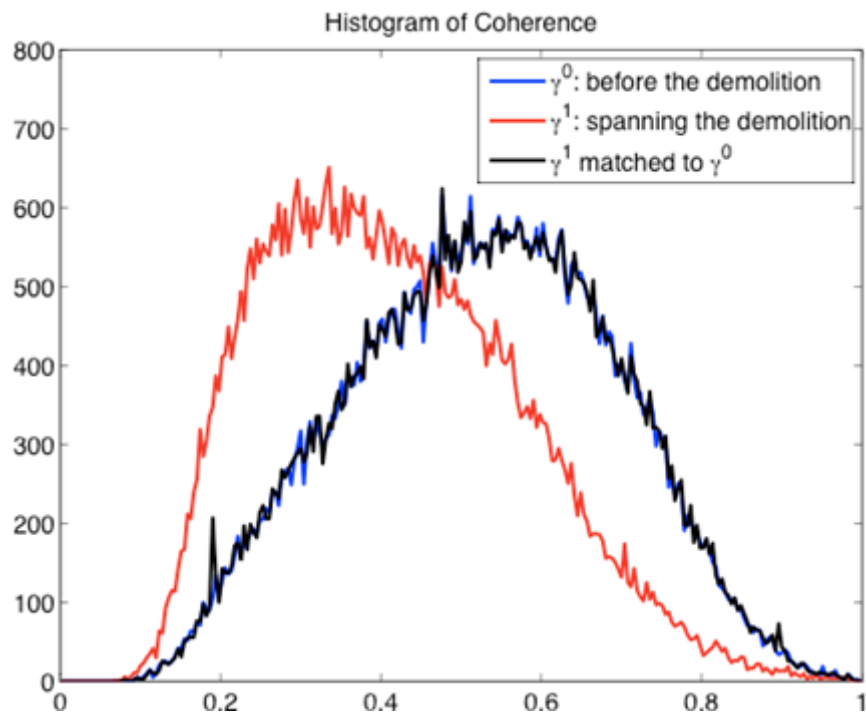
$$F_X(x) = P\{X \leq x\} = \int_{-\infty}^x p_X(r) dr$$

$$F_Y(y) = P\{Y \leq y\} = \int_{-\infty}^y p_Y(r) dr$$

$$\begin{aligned} F_Y(y) &= P\{Y \leq y\} \\ &= P\{F(X) \leq y\} \\ &= P\{X \leq F^{-1}(y)\} \\ &= F(F^{-1}(y)) = y, \quad \text{for } 0 \leq y \leq 1 \end{aligned}$$

- For a continuous random variable X , $Y = F_X(X)$ is another continuous random variable that has a uniform distribution in $[0, 1]$.
- Thus, it follows that if a random variable Y has a uniform distribution in $[0, 1]$, then $X = F_X^{-1}(Y)$ has a pdf of $p_X(X)$.
- Therefore, $X = F_X^{-1}(F_Y(Y))$ follows $p_X(X)$, where X : master coherence, Y : slave coherence

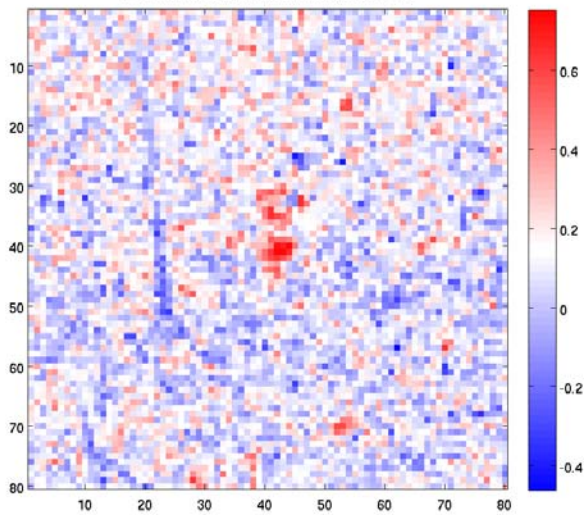
Histogram matching removes bias



Results

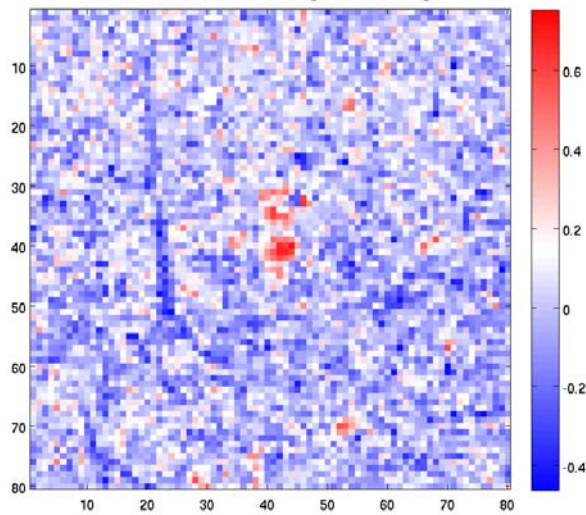
Simple Difference
SNR = 17.3

Decorrelation of the demolition site



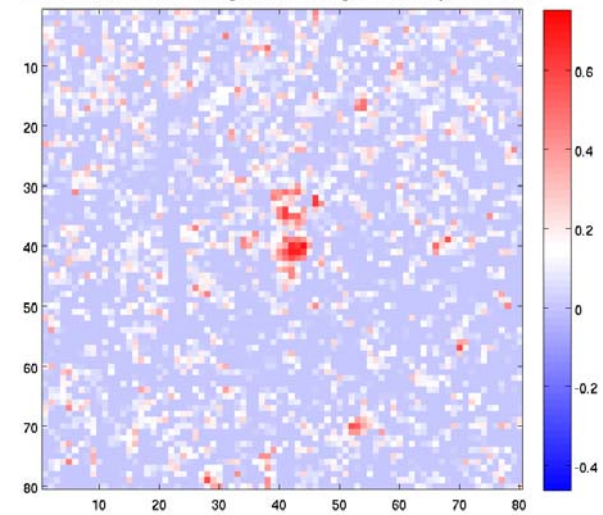
Histogram Matching
SNR = 23.1

Decorrelation after histogram matching

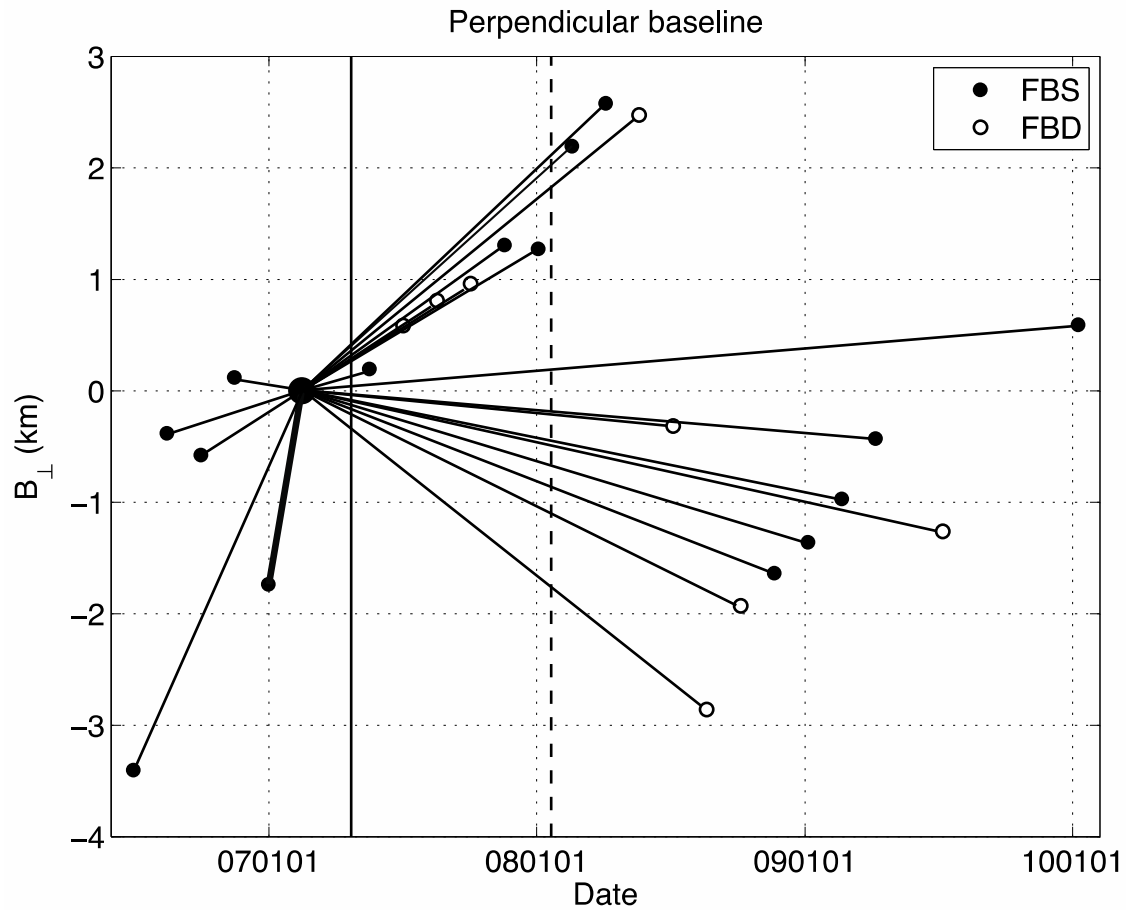


Causality Constraint
SNR = 44.6

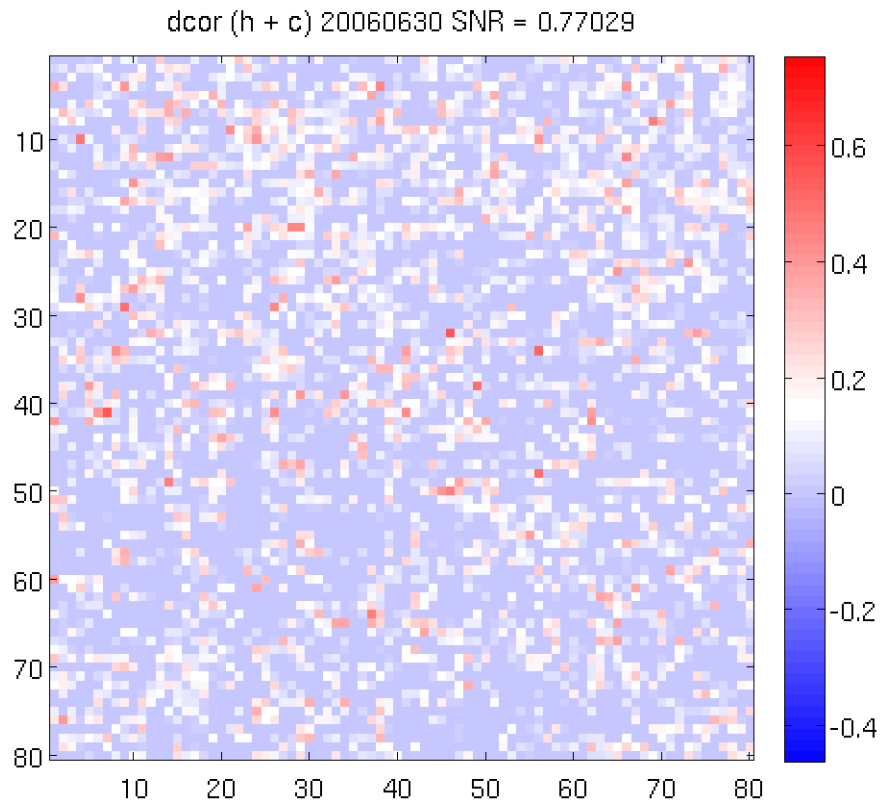
Decorrelation after histogram matching + causality constraint



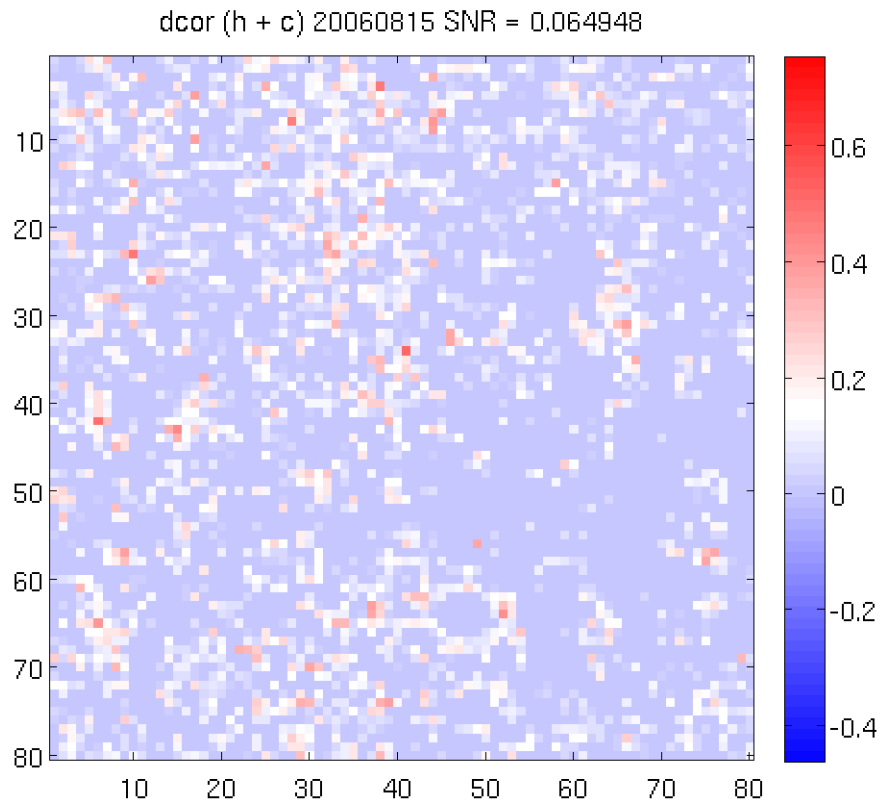
Pairing Scheme for Coherence Change Time Series



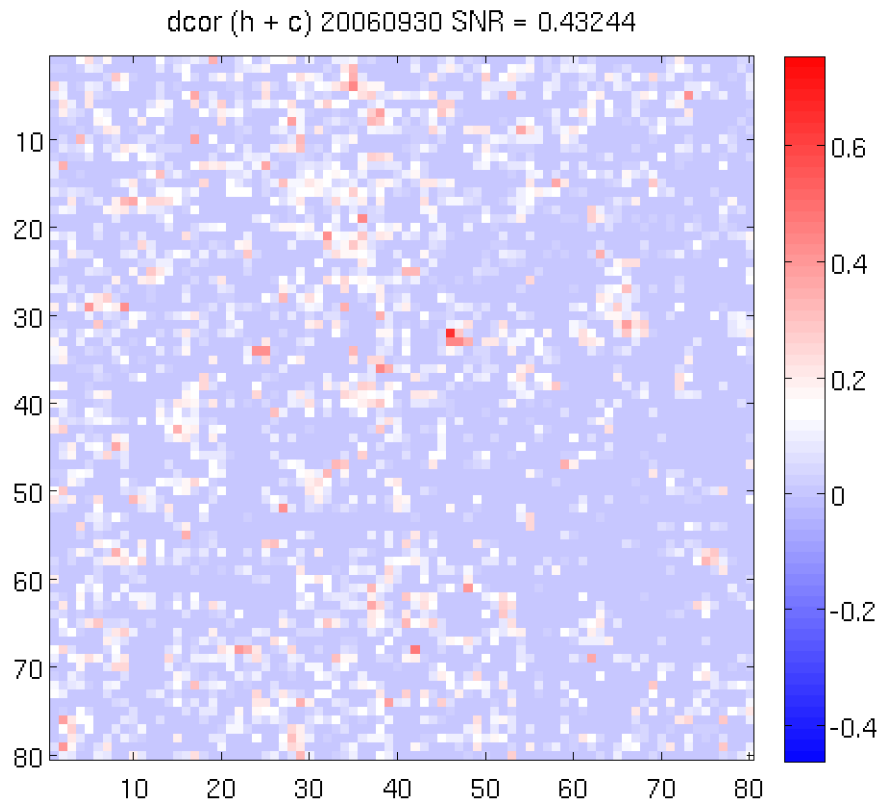
Time Series of Interferometric Coherence Difference



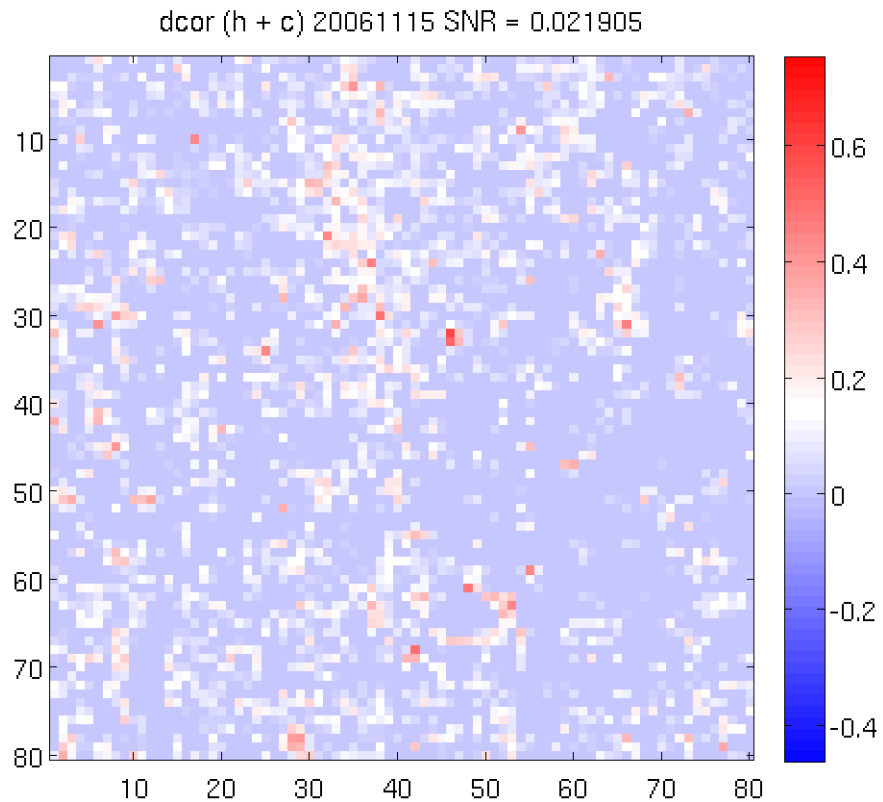
Time Series of Interferometric Coherence Difference



Time Series of Interferometric Coherence Difference



Time Series of Interferometric Coherence Difference

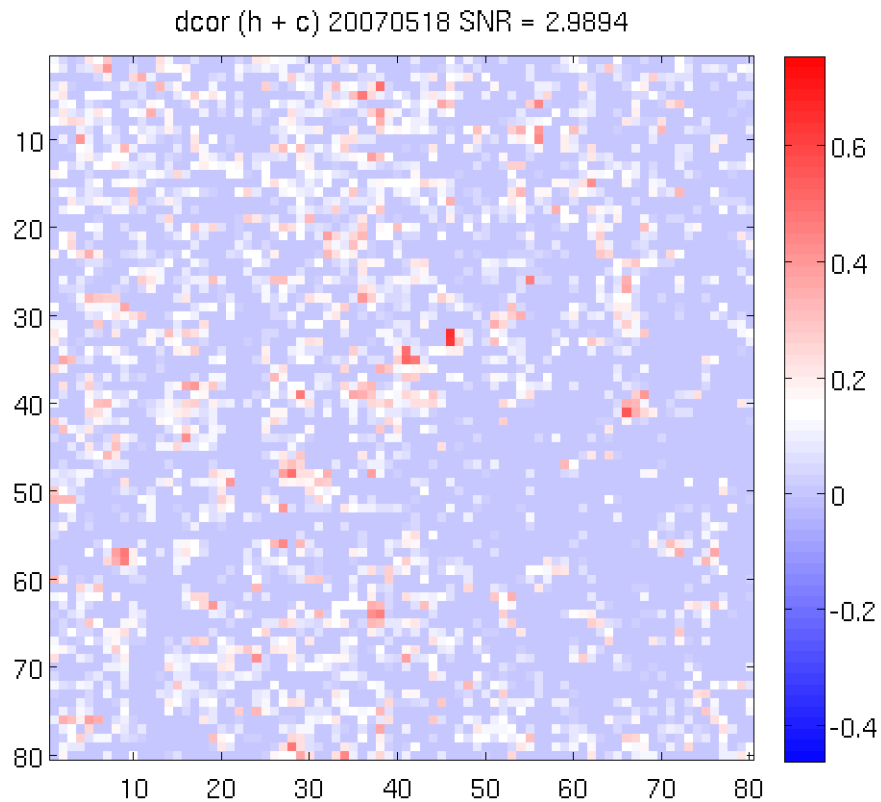


Time Series of Interferometric Coherence Difference

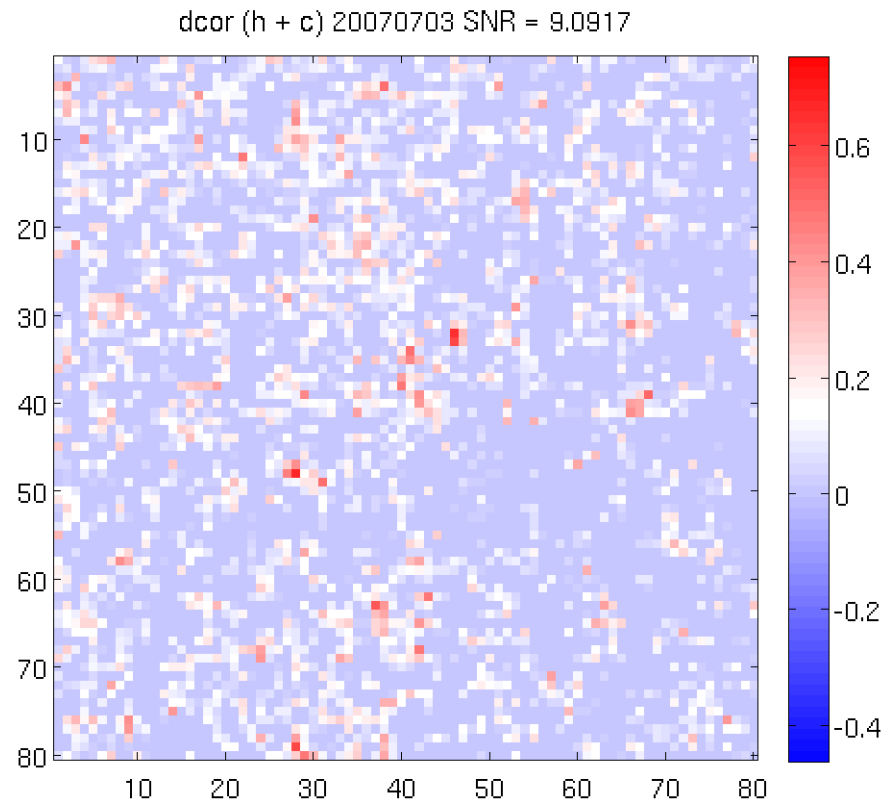
Demolition begins on 2007/04/23.



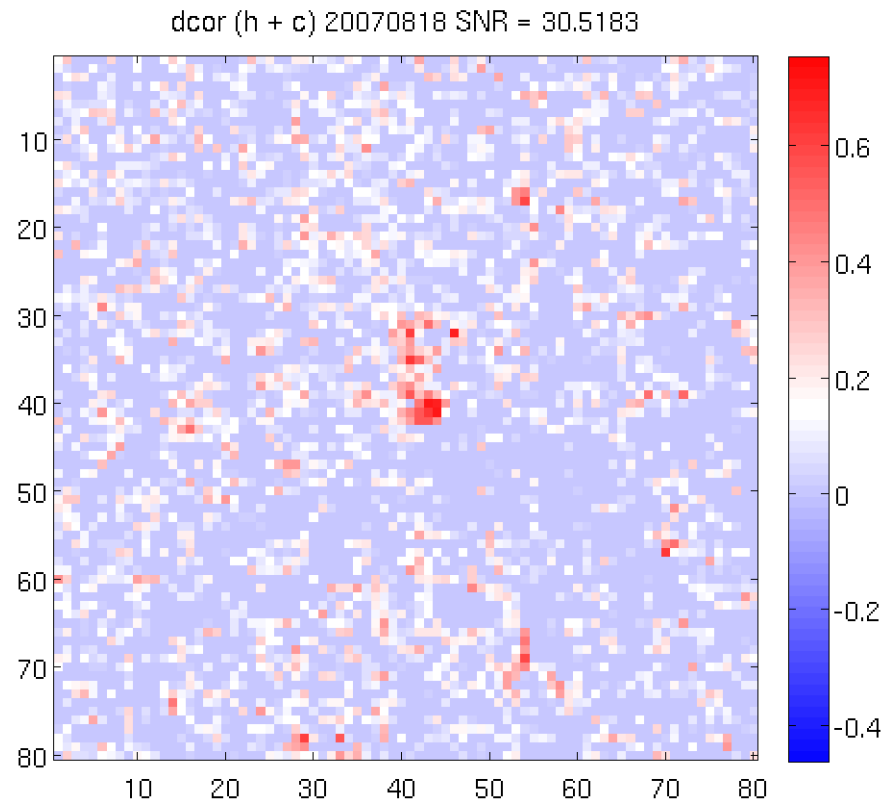
Time Series of Interferometric Coherence Difference



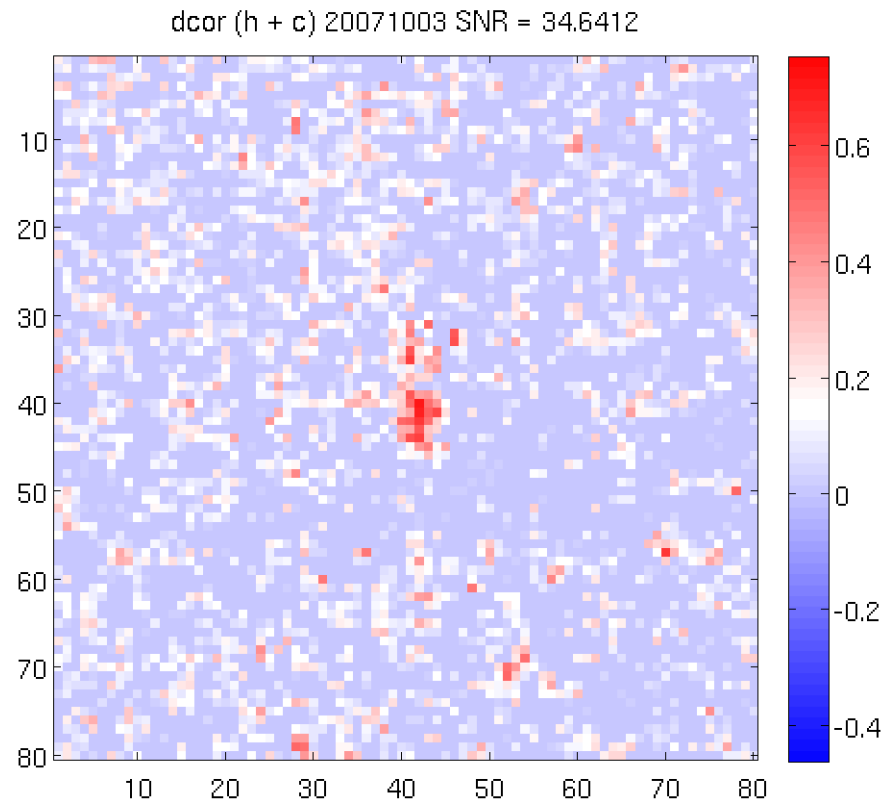
Time Series of Interferometric Coherence Difference



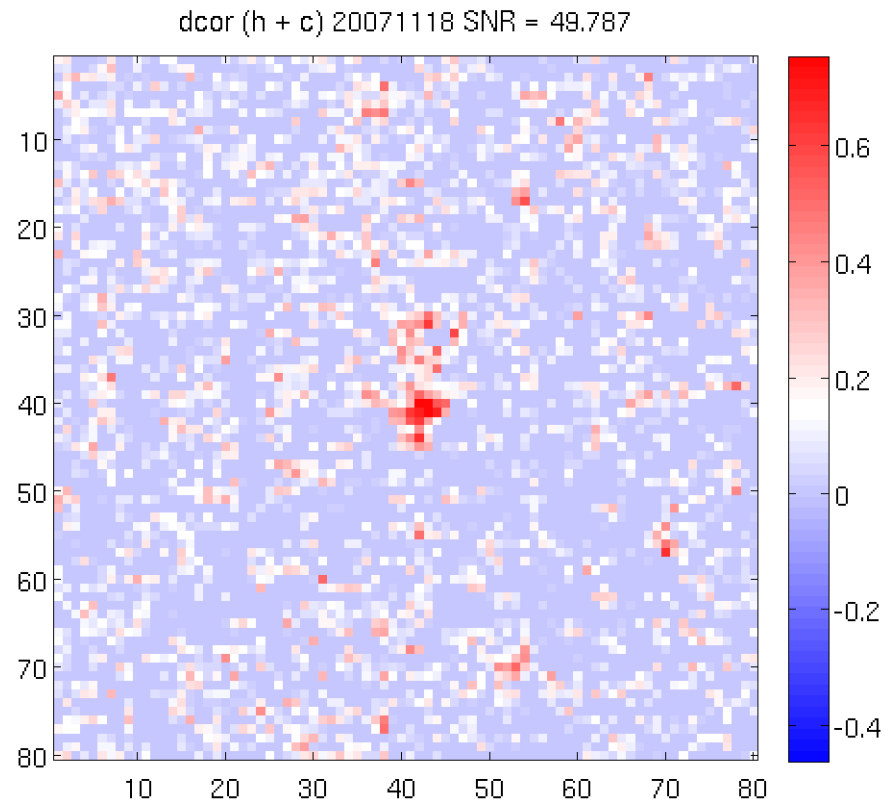
Time Series of Interferometric Coherence Difference



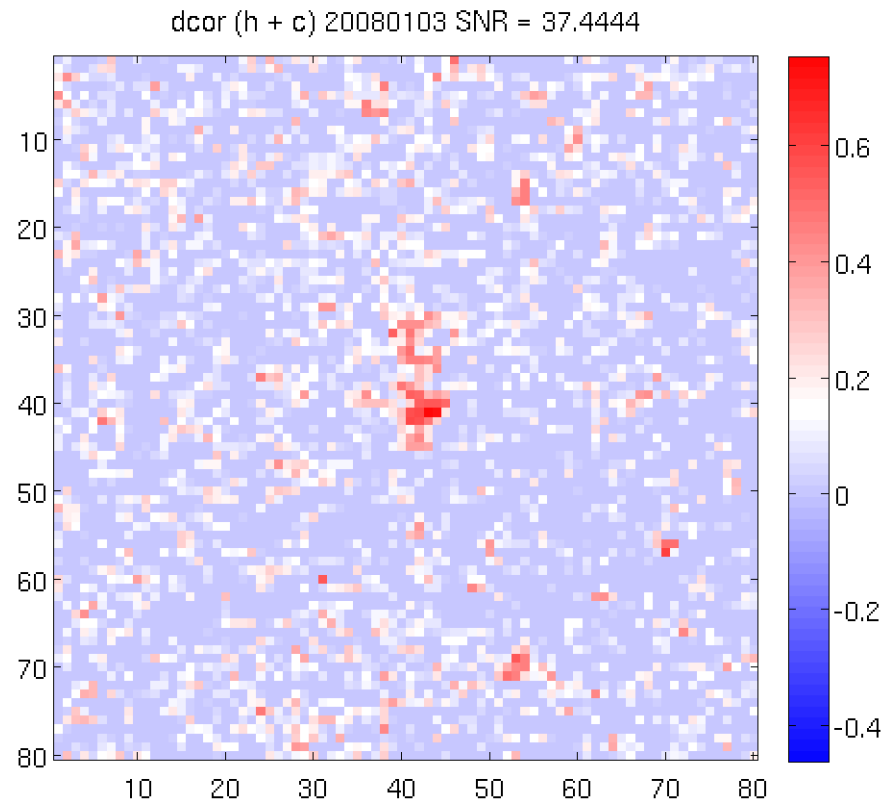
Time Series of Interferometric Coherence Difference



Time Series of Interferometric Coherence Difference



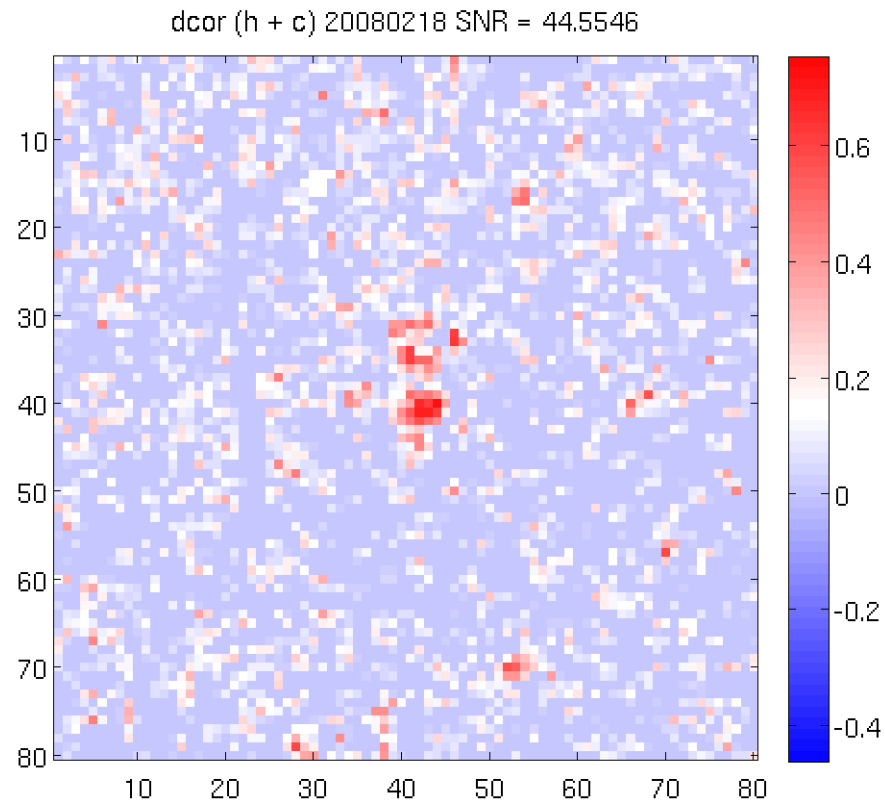
Time Series of Interferometric Coherence Difference



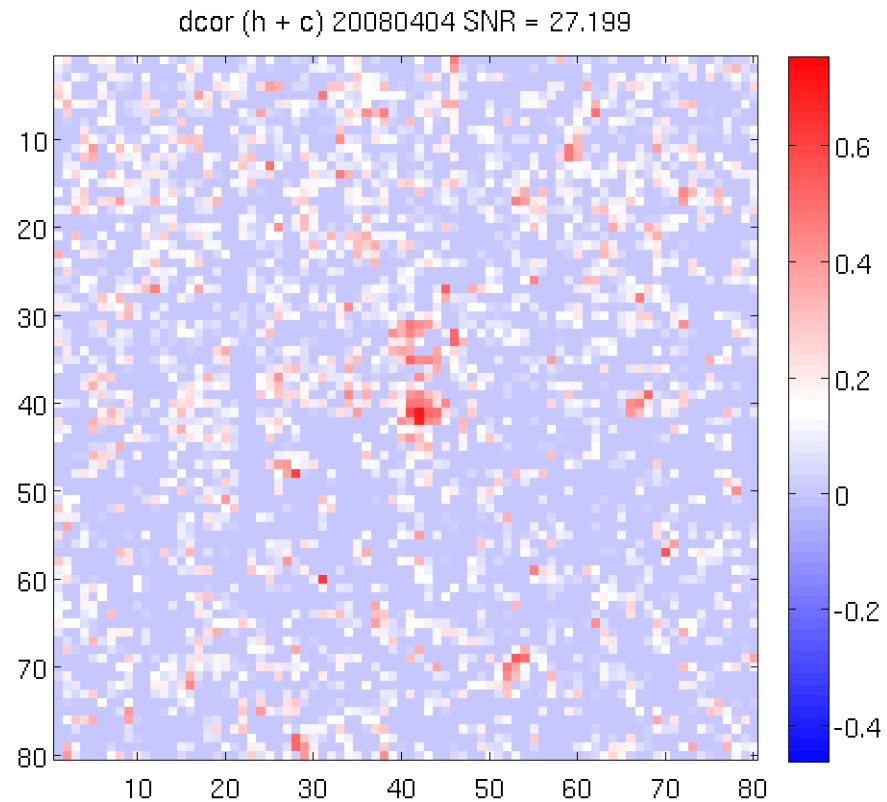
Time Series of Interferometric Coherence Difference

Demolition ends on 2008/01/22.

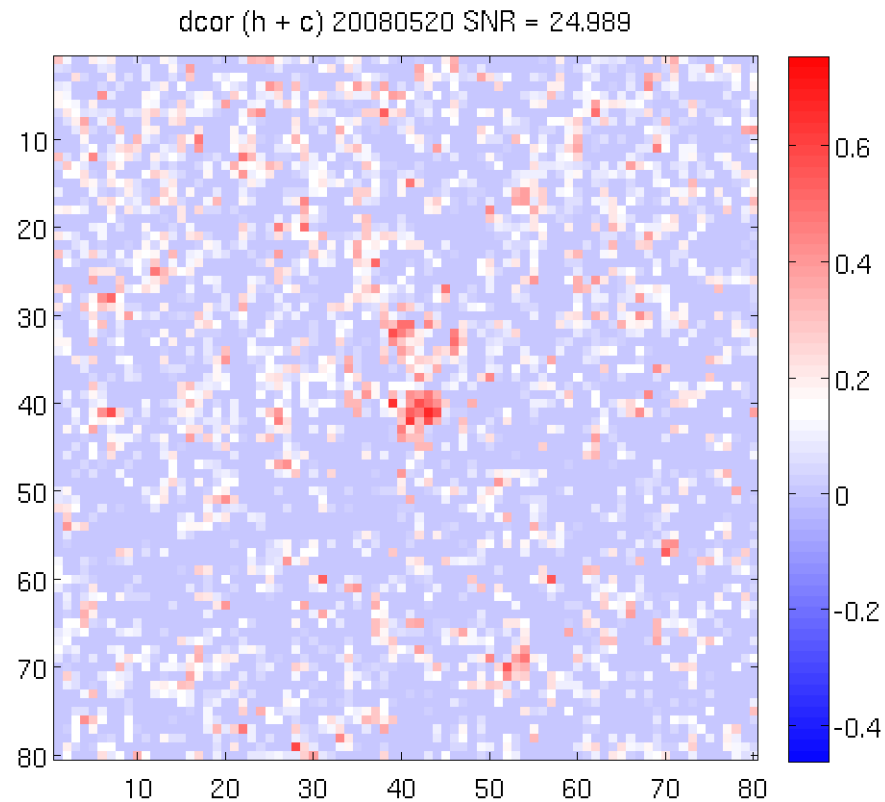
Time Series of Interferometric Coherence Difference



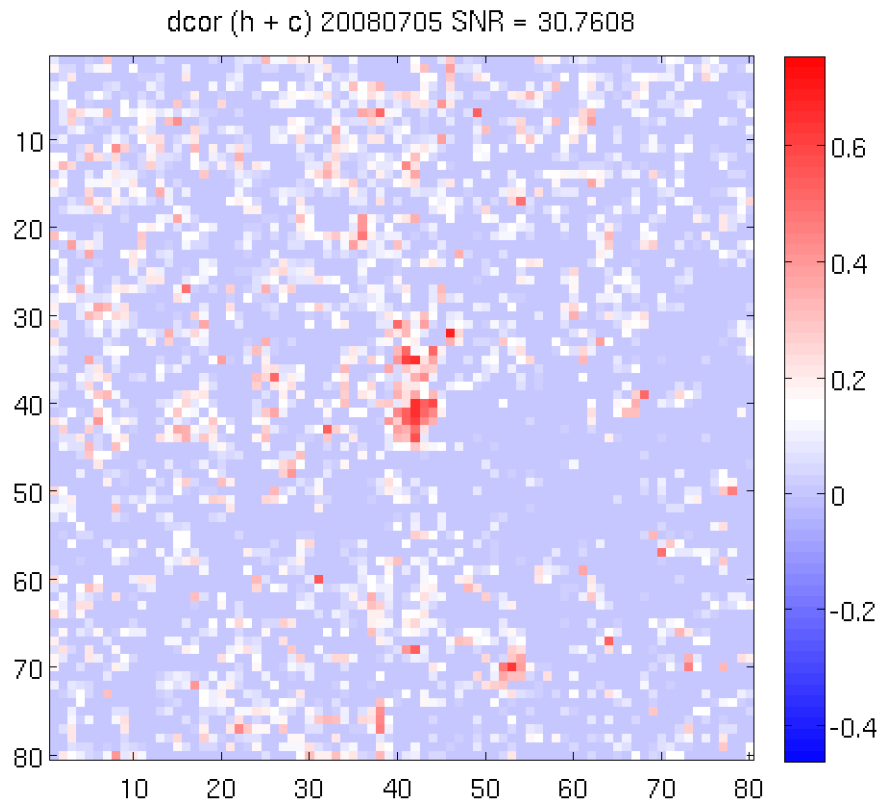
Time Series of Interferometric Coherence Difference



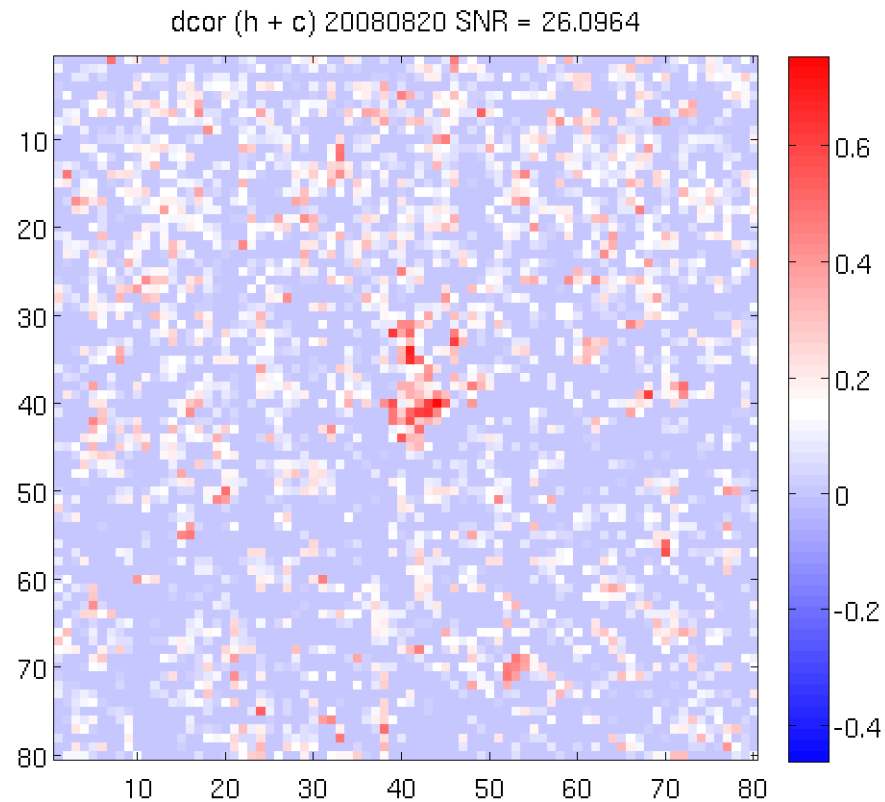
Time Series of Interferometric Coherence Difference



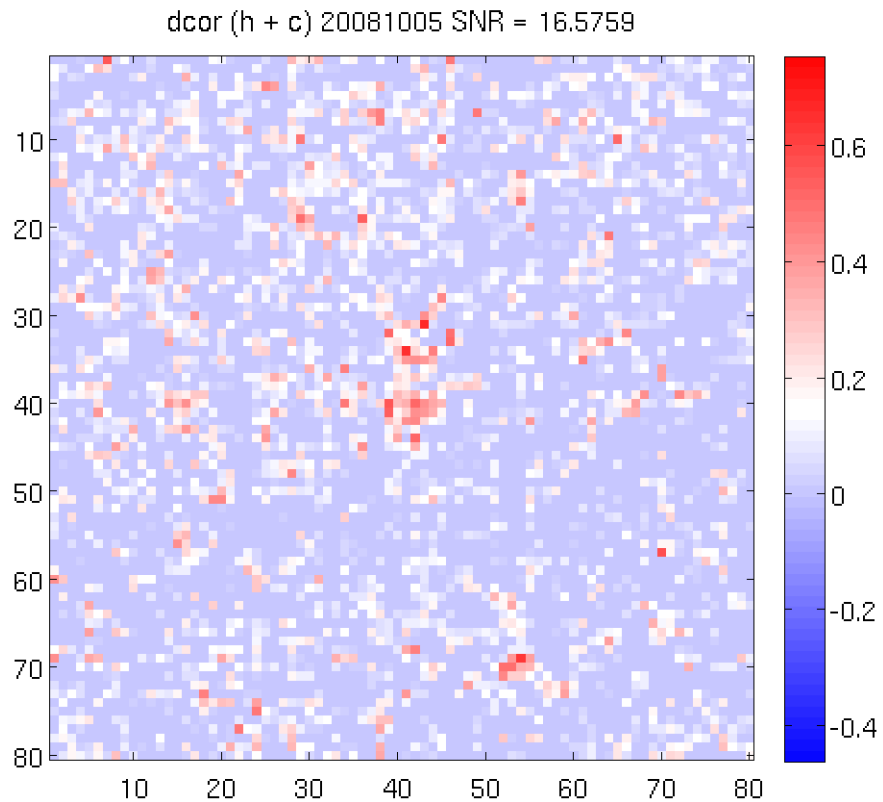
Time Series of Interferometric Coherence Difference



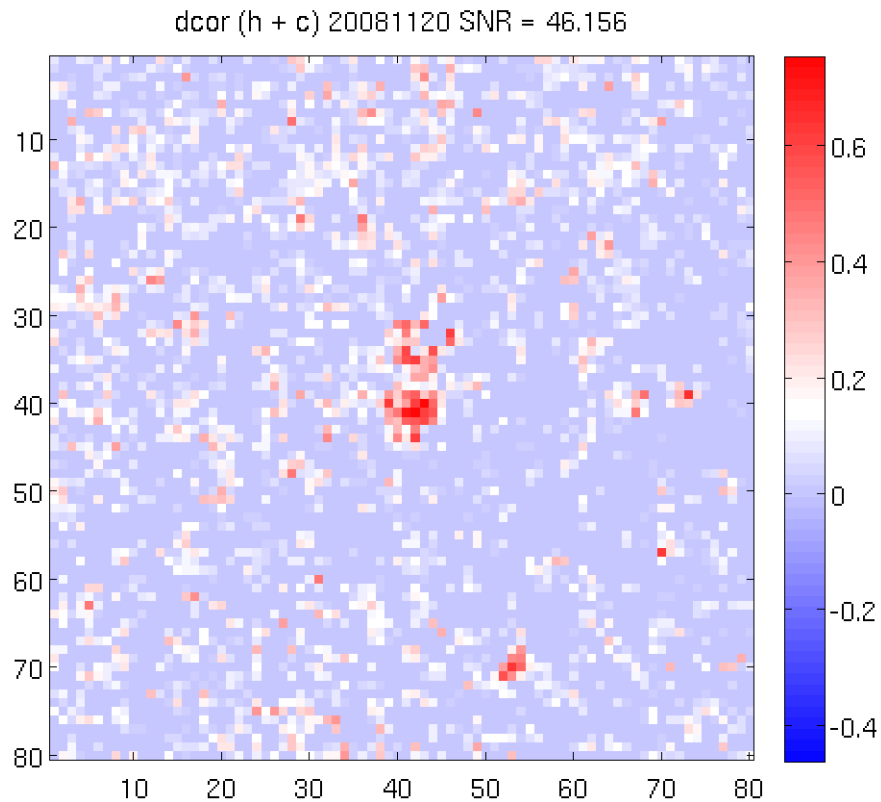
Time Series of Interferometric Coherence Difference



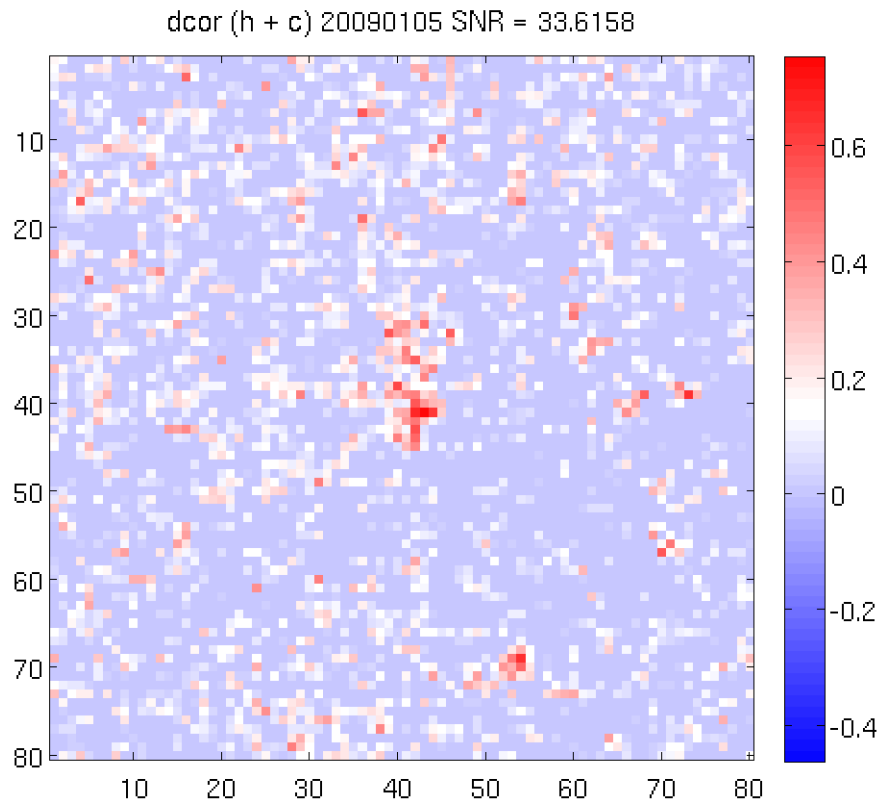
Time Series of Interferometric Coherence Difference



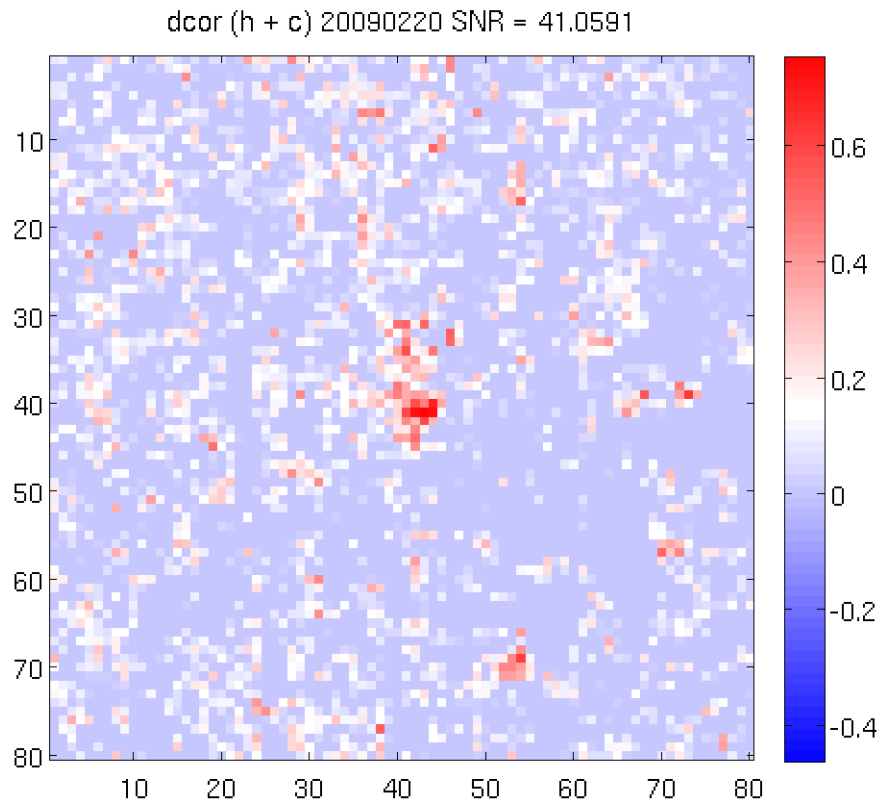
Time Series of Interferometric Coherence Difference



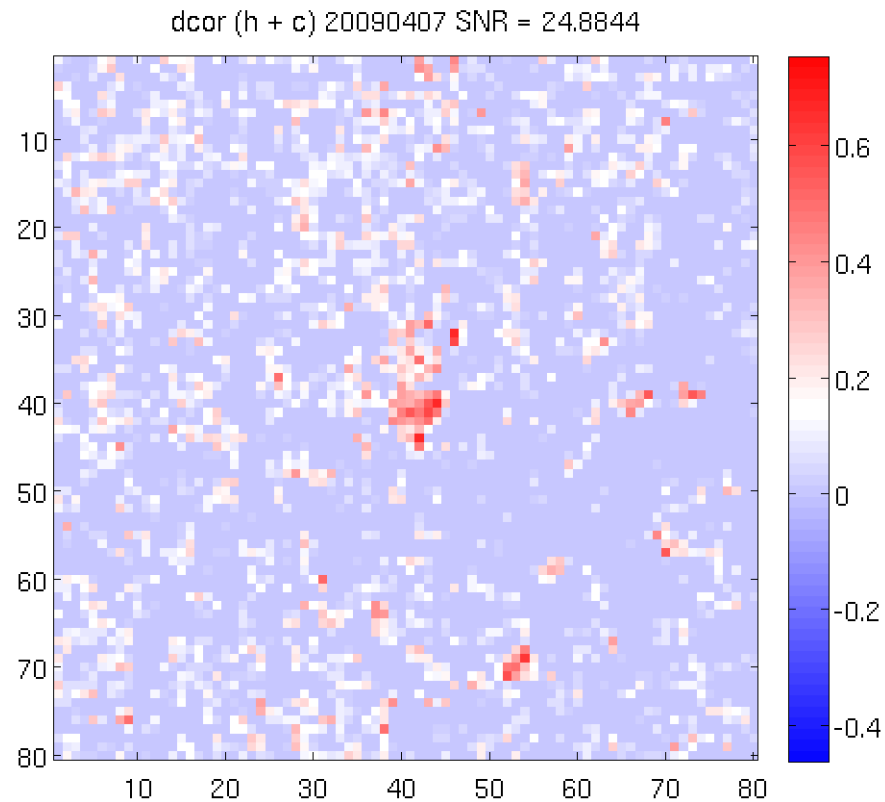
Time Series of Interferometric Coherence Difference



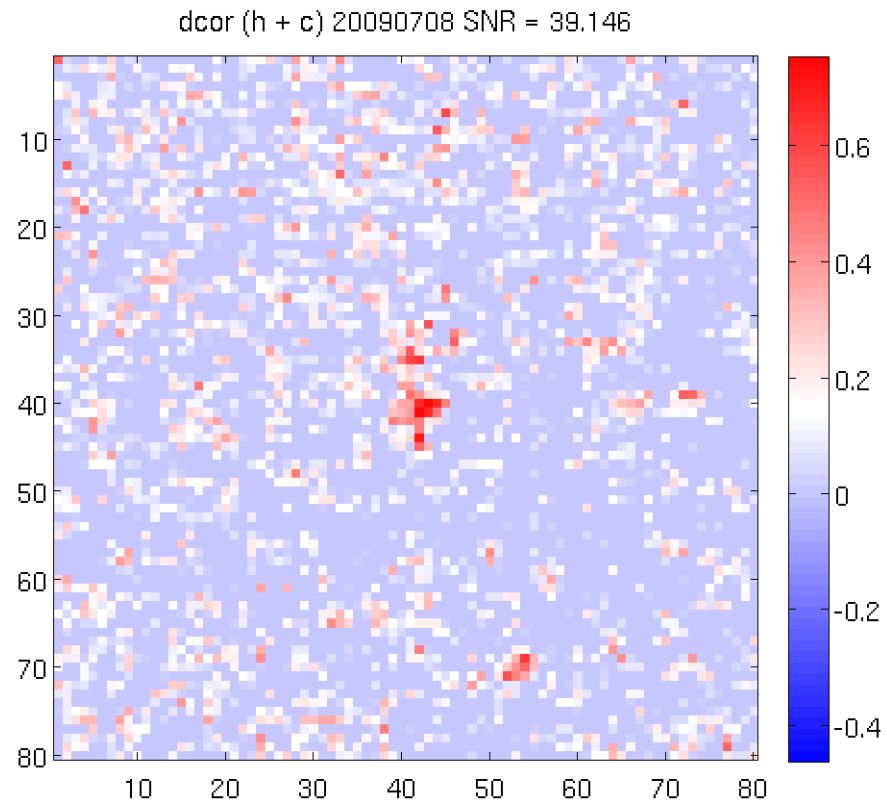
Time Series of Interferometric Coherence Difference



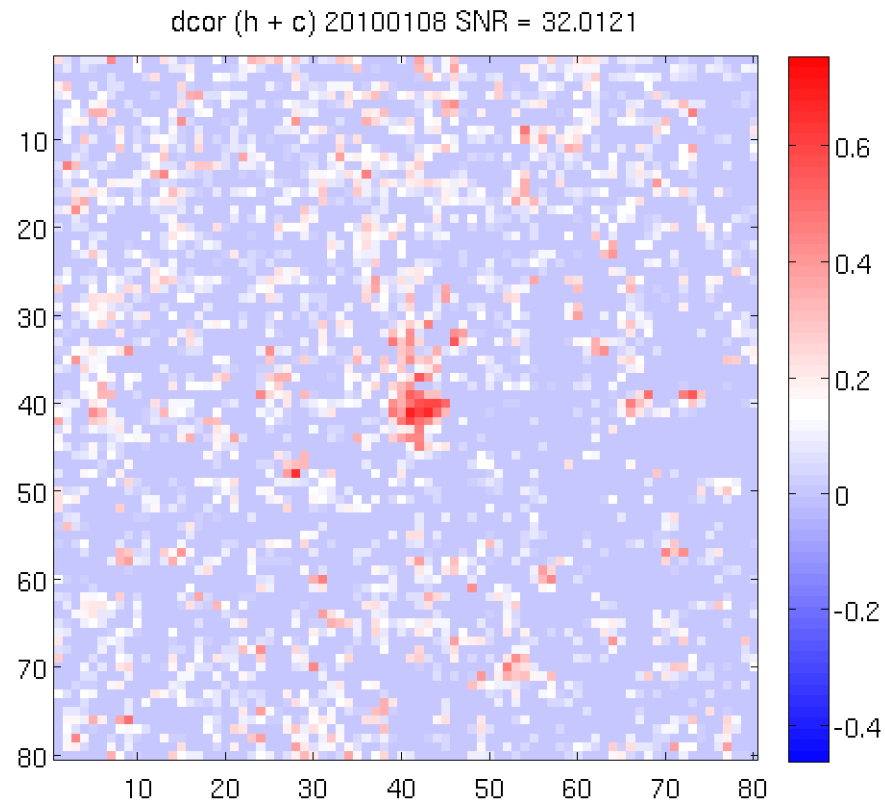
Time Series of Interferometric Coherence Difference



Time Series of Interferometric Coherence Difference

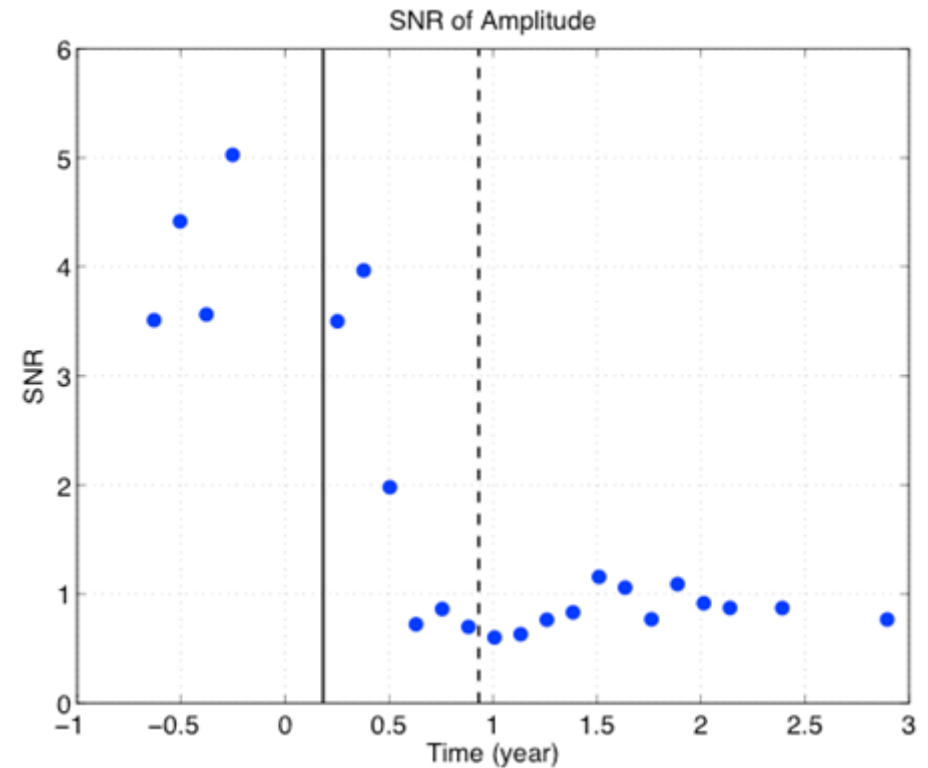
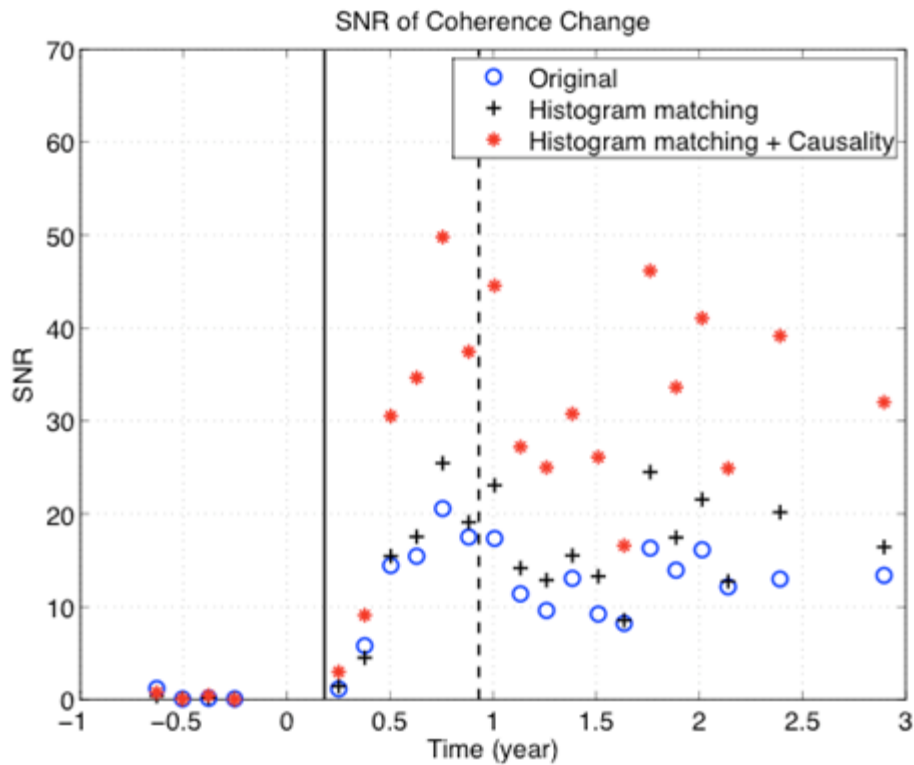


Time Series of Interferometric Coherence Difference



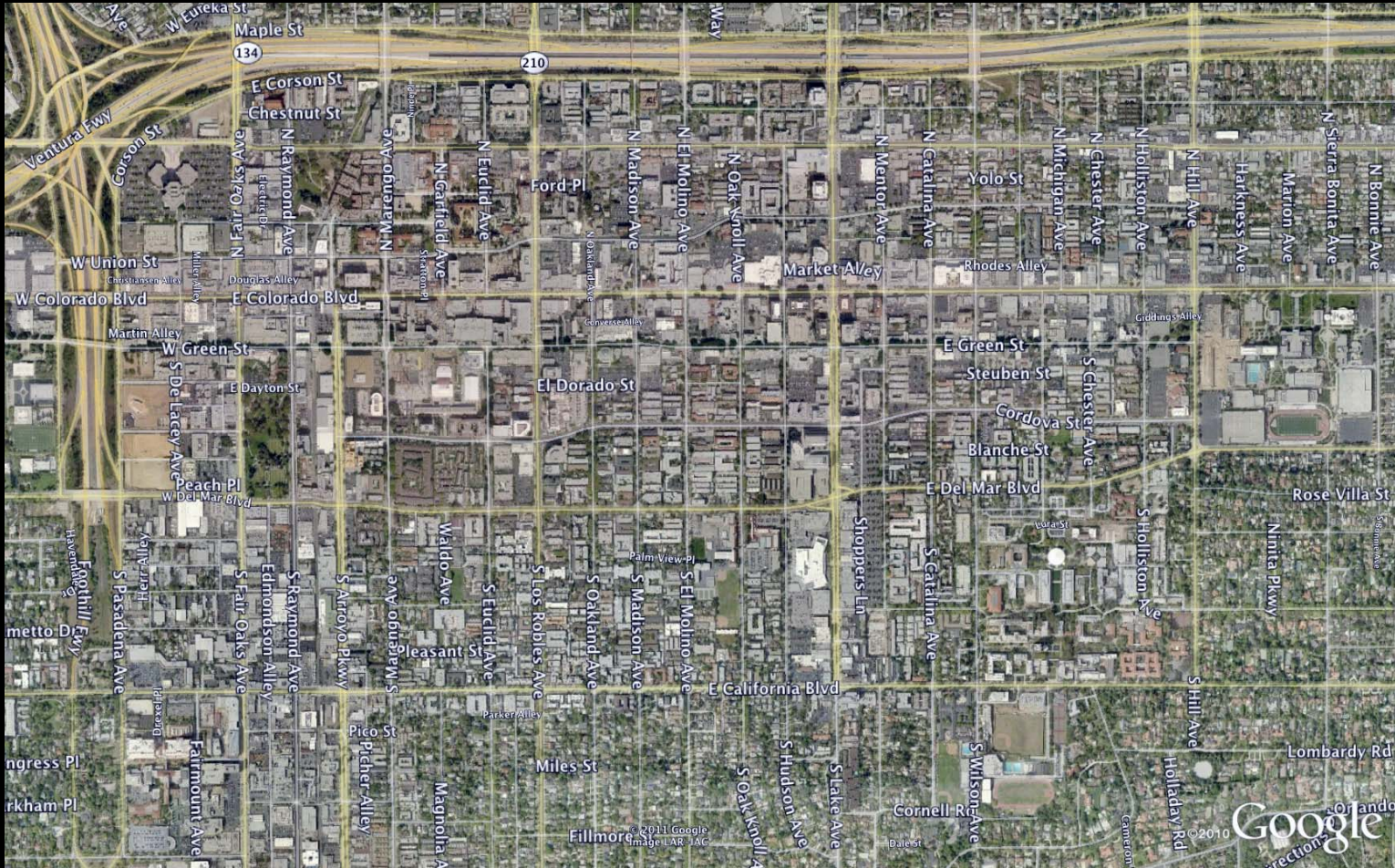
Time Series of SNR

InSAR Coherence Difference and SAR amplitude



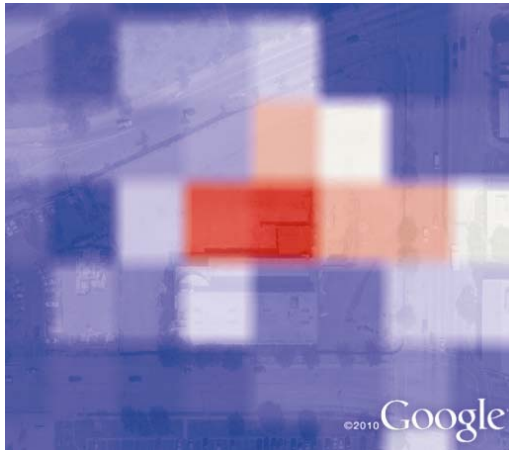
Pasadena

Google Earth Image (20080109)



Site 1

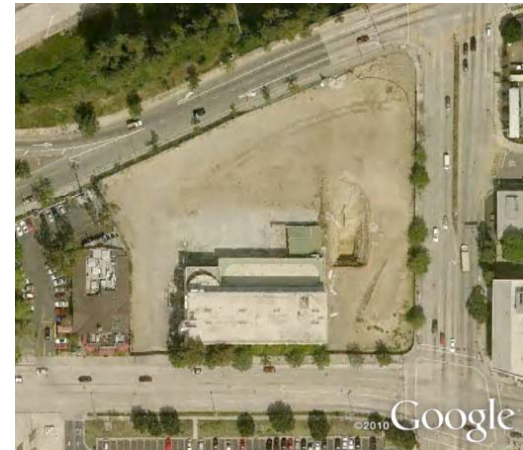
Tennis court and parking lot demolished



DPM



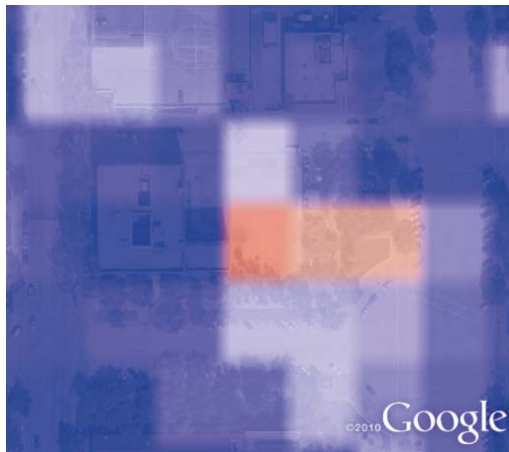
20071023



20080109

Site 2

Flat building demolished



DPM



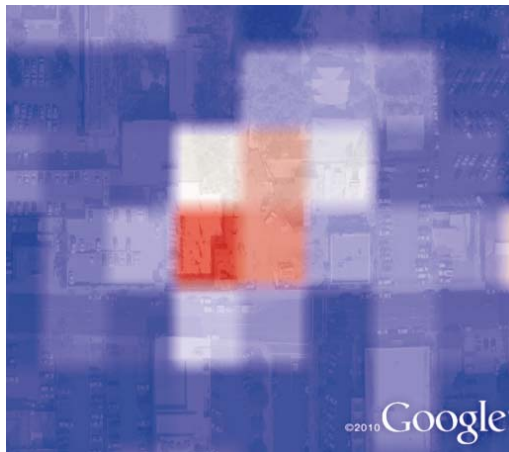
20071023



20080109

Site 3

Buildings demolished/constructed & Lawn demolished



DPM



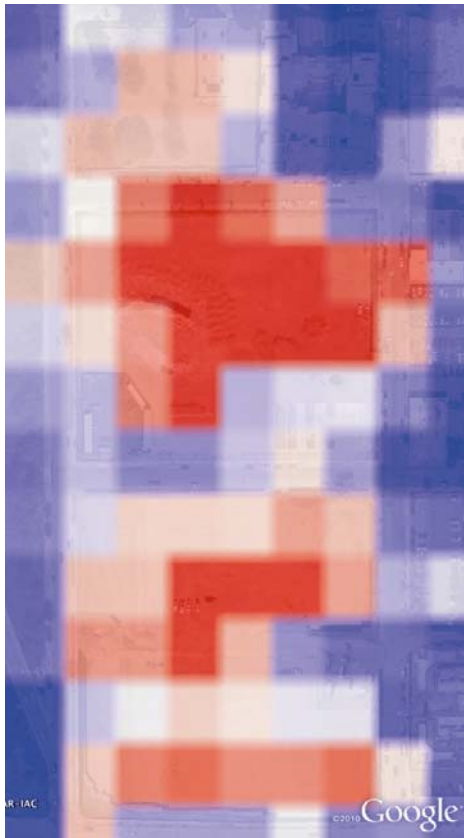
20071023



20080109

Site 4

Three building blocks demolished for new apartment complex



DPM



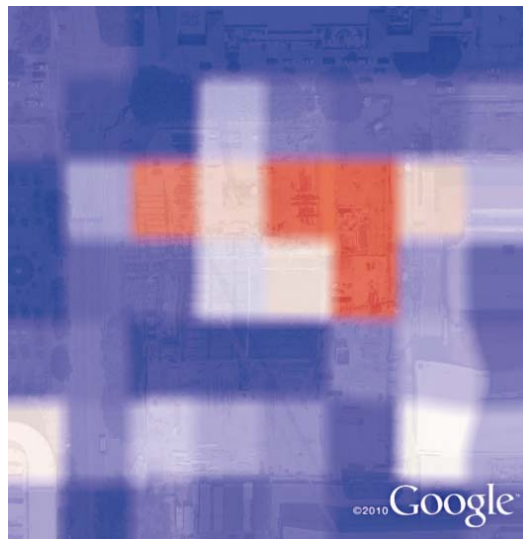
20071023



20080109

Site 5

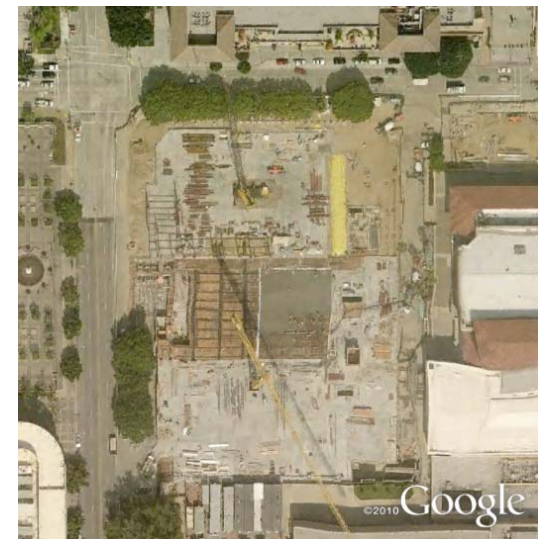
Pasadena convention center foundation constructed



DPM



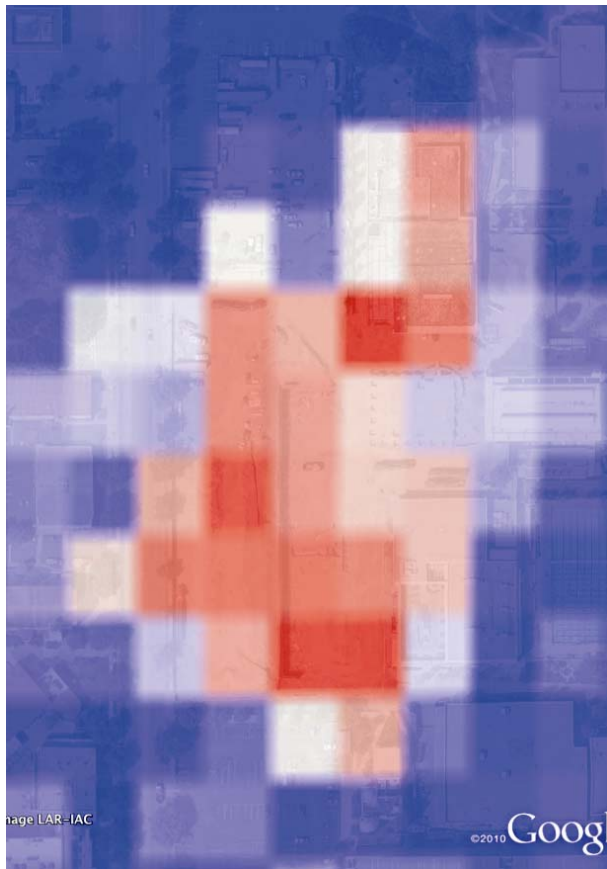
20071023



20080109

Site 6

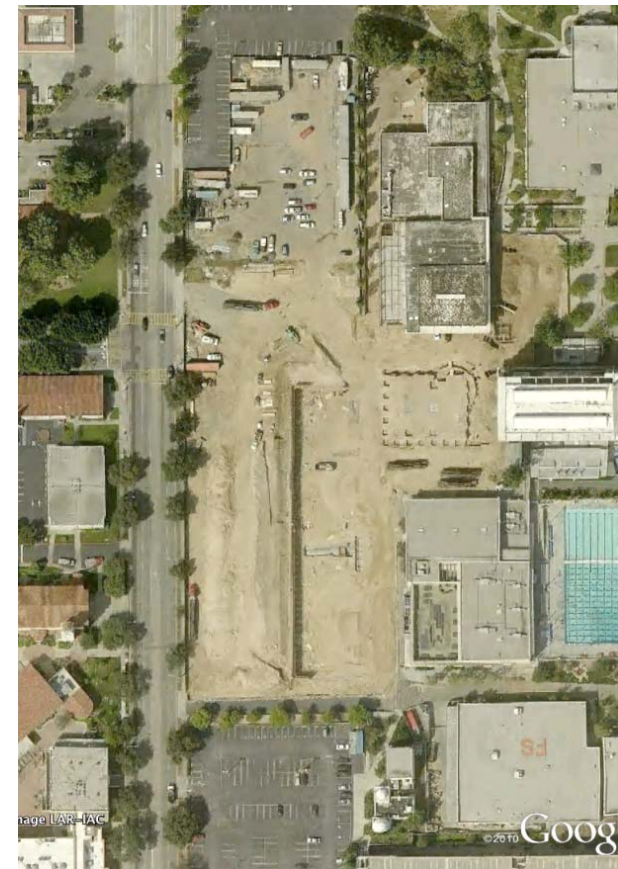
Pasadena City College tennis court and parking lot demolished for renovation



DPM



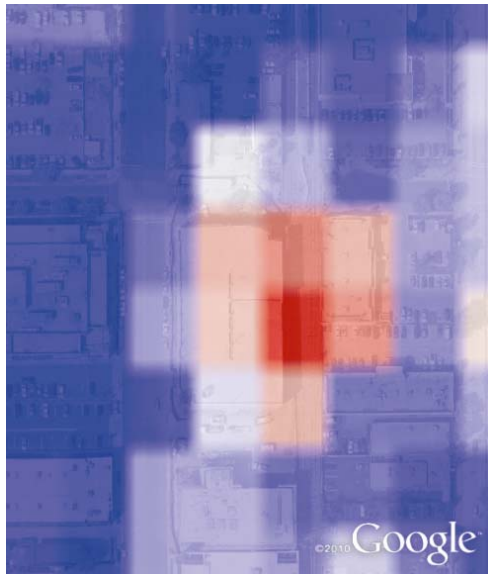
20071023



20080109

Site 7

Building construction



DPM



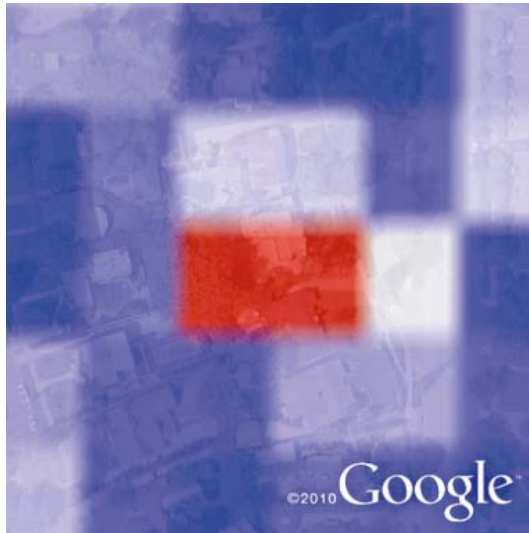
20071023



20080109

Site 7

Single family house room addition (4 m x 7 m)



DPM



20071023



20080109

Application: Christchurch Earthquake



February 22, 2011
M6.3 Christchurch EQ

At least 181 people were killed

Peak acceleration: 1.88g

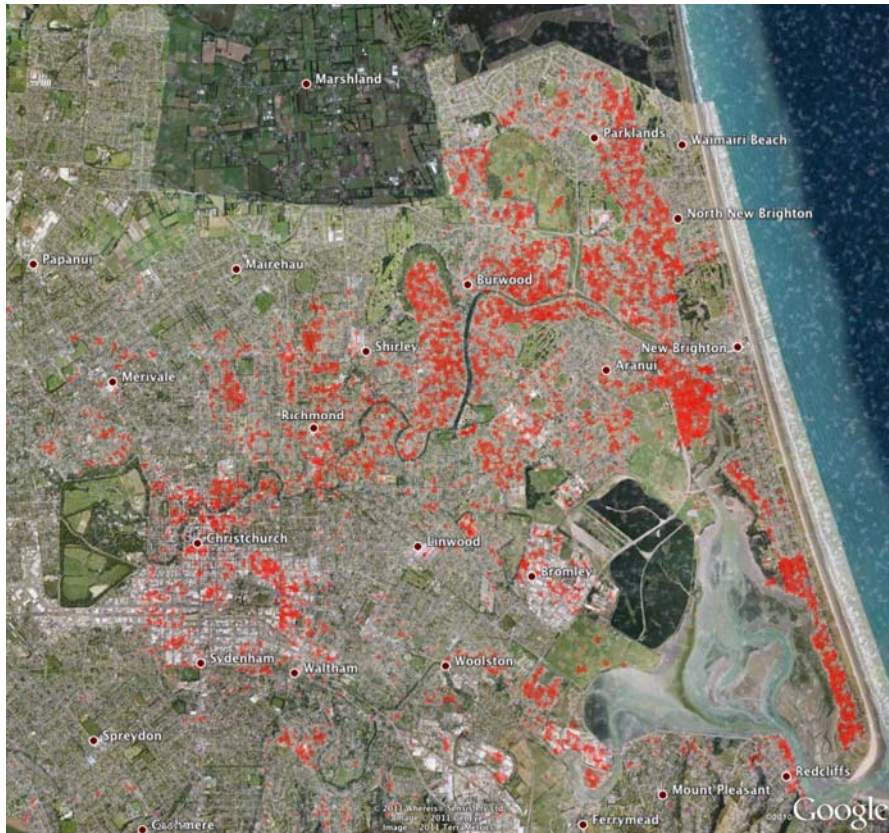
Extensive liquefaction producing
400,000 tons of silt

Estimated cost: NZ \$15-16 billion

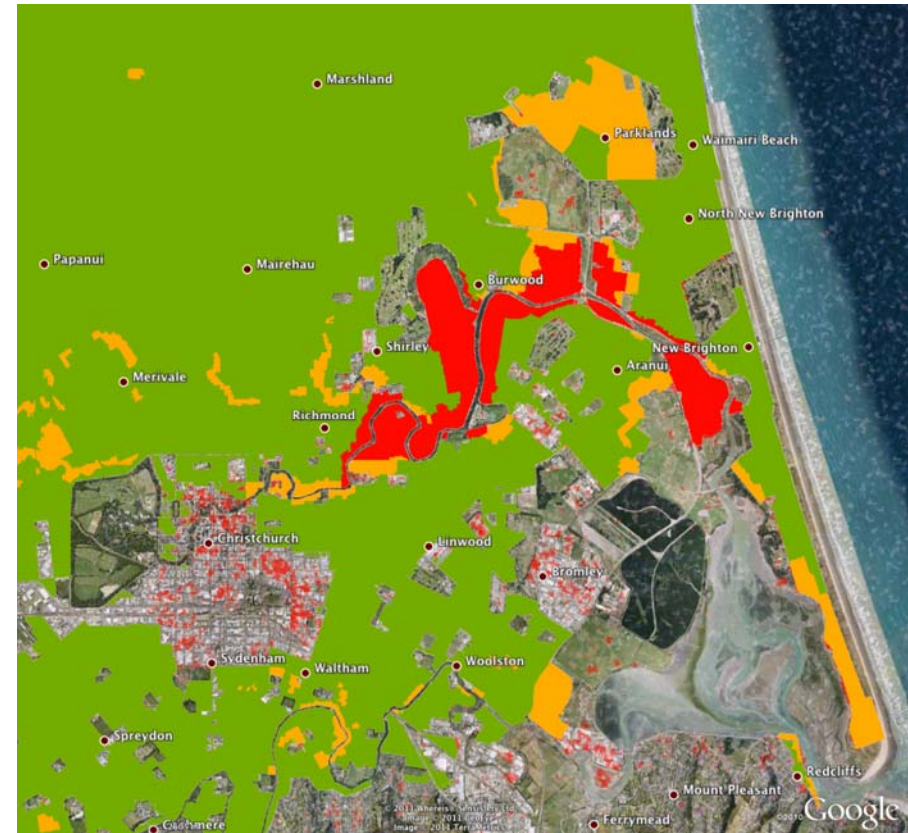
Damage assessment by NZ
government under progress



DPM vs Ground Truth



Damage Proxy Map (ALOS PALSAR A335):
2010/10/10 – 2011/01/10 – 2011/02/25
Google Earth (GeoEye) Image: 2011/02/26



2011/06/22 version
Sourced from geospatial.govt.nz, Created by Tonkin & Taylor
NZ for CERA (Christchurch Earthquake Recovery Authority)

Caveat: Not Necessarily Land Surface Change



Image from koordinates.com

Damage Proxy Map (ALOS PALSAR A335):
2010/10/10 – 2011/01/10 – 2011/02/25
Google Earth (GeoEye) Image: 2011/02/26

Christchurch Cathedral

Damage Proxy Map: 2010/10/10 – 2011/01/10 – 2011/02/25

Google Earth Image: GeoEye



Christchurch Cathedral on the day of the earthquake (REX/The Telegraph)



Damage Proxy Map



2010/09/03



2011/02/23

Cathedral of the Blessed Sacrament

Damage Proxy Map: 2010/10/10 – 2011/01/10 – 2011/02/25

Google Earth Image: GeoEye



Cathedral of the Blessed Sacrament was partly collapsed. (David Wethey/NZPA/Associated Press)



Damage Proxy Map



2010/09/03



2011/02/23

Canterbury TV Building

Damage Proxy Map: 2010/10/10 – 2011/01/10 – 2011/02/25

Google Earth Image: GeoEye



Rescuers working throughout the night at the Canterbury TV building where up to 100 people are feared lost as they look to recover bodies rather than rescue survivors. (www.news.com.au)



Damage Proxy Map



2010/09/03



2011/02/26

Pyne Gould Building

Damage Proxy Map: 2010/10/10 – 2011/01/10 – 2011/02/25

Google Earth Image: GeoEye

The collapsed Pyne Gould Guinness building trapped dozens of people. "We've been pulling 20 or 30 people out of those buildings right throughout the night," police Superintendent Russell Gibson said Wednesday morning. (Mark Mitchell/AFP/Getty Images)



Damage Proxy Map
building damage + liquefaction



2009/03/04



2011/02/26

Cliff Collapse

Damage Proxy Map: 2010/10/10 – 2011/01/10 – 2011/02/25

Google Earth Image: GeoEye



Luxury homes teeter on the edge after huge landslides in Redcliffs, near Christchurch (Photo by Torsten Blackwood from AFP).



Photo Courtesy David Petley



Damage Proxy Map



2010/09/03



2011/02/23



2011/02/26

EQ M6.3

Liquefaction near Bridge Street

Damage Proxy Map: 2010/10/10 – 2011/01/10 – 2011/02/25

Google Earth Image: GeoEye



Damage Proxy Map



2010/09/03



2011/02/23

Liquefaction near Burwood

Damage Proxy Map: 2010/10/10 – 2011/01/10 – 2011/02/25

Google Earth Image: GeoEye



Damage Proxy Map



2009/03/04

EQ M6.3



2011/02/22



2011/02/23



2011/02/26

Severe Liquefaction in Bexley

Damage Proxy Map: 2010/10/10 – 2011/01/10 – 2011/02/25

Google Earth Image: GeoEye



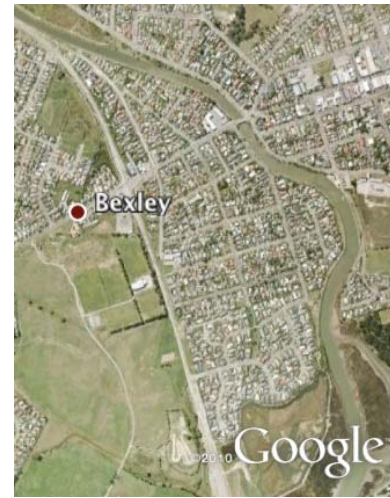
Cars stuck in the mud, Bexley
(Brett Phibbs/AFP/Getty Images)



Water Inundated Bexley (Mark Mitchell/New Zealand Herald/Associated Press)



Damage Proxy Map



2009/03/04



2011/02/23

Conclusions

- Future radar satellites will visit us within a day after an event. The expected wait time for the first SAR satellite to visit Lat: 38°N after a major earthquake in 2018 is 8~15 hours. Data transfer latency that often involves human/agency intervention far exceeds the data acquisition latency. → Need interagency cooperation to automate and accelerate the data transfer.
- We developed a prototype damage proxy map algorithm that uses interferometric coherence to generate damage proxy maps, to improve situational awareness for rescue operations and disaster size estimation after a major natural disasters.
- The algorithm was tested with ALOS PALSAR data of downtown Pasadena, California, and produced encouraging results. We are working on quality assessment, trying to estimate the probability of detection and probability of false alarm of the algorithm on the test area.
- Application to Feb. 2011 M6.3 Christchurch Earthquake detected three types of damage: liquefaction, building, cliff collapse. The overall damage pattern agrees well with ground truth map, and building scale damage sites were confirmed with optical imagery.
- The algorithm will be improved utilizing temporal characteristics of coherence and optimized for each type of data (L/C/X-band, Envisat, TerraSAR-X, COSMO-SkyMed, UAVSAR, DESDynI).

