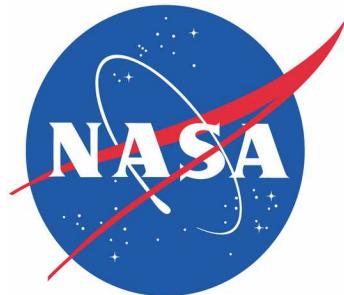


# Planetary Surface Reconstruction with the NASA Ames Stereo Pipeline (ASP)

Ross Beyer<sup>1,2</sup>, Scott McMichael<sup>2</sup>, and  
Oleg Alexandrov<sup>2</sup>



<sup>1</sup>Sagan Center at the SETI Institute  
<sup>2</sup>NASA Ames Research Center

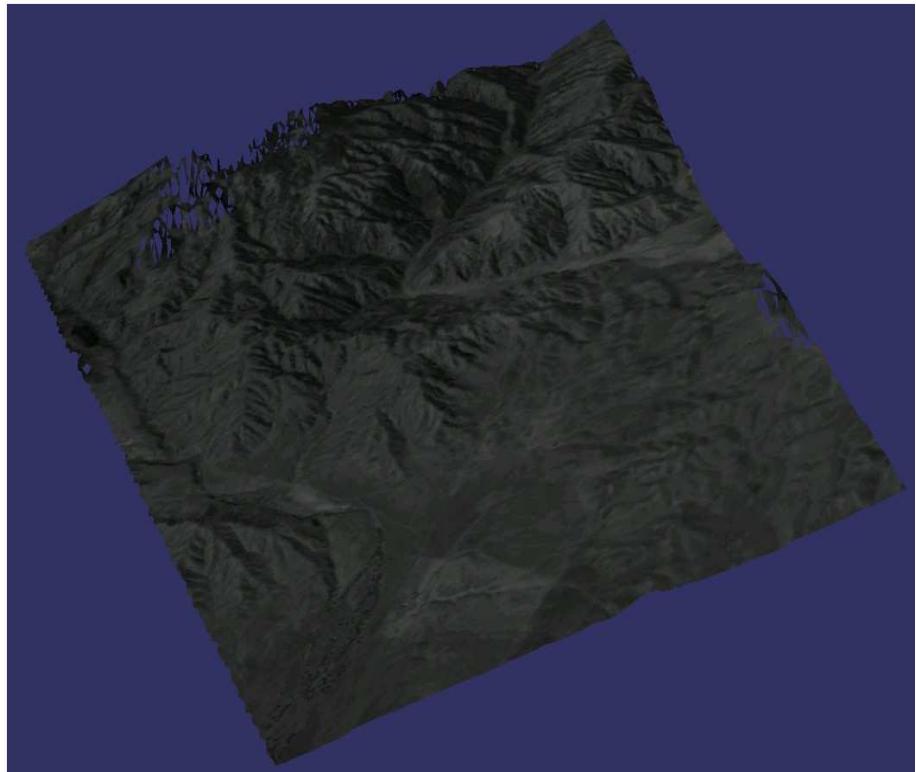
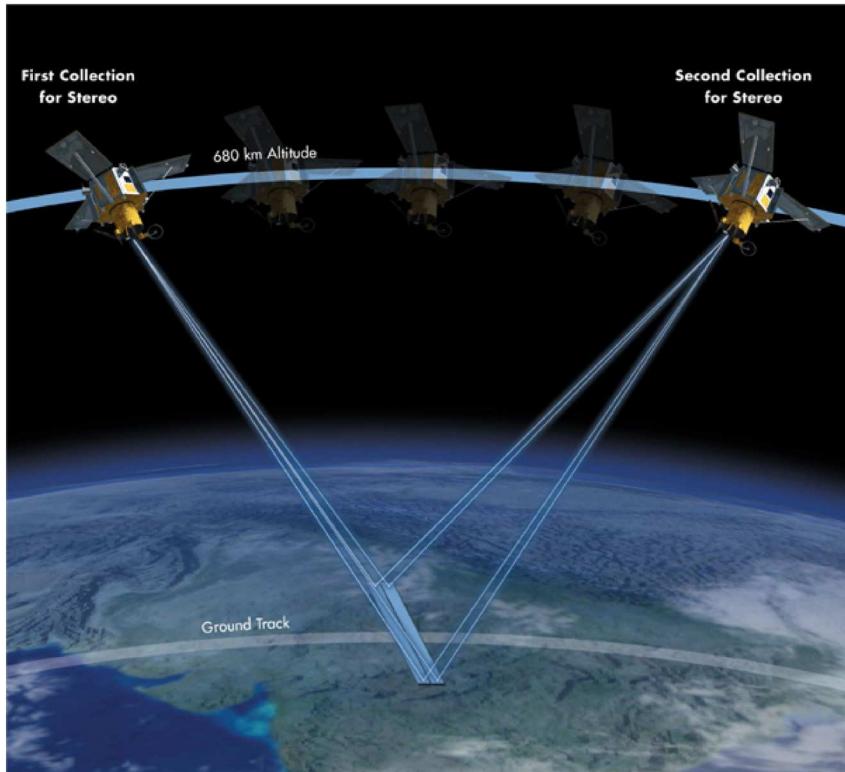


# Who Are We?

- Research engineers from NASA Ames, in Mountain View, California
- Planetary scientists and computer vision enthusiasts

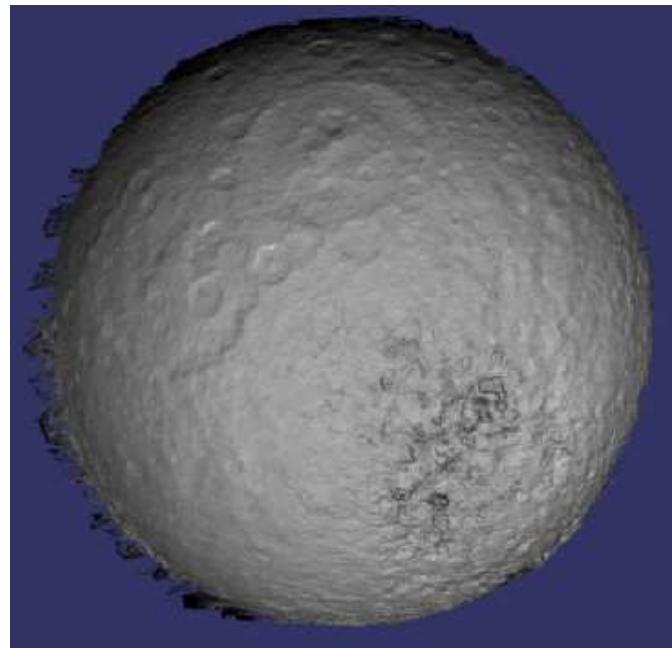


# ASP Creates 3D Terrain from Stereo Images



# ASP Background

- Originally developed to support planetary rovers and satellites but now evolved to handle terrestrial satellites and aerial cameras.
- Emphasizes parallel processing without manual intervention.

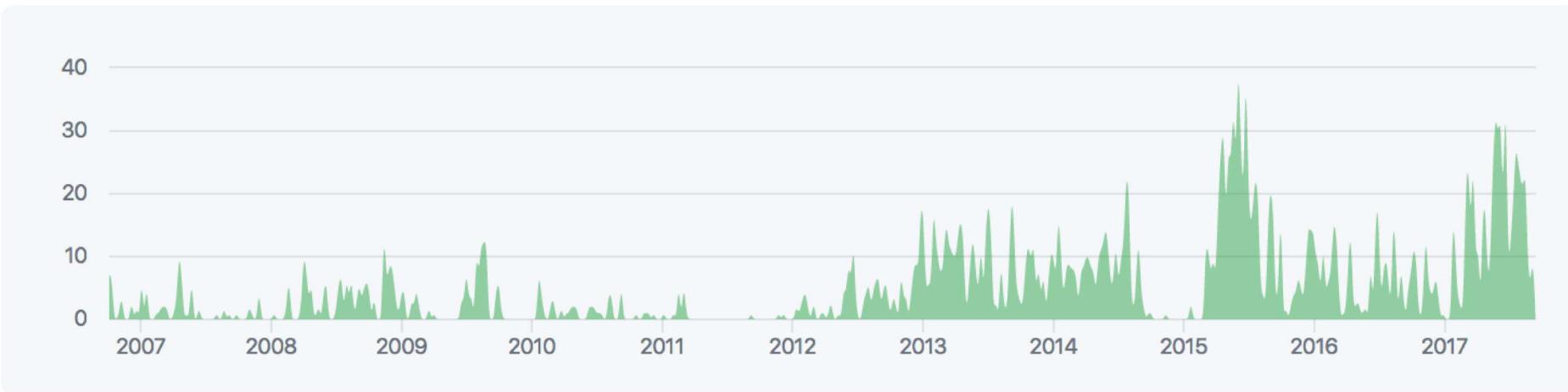


# ASP has been developed for more than 10 years

Dec 3, 2006 – Nov 13, 2017

Contributions: Commits ▾

Contributions to master, excluding merge commits



# Incorporates the USGS Integrated Software for Imagers and Spectrometers

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## ISIS

*Integrated Software for Imagers and Spectrometers*

### WELCOME

This is the home page for ISIS, a digital image processing software package. The focus of the software is to manipulate imagery collected by current and past NASA and International planetary missions sent throughout our Solar System.

### ANNOUNCEMENTS

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# How to Get It

- Ames Stereo Pipeline v2 is available as open-source software
  - ▶ Worldwide release (no country restrictions)
  - ▶ Can be freely reproduced and distributed, with or without modifications
- Apache 2 Licensed
- C++ code and executables for Linux and Mac are hosted on Github:

[github.com/NeoGeographyToolkit/StereoPipeline](https://github.com/NeoGeographyToolkit/StereoPipeline)



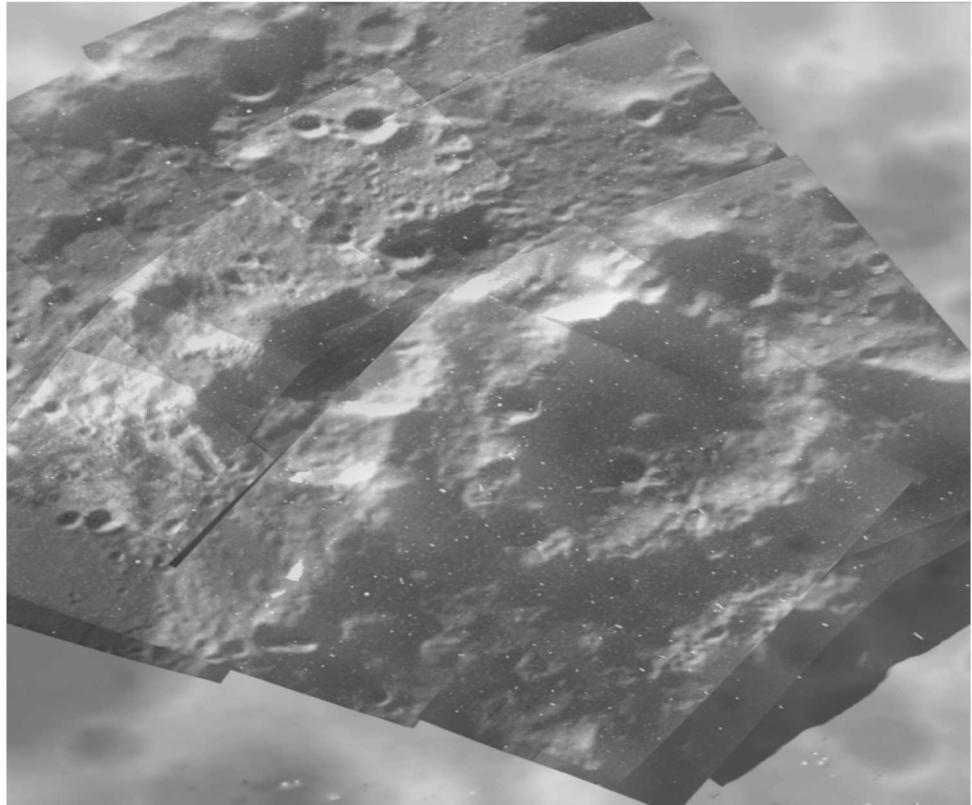
# ASP Users and Uses

- Planetary researchers.
- Constructing maps of potential landing sites for NASA's Resource Prospector Mission (RPM).
- Generated 1001 LRO-NAC terrain models as a demonstration of automated processing abilities.
- Used with WorldView data to study glacial movement in Earth's polar regions<sup>1</sup>.
- Processing declassified images from the U.S. KH-9 spy satellite program in order to evaluate ice cover changes since the 1970s.
- Currently processing 5 million Operation IceBridge aerial polar images.

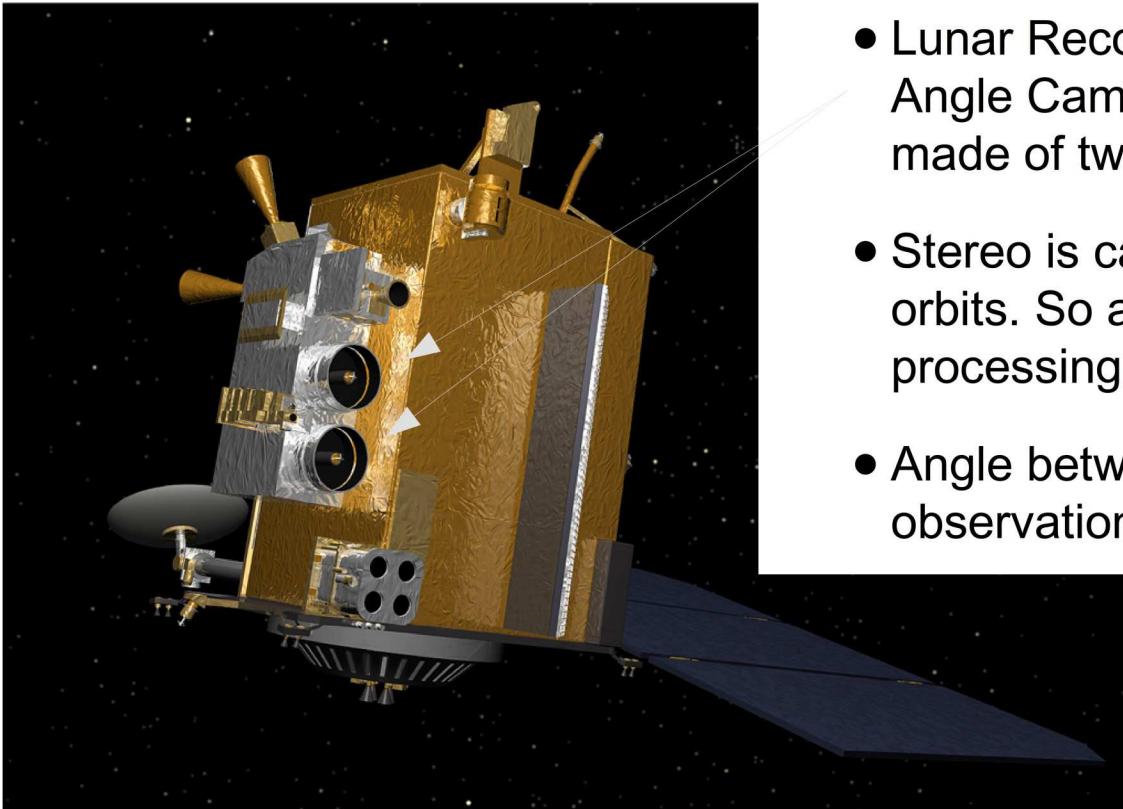
1. Shean, David E., et al. "An automated, open-source pipeline for mass production of digital elevation models (DEMs) from very-high-resolution commercial stereo satellite imagery." *ISPRS Journal of Photogrammetry and Remote Sensing* 116 (2016): 101-117.

# Processing data with ASP

- Gather Images
- Image Correction
- Interest Point Gathering
- Bundle Adjustment
- Stereo
- Create terrain models (DEM)
- Align DEM
- Mosaicking
- Shape-from-Shading



# Example Image Correction: LROC

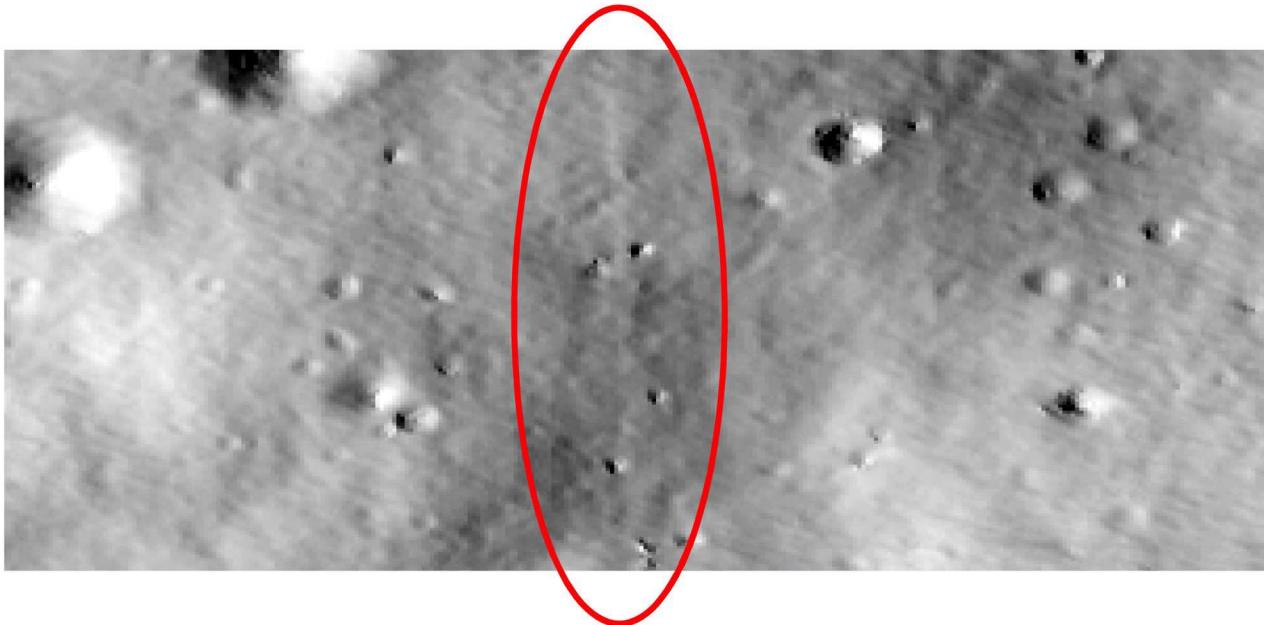


- Lunar Reconnaissance Orbiter Narrow Angle Camera (LRO-NAC) is actually made of two cameras.
- Stereo is captured through multiple orbits. So a stereo pair for LRO-NAC is processing 4 images.
- Angle between two sensors of a single observation changes with temperature.

LRO-NAC is made of two aligned telescopes. It is a linescan camera with 5064 px \* 2 width.

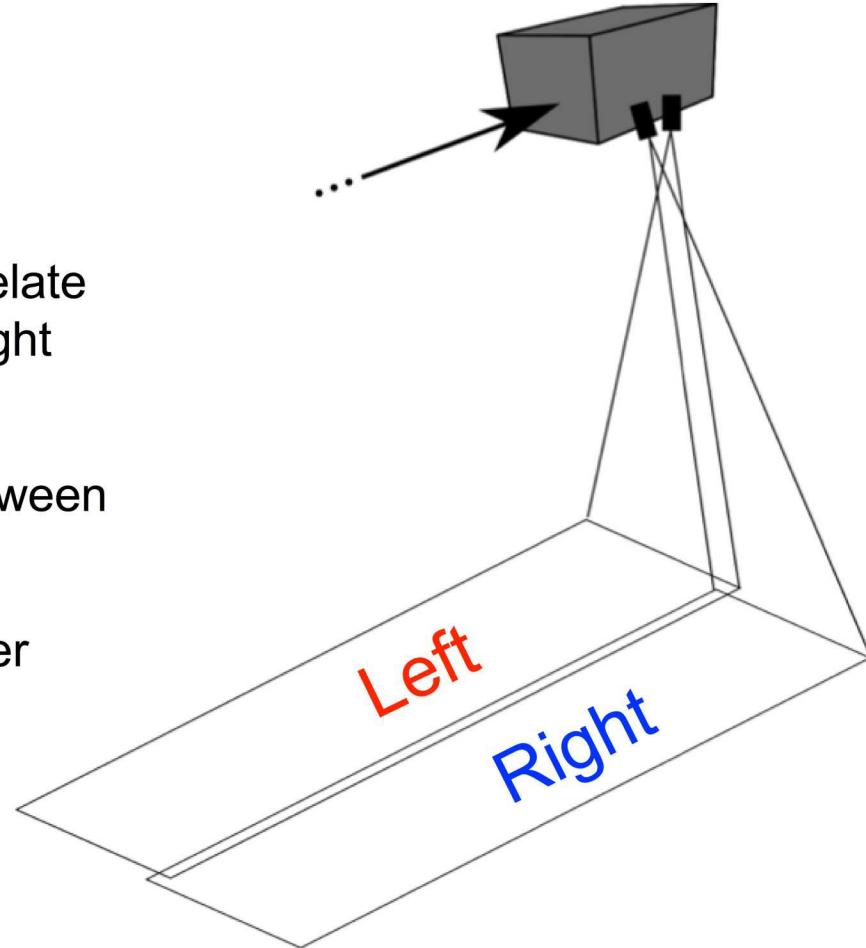
# LROC's Problem

- Temperature change causes misalignment of the two cameras
- Results in a “line” artifact in generated terrain



# LROC's Solution

- For each observation, correlate overlap between left and right CCD.
- Solve for angle change between CCDs.
- Rewrite IK SPICE kernel per observation.



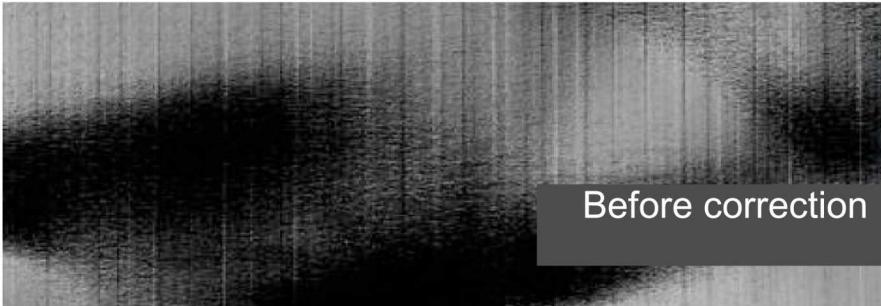
# Image Correction: World View

- World View had a similar problem to LRO-NAC, but with more sensors at the focal plane.
- Results in DEM elevation noise of ~2 meters.



DIGITALGLOBE

World View satellites are linescan cameras with 50 CCDs arranged side by side. Image size distributed to customers is ~1 Gpx.

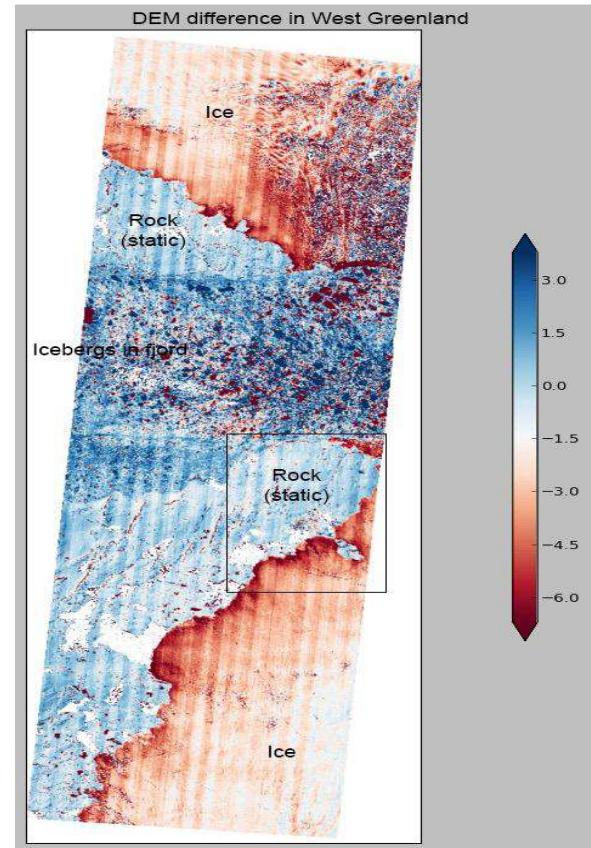
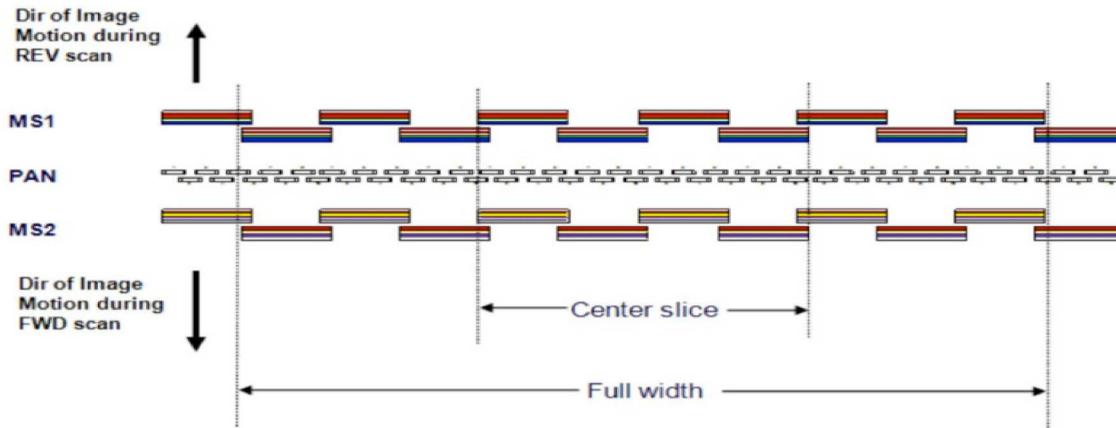


Before correction

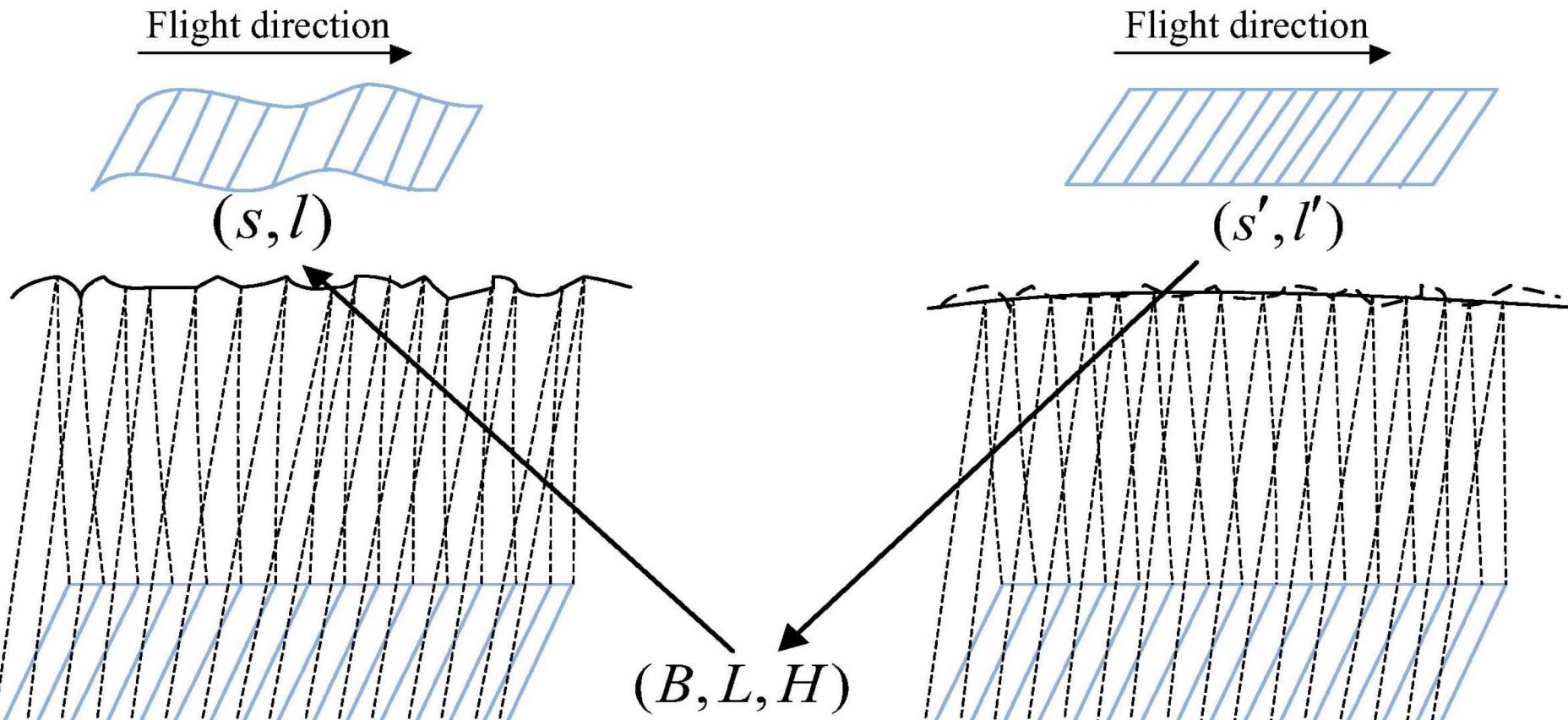


After correction

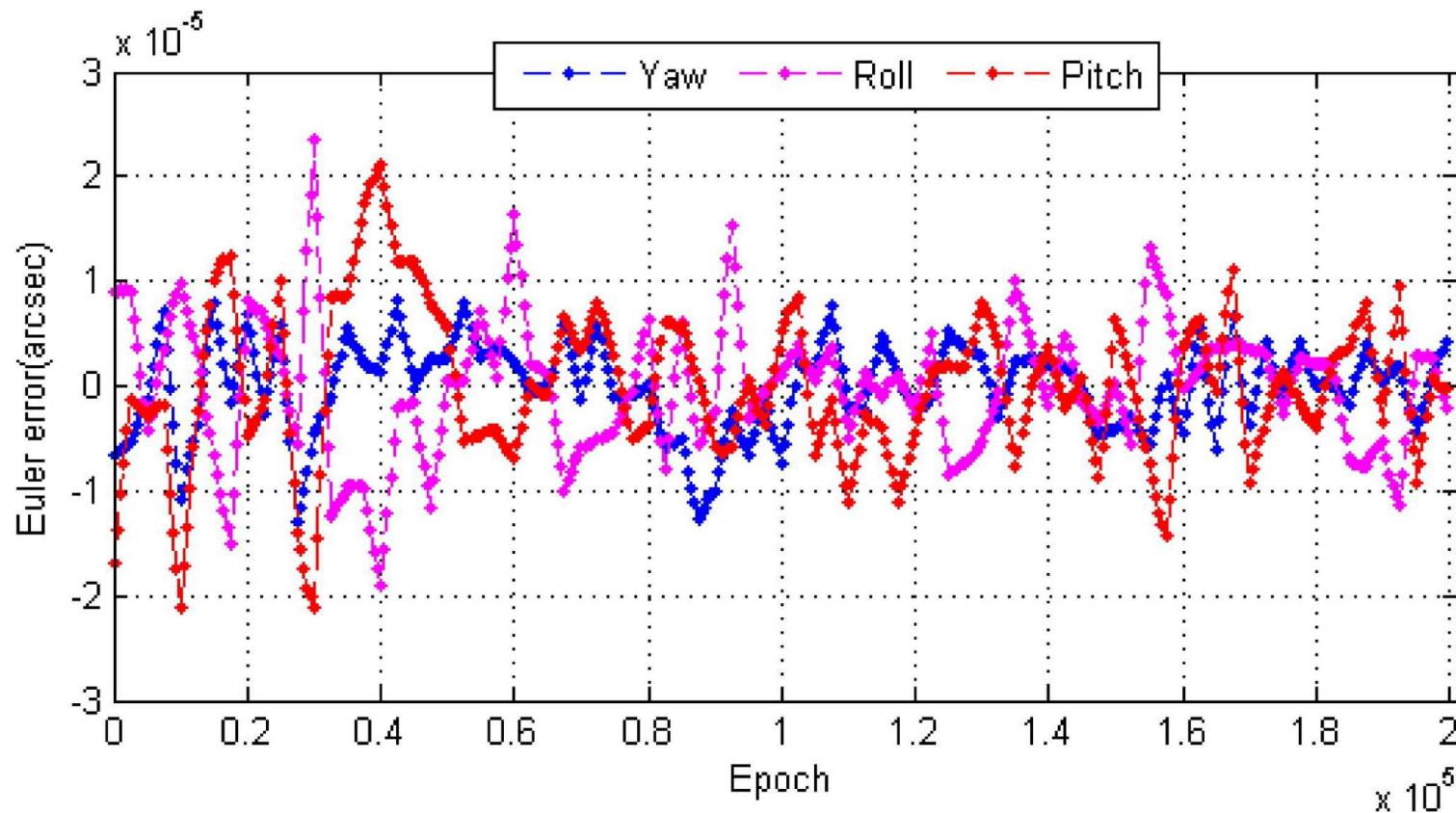
# World View Sensor



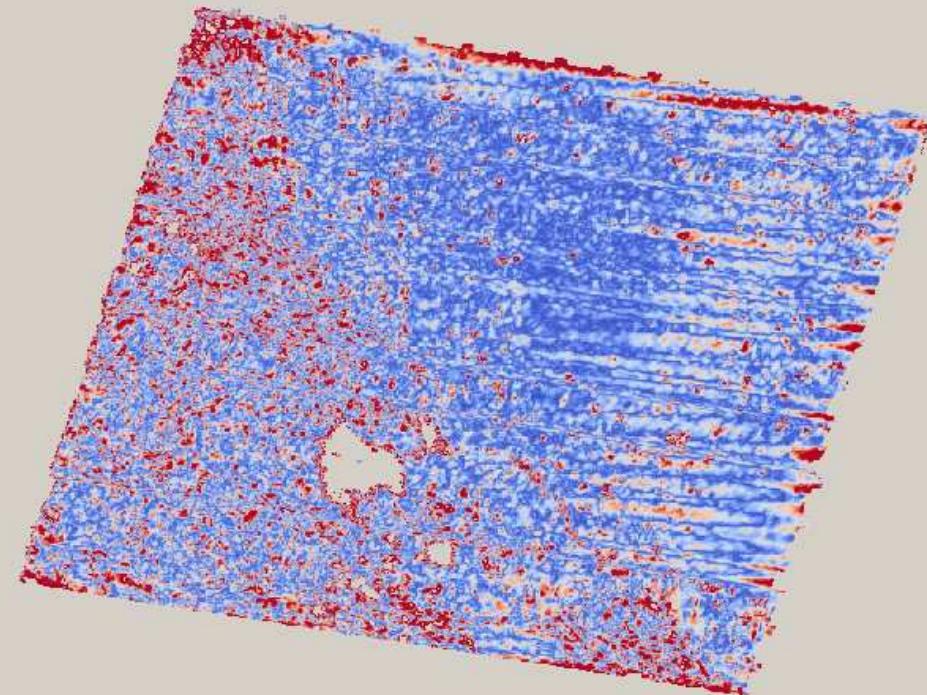
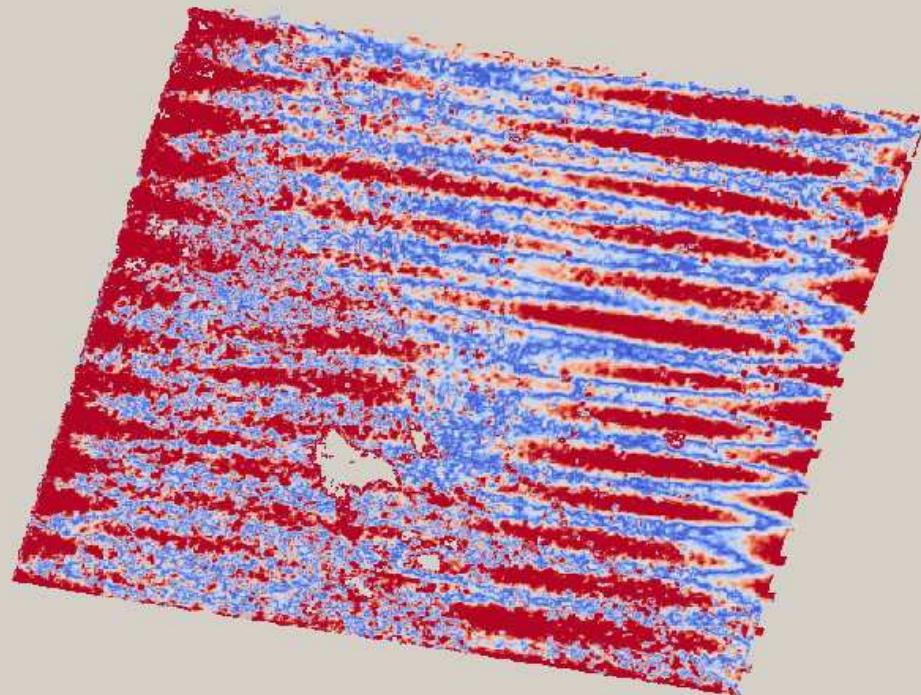
# Spacecraft Jitter



# Spacecraft Jitter

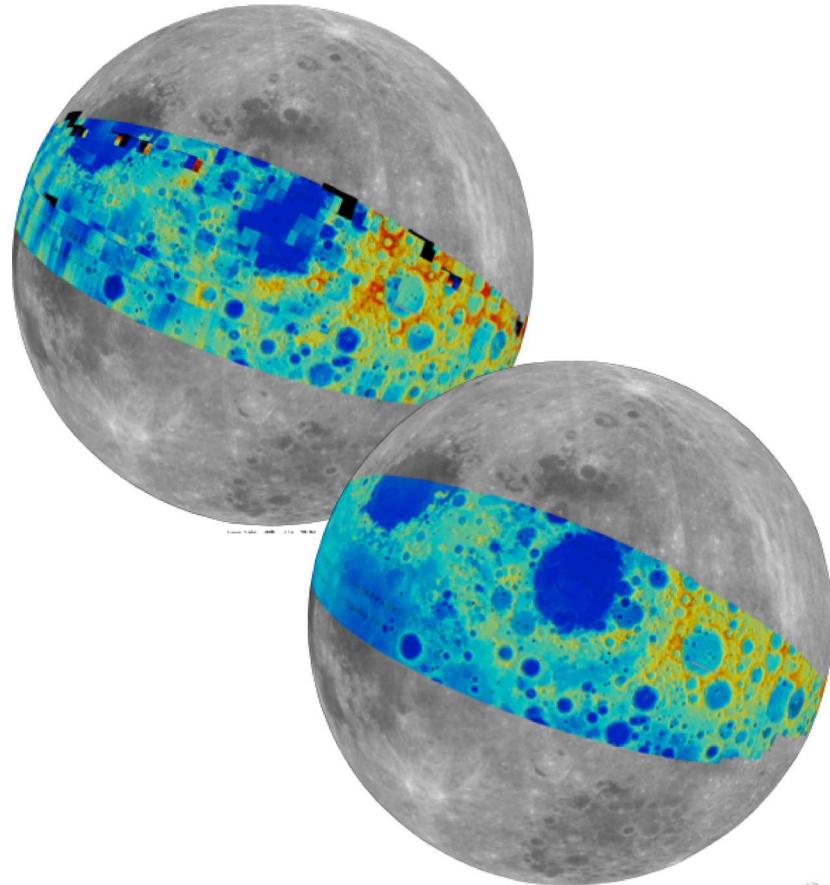
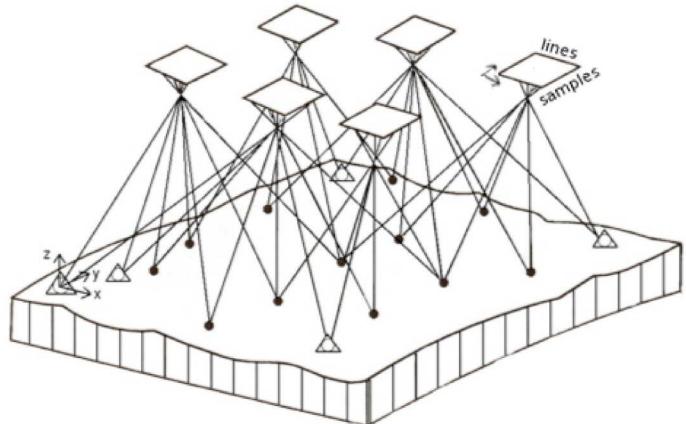


# Jitter Correction for Digital Globe (Not Yet Mature)



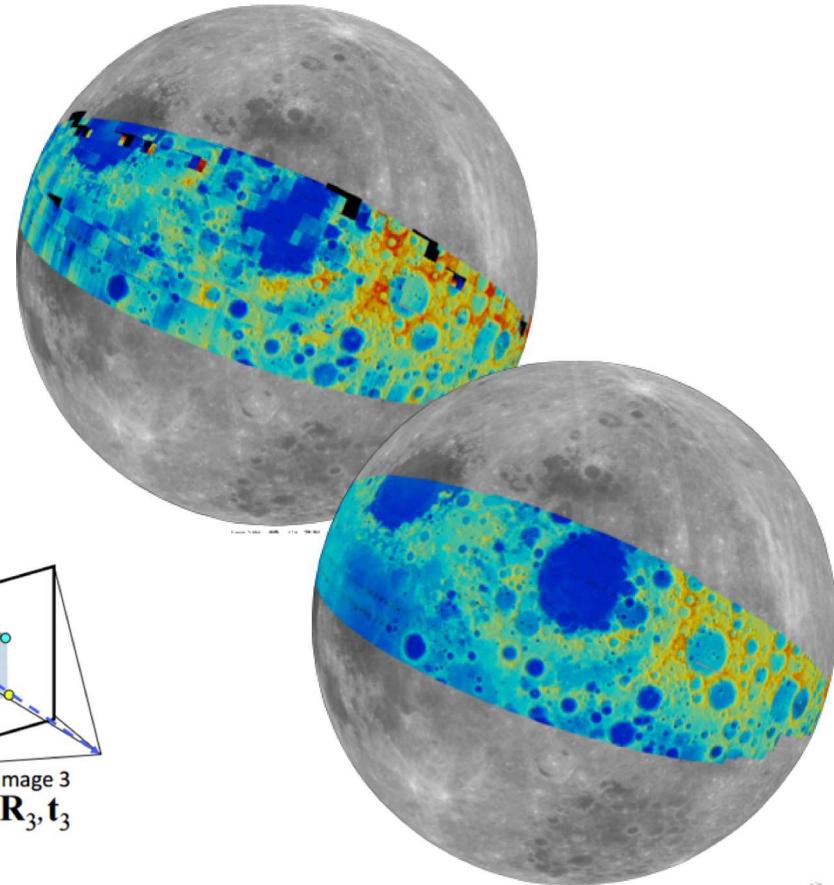
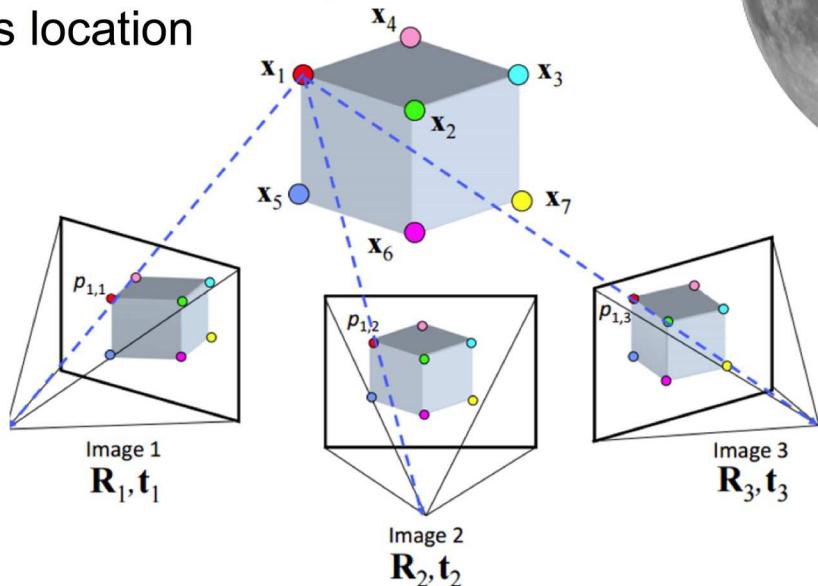
# Bundle Adjustment

By tracking all the feature correspondences between all images, solve for 3D location of points and their camera's location



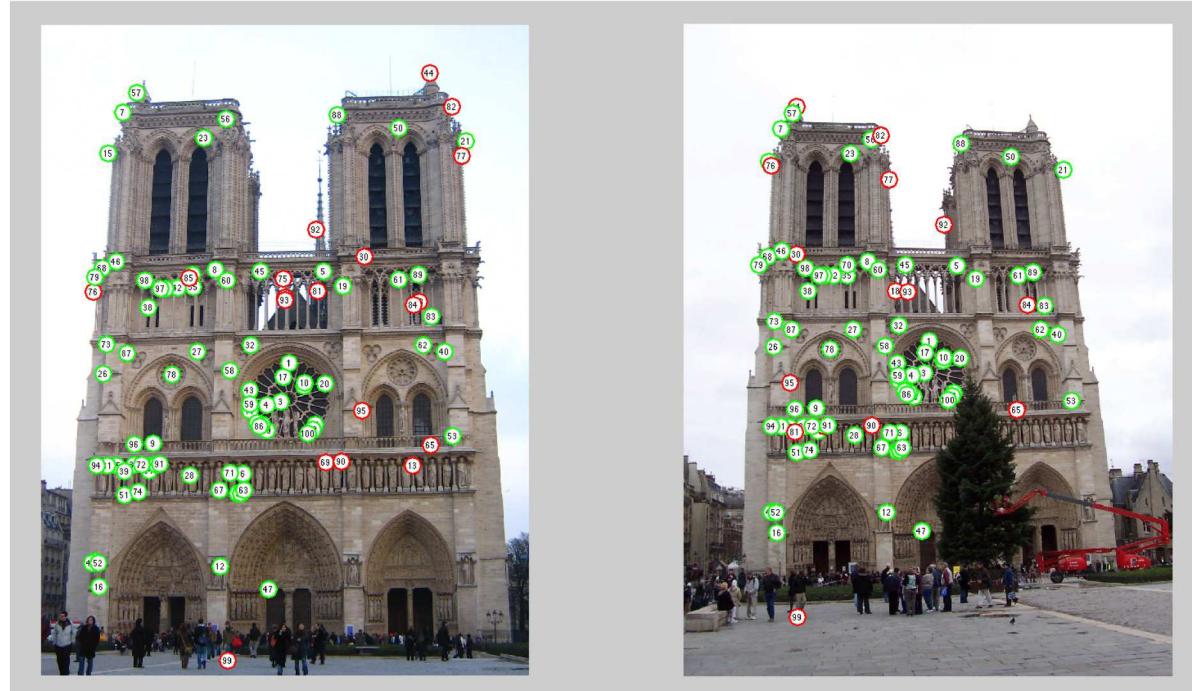
# Bundle Adjustment

By tracking all the feature correspondences between all images, solve for 3D location of points and their camera's location



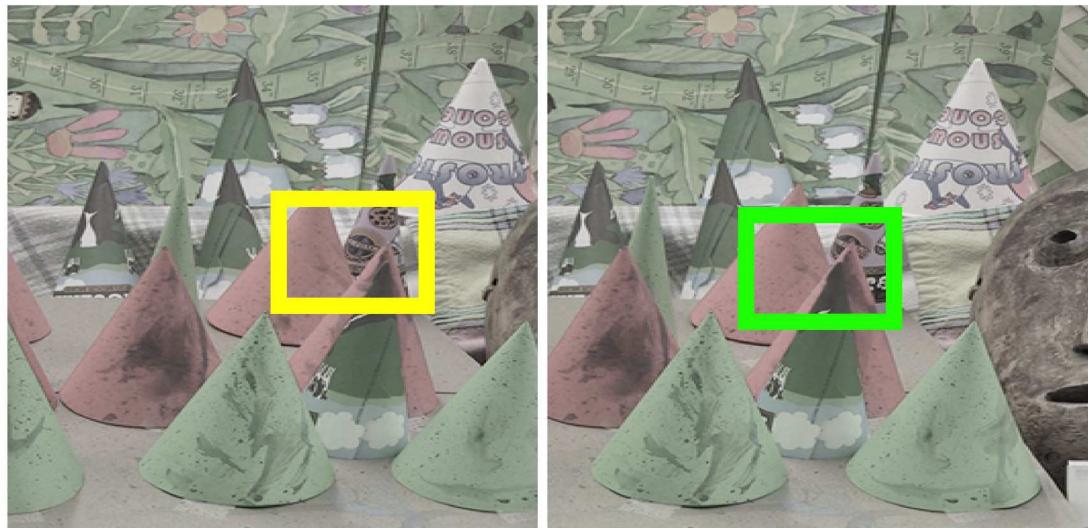
# Interest Point Detection and Matching

- Used for image alignment, bundle adjustment, and search range estimation.
- ASP supports the ORB, SIFT, and OBALoG IP detection methods.



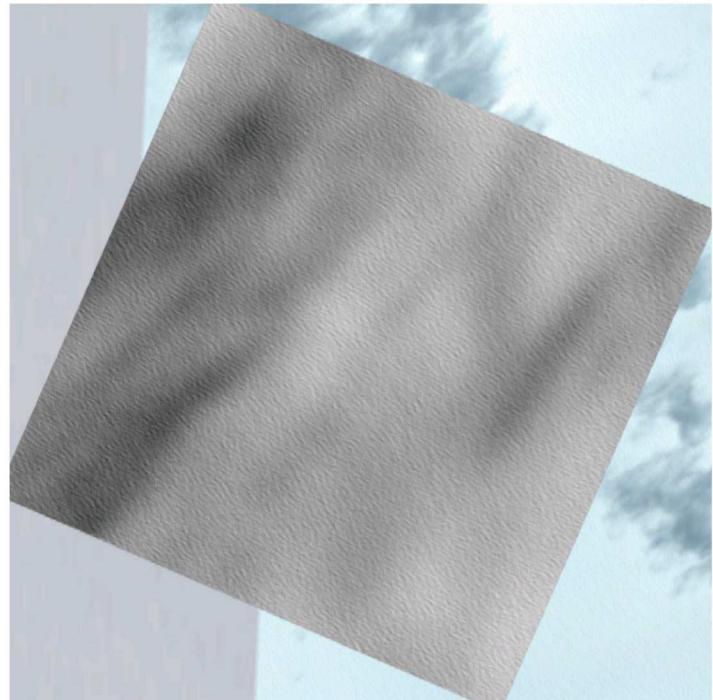
# Stereo Generation

Given two images, solve for pixel-to-pixel correspondences for the whole image.



# Stereo Limitations

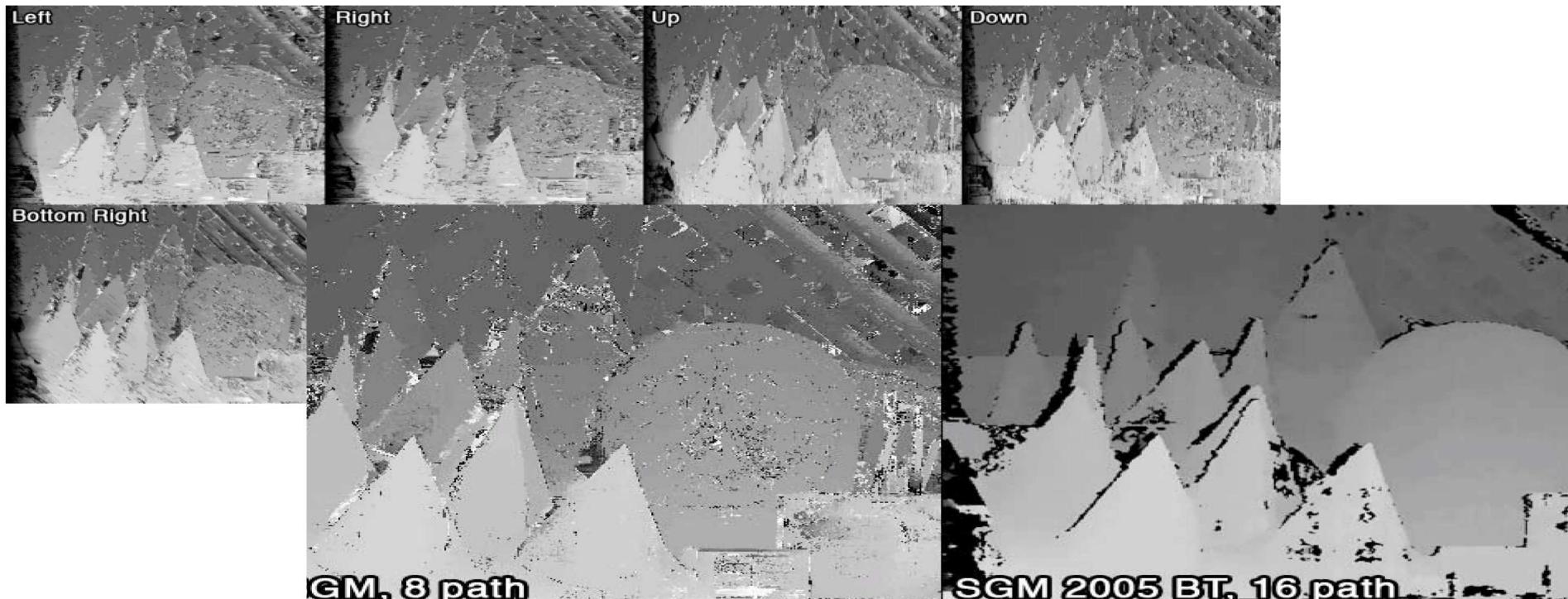
- Using a kernel bigger than one pixel will lose resolution.
- Clouds and water can confuse the pyramid correlator.
- Ice does not have texture at low resolution that can be correlated.



# Popular Stereo Algorithms

Block Matching	Simple, fast, classic algorithm
Patch Match	Avoids the need for pyramid processing.
Semi-Global Matching	Optimizes disparity values along many lines.
Graph Cuts and Belief Propagation	Optimize Markov Random Field disparity model.
SETSM	Uses tightly integrated geometric model of terrain.

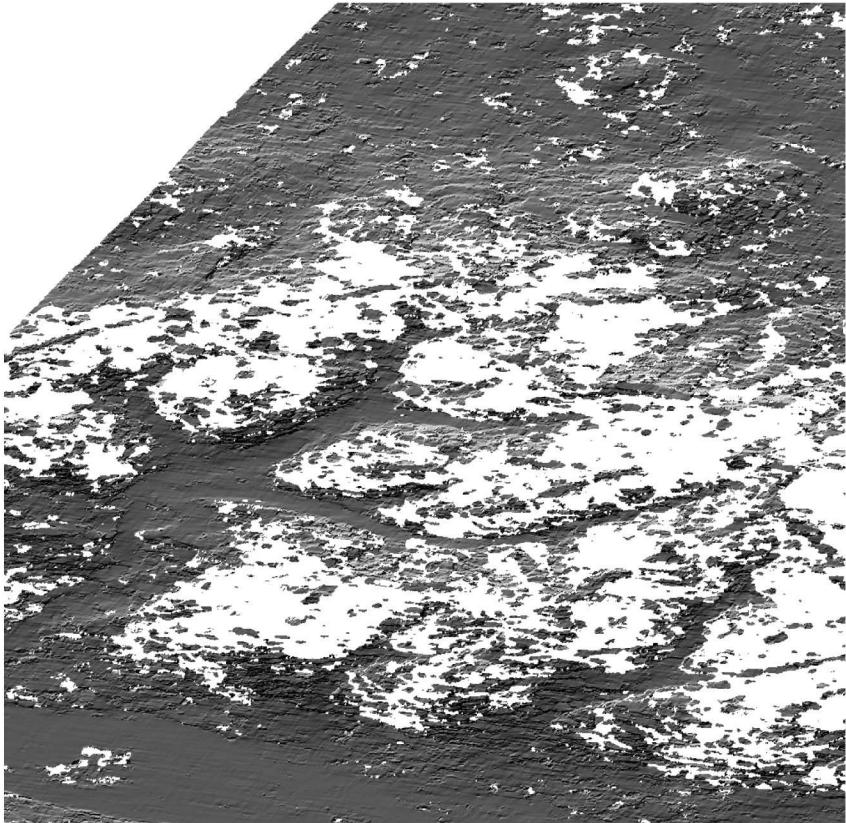
# Semi Global Matching



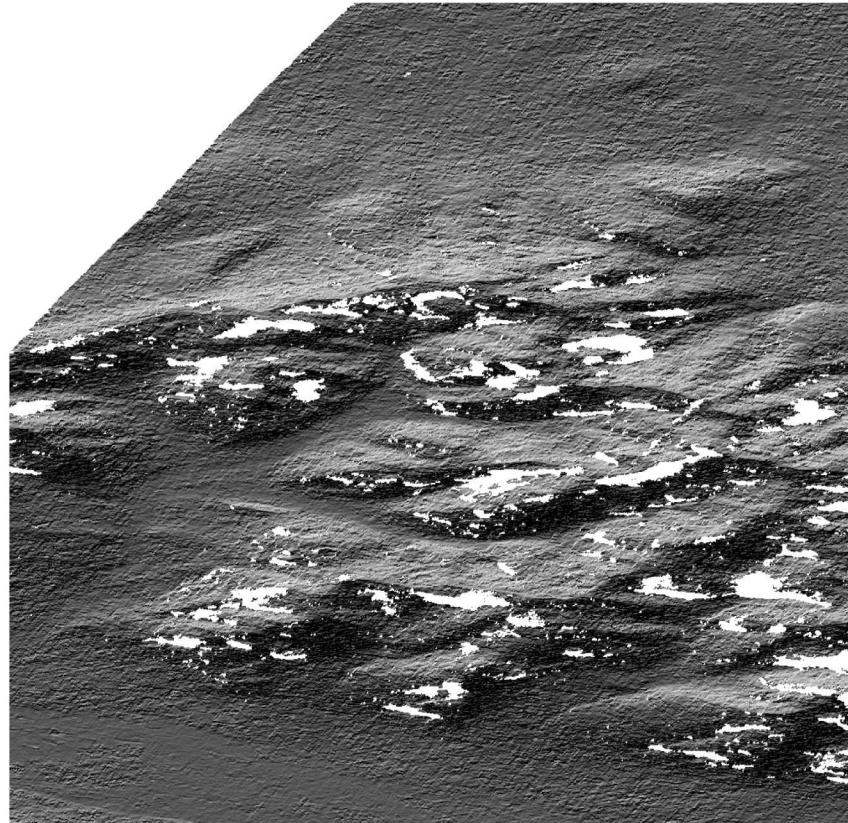
# SGM / MGM results

- So far, these algorithms have produced much better results than our old block matching algorithm on terrestrial, arctic terrain images.
- Our block matching with iterative subpixel algorithm often works better on planetary images.
- Steep slopes are the regions that see the greatest benefit from switching to SGM.
- Our implementation can search over vertical disparities but the results are better when the input images are accurately aligned.
- Compared to SGM, MGM produces smoother and slightly more accurate images at the cost of increased run-time and memory usage.
- Both SGM and MGM suffer from a distinctive artifact pattern but this can be suppressed by incorporating more than two input images.

# Results - KH9

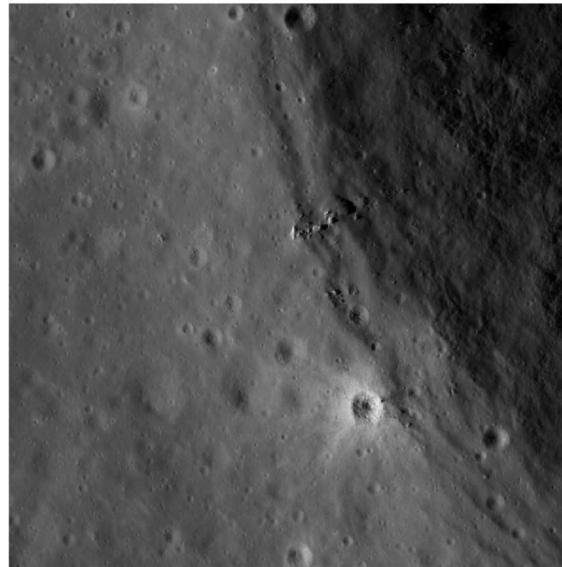


Block matching



MGM

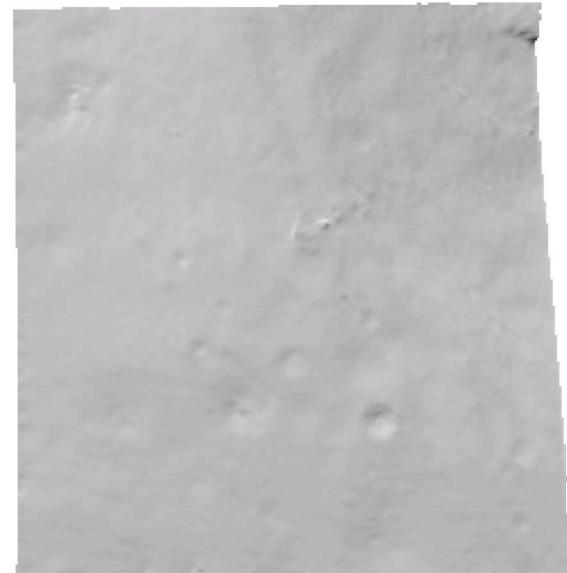
# Results - LRO-NAC



Input image



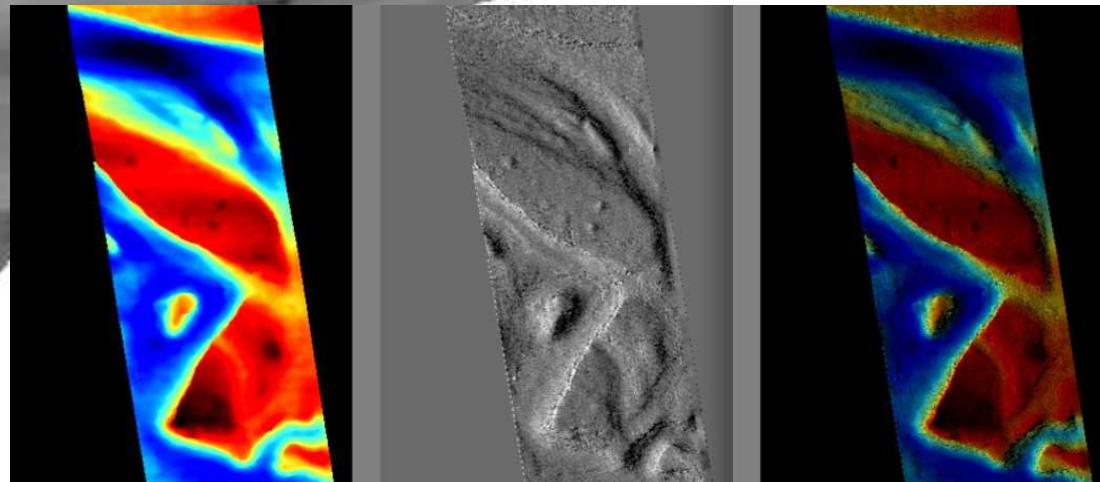
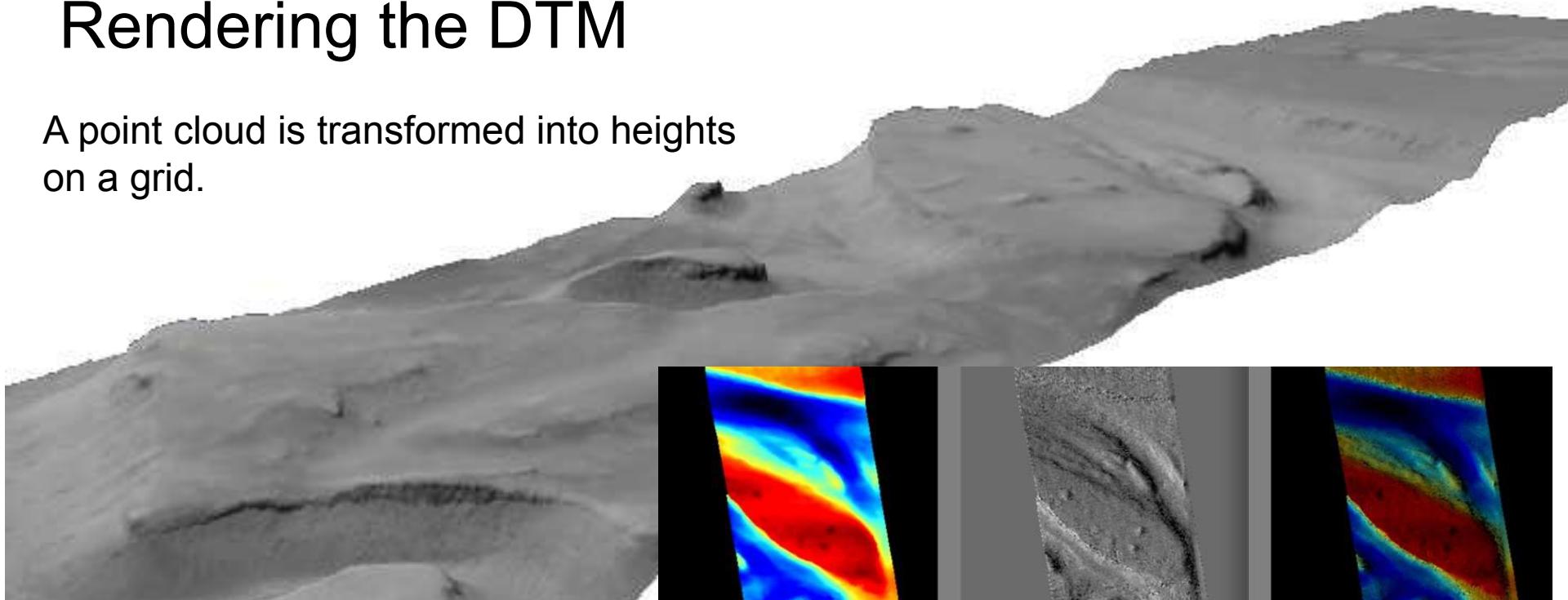
Block matching



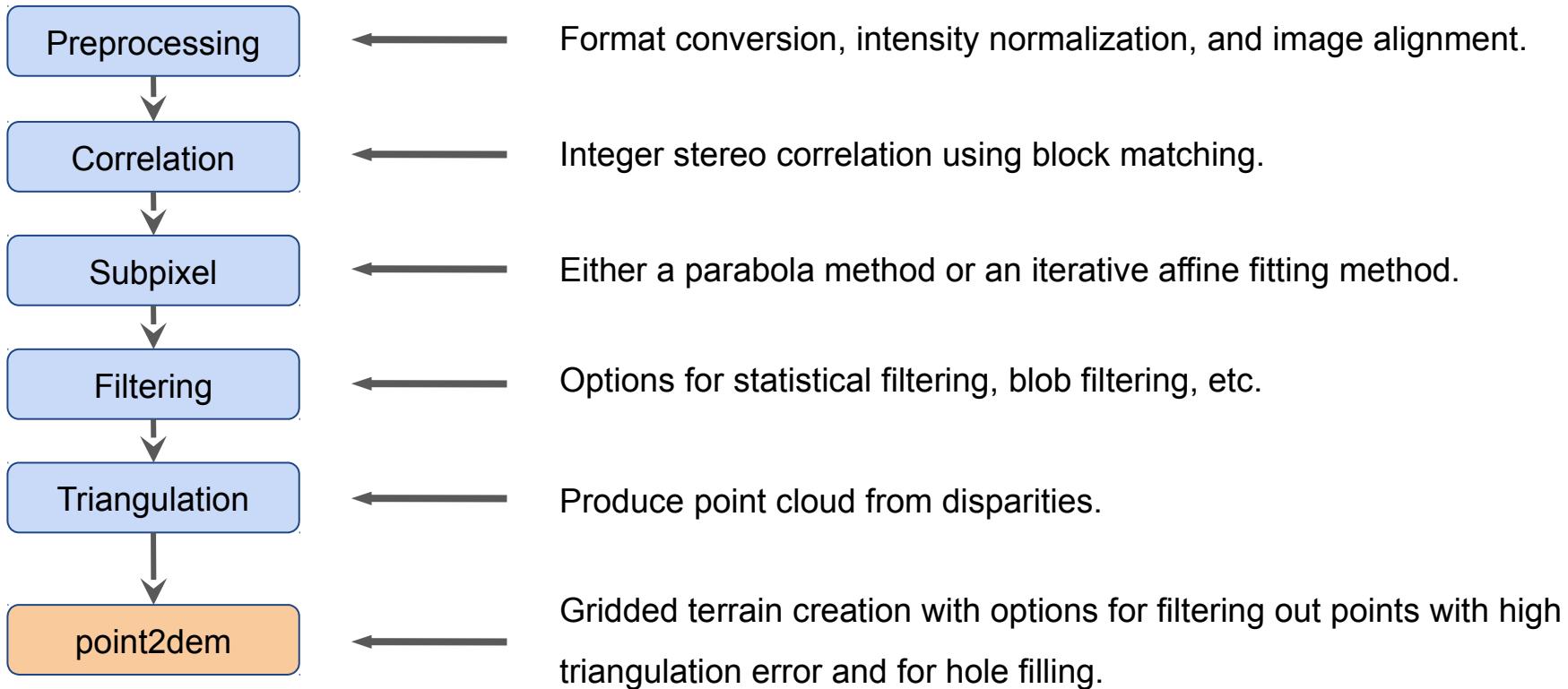
MGM

# Rendering the DTM

A point cloud is transformed into heights  
on a grid.



# Stereo Creation Steps



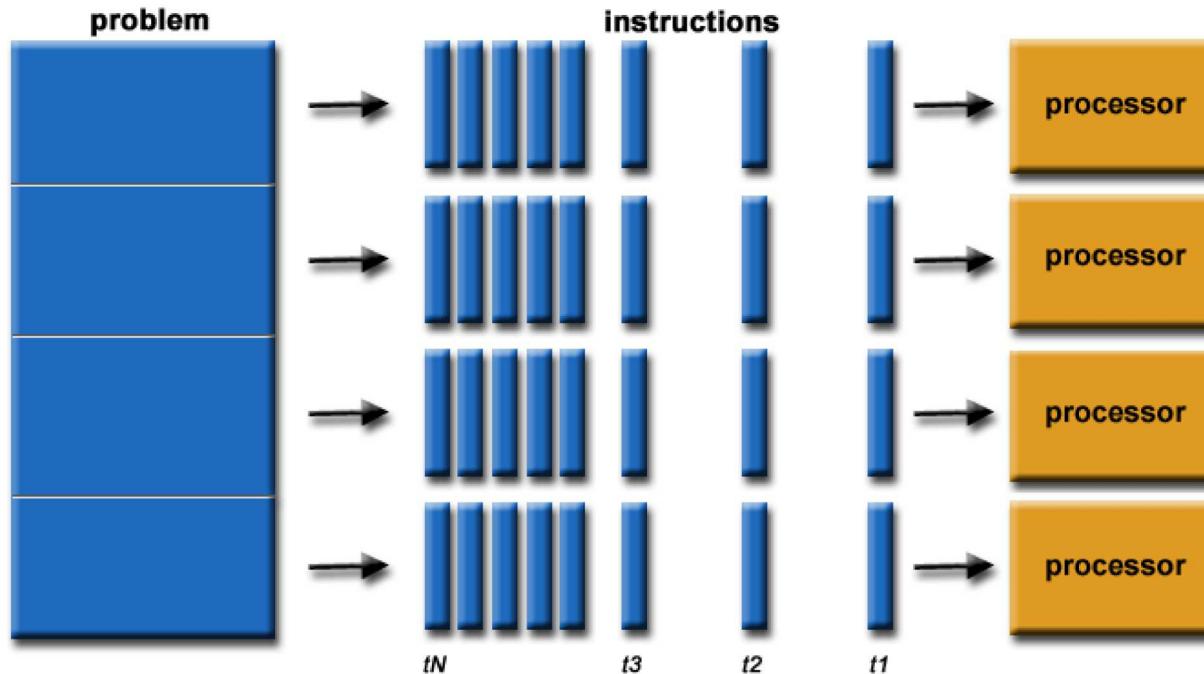
# Graphical User Interface

- ASP has a basic optional GUI tool to assist with data processing and visualization.
- Displays supported input data.
- Displays detected interest points.
- Selects region of interest for stereo processing.
- Ground control point editor.
- Queries pixel values.
- Can launch stereo processing.
- View hill-shaded and georeferenced terrains.



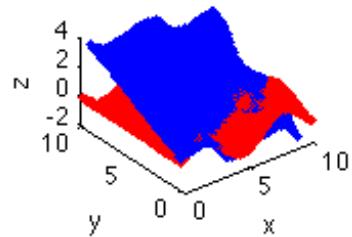
# ASP is Parallelizable

It can run on multiple machines, using multiple processes and threads

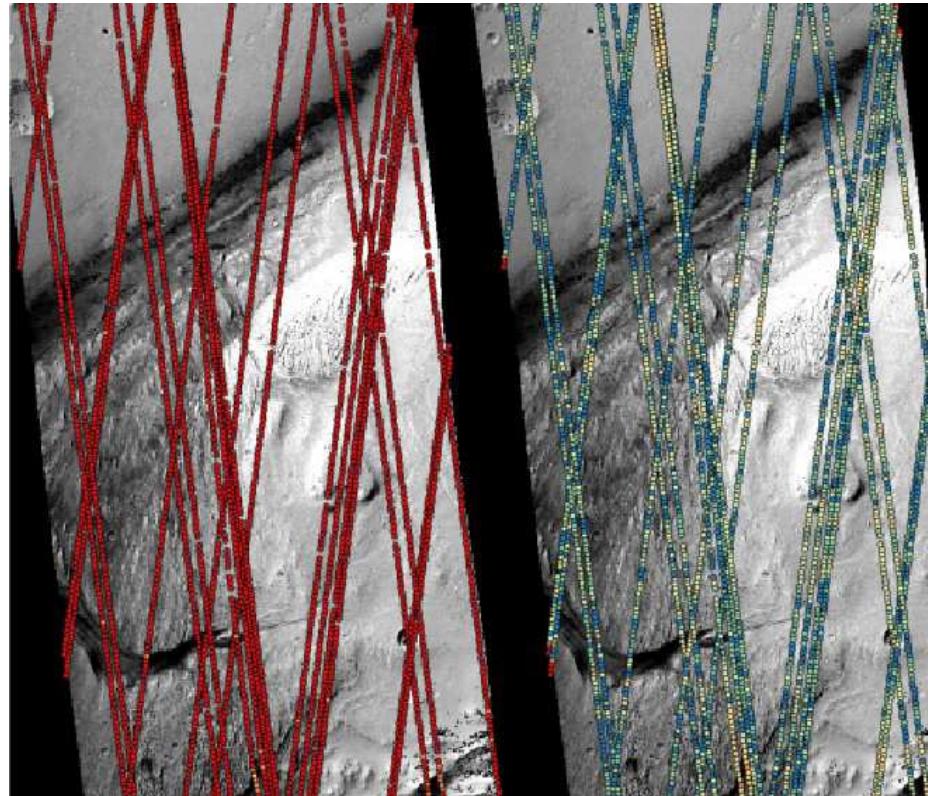
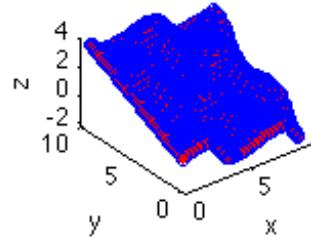


# Lidar-to-DEM alignment example

Red:  $z = \sin(x) * \cos(y)$ , blue: transformed point cloud



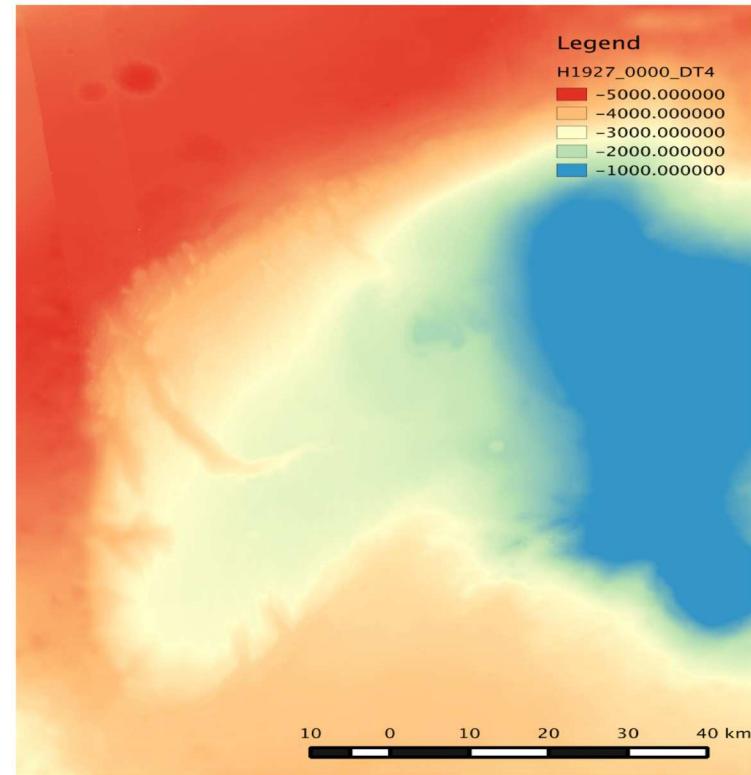
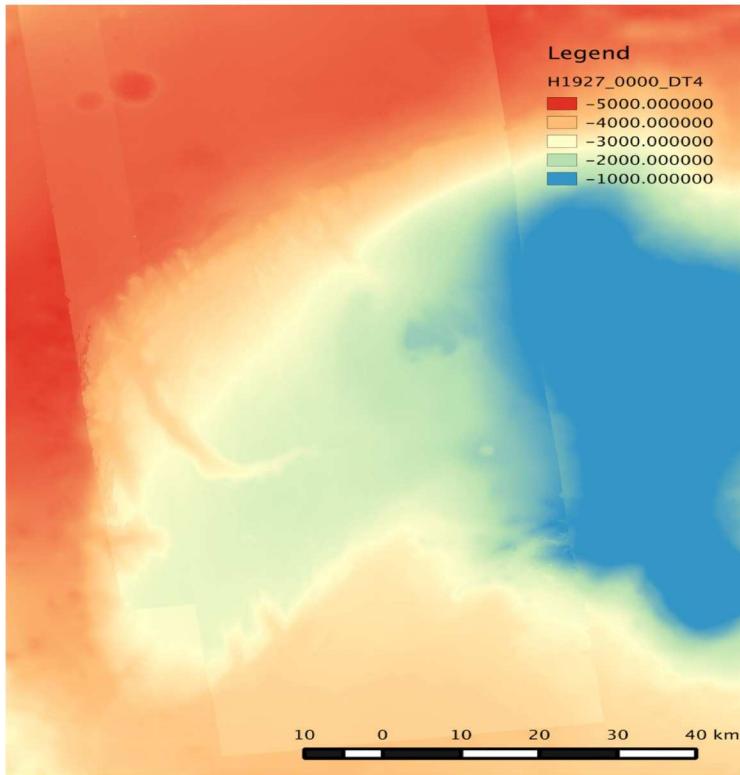
ICP result



Red dots:  
 $>100$  m error

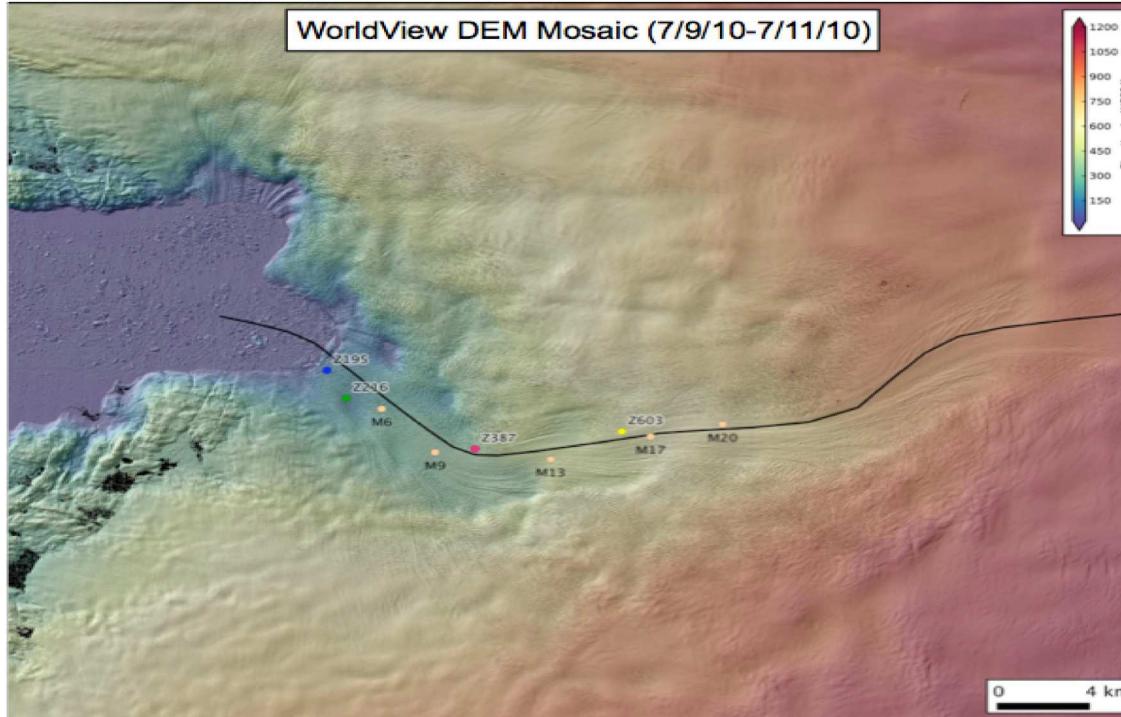
Blue dots <  
5 m of error

# DEM Alignment Using ICP



# Mosaicking

dem\_mosaic is a large-scale mosaicking tool



# NASA IceBridge

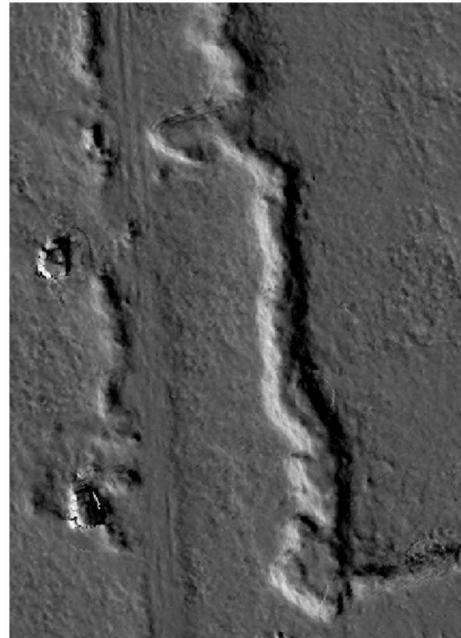
- Our major effort this year is to process a large backlog of frame camera images captured during NASA's IceBridge program flights.
- There are five million images which will be processed on the NASA Pleiades supercomputer.
- In addition to trying to obtain the best possible stereo results with no human intervention, another challenge is to accurately align the stereo DEMs with the narrow strip LIDAR data.
- Our results are comparable to DEMs produced with the Agisoft Photoscan software several years ago but we are much more robust to difficult circumstances.



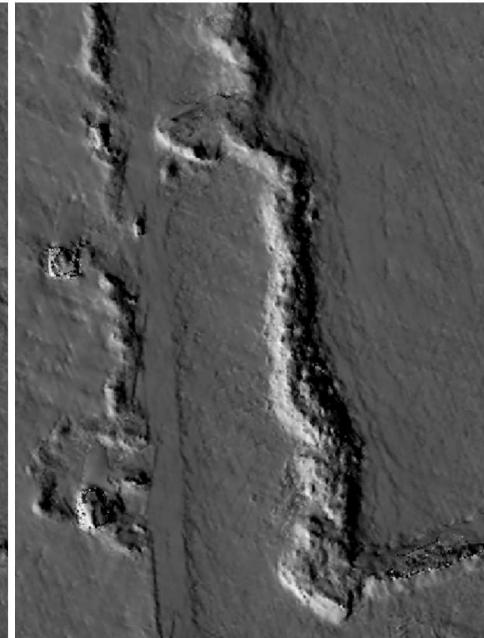
# IceBridge Results



Input image



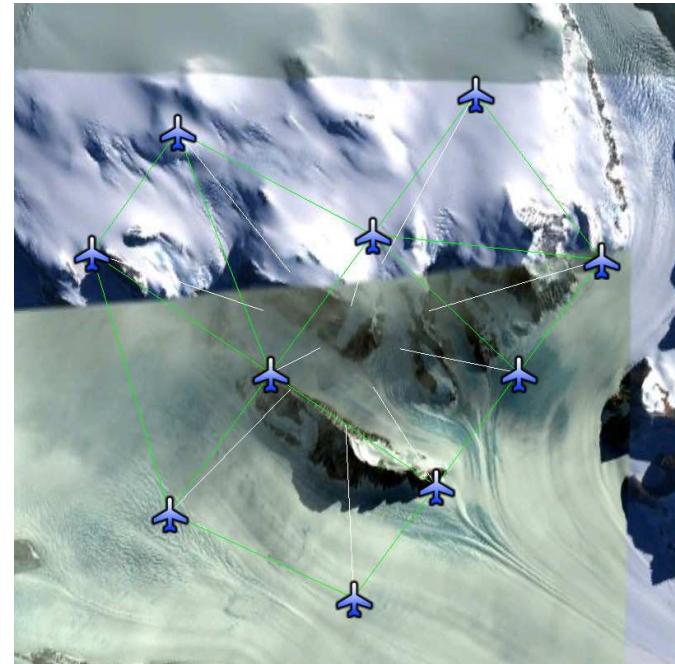
Fireball  
(Agisoft Photoscan)



ASP MGM

# Structure from Motion

- ASP has tools to solve for the position and orientation of frame cameras with incomplete metadata.
- ASP uses the Theia SfM software package to solve for relative camera positions<sup>1</sup>.
- ASP's bundle adjustment tool uses Ground Control Points (GCPs) to refine the cameras and transform them to global coordinates.
- ASP's point cloud alignment tool can be used for final alignment (including scale) if the GCPs are not sufficiently accurate.

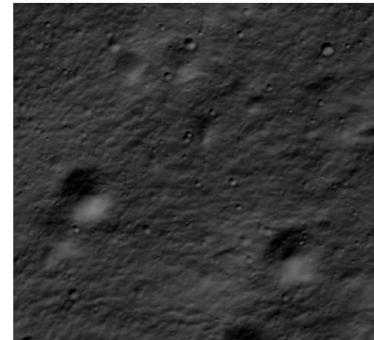
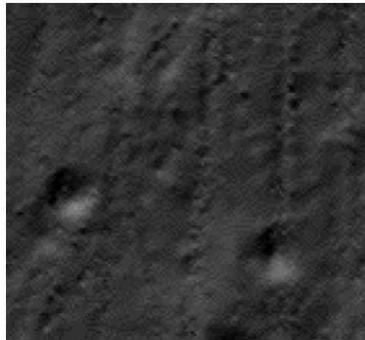


1) <http://www.theia-sfm.org/>

# Shape from Shading

- By starting with the observation that the shading in an image is influenced by angle-dependent reflection, ASP is able to use multiple images taken with different lighting conditions to produce very accurate terrain models.
- ASP models reflectance, albedo, camera exposures, camera positions/orientations, and shadows.
- The surface starts with an initial guess from stereo or LIDAR and iterates until a solution is reached.
- This process can achieve a level of detail comparable to the input images.
- Though powerful, this method requires more input imagery, more computation time, and a good understanding of the material properties of the ground. Used with non-Earth imagery.

LOLA gridded  
DEM



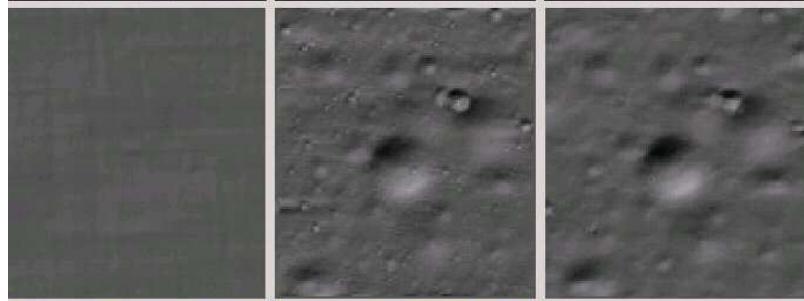
Shape from  
Shading DEM

# Shape from Shading

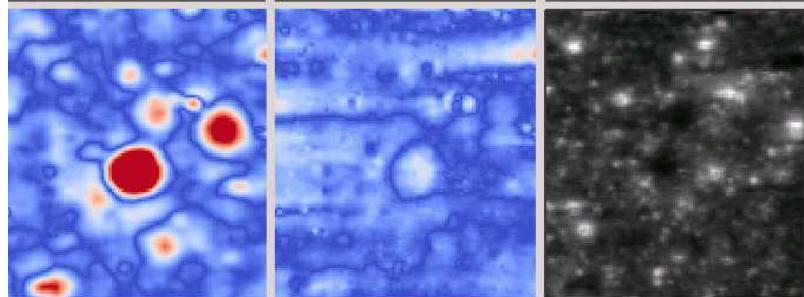
LRO-NAC 10x. →



Stereo DEM from 10x,  
SfS DEM from 10x,  
Stereo DEM from 1x →



Error between SfS and 10x stereo,  
error between SfS and 1x stereo,  
and solved albedo. →



# Future Development

- Add piecewise epipolar image alignment for pushbroom sensors
- Improve SGM/MGM results on extraterrestrial data
- Incorporate geometric filtering in correlation step
- Add new stereo algorithms
- Improve modeling of distortion
- Add more preprocessing options

# Contact

Google group:

<https://groups.google.com/forum/#!forum/ames-stereo-pipeline-support>

Mailing list:

[stereo-pipeline@lists.nasa.gov](mailto:stereo-pipeline@lists.nasa.gov)

Email the developers directly:

[stereo-pipeline-owner@nasa.gov](mailto:stereo-pipeline-owner@nasa.gov)

# Questions?

