# Satellite Radar Remote Sensing for Science, Monitoring and Disaster Response CMS273 – Ollie, Tobias, Zach & Mark

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Photo Courtesy: Time Magazine



#### Present/Future





35 Tbits/day

### Quasi-daily imaging

# Disaster Response Using Radar Remote Sensing Radar "sees" through clouds and at night – unlike optical data







Measuring ground movement using satellite radar images Interferometric Synthetic Aperture Radar (InSAR)



Images: 100's km in extent with meter scale resolution

> Satellite orbits Signal & Image processing Tides Atmospheric models Cartography/GIS

Maps of coherent (net) movement Maps of incoherent (scramble) movement

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# Background

- The international constellation of radar satellites allows us to provide rapid high-resolution synoptic assessments of devastation following natural disasters (e.g., earthquakes, floods, fires, etc.).
- Each radar image spans O(100km) in each dimension with O(m) pixel resolution. Each pixel has both an amplitude and a phase. These images are known as single look complex images (SLCs), where the single-look means it is full resolution has not been spatially averaged.
- The amplitude for each pixel is the amount of radar energy scattered back to the satellite and the phase (0:2pi) represents the distance between the ground and the satellite measured in units of the radar wavelength, but with no sensitivity to the integer number of wavelengths, just the last fractional part.
- Interferometric synthetic aperture radar (InSAR) which relies on interferometric differences between two
  images. Consecutive co-registered images can provide synoptic maps of ground movement that occurred in
  the time spanned by the two images. However, if something disrupts the ground (e.g., a building failure) in the
  same time span, then the measurement for the relevant pixel is randomized. We refer to this as *interferometric decorrelation*.

# Assessing Devastation From Space: Mw 6.3 Christchurch, NZ earthquake February 21st, 2011









Relationship to shaking and topographic effects?



#### San Juan del Río

Toluca

Iguala

#### DPM of the Sep 19, 2017 M7.1 Mexico City Earthquake

Twelve days after the M8.1 earthquake, on 19 September, a magnitude 7.1 earthquake devastated central Mexico, including Mexico City, causing 370 deaths and injuring more than 6,000.

A damage proxy map was made from the Sentinel-1 SAR data acquired on 20 September (6-1/2 hours after the quake) and was delivered to the Mexican Space Agency (AEM) and Mexico National Center for Prevention of Disasters (CENAPRED) on Sept. 20 – a record within-a-day delivery



Mexico City Chalco de Díaz

Cuernavaca

Cuautla



Córdoba

Tehuacán

Data SIO, NOAA, U.S. Navy, NGA, GEBCO



https://www.nasa.gov/feature/jpl/nasa-produced-damage-maps-may-aid-mexico-quake-response

#### Soriana Tasqueña



SOI LIANA

Before

After

Residential Building on Emiliano Zapata

Source: Google

Source: Google

Courtesy: New York Times







DPM

After

Source: www.adn40.mx

50RIA

# **Current State of Affairs**

- Identification of anomalous pixel behavior can be used to guide emergency officials responding to disasters. We refer to these estimates as damage proxy maps (DPMs).
- Currently, we provide key information used by FEMA and many other organizations in the U.S. and abroad for rapid response and situational awareness.
- However, we currently exploit only a two pairs of images and do not take advantage of time series of hundreds of images that are now routinely available. Thresholds for identification are manually set and no confidence metrics are available. (How sure are we that what we have flagged as damaged is not actually natural change in the surface properties of the earth?).
- Furthermore, our current approaches sacrifice maximum spatial resolution as they are based on local ensembles.

# The Challenge

- Starting from stacks of O(100) co-registered radar images, exploit all the *spatial and temporal* information available in the *complex* InSAR data and to *provide confidence intervals* on our estimates.
- Beyond DPM-style applications, these change detection problems arise in monitoring deforestation, desertification, as well as *damage distributed both in space and in time* (e.g., routine building demolition/construction or devastation in war zones).
- This effort naturally falls into the domain of *classification/clustering* combined with *anomaly detection*. (ML/DL?) We imagine both *supervised* and *unsupervised* approaches may be useful.
- Data volumes are large, visualization needs significant, algorithmic possibilities are multiple and, of course, eventual impact on society is profound.

As a brief background, you check out:

http://web.gps.caltech.edu/~simons/publications/pdfs/Yun\_etal\_2015.pdf

and the Yun et al references contained therein.

Building Block in Pasadena, California Building demolition ≈ Building collapse





Demolition: 2007/04/23 – 2008/01/22

### Google Earth (Downtown Pasadena, CA on 2007/10/23)





November 5, 2012

## Google Earth (Downtown Pasadena, CA on 2009/11/15)





### Damage Proxy Map (Downtown Pasadena, CA) 2006/12/31 – 2007/02/15 – 2008/02/18





**Combining Damage Proxy Map** with GIS Reverse Geocoding





Geopy + Google geocoder:

- S1: (34.150055, -118.151389) → 25 Walnut St., Pasadena, CA 91103
- S2: (34.148033, -118.145444) → 235 E Holly St., Pasadena, CA 91101
- S3: (34.147467, -118.139595) → 527 E Union St., Pasadena, CA 91101
- S4: (34.141923, -118.153428) → 144 Valley St., Pasadena, CA 91105
- S5: (34.143786, -118.145282) → 100-190 S Marengo Ave, Pasadena, CA 91101

Yun, S., Fielding, E., Simons., M., Webb, F., 2011. Damage Proxy Map from InSAR Coherence, U.S. Provisional Patent filed on June 20, 2011, Docket No. CIT-5901-P.