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Radar Interferometry

Dealing with atmospheric errors for individual interferograms

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- ❖ Structure of the Atmosphere
 - Tropospheric Delays (✓)
 - Ionospheric Delays (✗)
- ❖ InSAR water vapour correction models
 - Empirical Models (✓)
 - Ground-based Continuous GPS (✓)
 - MERIS/MODIS models for IM and WS (✓)
 - Numerical Weather Models (✓)
 - JPL OSCAR (✓)
- ❖ InSAR time series with water vapour correction/estimation (✗)



Atmospheric refraction

The traveling path is not a direct line

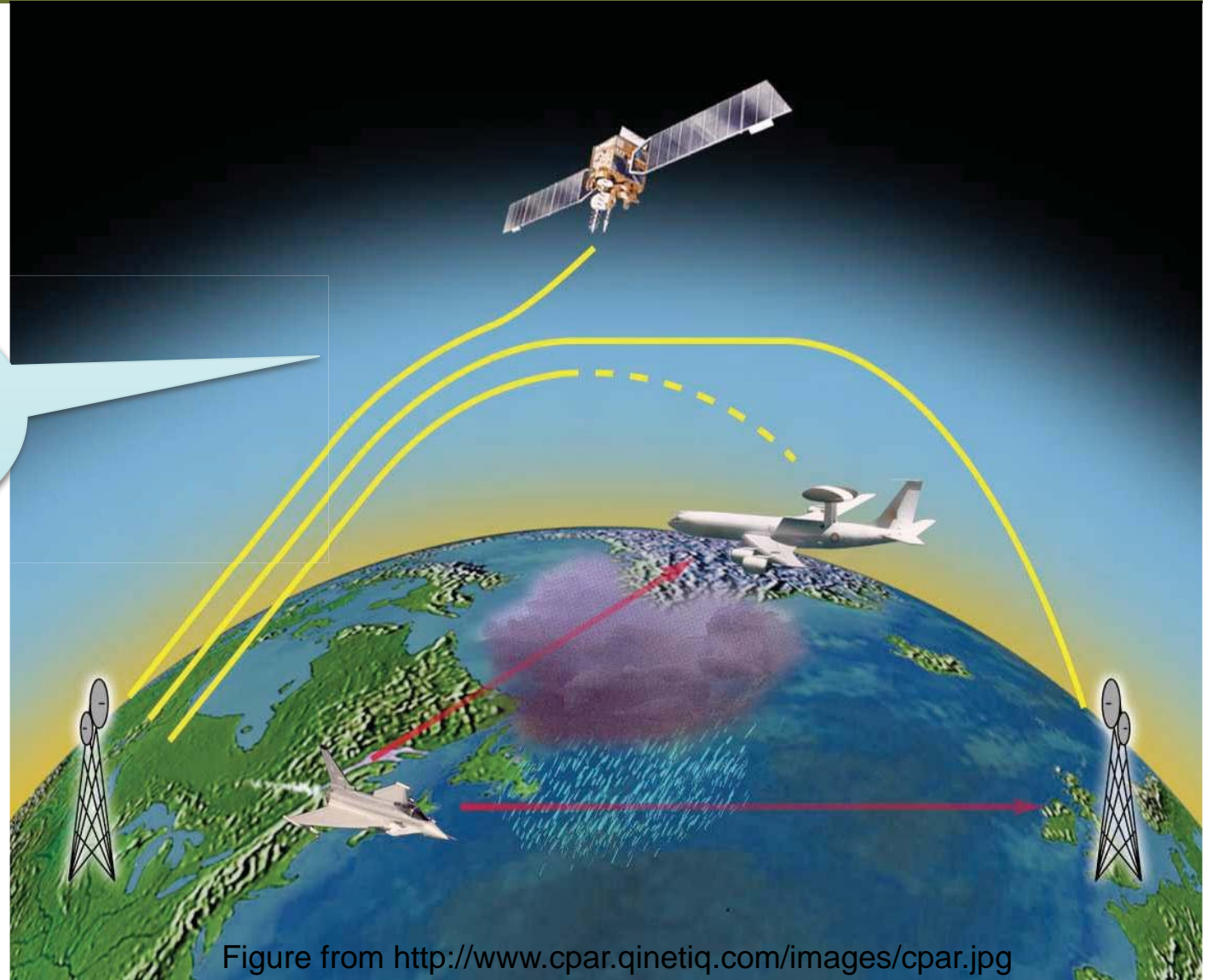
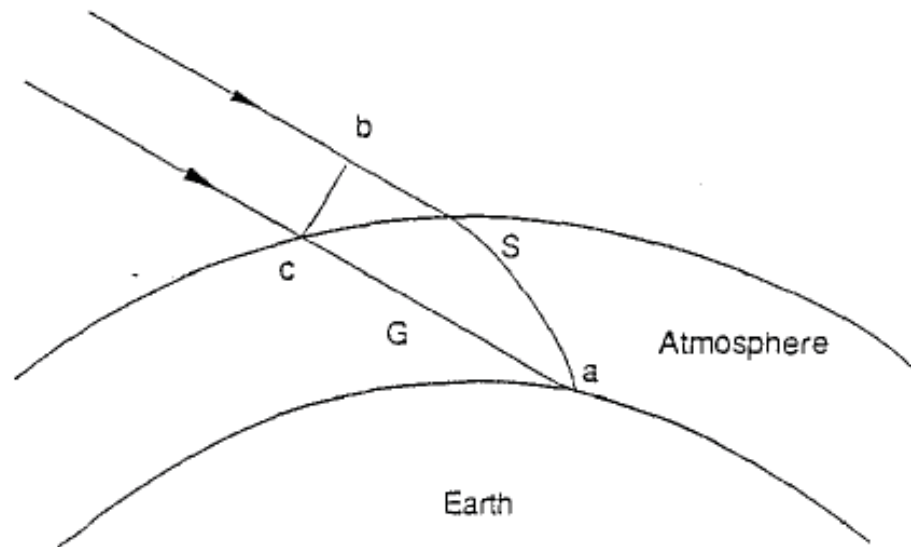


Figure from <http://www.cpar.qinetiq.com/images/cpar.jpg>



Atmospheric refraction

- ◆ Radar signals are bent and slow down in the atmosphere
 - Distance is different from a straight line
 - Traveling time is longer than in the vacuum





◆ Excess path length

$$\Delta S = 10^{-6} \int_s N \cdot ds$$

where N is refractivity: $N = (n - 1) \times 10^{-6}$

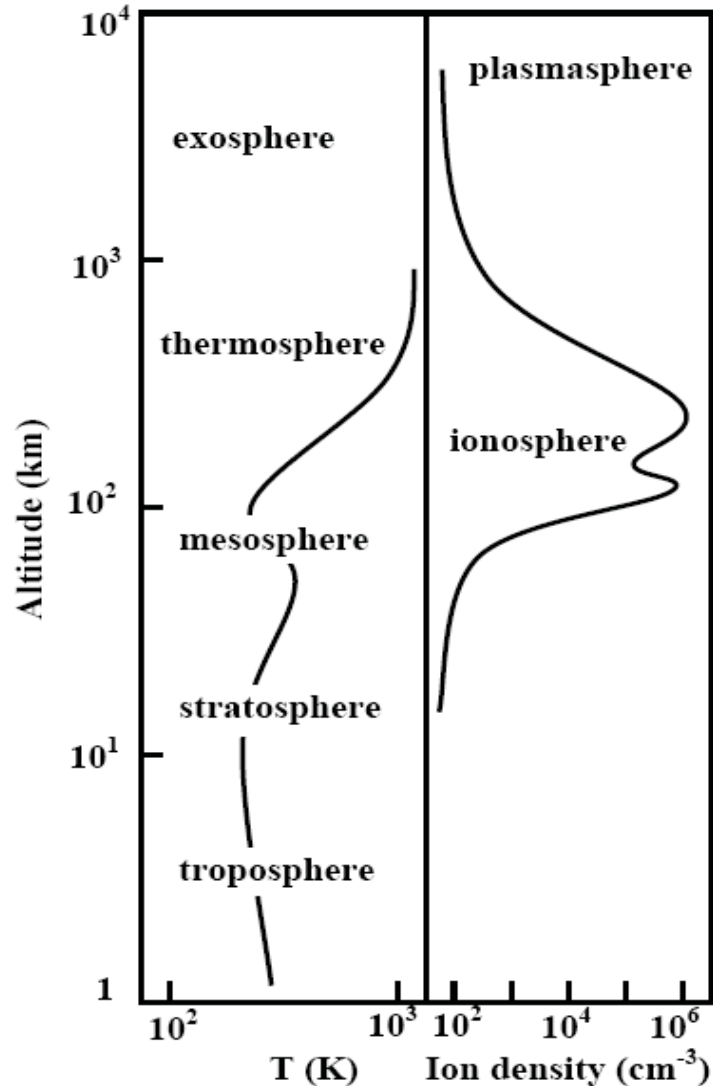
◆ Need to consider two different effects:

- Topospheric delay

- Ionospheric delay (Wednesday)



Basic structure of the atmosphere



❖ Troposphere:

- Contains 80% of air mass
- Contains 99% of water vapour
- Air temperature decreases with altitude
- ~12km thick on average
- ~16 km in the Tropics
- ~9km in the Polar Regions
- Not dispersive (up to 30 GHz)



- ❖ Assuming a spherically symmetric atmosphere, the zenith tropospheric delay (ZTD) can be expressed as:

$$ZTD = ZHD + ZWD$$

- *ZHD*: Zenith Hydrostatic Delay
- *ZWD*: Zenith Wet Delay



- ❖ ZHD can be obtained using the *Saastamoinen* model [Saastamoinen, 1972; Davis et al., 1985]:

$$ZHD = 0.0022768 \times \frac{P_s}{f(\varphi, H)}$$

$$f(\varphi, H) = 1 - 0.00266 \cos(2\varphi) - 0.00028H$$

- P_s is total surface pressure in hPa;
- φ : latitude in degrees; ZHD : in meters;
- H : station height in km above the geoid



- Typical ZHD = 2.3 m.
- 1 hPa error in surface pressure can lead to 2.3 mm error in ZHD;
- Surface pressure data can be obtained from radiosondes, GPS stations, space-based sensors (MODIS, MERIS), ECMWF, etc.
- Error in ground-based surface pressure is usually less than 0.2 hPa, so ...
- Surface pressure from MODIS, MERIS, ECMWF: Not accurate enough!



- ❖ ZWD can be estimated from surface measurements
[Saastamoinen, 1972]:

$$ZWD = 0.002277 \left(\frac{1255}{T} + 0.05 \right) e_w$$

$$e_w = RH \cdot \exp(-37.2465 + 0.213166 \cdot T - 2.56908 \cdot 10^{-4} \cdot T^2)$$

- T is surface temperature in degrees Kelvin;
- RH: Relative humidity in percentage
- e_w is water vapour partial pressure in hPa;
- **Low accuracy: 2~5 cm of ZWD**



Zenith Wet Delay (ZWD)

- ZWD is much smaller than ZHD
- ZWD is usually between 0-30cm.
- ZWD varies from place to place, from time to time
- ZWD is the most highly variable (both spatially and temporally) component of delay and is not easy to determine using surface measurements.
- ZWD can be determined with water vapour radiometer (WVR) and radiosondes. But both methods are expensive.



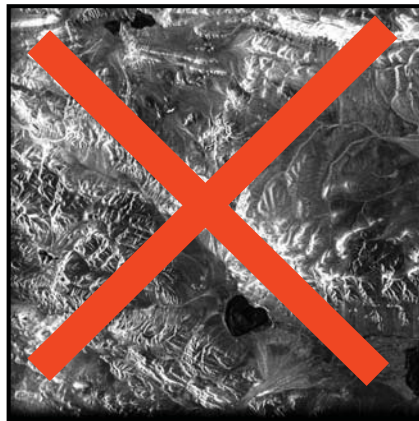
Elevation angle (degrees)	Hydrostatic delay (m)	Wet delay (m)
90	2.3	0.2
30	4.6	0.4
10	13.2	1.2
5	26.4	2.3

- ❖ The lower the elevation angle, the greater the delay
- ❖ Note: The table shows one-way delays only!

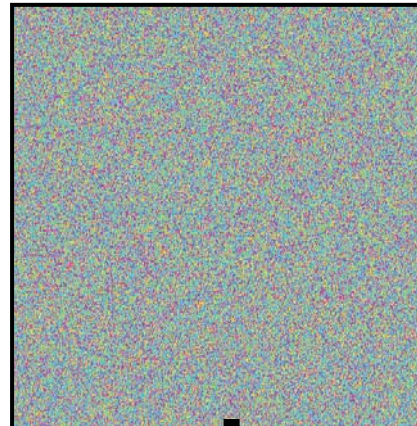


InSAR – how does it work?

Image A: 071123



Amplitude



Phase

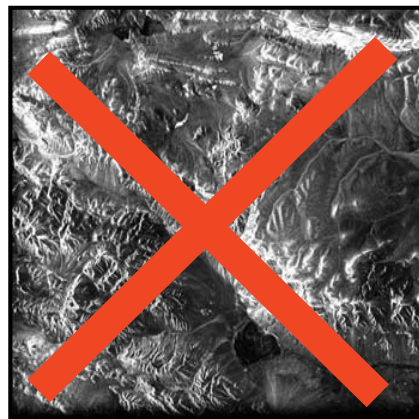
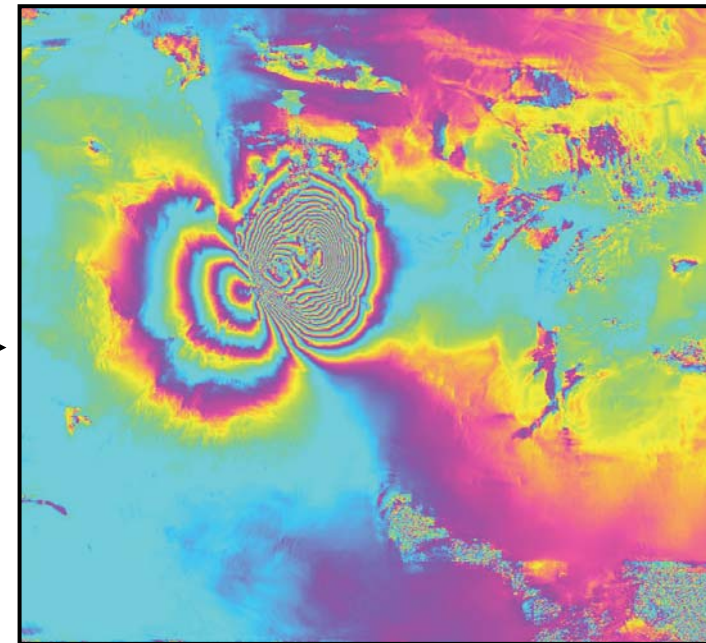


Image B: 080201



Interferogram =
Phase A – Phase B

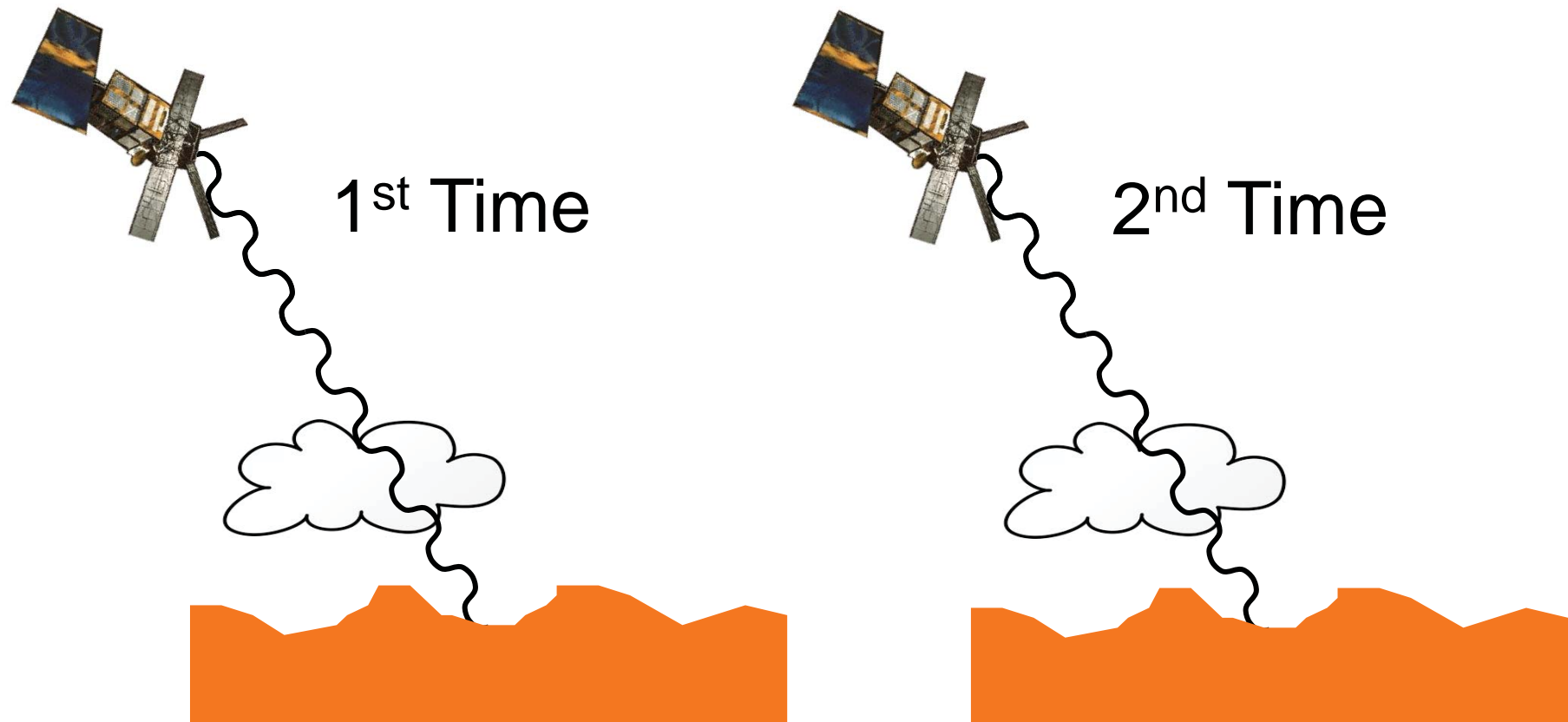


2008 Gaize Earthquake
(Tibet)



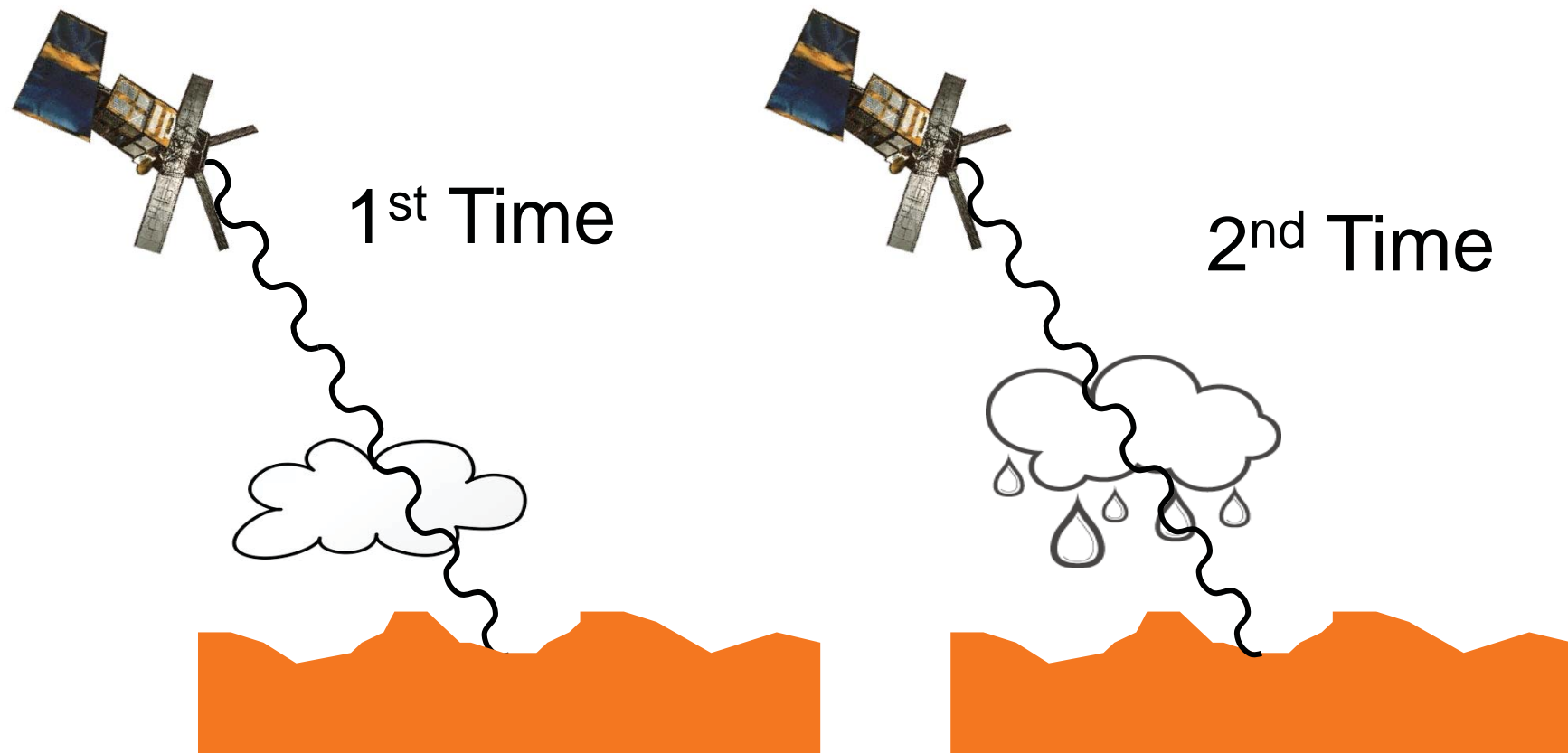
InSAR – Ideal scenarios (NO atmospheric effect)

- Ideal scenarios: (1) no spatial variation; (2) no temporal variation; or (3) constant temporal change across the whole image





- Spatiotemporal variations in Atmosphere represent one of the major limitations of repeat-pass InSAR





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Atmospheric water vapour products

❖ GPS

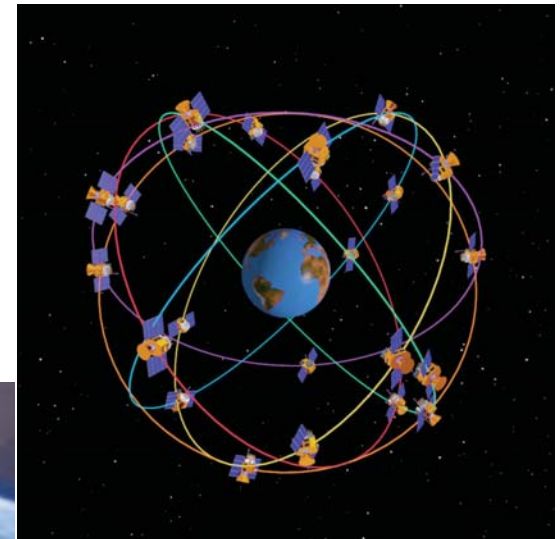
(Global Positioning System)

❖ MODIS

(Moderate Resolution Imaging Spectroradiometer)

❖ MERIS

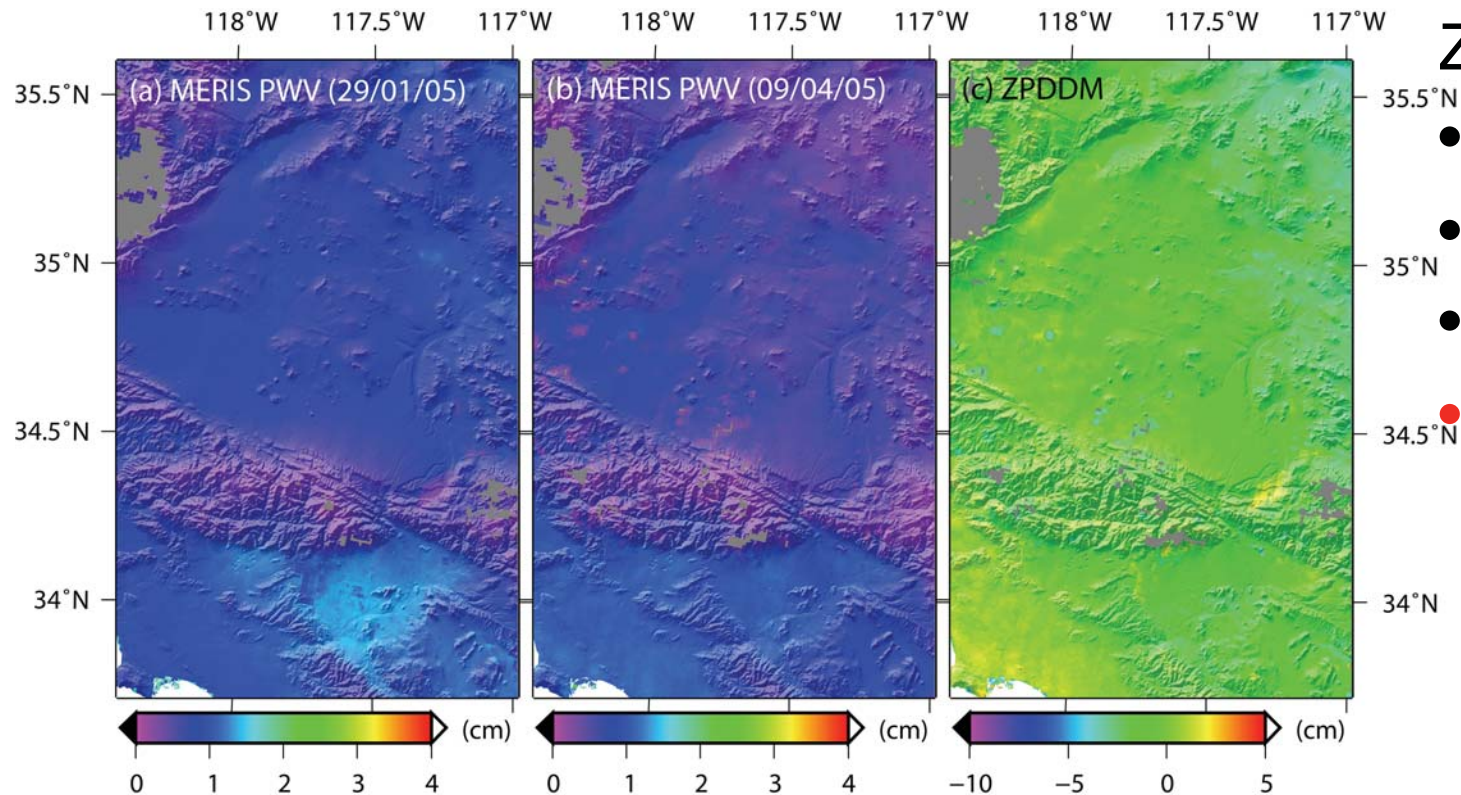
(Medium Resolution Imaging Spectrometer)





Atmospheric water vapour effects (limited)

Southern California (29 Jan 2005 – 09 Apr 2005)



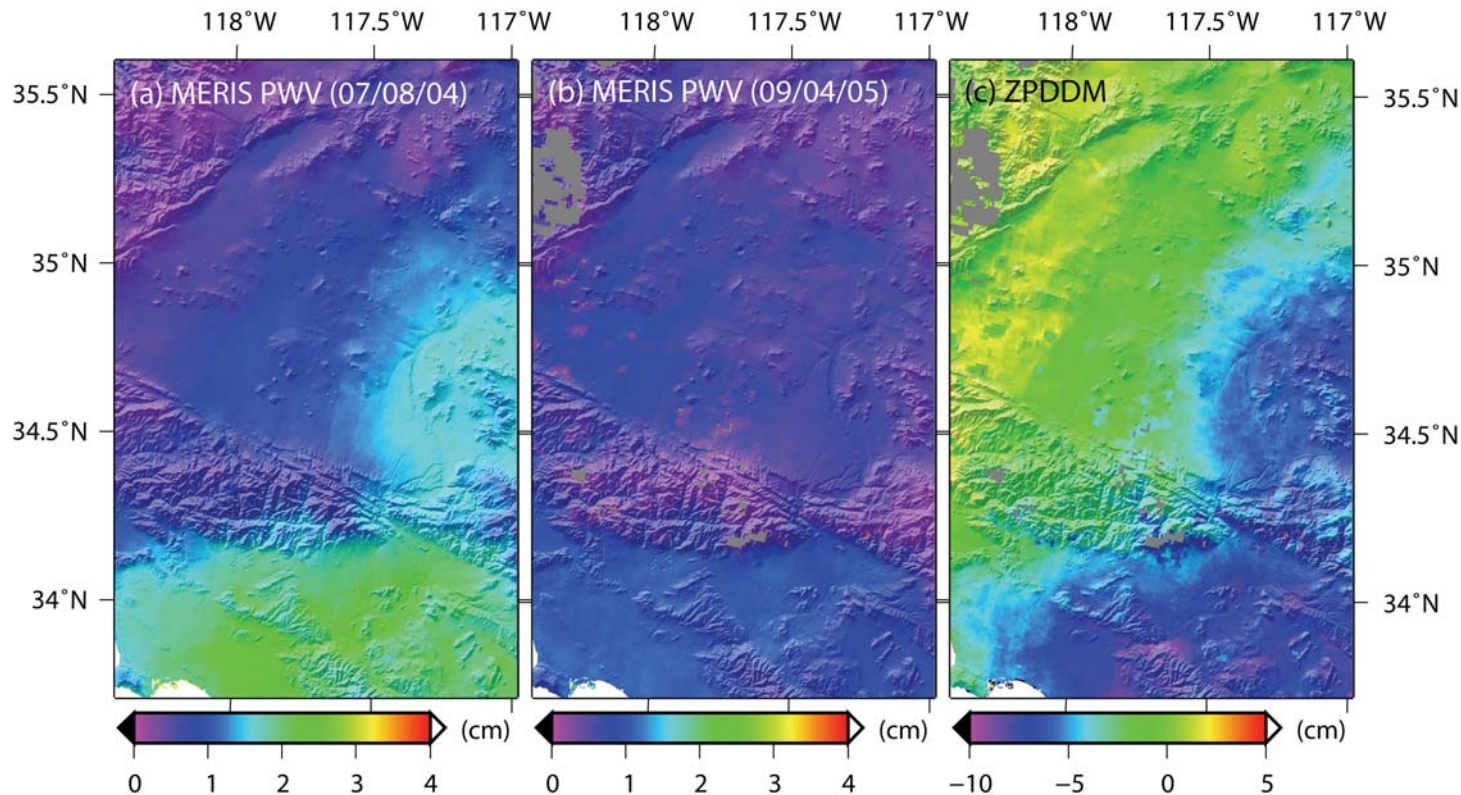
ZPDDM

- Max: 7.8 cm
- Min: -5.2 cm
- Mean: -0.9 cm
- StdDev: 1.0 cm

- 1 mm of PWV => ~6.2 mm of ZPD
- ZPDDM: Zenith Path Delay (ZPD) Difference Map



Southern California (07 Aug 2004 – 09 Apr 2005)



ZPDDM:

Max: 2.7 cm

Min: -12.8cm

Mean: -2.9 cm

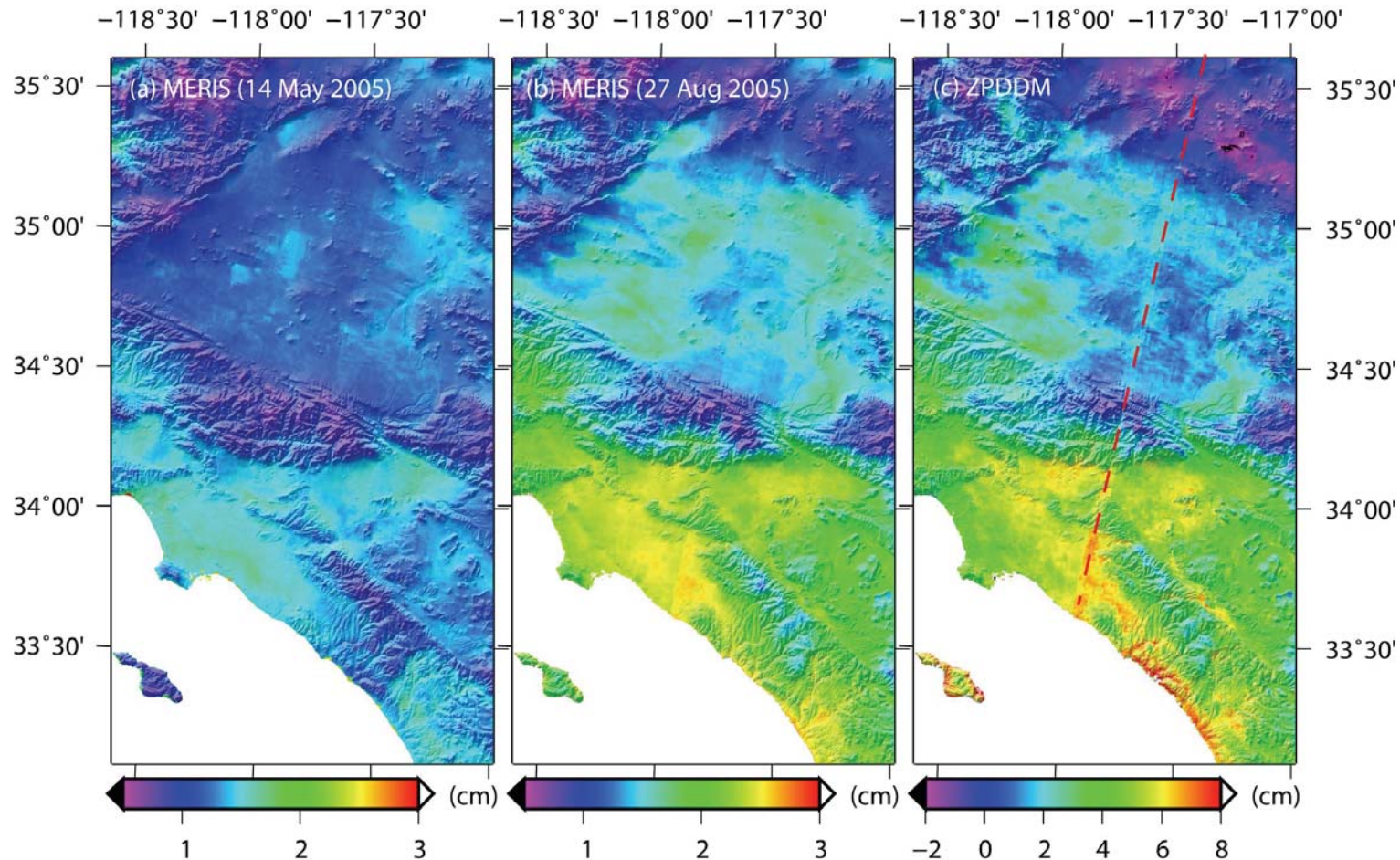
StdDev:

2.9 cm

N.B. Strong gradient in Figure (a)



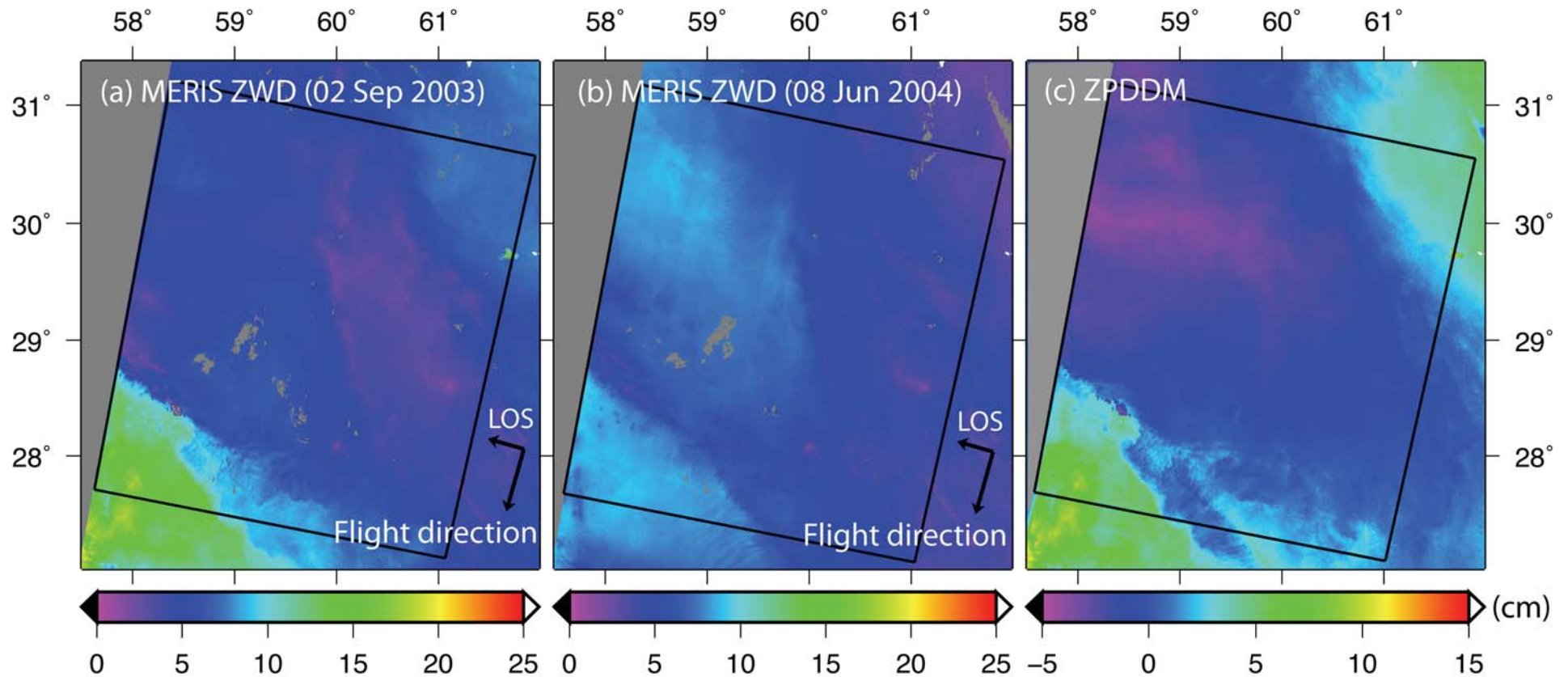
Southern California (14 May 2005 – 27 Aug 2005)



Red dashed line: MERIS camera border artefact (Camera 4)



Bam, Iran



$$\mathbf{ZPDDM} = \mathbf{ZPD} (\text{Day 2}) - \mathbf{ZPD} (\text{Day 1})$$

(Li et al., 2011, IEEE GRSL)



- Ground-based measurements (GPS)
Li et al (2006); Onn & Zebker (2006); Xu et al (2011)
- Space-based water vapour measurements (MERIS, MODIS)
Li et al (2005, 2006, 2009, 2011); Puysségur et al (2007)
- Numerical Weather Models (UM, MM5/WRF, ECMWF):
Wadge et al (2002), Foster et al (2006; 2013), Puysségur et al (2007), Jolivet et al. (2011; 2013)
- JPL OSCAR

N.B. This is an incomplete list!



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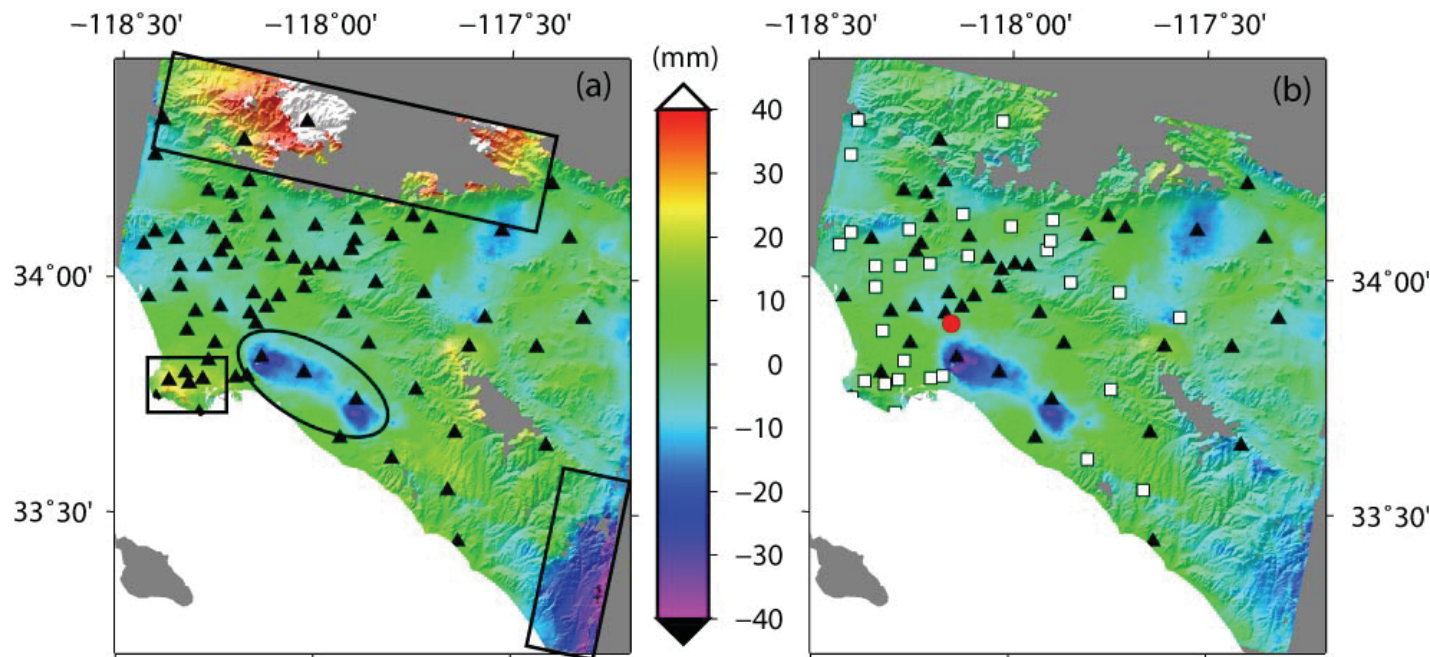
GPS Topography-dependent Turbulence Model (GTTM)

❖ Underlying assumptions of GTTM:

- Water vapour variations conform temporally and spatially to a statistical turbulent model;
- Water vapour distributions are correlated with topography to some extent.

◆ Key features:

- The reduction of topography-independent water vapor effects is limited by the spatial distribution of GPS stations
- Topography-dependent effects can be significantly reduced
(Li et al., 2006, JGR)



(Total: 77; White Square: 32; Red circle: 1)

➤ Range changes:
GPS vs. InSAR
1.1cm ⇒ 0.6cm

➤ Black oval:
Uplift

➤ Rectangles:
water vapour signals

(1) black solid triangles represent GPS stations w/o changes after correction;

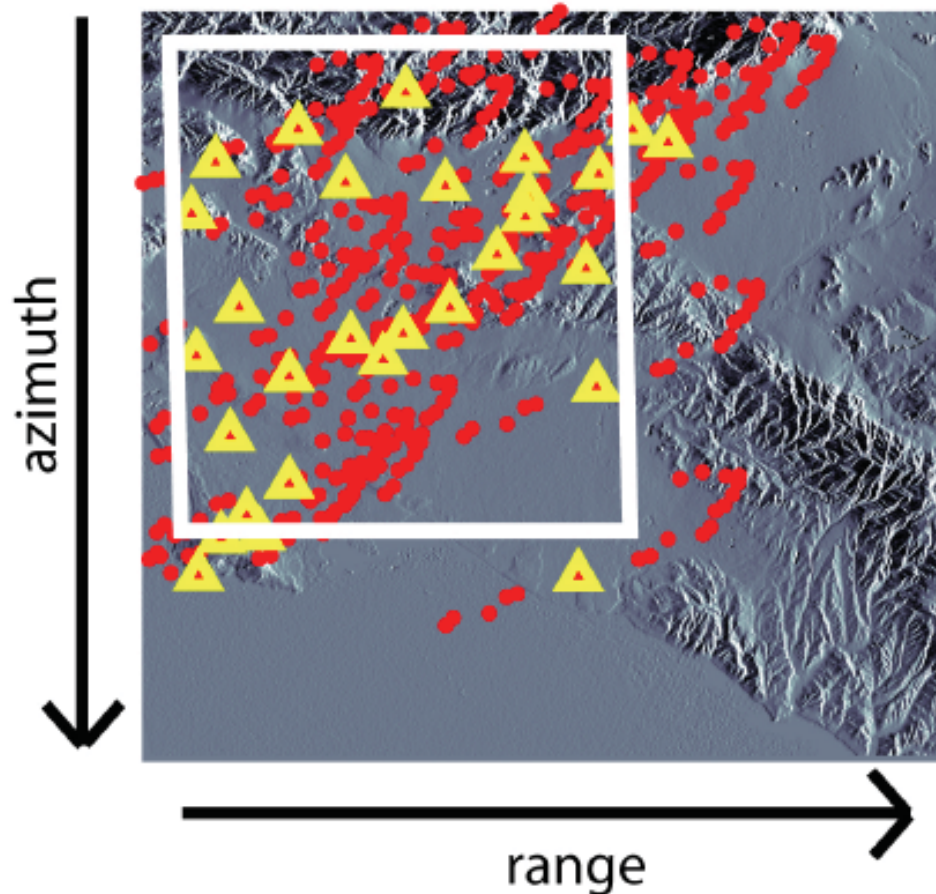
(2) white squares with black borders imply improvement after correction;

(3) red solid circles indicate deterioration after correction (Li et al., 2006, JGR)

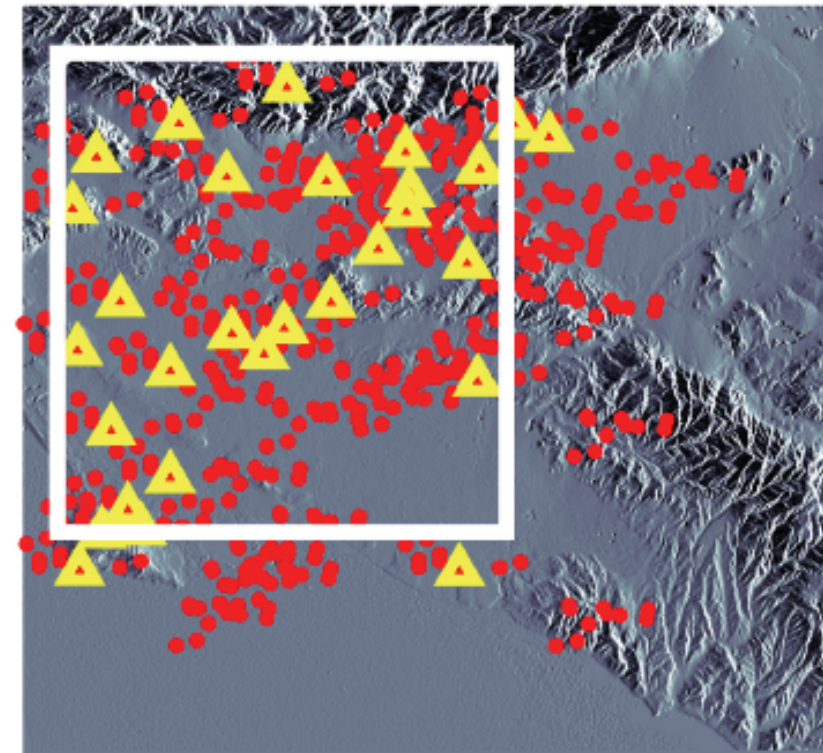


CGPS: Frozen-flow Air

Spatial distribution of GPS ZWD on Feb 5th 2000 after application of "frozen-flow" hypothesis



Spatial distribution of GPS ZWD on Nov 27th 1999 after application of "frozen-flow" hypothesis

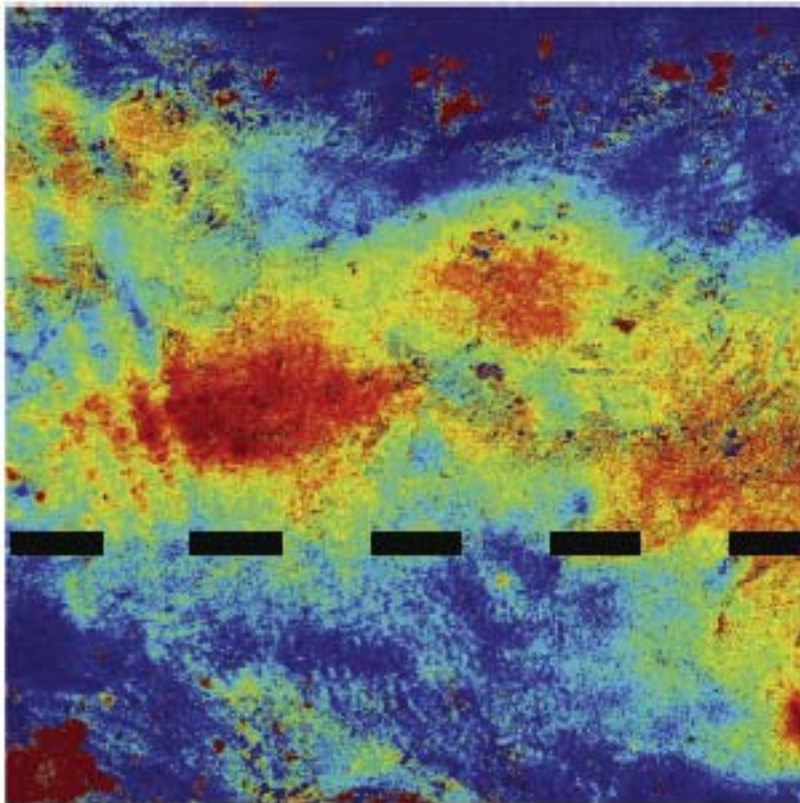


(Onn and Zebker, 2006)

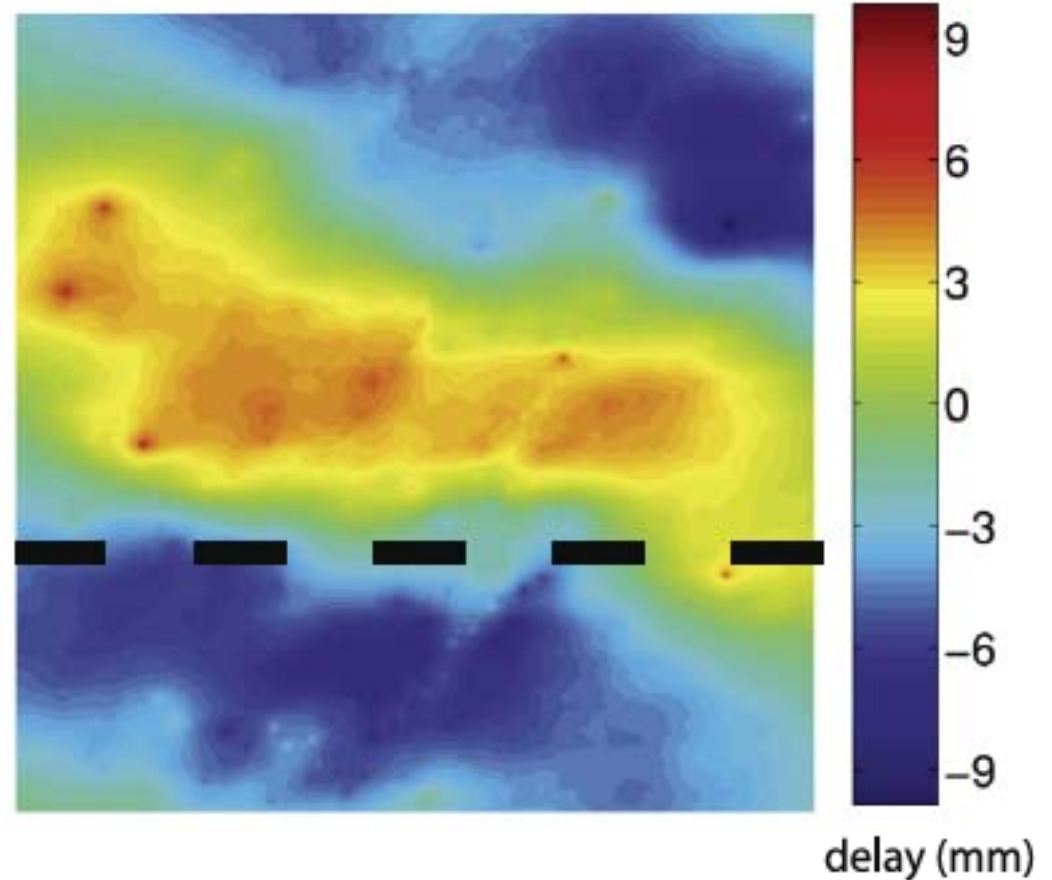


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CGPS: Frozen-flow Algorithm



Interferogram



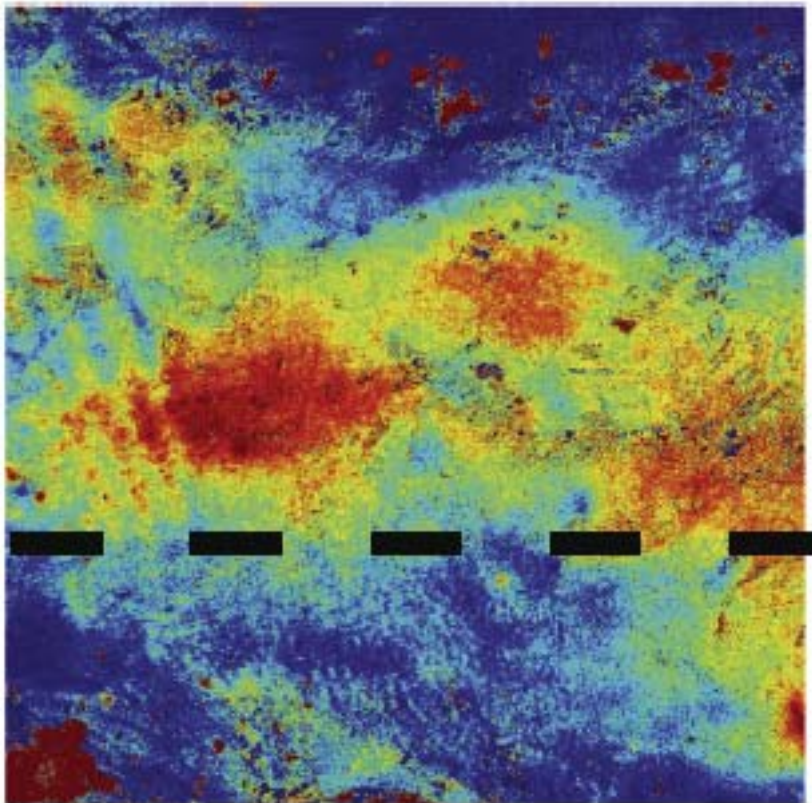
GPS 'Frozen-flow' Path Delay

(Onn and Zebker, 2006)

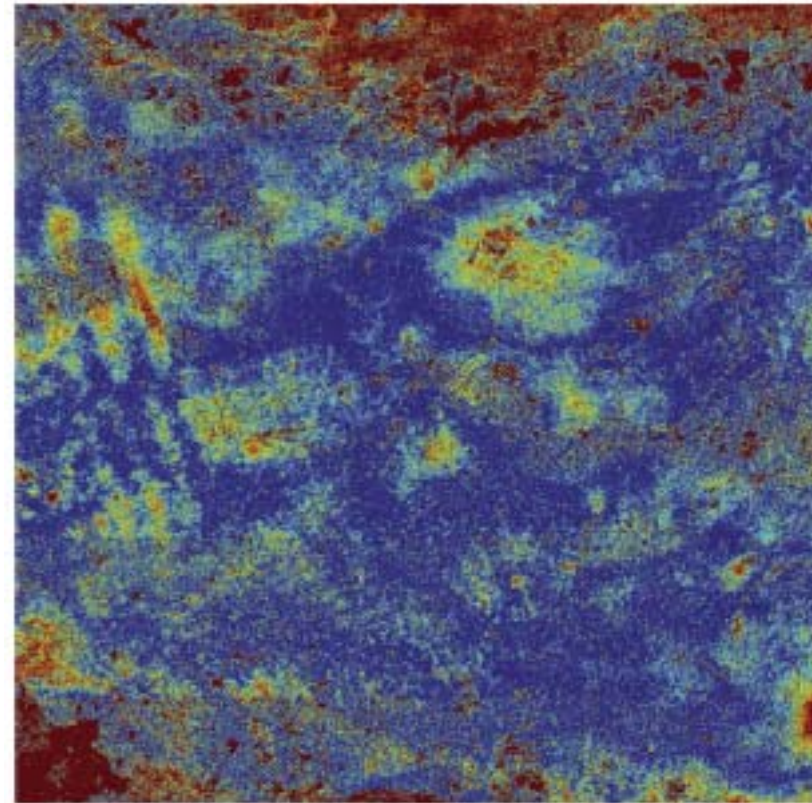


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CGPS: Frozen-flow Algorithm



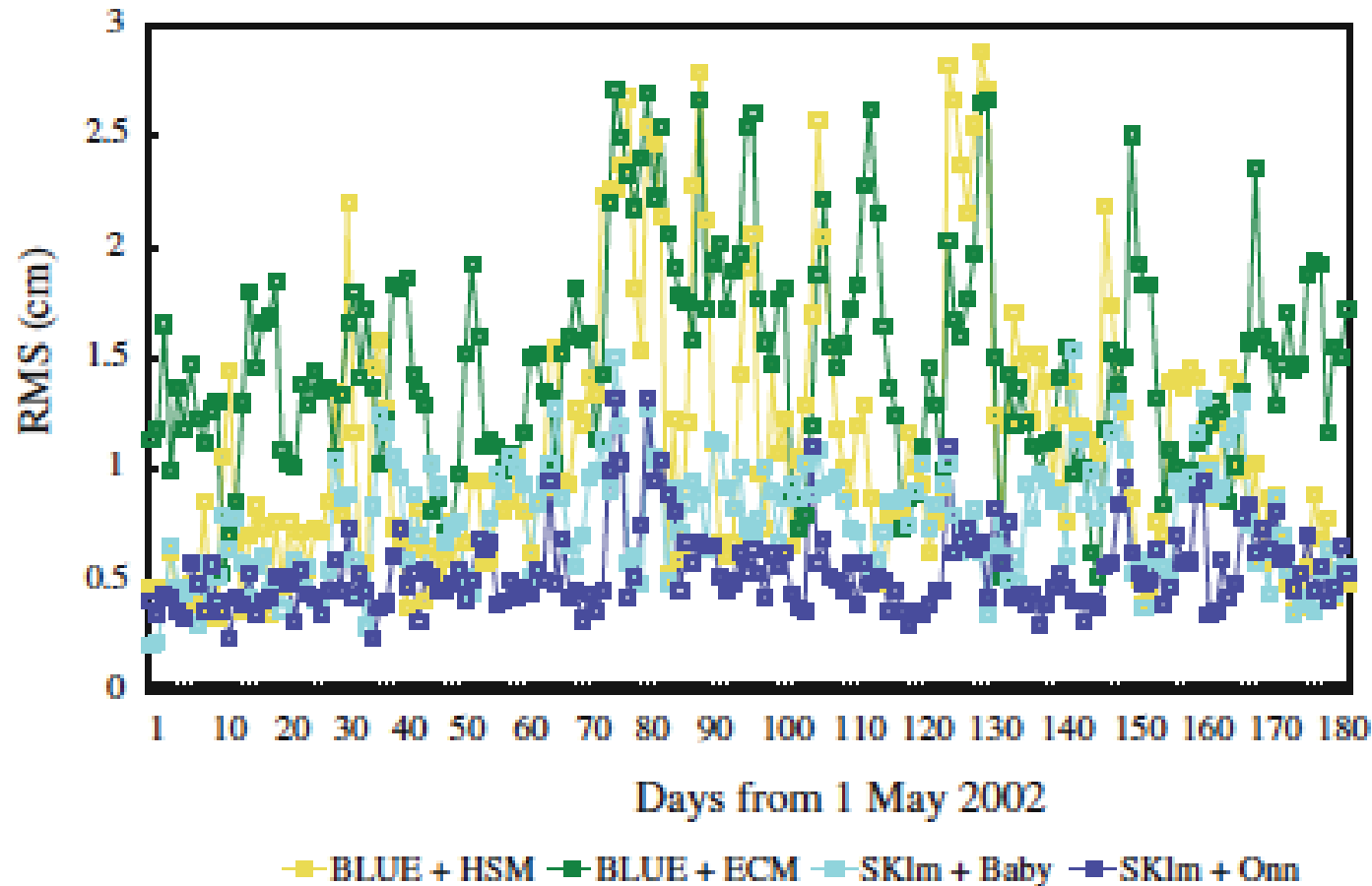
Interferogram



delay (mm)

Residual

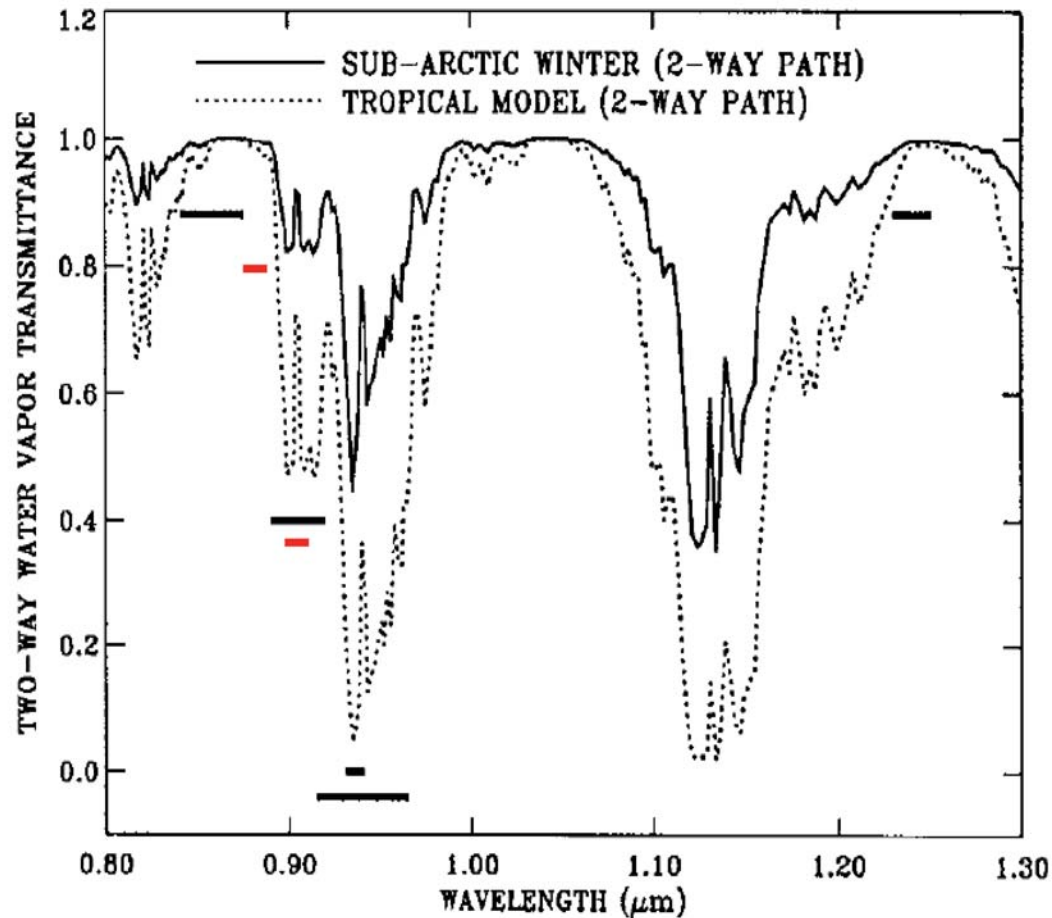
(Onn and Zebker, 2006)



(Xu et al., 2011, J. Geodesy)



MODIS/MERIS Channel Positions related with PWV



MODIS:

- ❖ 2 non-absorbing
- ❖ 3 absorbing

MERIS:

- ❖ 1 non-absorbing
- ❖ 1 absorbing

(Figure adapted from
Gao and Kaufman
[1998])

- ❖ PWV retrievals rely on channel ratio techniques



❖ Basic principles:

- There is a scale uncertainty in MODIS near-IR water vapour products (*Li et al.*, 2003, JGR)
- Only one continuous GPS station is required to calibrate MODIS scale uncertainty within a 2,030 km × 1,354 km MODIS scene
- GPS and MODIS data can be integrated to provide regional water vapour fields with a spatial resolution of 1 km × 1 km
- ~60 minute time difference between ENVISAT and MODIS

(Li et al., 2005, JGR)

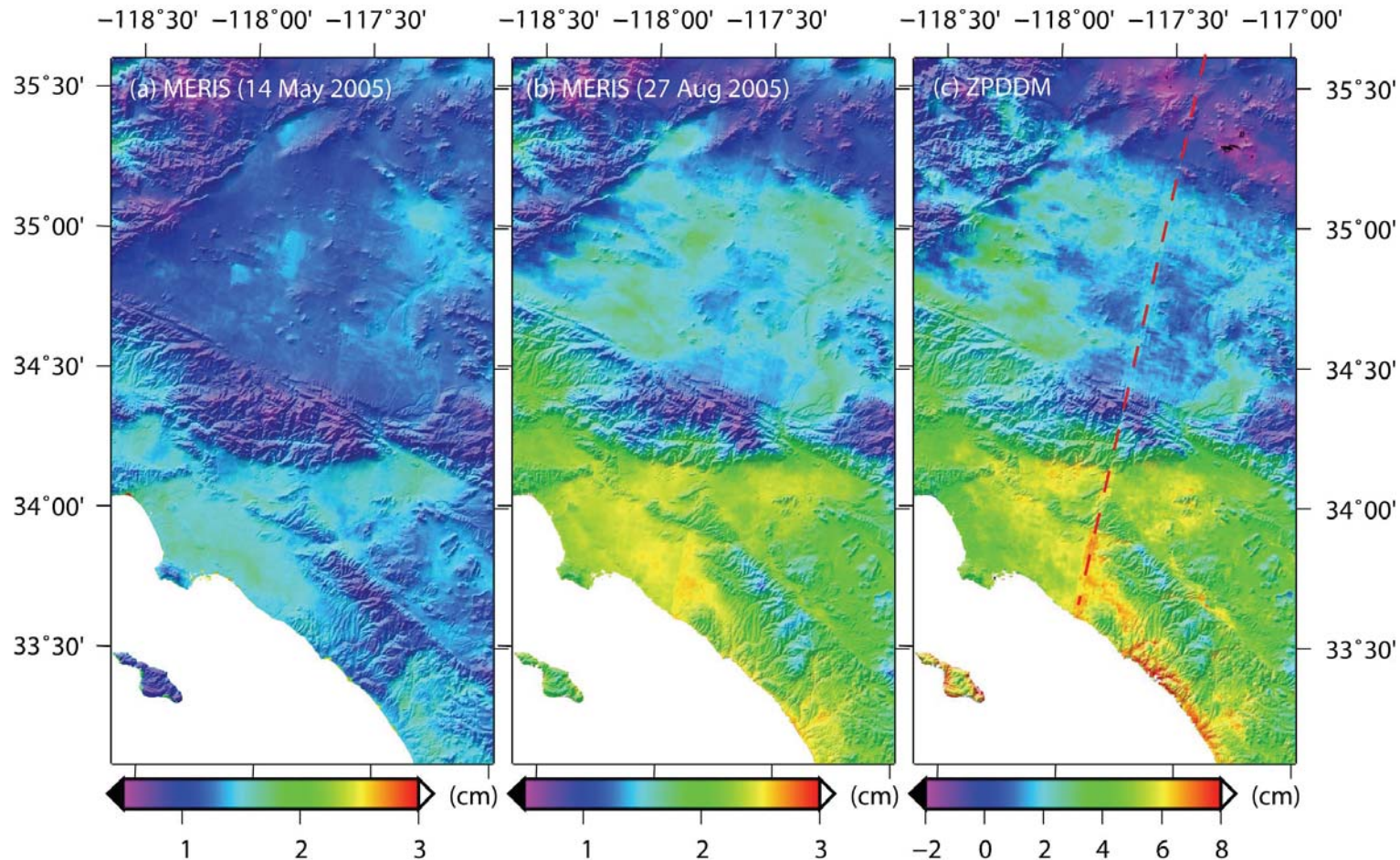


- MERIS data can be acquired at the same time as ASAR data (time differences between MODIS and SAR data: ~1 hour)
- MERIS has better spatial resolution, up to 300 m against 1km for MODIS
- MERIS near IR water vapour product agrees more closely with GPS than MODIS (though MODIS cloud mask is more robust)

(Li et al., 2006, GRL; Li et al., 2009, IJRS)



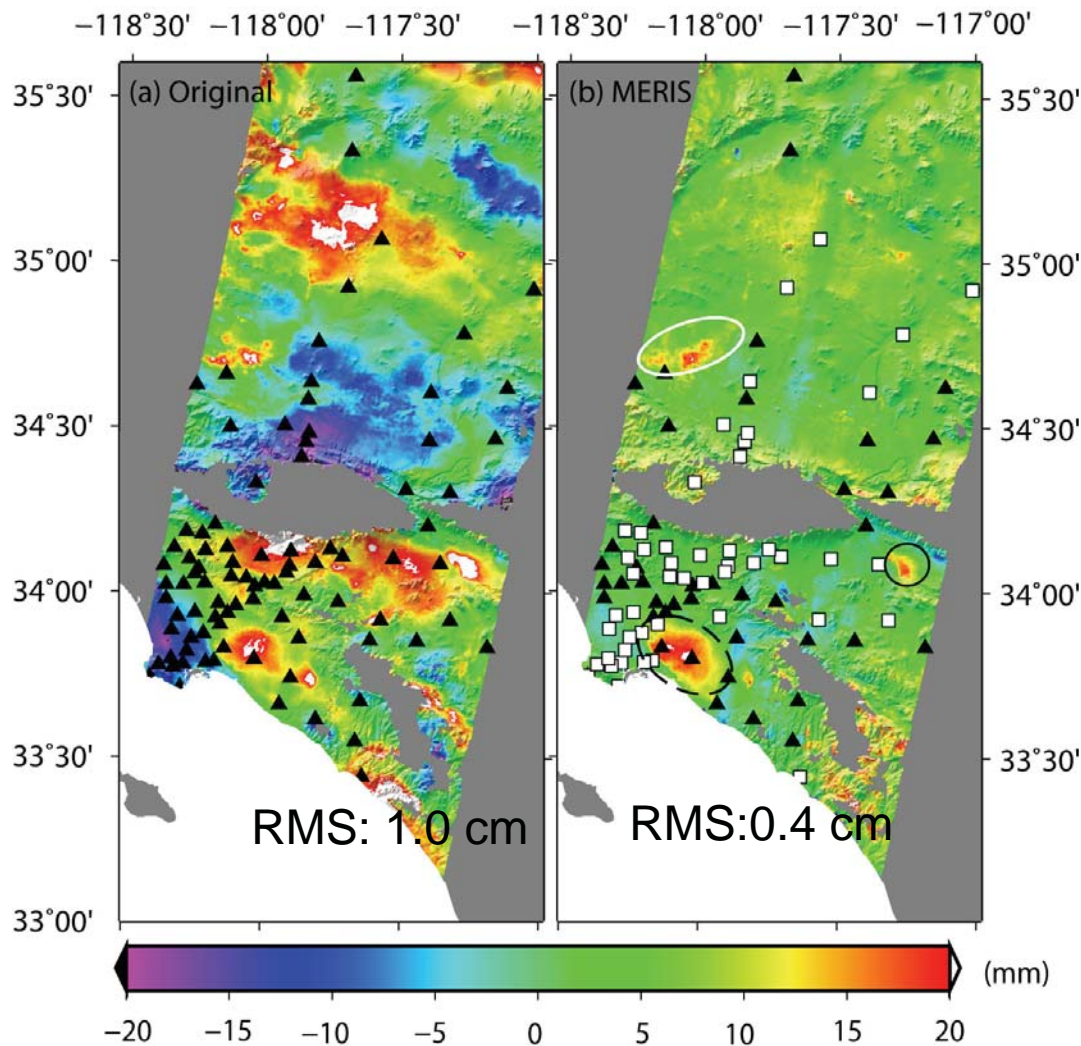
Southern California (20050514 – 20050827)



Red dashed line: MERIS camera border artefact (Camera 4)



(Los Angeles: 20050514-20050827)



➤ Range changes:
GPS vs. InSAR
1.0cm ⇒ 0.4cm

➤ Dashed black oval,
Solid white oval,
Solid black circle:
Subsidence

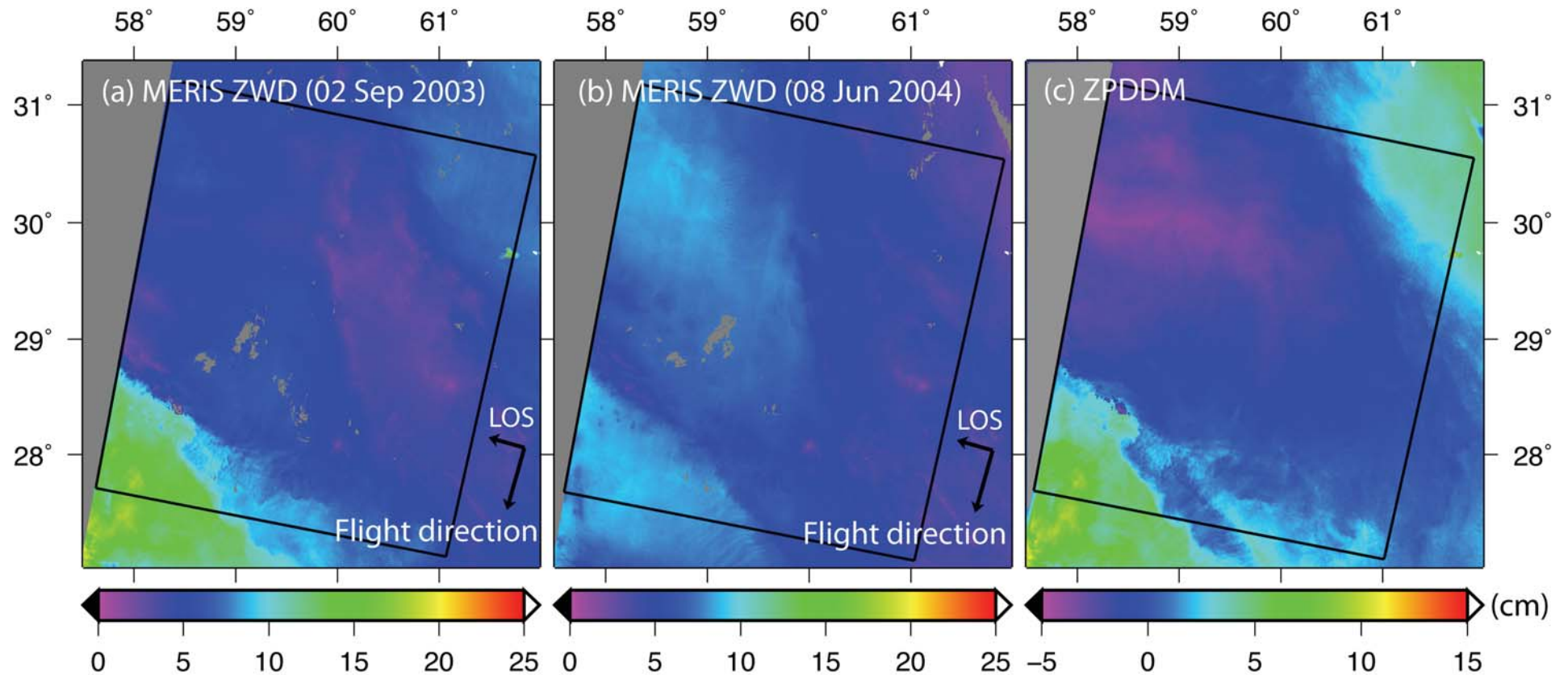
(1) black solid triangles represent
GPS stations w/o changes
after correction;

(2) white squares imply
improvement after correction.



MERIS water vapour and simulated Interferogram

Bam, Iran



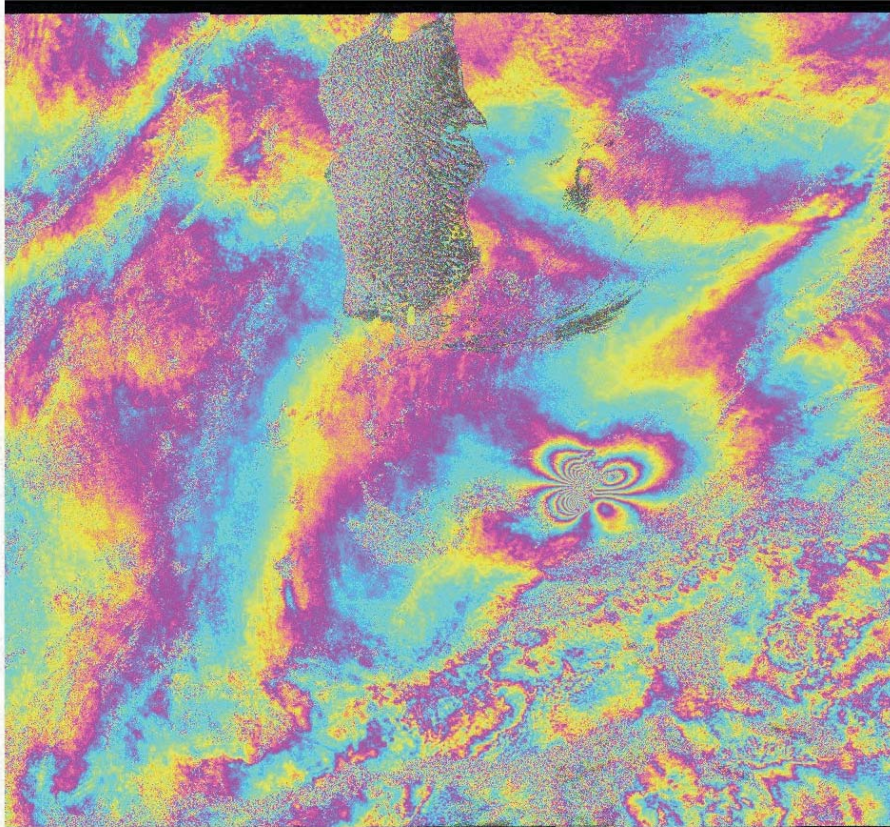
$$\mathbf{ZPDDM} = \mathbf{ZPD} (\text{Day 2}) - \mathbf{ZPD} (\text{Day 1})$$

(Li et al., 2011, IEEE GRSL)

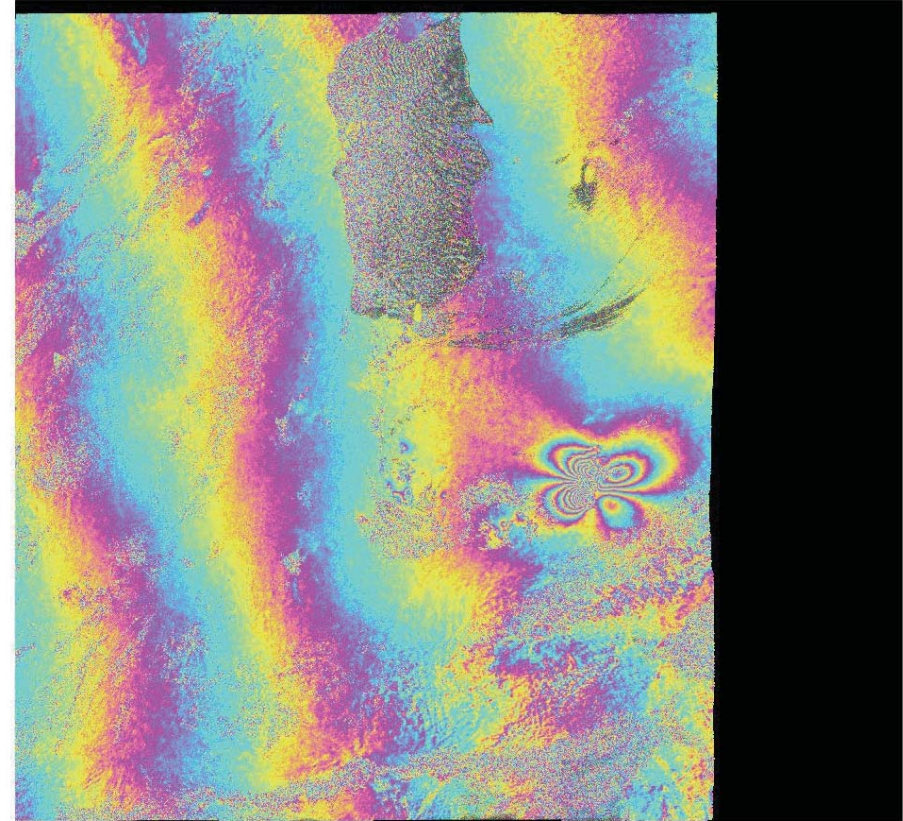


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MERIS water vapour correction model for WS ASAR (Bam)



Original Interferogram



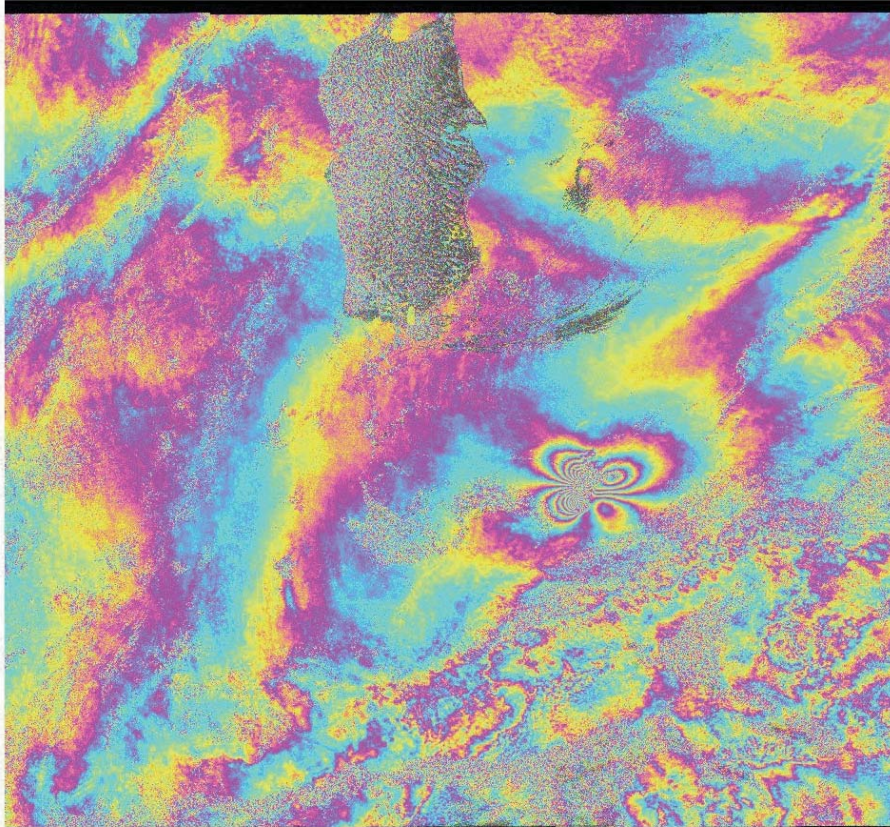
After MERIS water vapour
correction

(Li et al., 2011, IEEE GRSL)

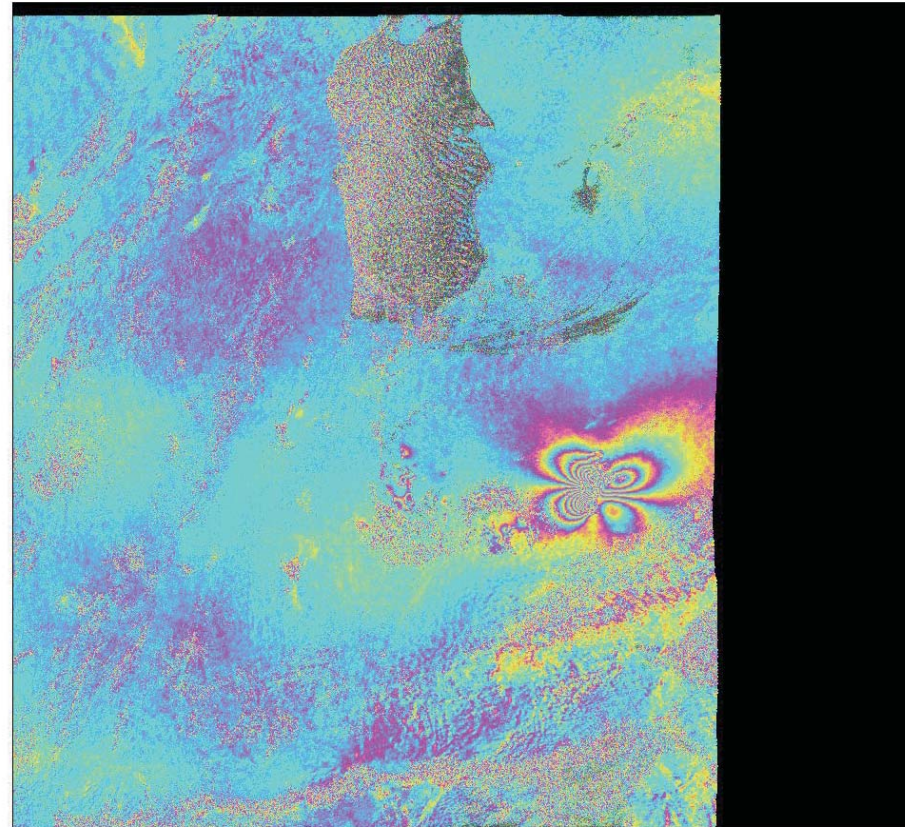


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MERIS water vapour correction model for WS ASAR (Bam)



Original Interferogram



After orbital ramp removal

(Li et al., 2011, IEEE GRSL)



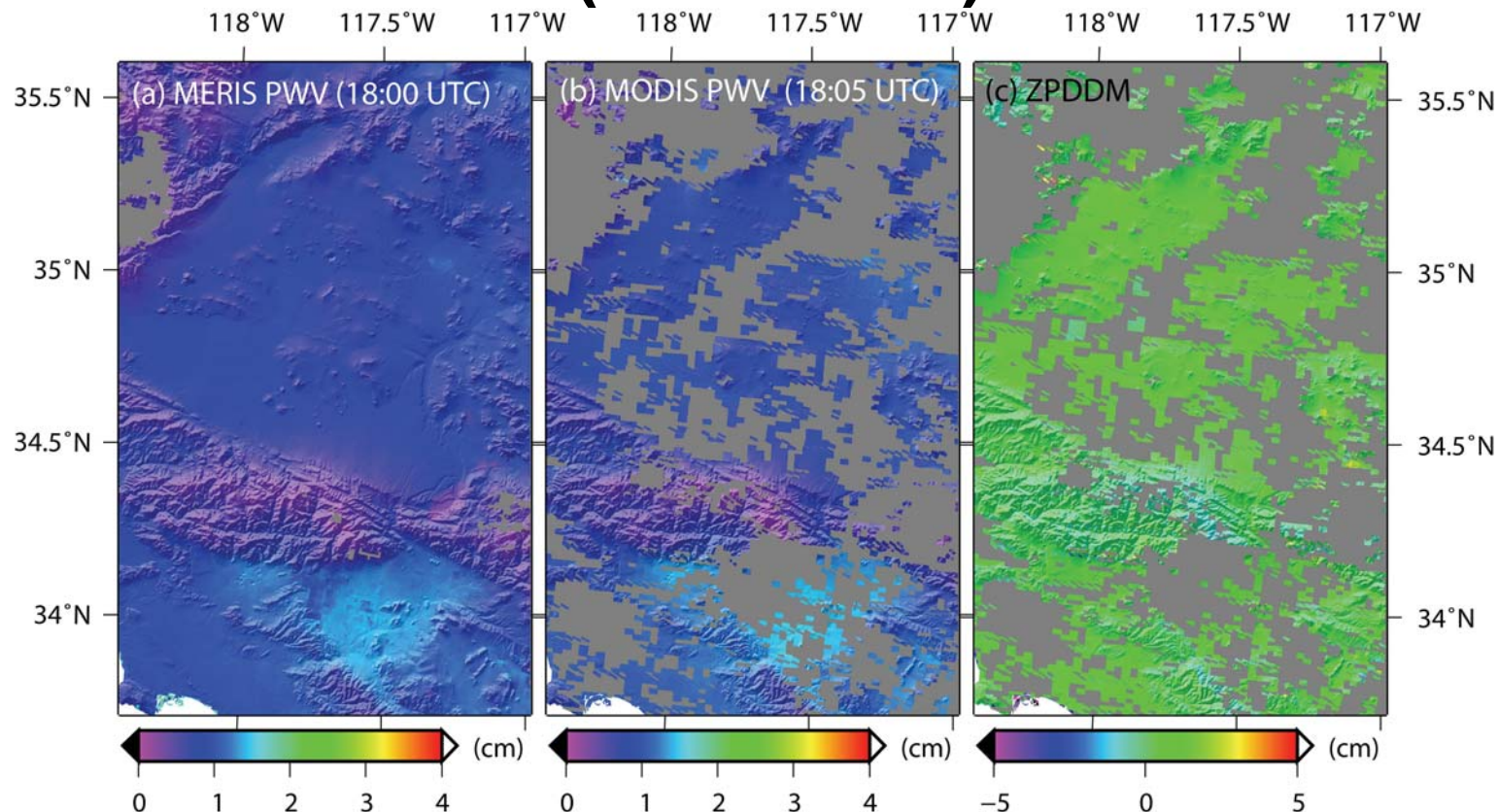
Time differences between MODIS and ERS/Envisat

- Terra MODIS descending node: **10:30 am** (local time)
- ERS-2 descending node: **10:30 am** (local time)
- ENVISAT descending node: **10:00 am** (local time)
- MODIS-ERS time difference: **<60 min** (usually)
- MODIS-ASAR time difference: **30~60 min** (normally)



Impact of time differences

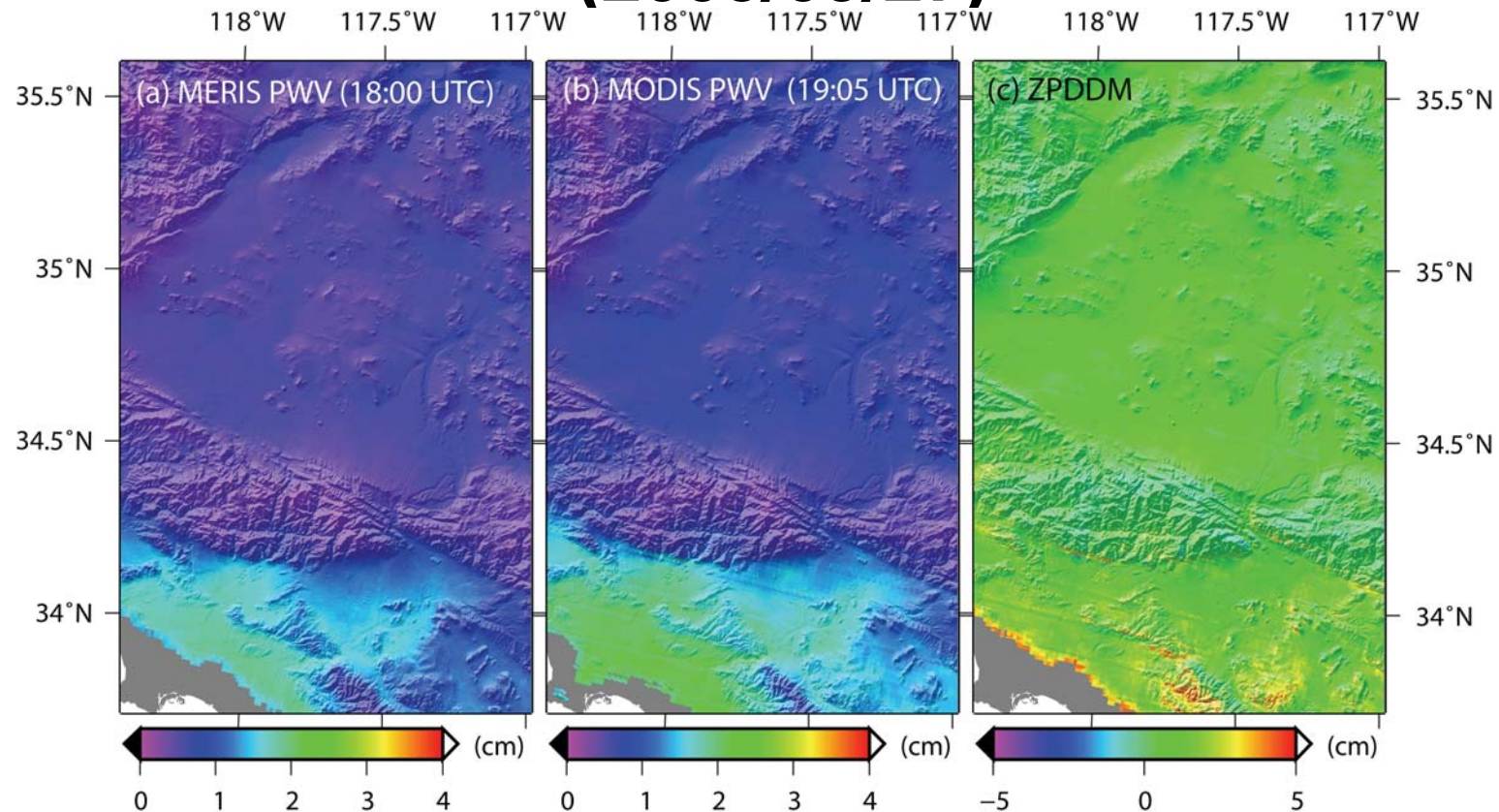
(2005/01/29)



- Time difference across scene: **5 min**
- Little water vapour variation



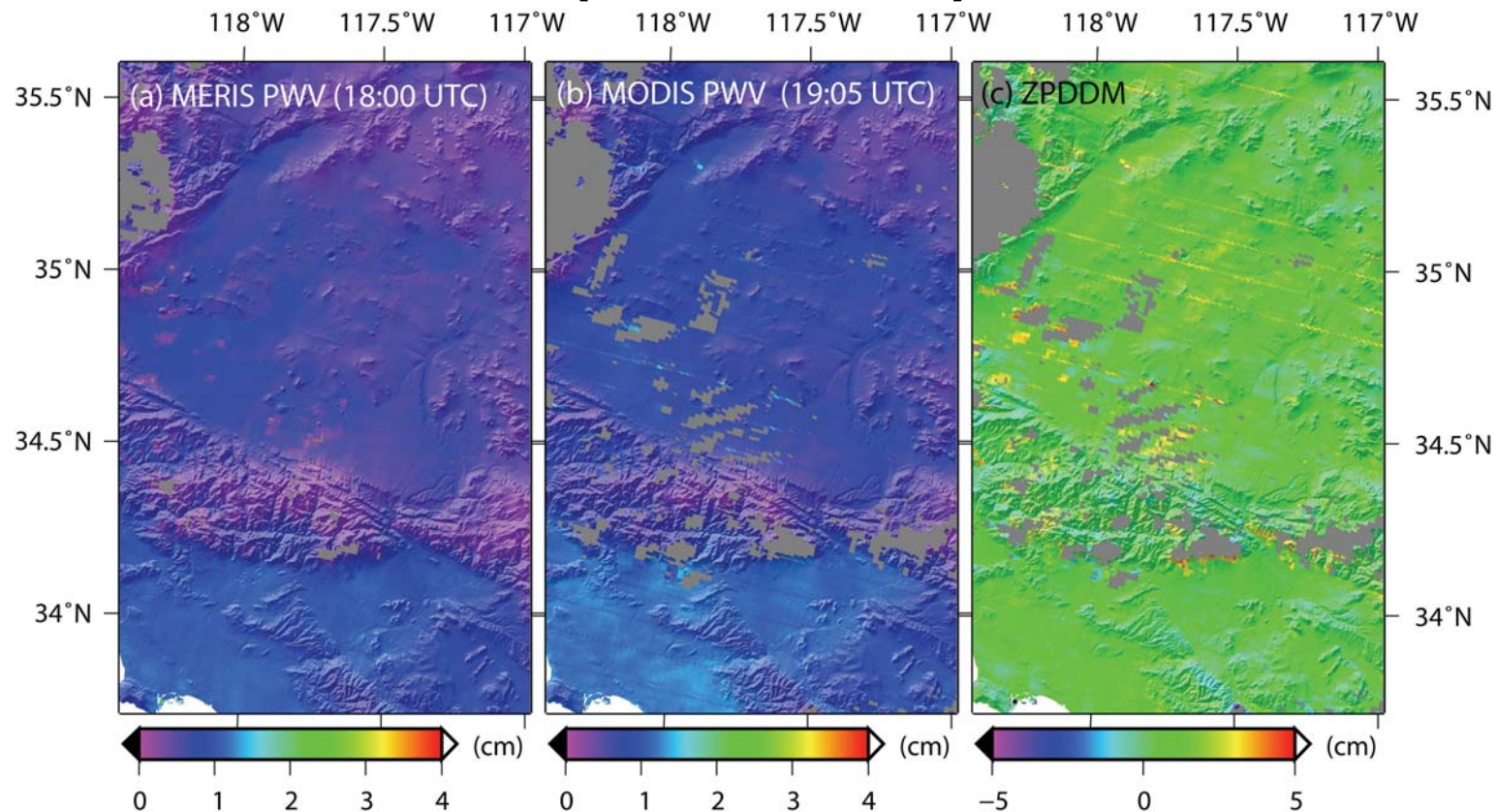
(2003/09/27)



- Time difference across scene: **65 min**
- Little water vapour variation



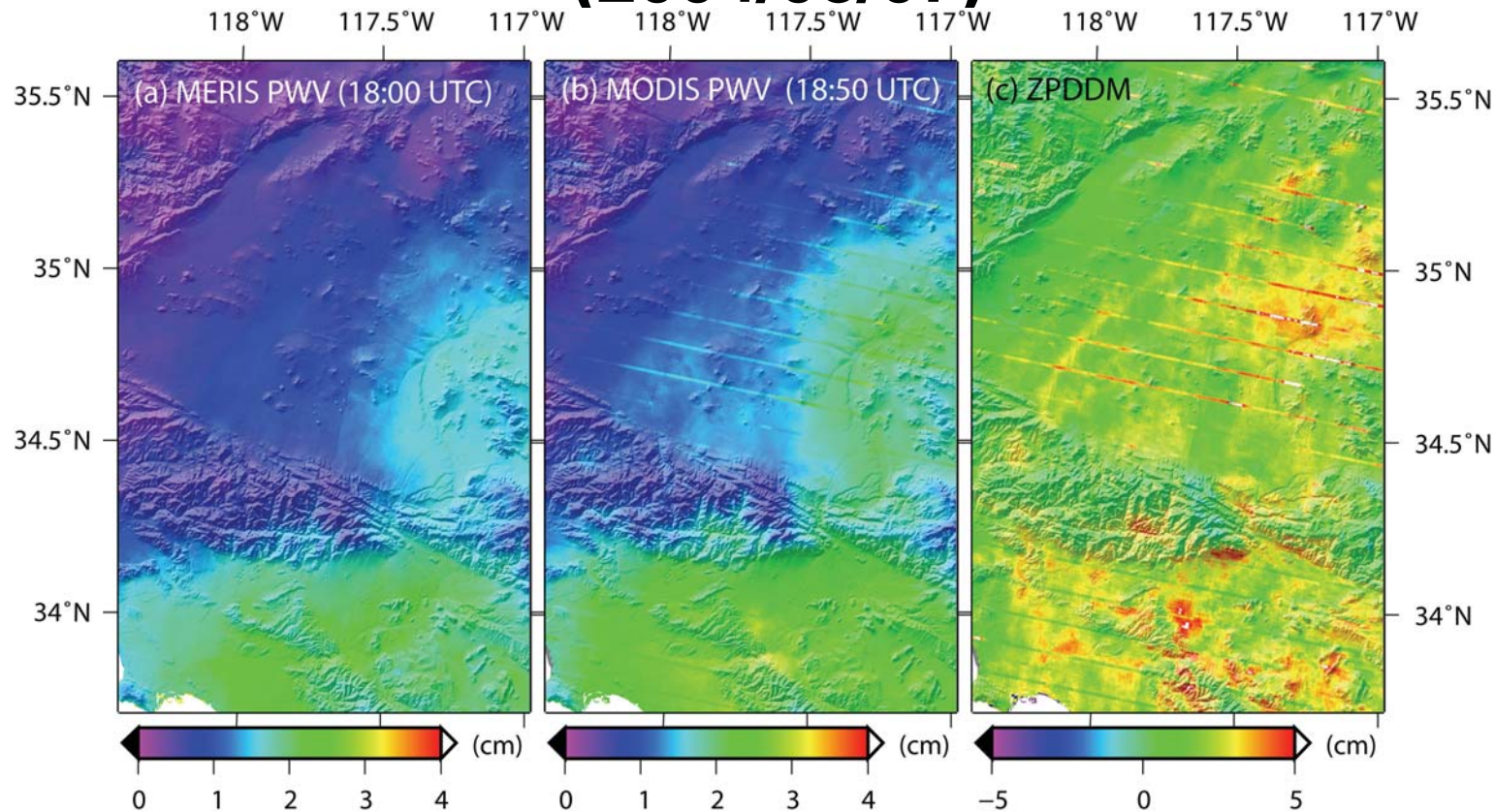
(2005/04/09)



- Time difference across scene: **65 min**
- Little water vapour variation



(2004/08/07)

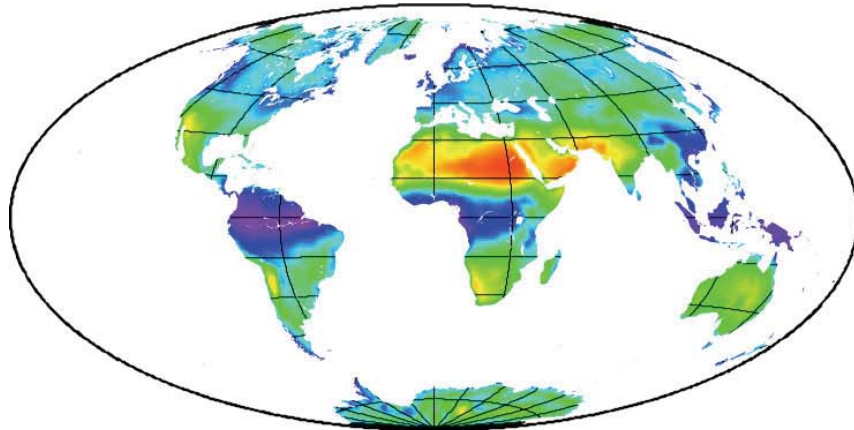


- Time difference across scene: **50 min**
- Strong local water vapour variation

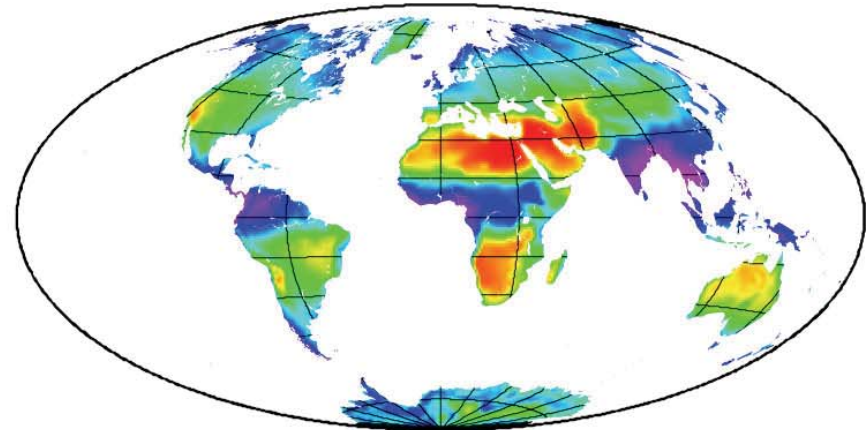
NB: Stripes are due to radiometric calibration errors in MODIS sensors.

Seasonal Frequencies of cloud free conditions

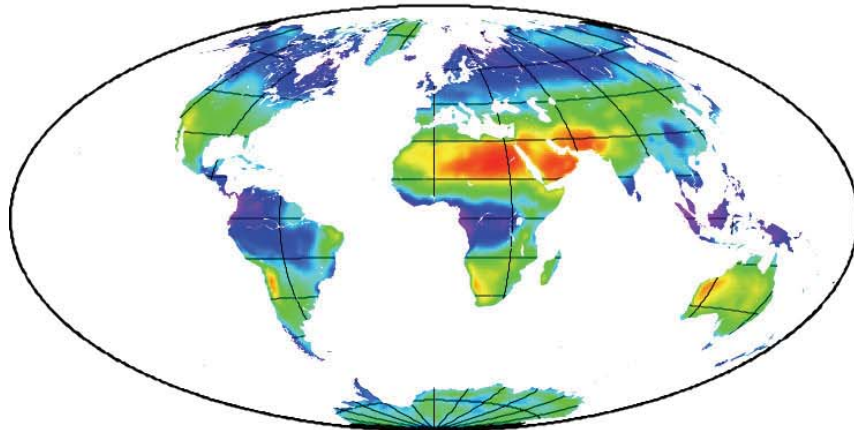
(a) Boreal Spring



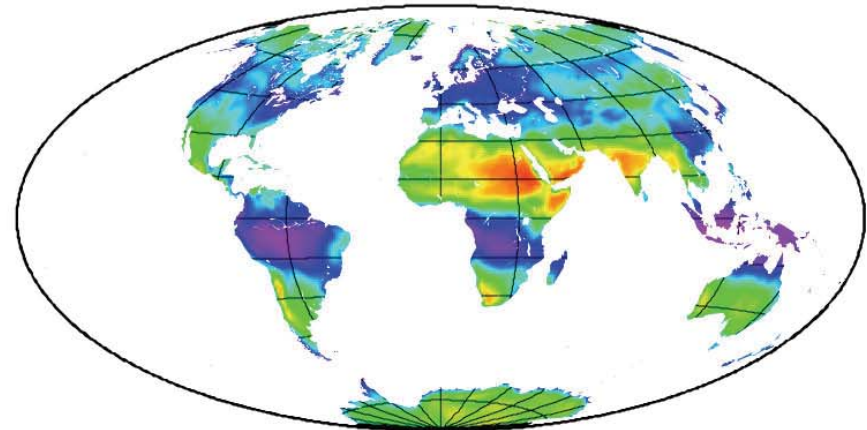
(b) Boreal Summer



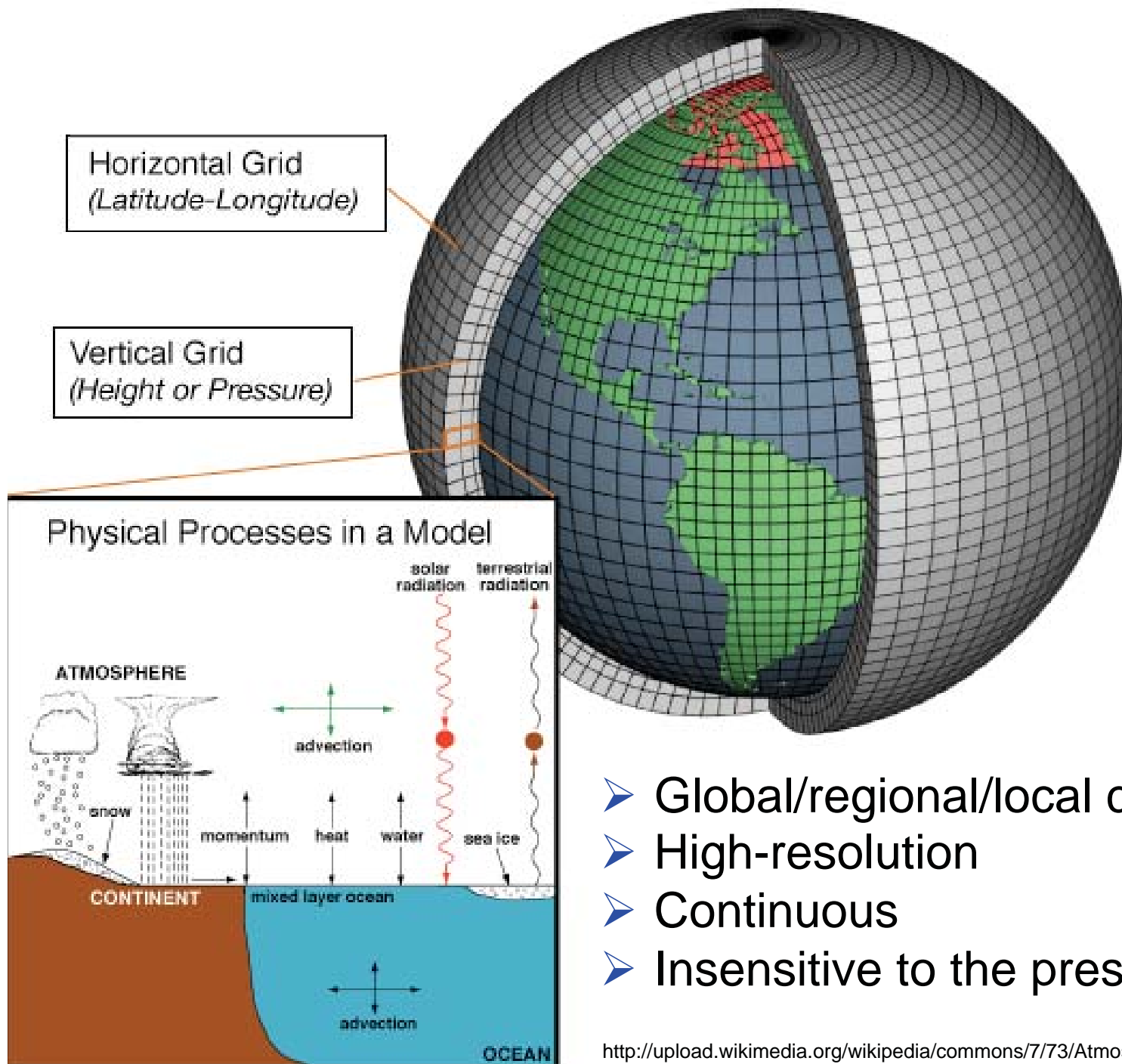
(c) Boreal Autumn



(d) Boreal Winter



Numerical Weather Models



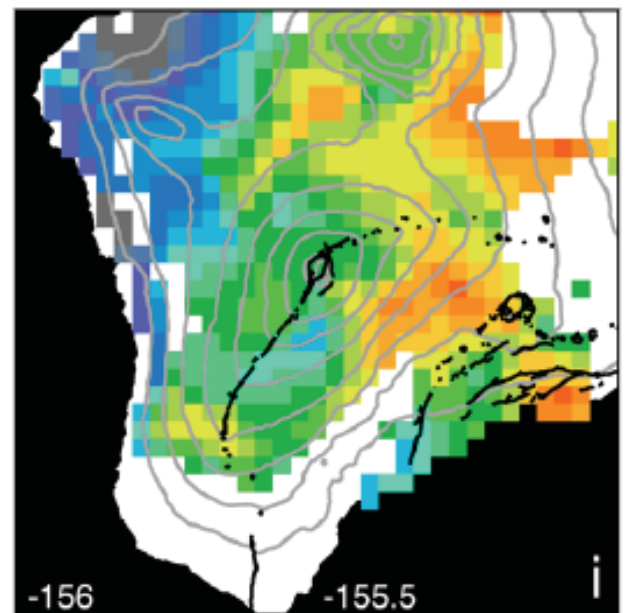
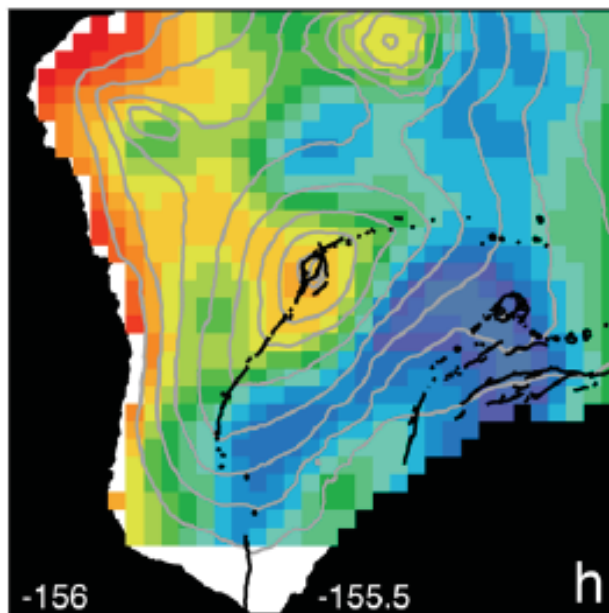
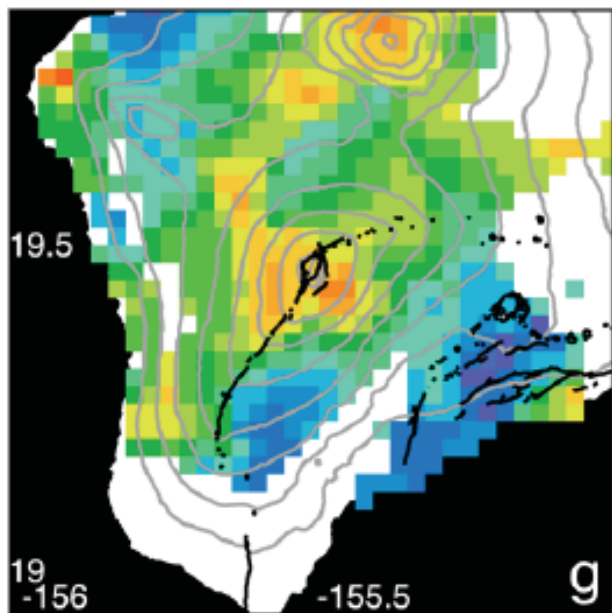
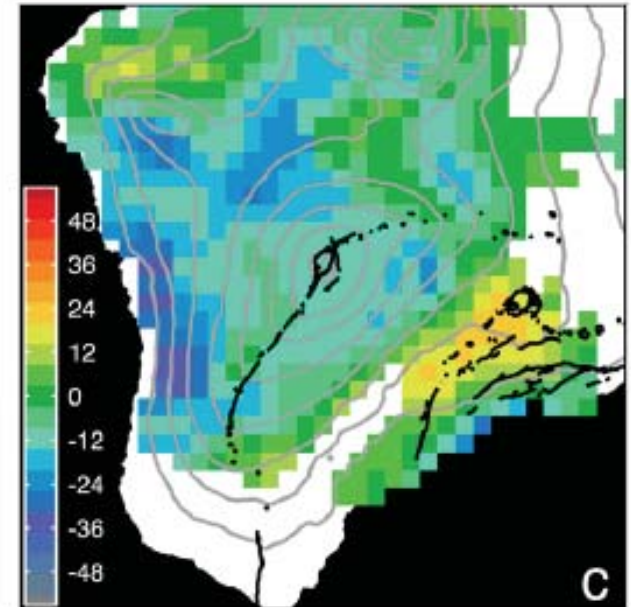
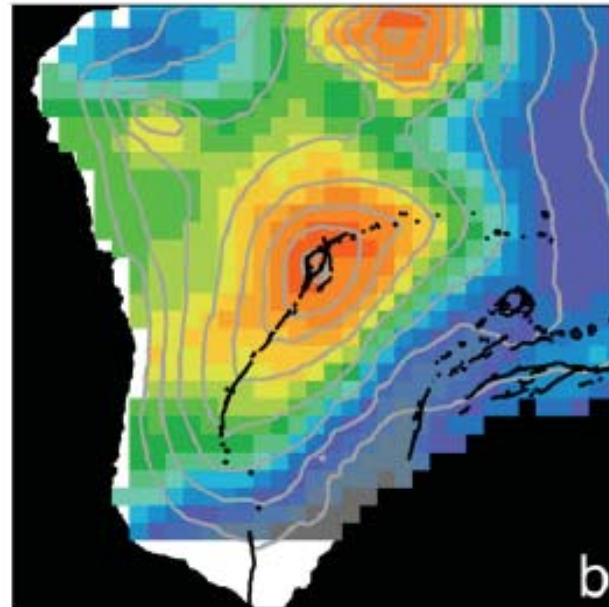
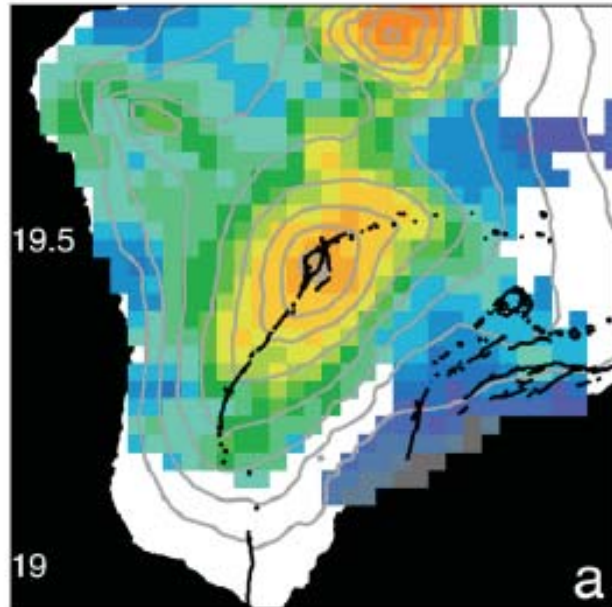
- Global/regional/local coverage
- High-resolution
- Continuous
- Insensitive to the presence of clouds

MM5: case studies

InSAR

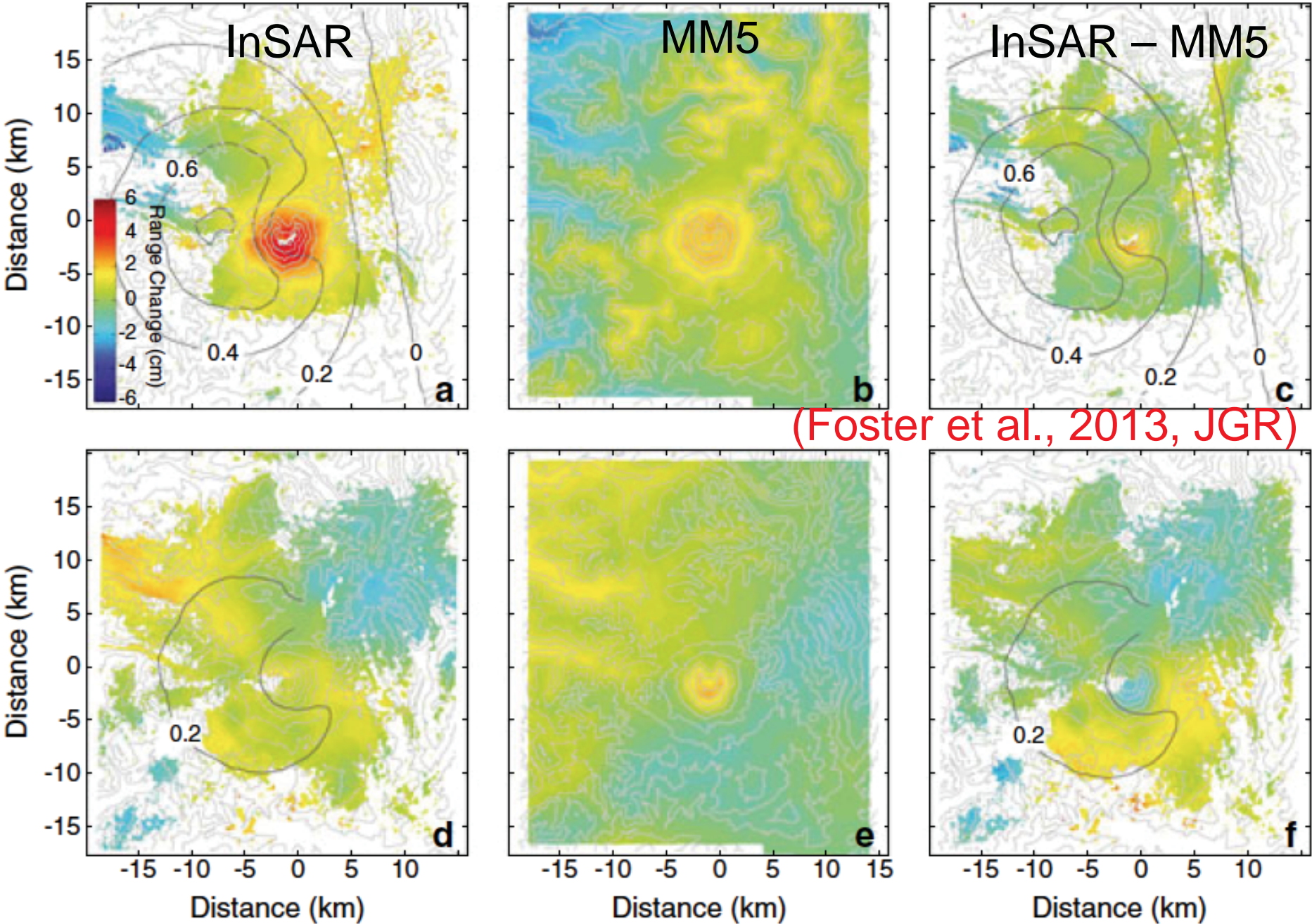
MM5

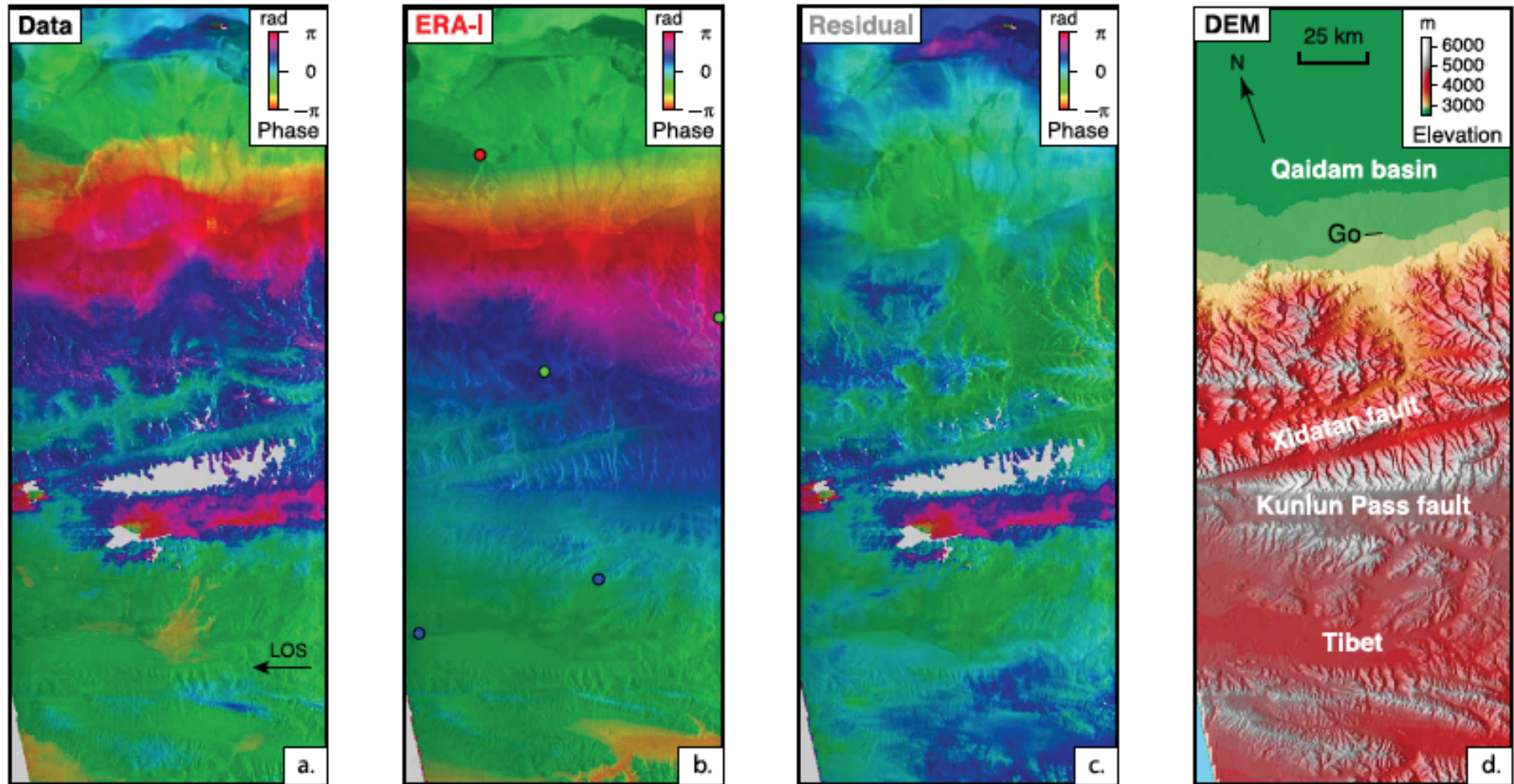
InSAR - MM5



(Foster et al., 2006, GRL)

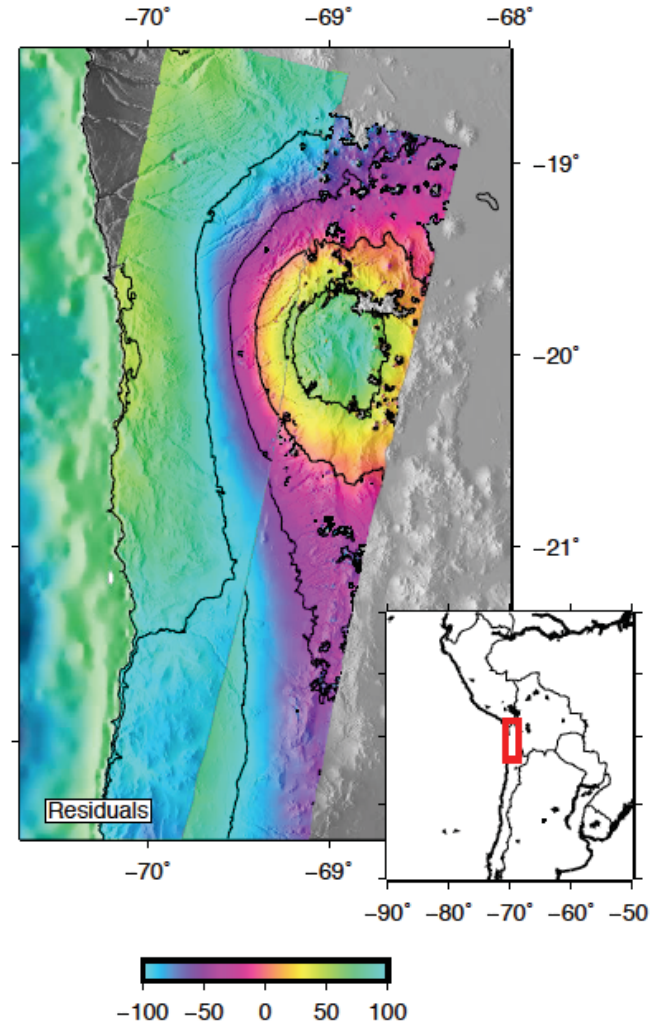
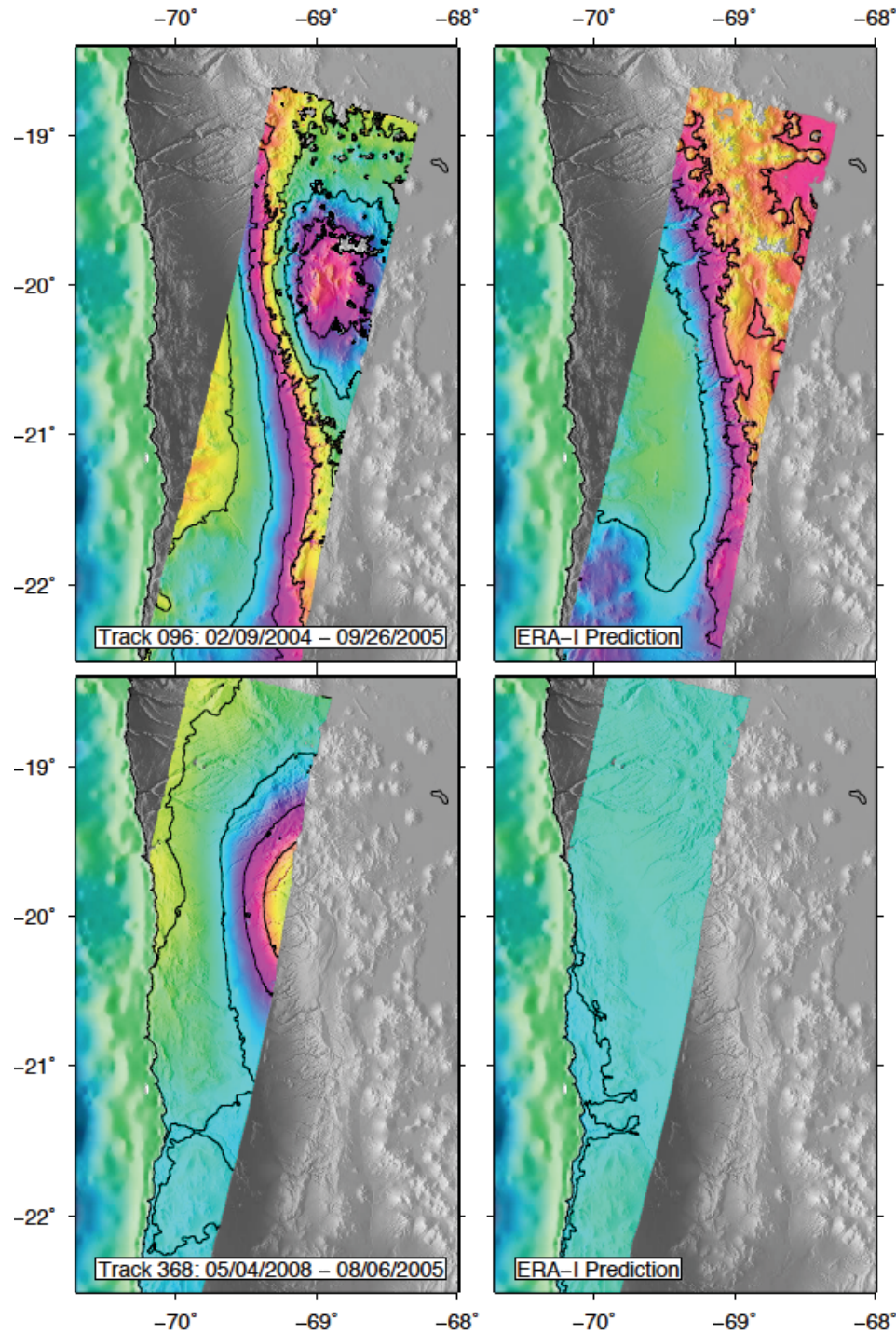
MM5 Assimilation: case studies





(Jolivet et al., 2011, GRL)

ECMWF ERA-Interim



(Jolivet et al., 2013, in review for JGR)



OSCAR: Online Services for Correcting Atmosphere in Radar

- Time series filtering or estimation
- Correlation of phase with topography
- CGPS (Continuous Global Positioning System) zenith wet delay interpolated spatially and temporally
- Total column water vapor from absorption of reflected near IR (MODIS and MERIS)
- Water vapor measurements (profiling and total column) from thermal IR and MW (AIRS, MODIS, AMSU)
- European Center for Medium Range Weather Forecasting (ECMWF)
- NOAA NCEP North American Mesoscale Model (NAM)

**InSAR
Derived**

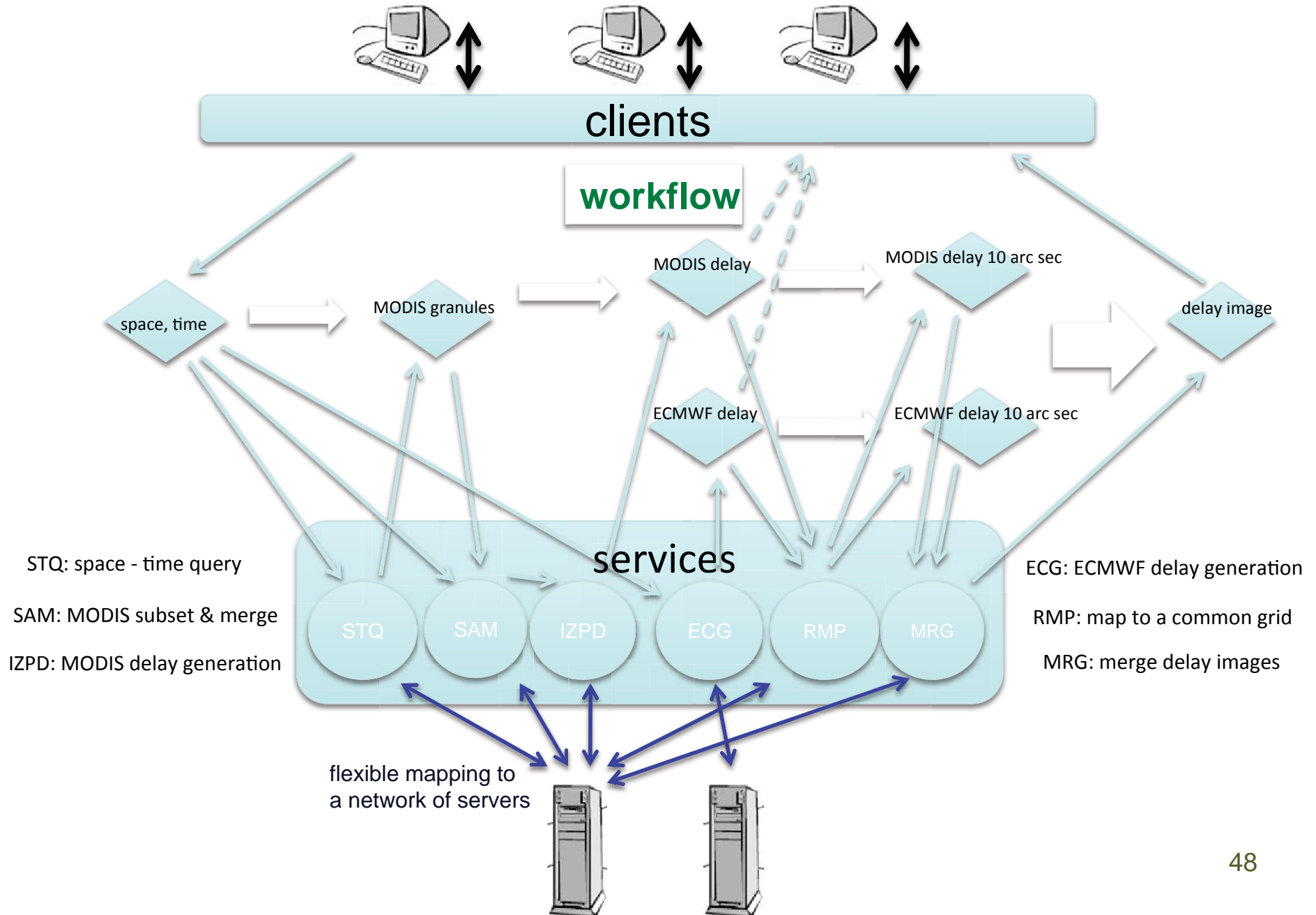
**Ground-
Based**

**Remote-
Sensed**

**Numerical
Weather
Forecast
Models**

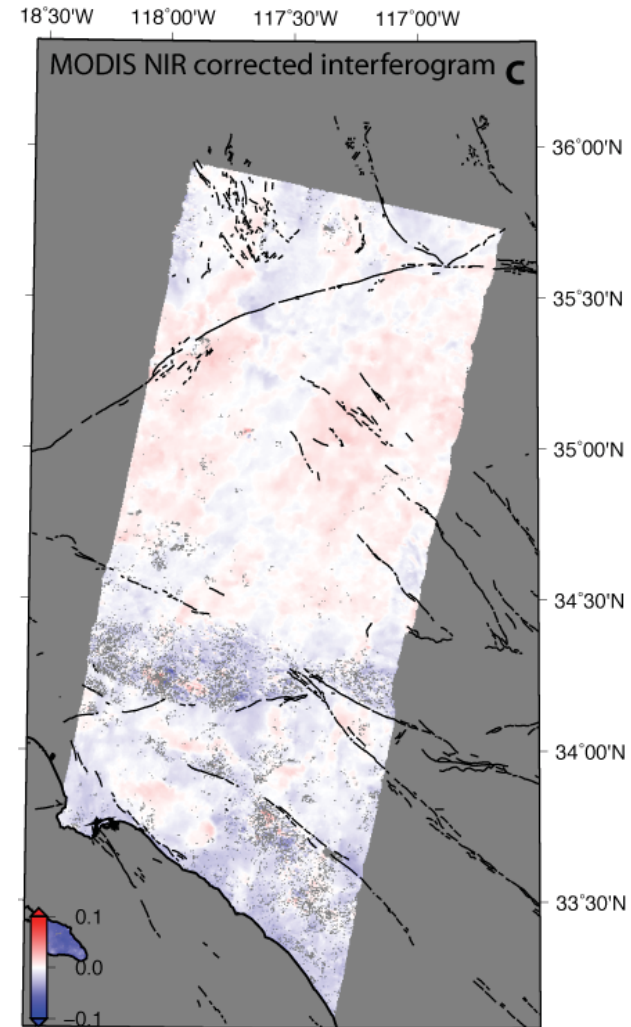
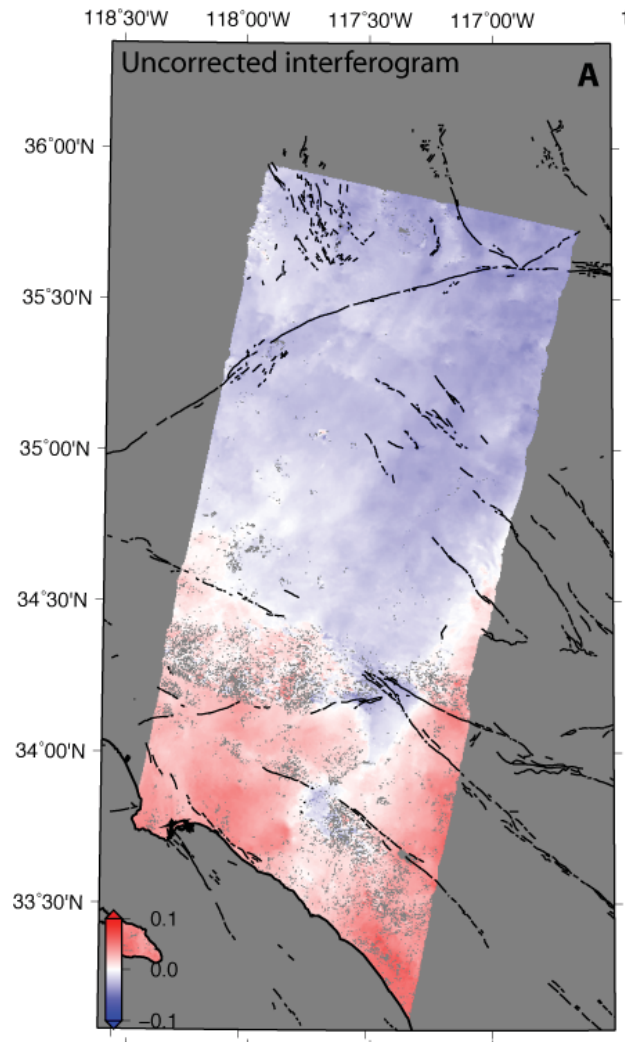
OSCAR is a web service that locates, retrieves, and merges these data sets to derive an optimal, best estimate of tropospheric delay

Functional Architecture Diagram





Example of OSCAR MODIS correction



Original interferogram

MODIS-corrected interferogram



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JPL OSCAR



Jet Propulsion Laboratory
California Institute of Technology

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Online Services for Correcting Atmosphere in Radar (OSCAR)

Objectives

1. Use web services technology to accurately estimate spatial distribution of water vapor, at high resolution, at the times of image acquisition for existing InSAR missions and DESDynI
2. Improve efficiency and increase data availability in the Earth Science community via an automated system
3. Improve InSAR imagery for crustal deformation, ice motion & biomass measurements

Services

[Read more.](#)

Clients

Sample clients in [python](#), [matlab](#), or [web browser](#).

Partners and Customers

[Links to collaborators and customers.](#)

[PRIVACY](#) | [IMAGE POLICY](#)

Site Manager: Paul von Allmen
JPL Clearance: CL#11-3402

(<http://oscar.jpl.nasa.gov>)



Comparisons: InSAR correction models

Models	GPS	MERIS/MODIS	NWM
Coverage	Regional/Local	Global	Global
Observation period	Day and Night	Day (Near IR)	Day and Night
Spatial resolution	A few to tens of km	0.3 – 1.2 km	Up to 100s metres
Temporal resolution	Almost continuous (e.g. 5 min)	Up to 4 times a day	Often 6 hours
Sensitivity to clouds	NO	YES	NO
PWV accuracy	~1 mm	1.6-2.0 mm	~2 mm (WRF; Gonzalez et al., 2013)
InSAR accuracy	5-10 mm	5-10 mm	???



- Uncertainties in PWV from different Numerical Weather Models (ECMWF, UM, MM5 or WRF) in different places at different times?
- Which NWM is the best for InSAR correction? Why? When? Where?
- What is the optimal procedure to use NWM for InSAR correction? For individual interferograms? For time series analysis?
- In the cases without ground truth, how to ensure the usability of NWM-based correction models?



University
of Glasgow

**Thank
you !**





OSCAR: Online Services for Correcting Atmosphere in Radar

- **Time series filtering or estimation**
- **Correlation of phase with topography**
- CGPS (Continuous Global Positioning System) zenith wet delay interpolated spatially and temporally
- Total column water vapor from absorption of reflected near IR (MODIS and MERIS)
- Water vapor measurements (profiling and total column) from thermal IR and MW (AIRS, MODIS, AMSU)
- European Center for Medium Range Weather Forecasting (ECMWF)
- NOAA NCEP North American Mesoscale Model (NAM)

**InSAR
Derived**

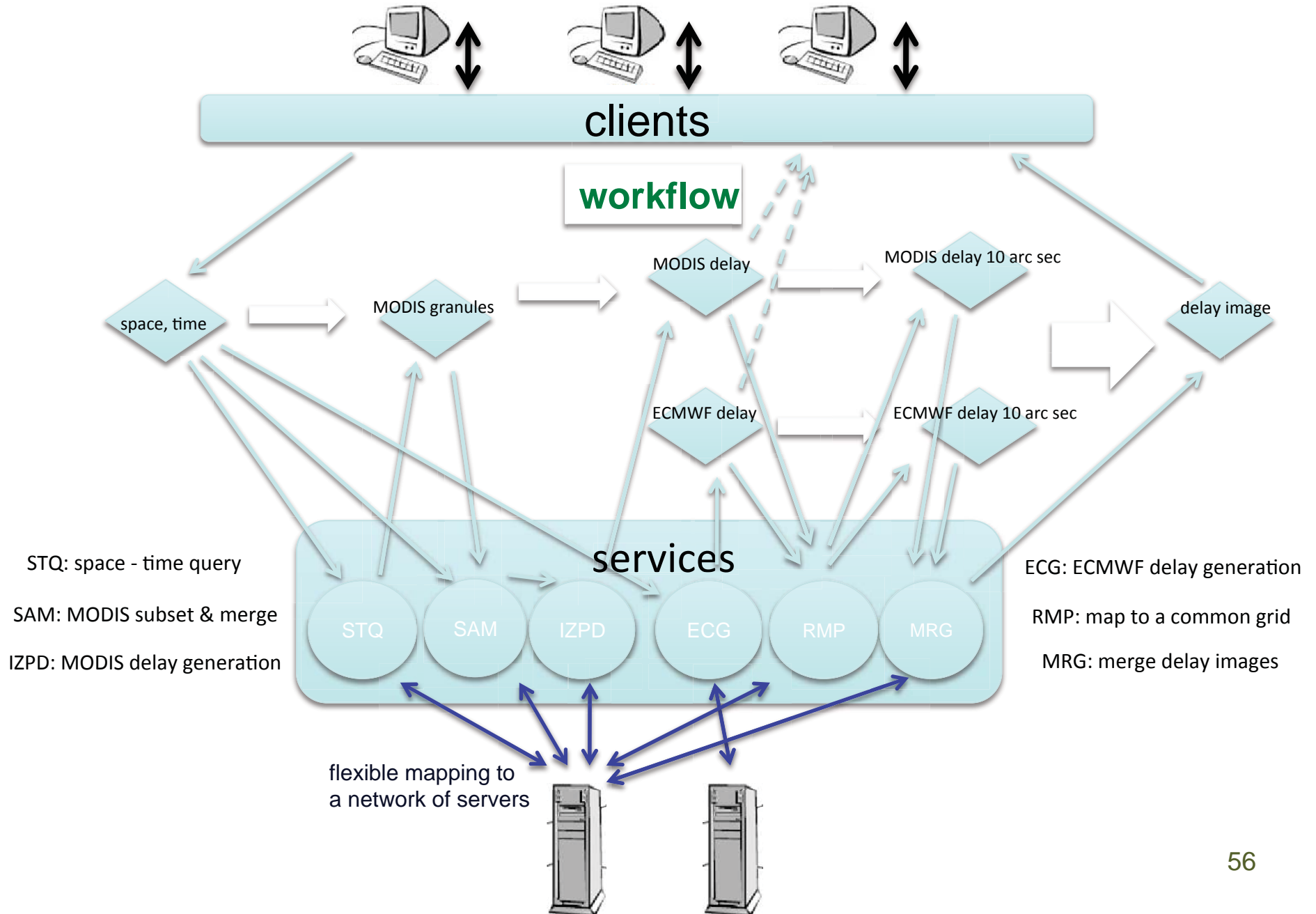
**Ground-
Based**

**Remote-
Sensed**

**Numerical
Weather
Forecast
Models**

OSCAR is a web service that locates, retrieves, and merges these data sets to derive an optimal, best estimate of tropospheric delay

Functional Architecture Diagram

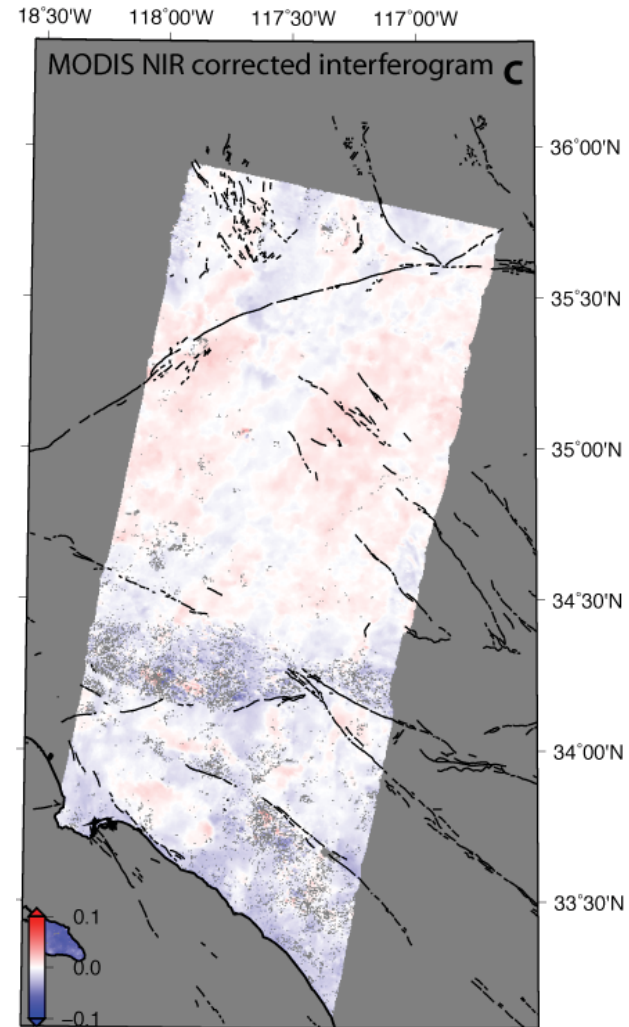
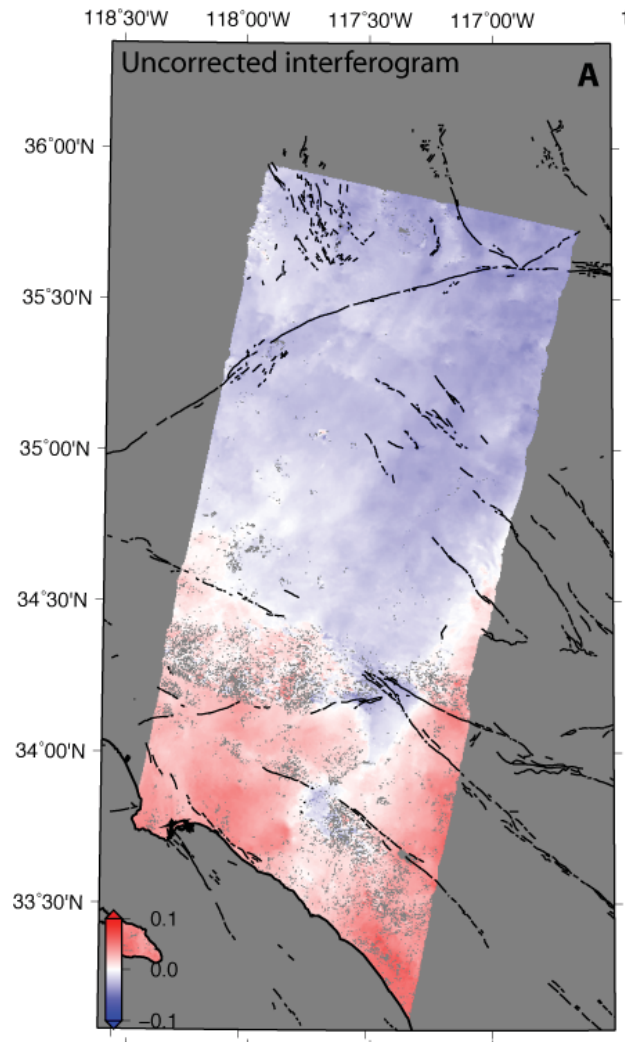




1. User selects InSAR scenes, where OSCAR will compute tropospheric delays
2. User selects data to use for corrections (MODIS, MERIS, AIRS, ECMWF, NAM)
3. User provides OSCAR client with spatial bound box and temporal constraints
4. OSCAR retrieves the URL of data granules corresponding to spatio-temporal constraints
5. OSCAR merges granules and subsets the data
6. OSCAR returns the delays on a latitude-longitude grid
7. User applies gridded delays to InSAR scenes in data processing package (e.g., ROI_PAC)
8. User retrieves scientific analysis from InSAR package (ROI_PAC or ISCE)



Example of OSCAR MODIS correction



Original interferogram

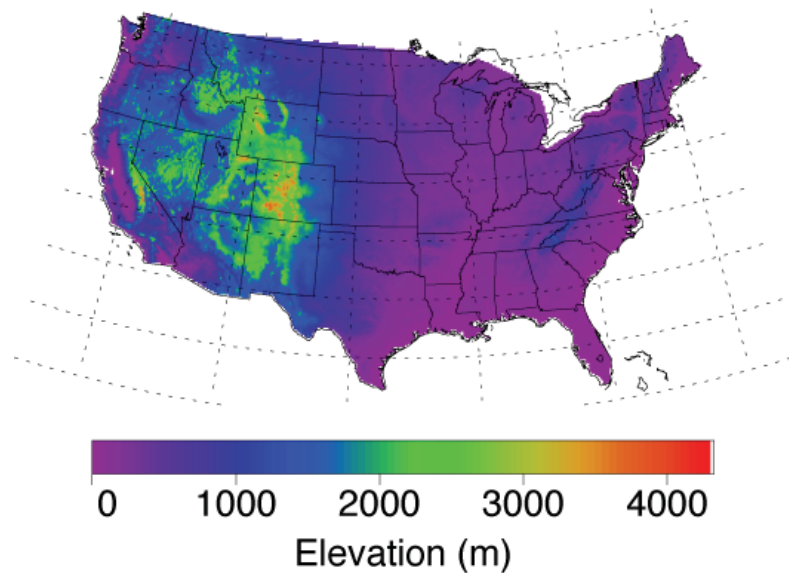
MODIS-corrected interferogram



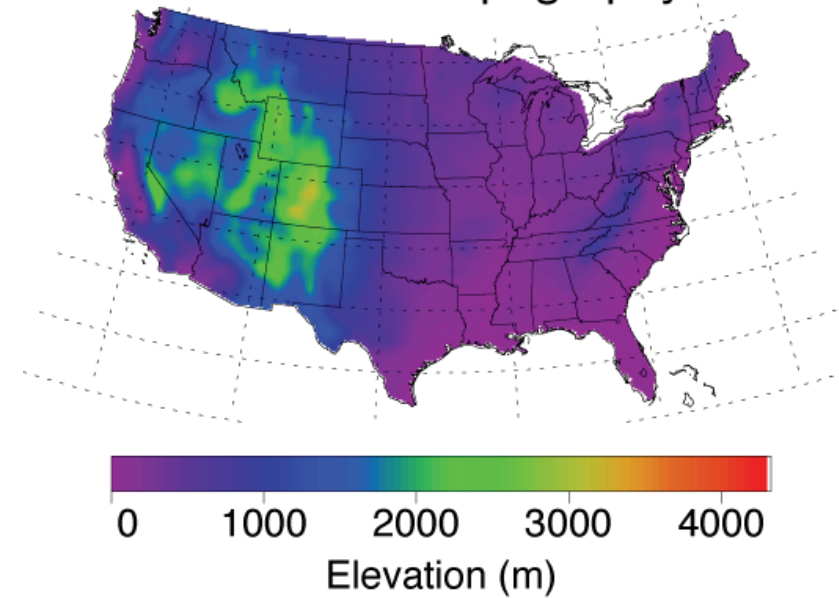
ECMWF Topographic Corrections

- Coarse spatial resolution of ECMWF topography introduces errors in local water vapor which can be corrected through a local topography correction.

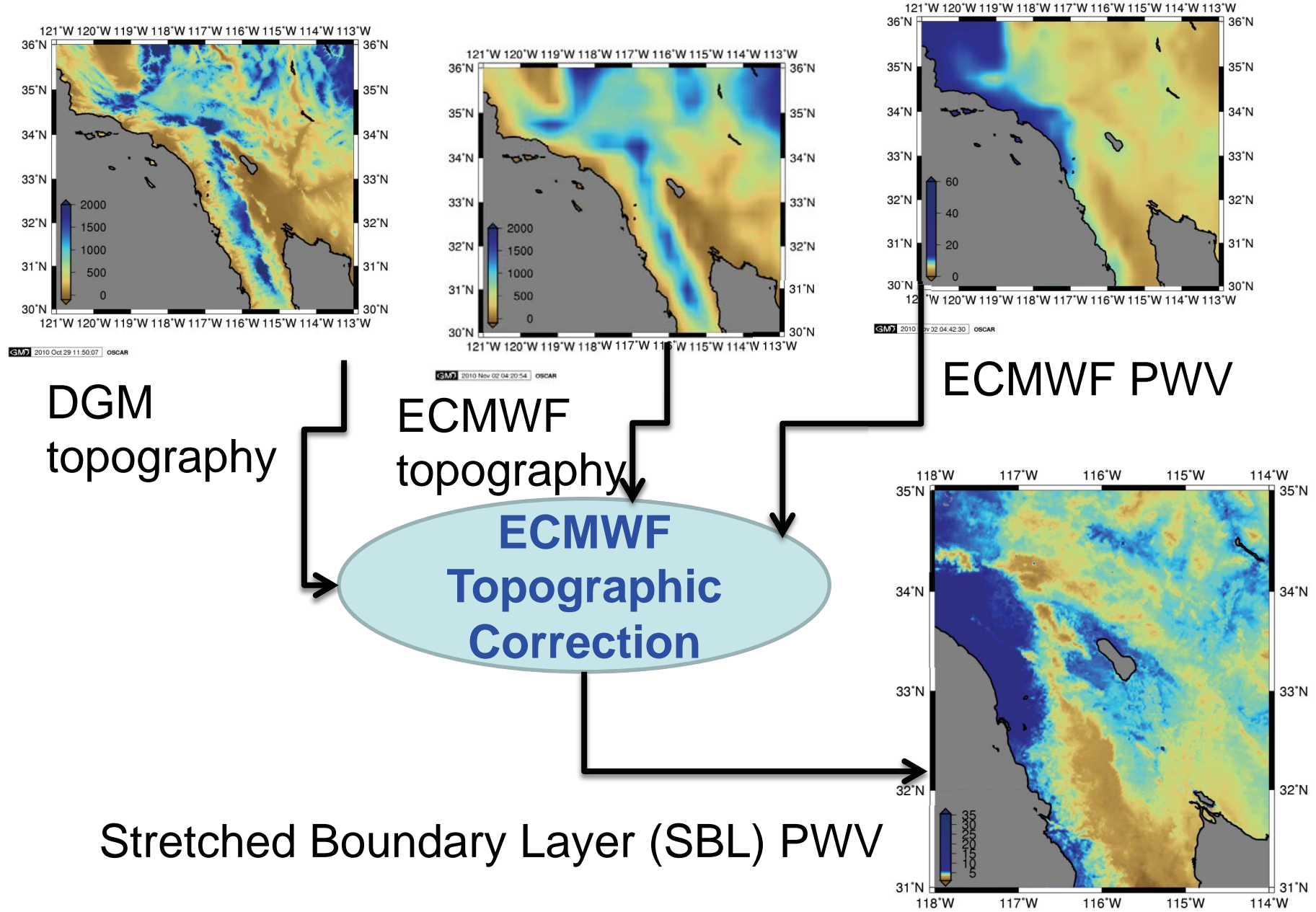
30 arcsec Topography



ECMWF Topography

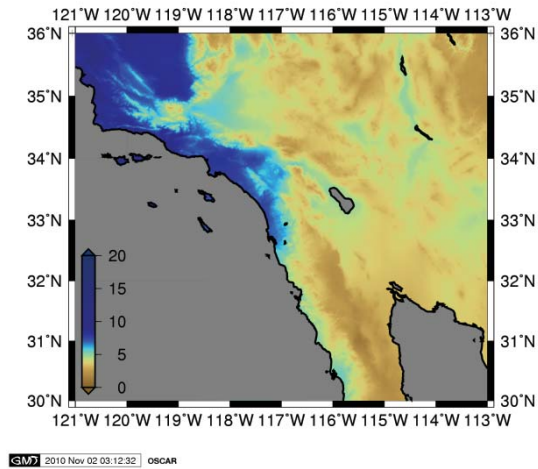


Data Flow

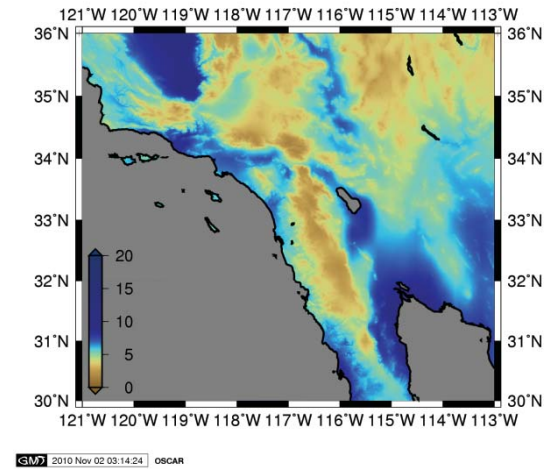




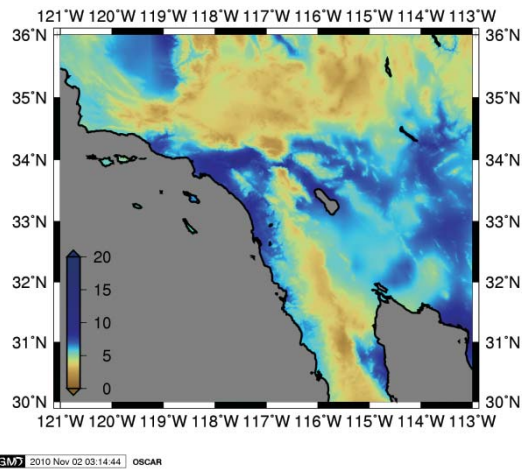
Examples of ECMWF SBL output



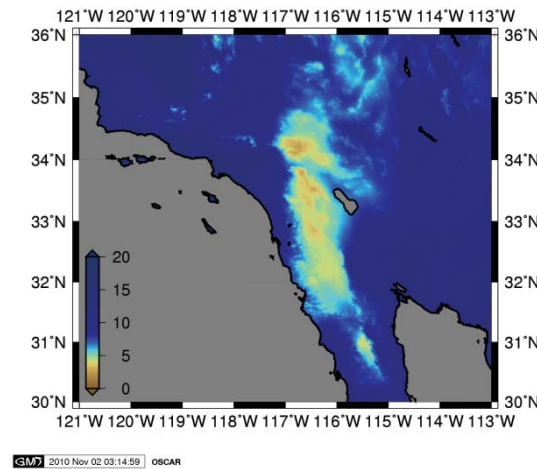
12 Mar 2010



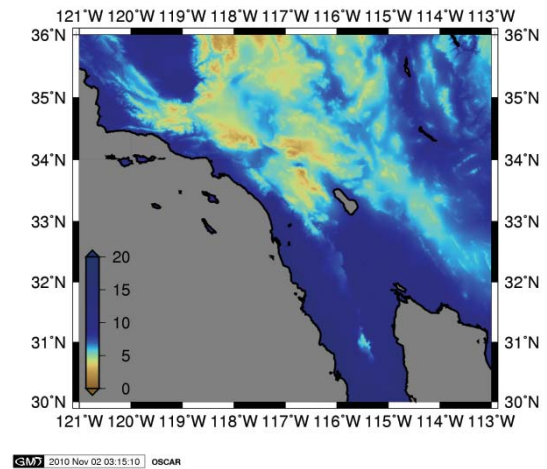
16 Apr 2010



21 May 2010



25 Jun 2010



3 Sep 2010

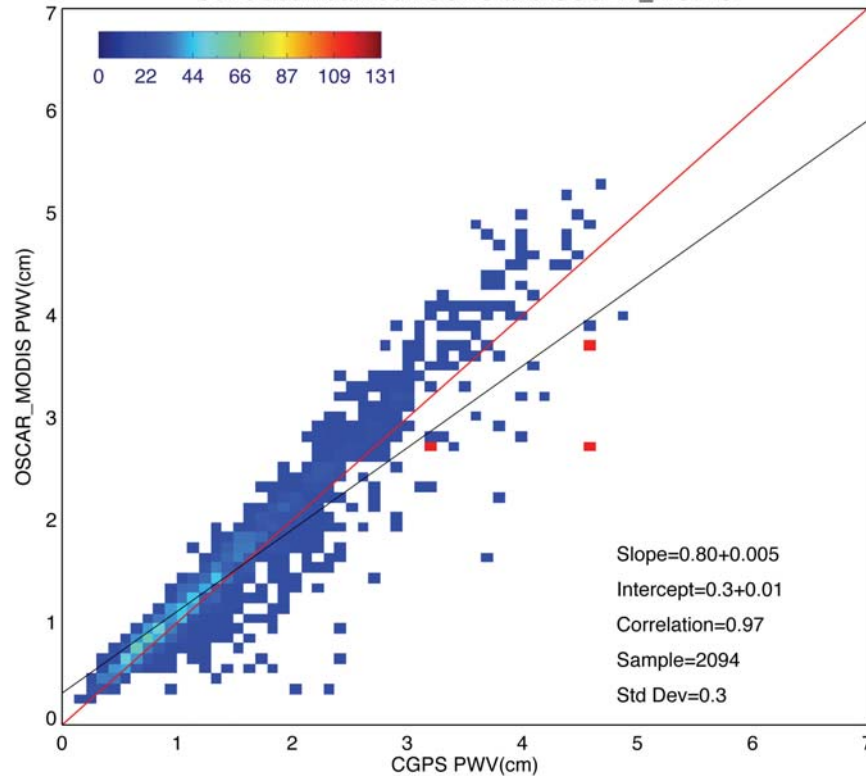


Validation of OSCAR products

MODIS

Std dev = 3 mm path delay

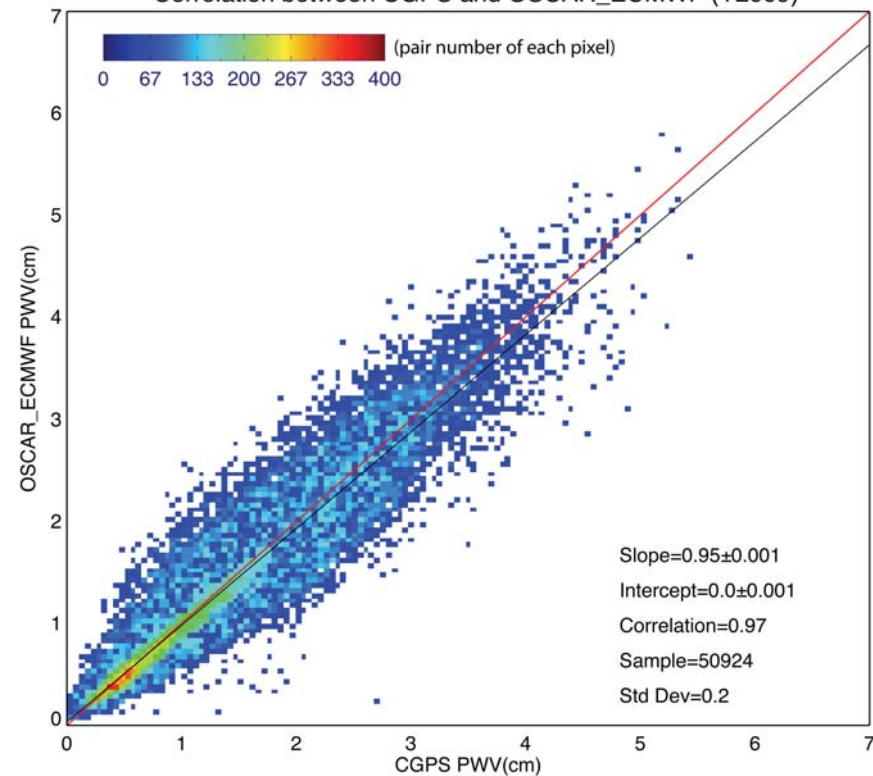
Correlation between CGPS and OSCAR_MODIS



ECMWF

Std dev = 2 mm path delay

Correlation between CGPS and OSCAR_ECMWF (Y2009)

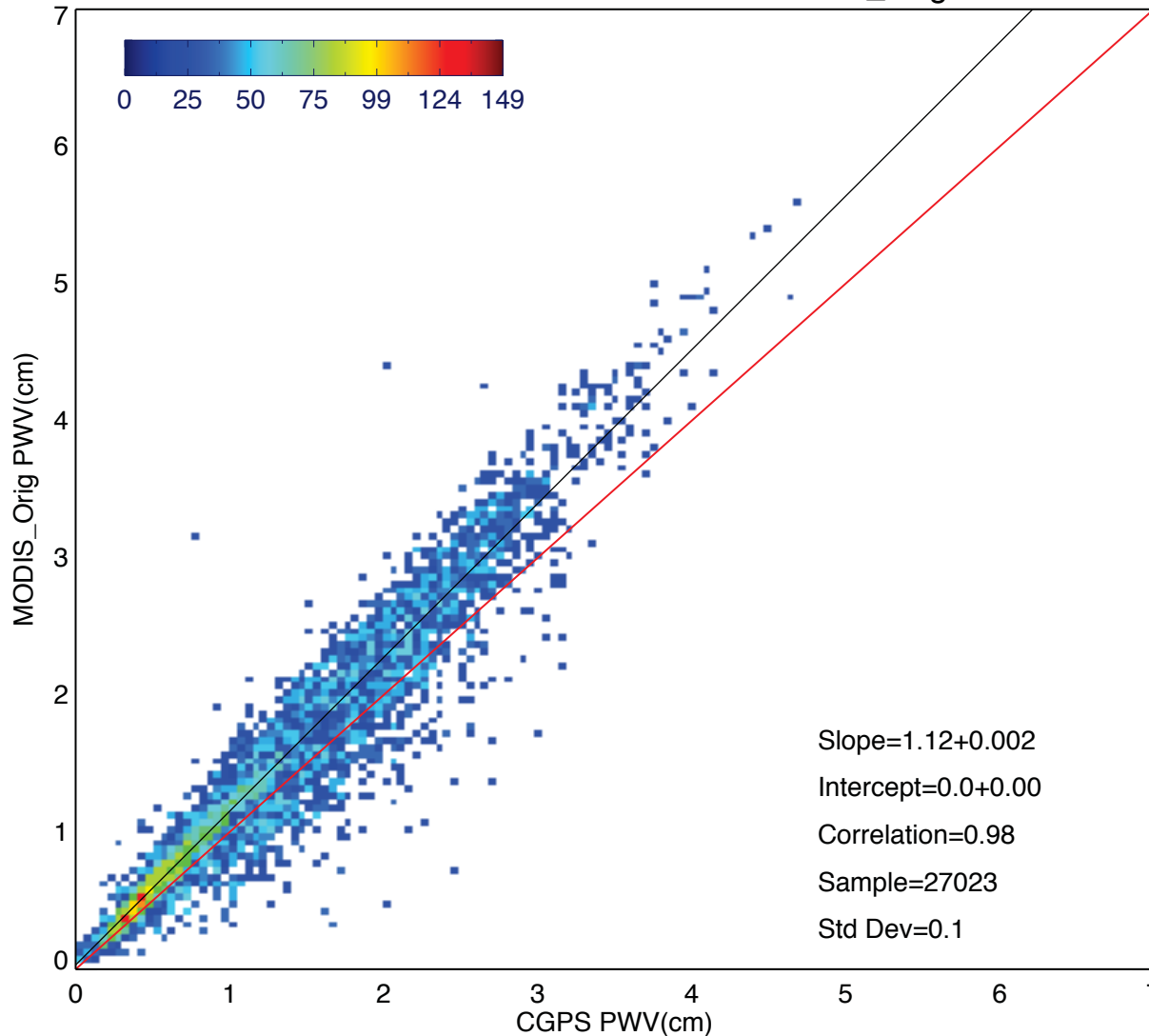


Comparing MODIS and ECMWF delay with GPS delay for Year 2009 in Southern California



GPS vs Original MODIS

Correlation between CGPS and MODIS_Orig



(1) Original MODIS:
PWV extracted using
IDL codes

(2) High correlation and
small RMS, which is
similar to our
previous studies

(3) Higher scale factor
than Li et al. (2005)

Reported to the OSCAR
team in December 2010.

MODIS_SAMI developed
in 2012.