



# Big Data Earth Observation Processing

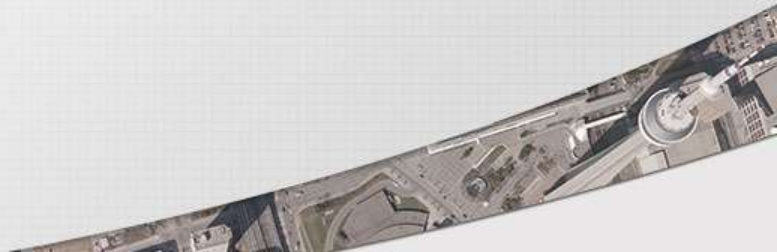
Shawn Melamed  
Tech. Solution Specialist



# About PCI and Big Data

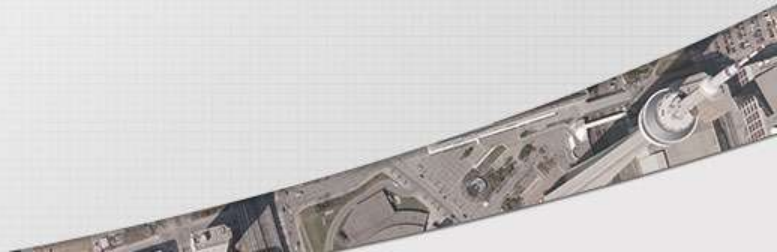
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- In 2007, PCI Geomatics developed its first high volume Earth Observation (EO) processing system called the GeoImaging Accelerator (GXL)
- The GXL was initially created as a customer solution to orthorectify SPOT-4/5 imagery for all of Canada, as part of the National Imagery Project (NIP) [http://www.pcigeomatics.com/pdf/case\\_study\\_NIP.pdf](http://www.pcigeomatics.com/pdf/case_study_NIP.pdf)



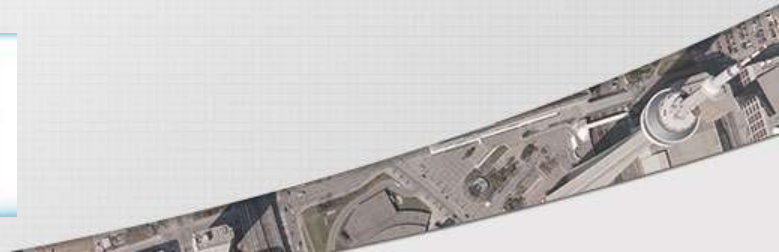
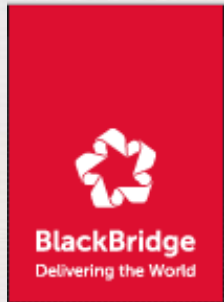
# About PCI and Big Data

- The National Imagery Project (NIP) was announced in 2007 (8 years ago)
- Over \$2.4 million dollars was invested in this project for data acquisition, processing and dissemination
- 11.5 million km<sup>2</sup> of SPOT-4/5 (10m PAN and 20m MS) data was processed
- The data is freely available to all Canadians and non-Canadians at [www.geobase.ca](http://www.geobase.ca)



# About PCI and Big Data

- Since the NIP project in 2007, PCI Geomatics has successfully delivered dozens of GXL systems worldwide





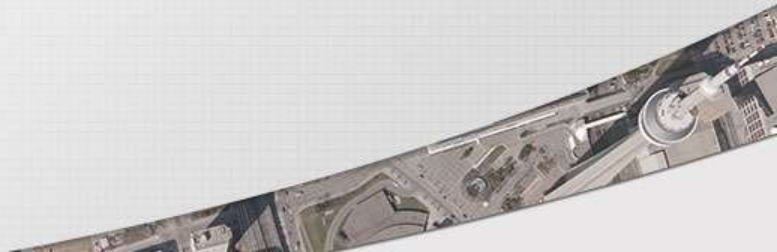
Earth Observation by the Numbers



# EO Market by the Numbers

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- In the last 10 years 179 civil and commercial EO satellites >50kg have been launched<sup>2</sup>
- Top nations by number of EO satellites include: China 25.5%, USA 23.5%, India 7.29%, Germany 4.69% and Russia 3.65%<sup>1</sup>
- It is expected that over 400 more satellites will be launched in the next 10 years (not including micro satellites)<sup>2</sup>



# EO Market by the Numbers

- In 2024 the market for commercial EO data is expected to reach \$3.5 billion<sup>2</sup>
- Largest growth markets, expected to be Asia, Latin America and Africa<sup>2</sup>
- Major applications: Natural resource management, infrastructure and defense<sup>2</sup>

1 Pixalytics - <http://www.pixalytics.com/how-many-eo-space/>

2 Euroconsult - <http://www.euroconsult-ec.com/shop/earth-observation/74-satellite-based-earth-observation-market-prospects-to-2024.html>



# EO Market by the Numbers

- This means there will be many Exabytes (1024 Petabytes) of data
- This will require specially designed systems and algorithms to convert EO data to EO information





# Fun Fact

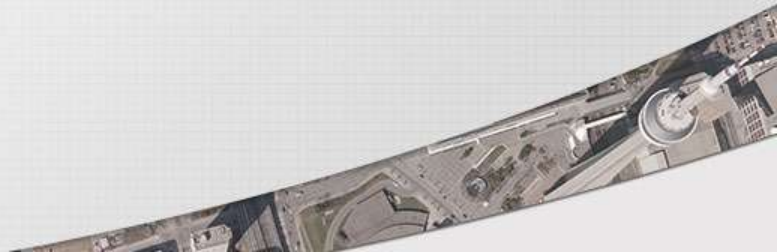
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What is the oldest EO satellite currently in operation?

Hint: It was expected to be operational for 1 year!

Hint: It has been operational for over 22 years and counting

Answer: The Brazilian made Satélite de Coleta de Dados (SCD-1)

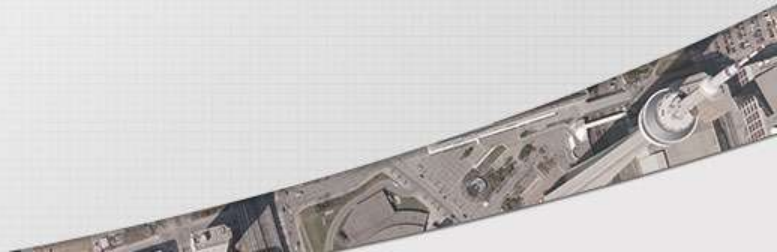


# Fun Fact

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What can we deduce from this?

The world needs Latin America to build more EO satellites





## Big Data Processing Systems



# What is the GXL?

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**A high volume *photogrammetric & mosaicking* production system – Geolmaging Accelerator**



# Designed for Limited Operators

## Distributed Production Systems



## Desktop Processing



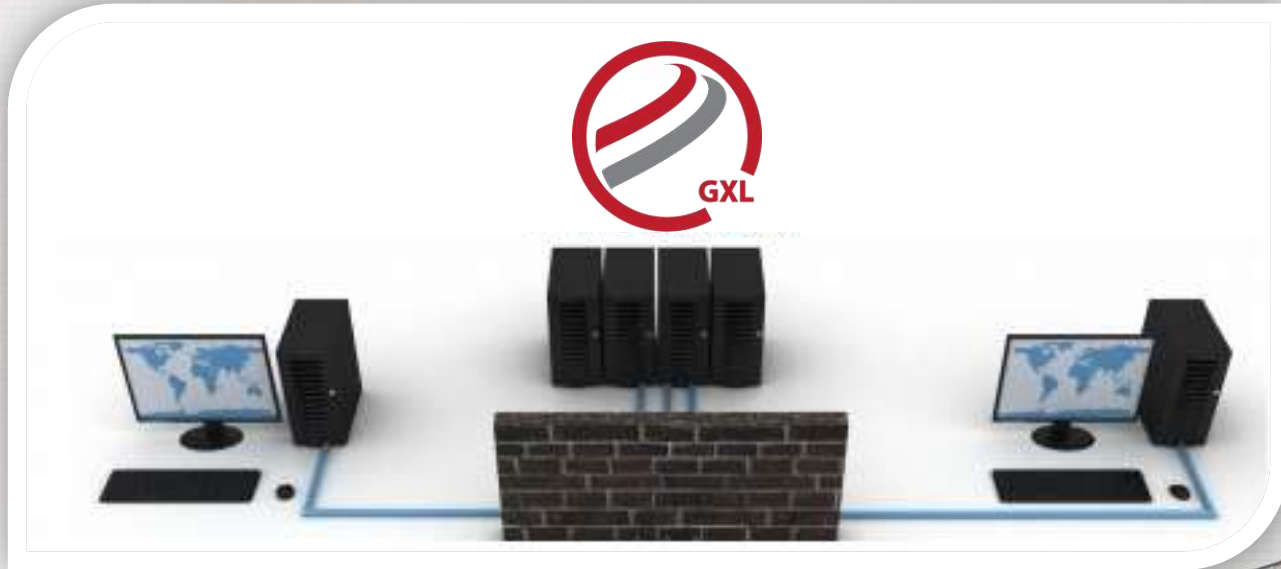
# Ease of Use – Web Portal

**Open Configuration** – Access the GXL from any computer on the web



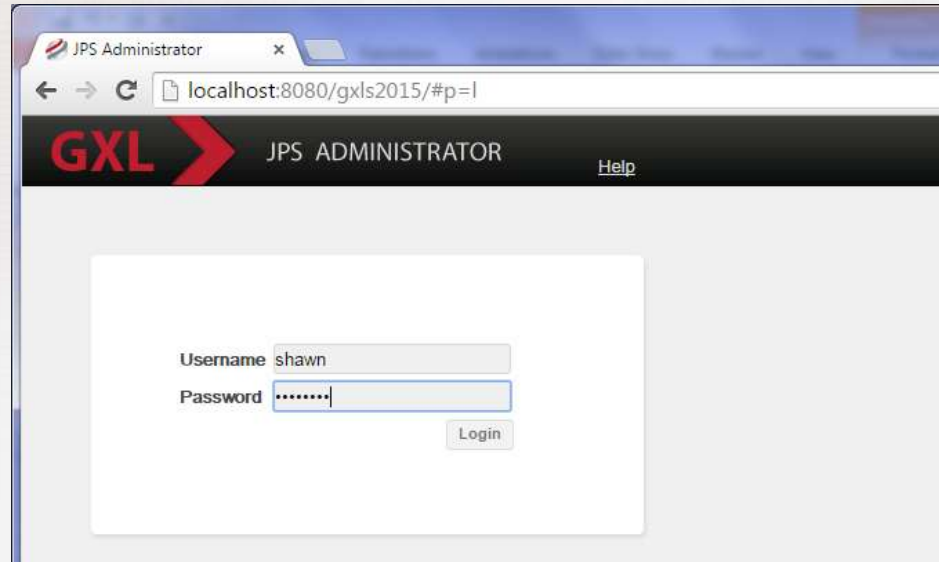
# Ease of Use – Web Portal

**Secure Configuration** – Access the GXL from any computer on your local network



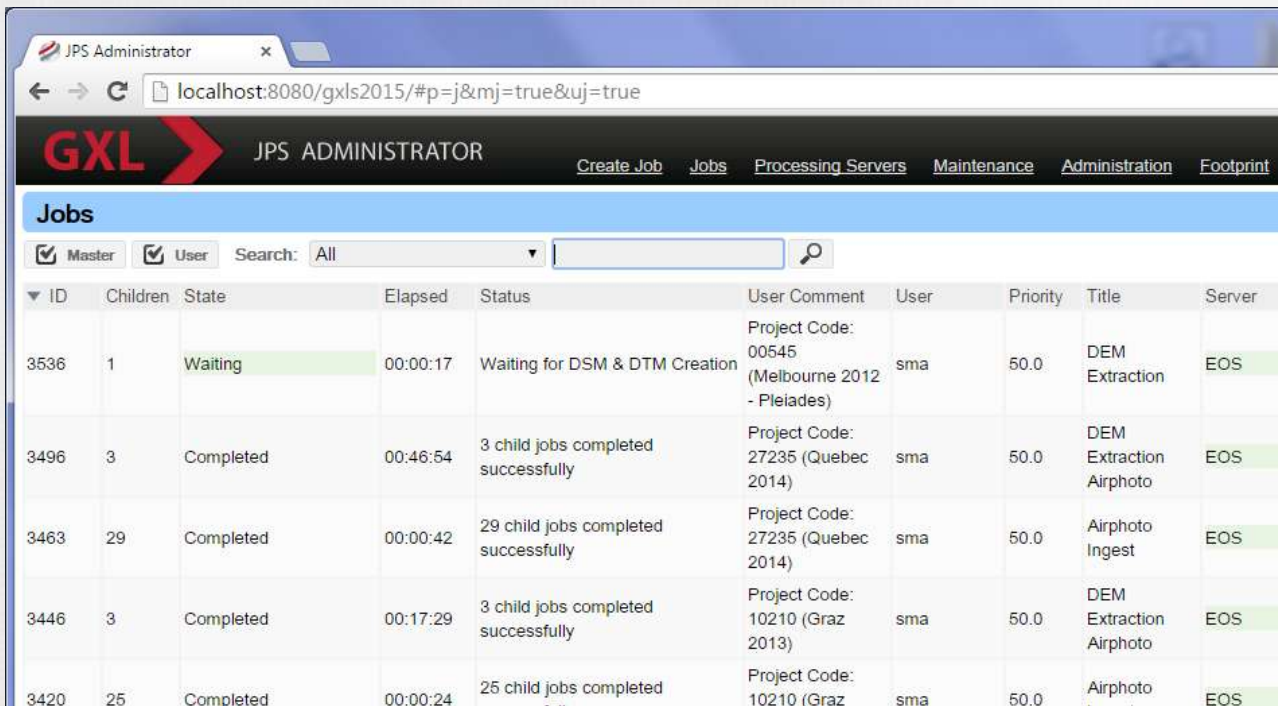
# Ease of Use – Web Portal

- Securely access the GXL from any computer, tablet or phone on the GXL's network
- Multiple User Access





# Ease of Use – Monitor & Manage Batch Projects



The screenshot shows the JPS Administrator web interface. The browser address bar displays 'localhost:8080/gxls2015/#p=j&mj=true&uj=true'. The page header includes the 'GXL' logo and navigation links for 'Create Job', 'Jobs', 'Processing Servers', 'Maintenance', 'Administration', and 'Footprint'. The main content area is titled 'Jobs' and features a search bar with 'All' selected. Below the search bar is a table with the following columns: ID, Children, State, Elapsed, Status, User Comment, User, Priority, Title, and Server. The table contains five rows of job data.

| ID   | Children | State     | Elapsed  | Status                                  | User Comment   | User | Priority | Title                         | Server |
|------|----------|-----------|----------|---|--|------|----------|-------------------------------|--------|
| 3536 | 1        | Waiting   | 00:00:17 | Waiting for DSM & DTM Creation          | Project Code:<br>00545<br>(Melbourne 2012<br>- Pleiades) | sma  | 50.0     | DEM<br>Extraction             | EOS    |
| 3496 | 3        | Completed | 00:46:54 | 3 child jobs completed<br>successfully  | Project Code:<br>27235 (Quebec<br>2014)                  | sma  | 50.0     | DEM<br>Extraction<br>Airphoto | EOS    |
| 3463 | 29       | Completed | 00:00:42 | 29 child jobs completed<br>successfully | Project Code:<br>27235 (Quebec<br>2014)                  | sma  | 50.0     | Airphoto<br>Ingest            | EOS    |
| 3446 | 3        | Completed | 00:17:29 | 3 child jobs completed<br>successfully  | Project Code:<br>10210 (Graz<br>2013)                    | sma  | 50.0     | DEM<br>Extraction<br>Airphoto | EOS    |
| 3420 | 25       | Completed | 00:00:24 | 25 child jobs completed                 | Project Code:<br>10210 (Graz                             | sma  | 50.0     | Airphoto                      | EOS    |

Simple table to track and access all batch processing projects (jobs)



## Big Data Processing Algorithms & Tools

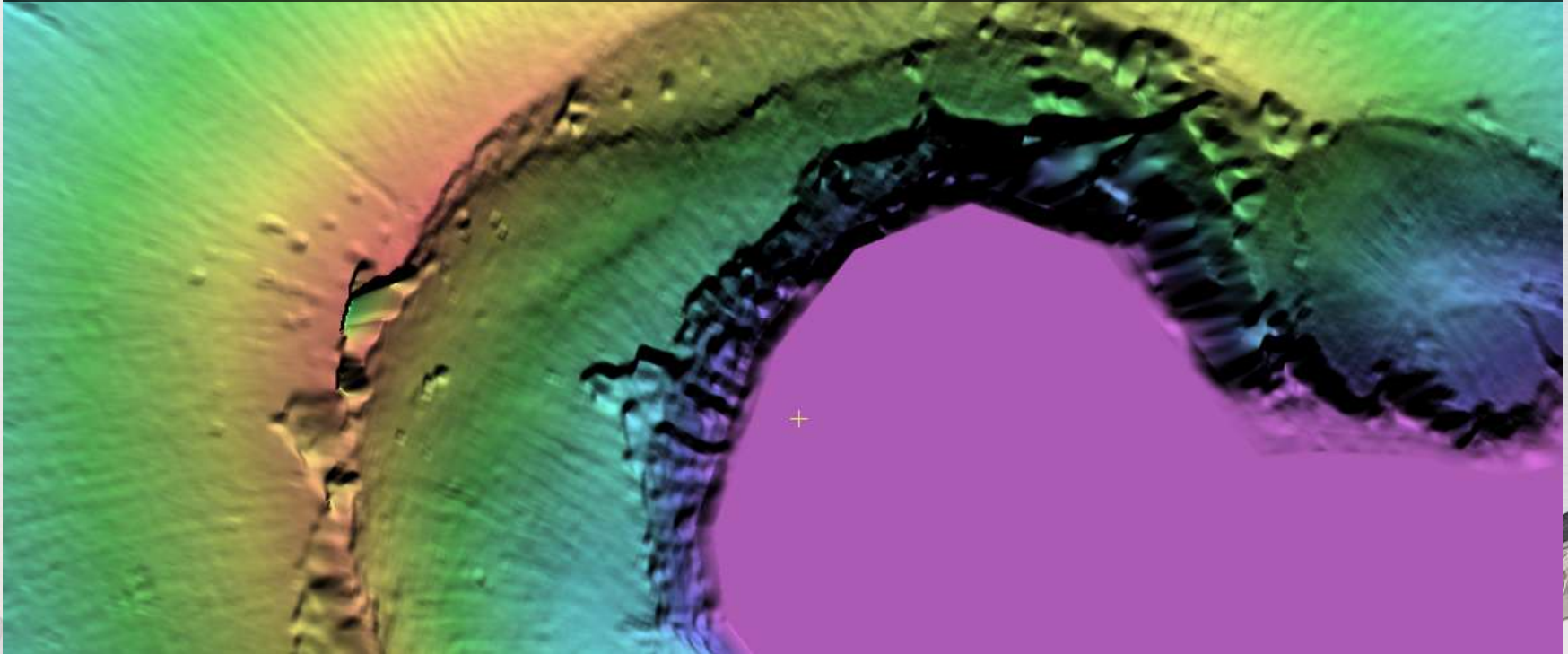
# High Performance DEM Extraction

| Source                         | Original | Current | Improvement |
|--------------------------------|----------|---------|-------------|
| UltraCam airphoto              | 160s     | 40s     | 4x          |
| WorldView 2 (hi-res satellite) | 35m      | 11m     | 3x          |

- DEM extraction specifically improved (epipolar generation and geocoding unchanged)
- With all steps included total times are 1.5x to 2x faster

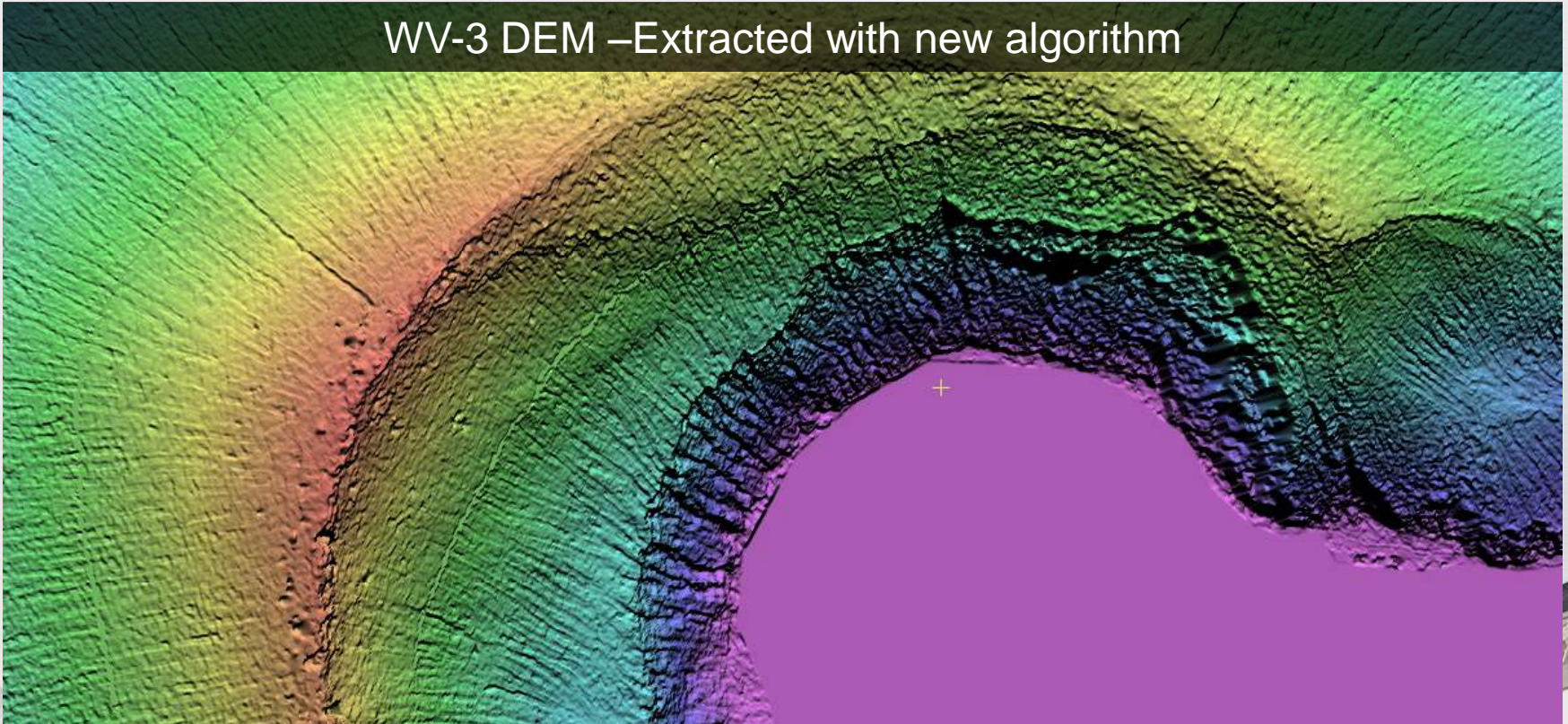
# DEM Extraction - Quality

WV-3 DEM –Extracted with old algorithm



# DEM Extraction – Quality

WV-3 DEM –Extracted with new algorithm



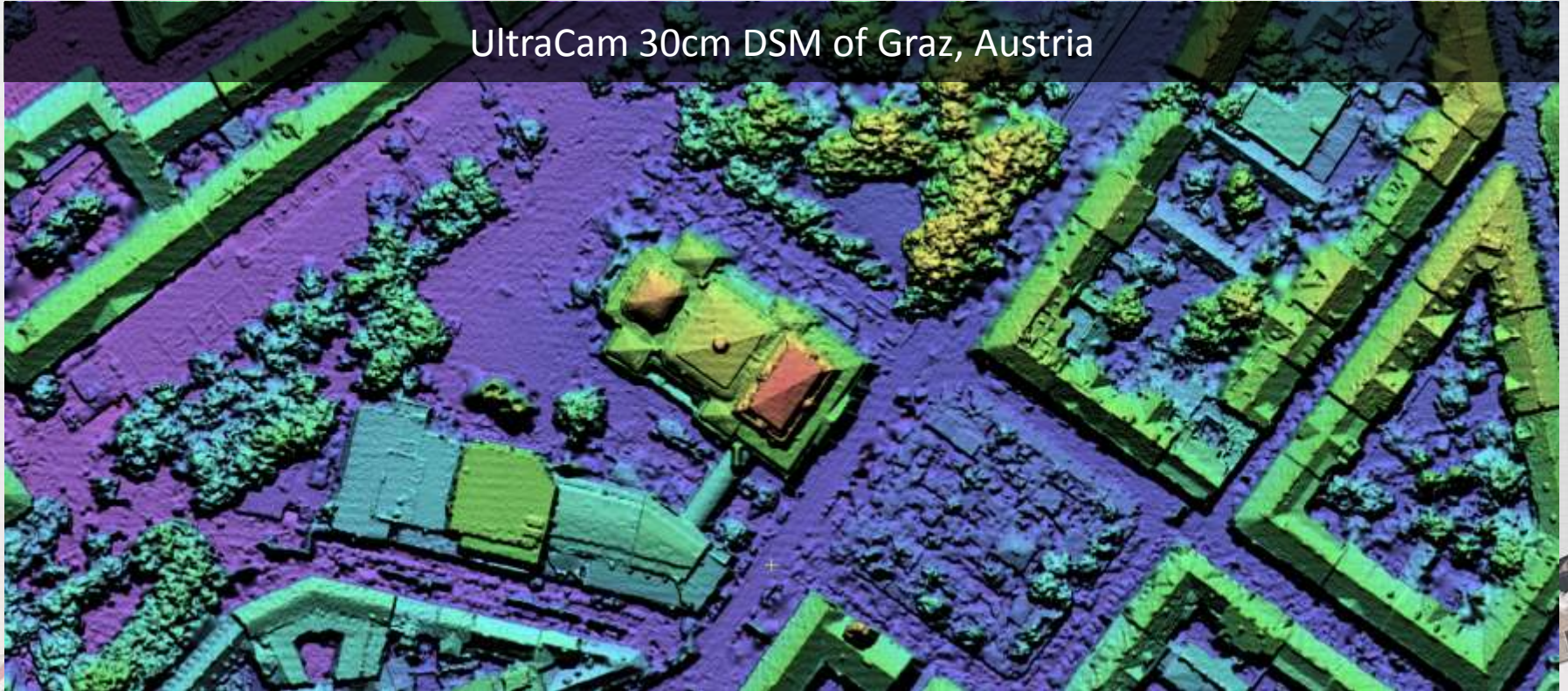
# High Quality DEM Extraction

UltraCam 7.5cm ortho-image of Graz, Austria



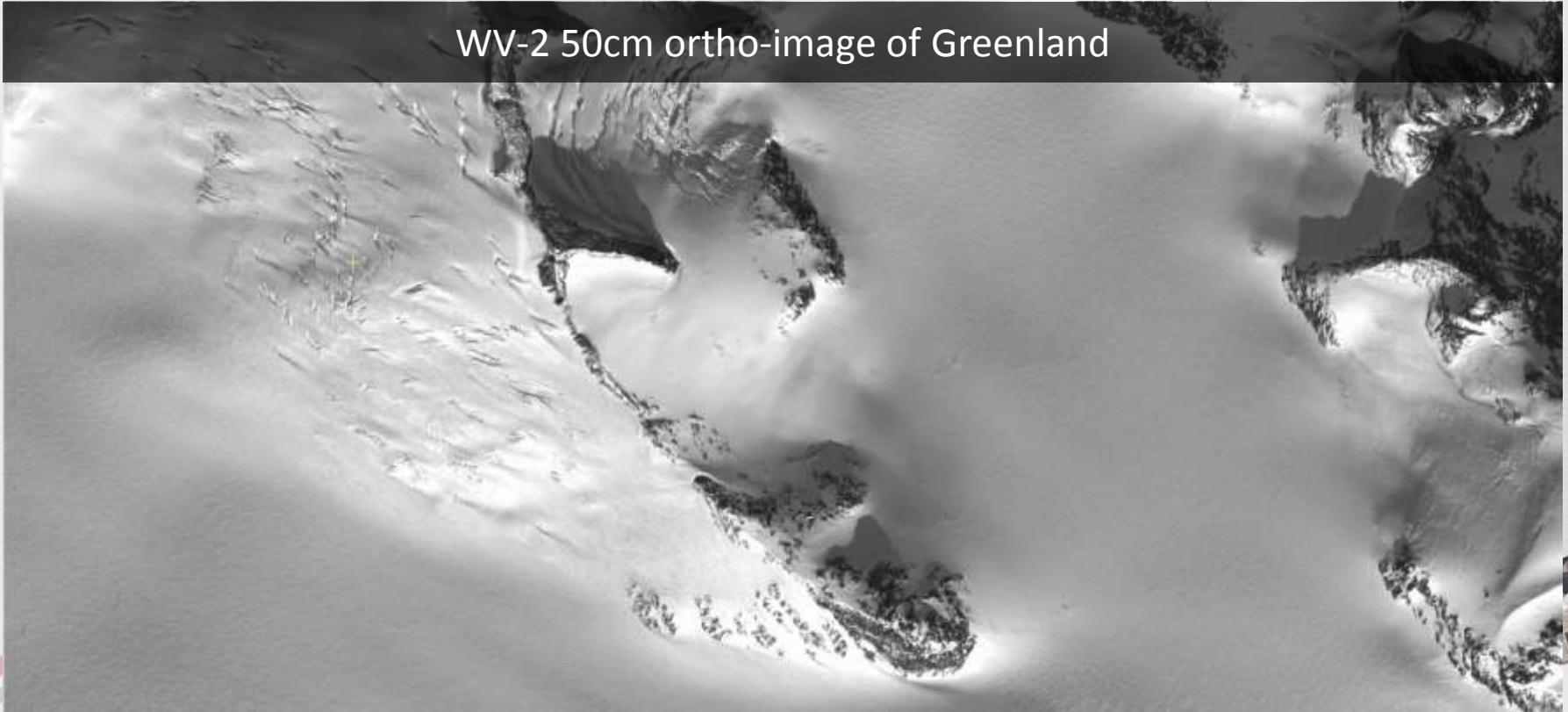
# High Quality DEM Extraction

UltraCam 30cm DSM of Graz, Austria



# High Quality DEM Extraction

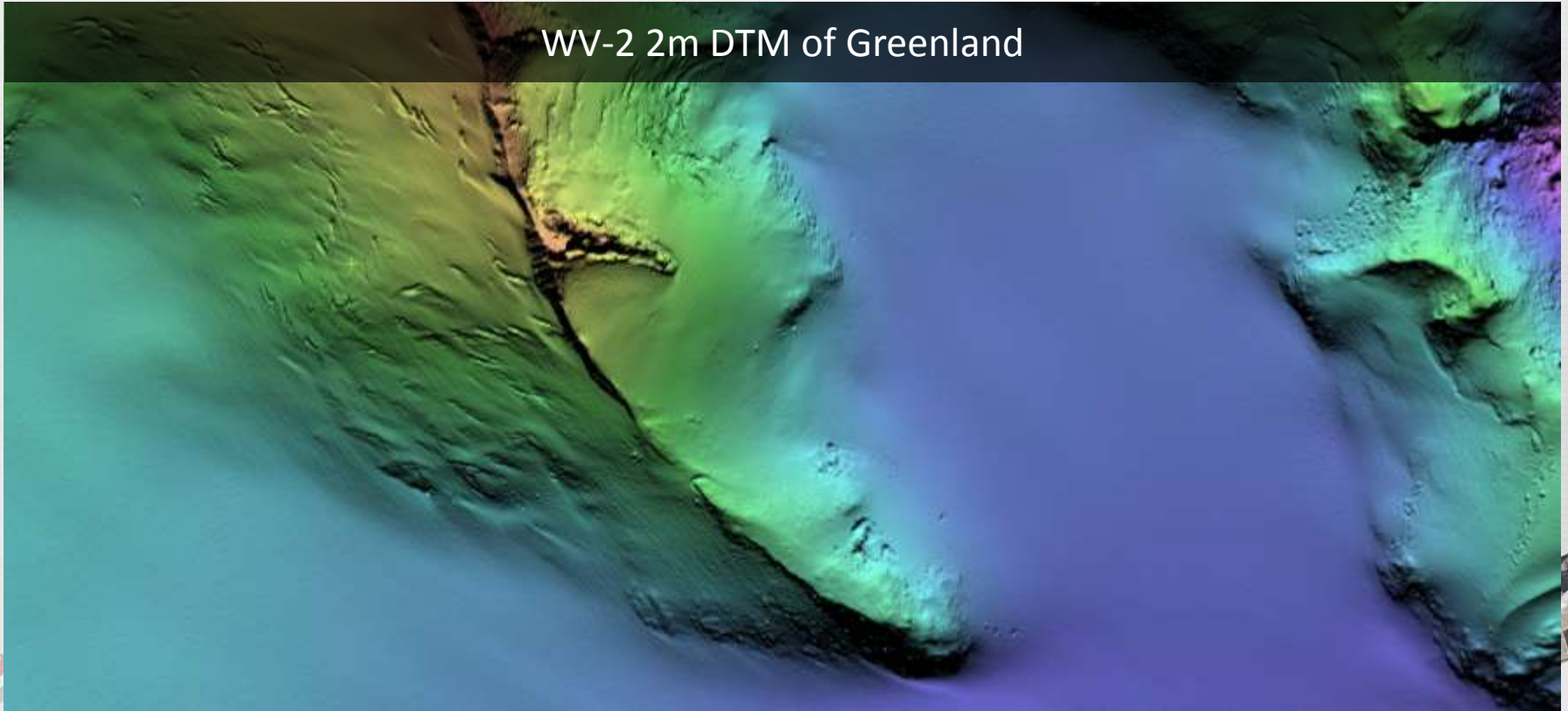
WV-2 50cm ortho-image of Greenland





# High Quality DEM Extraction

WV-2 2m DTM of Greenland



# Automatic Mosaicking Quality

None



Bundle



# Traditional Colour Balancing Algorithms

- Traditional Method uses a single set of coefficients to define the brightness and contrast of each colour band



- Calculation and use of band specific gain and bias coefficients for color balancing

# Traditional Colour Balancing Algorithms

- Traditional method is more likely to create checkerboard effect



# New Colour Balancing Algorithm

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- New colour balancing algorithm is called 'Bundle'
- It consists of 2 primary steps to balance a set of images for mosaicking
  1. Coarse Balancing
  2. Local Balancing (edges)

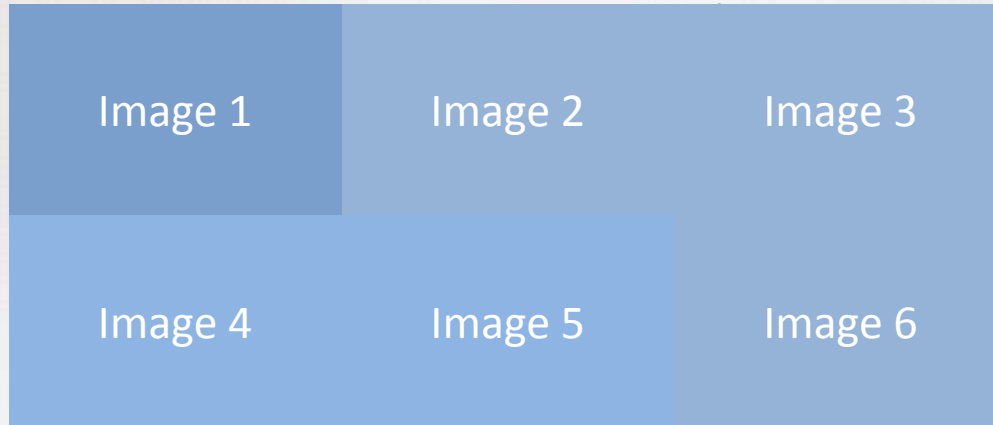
# New Colour Balancing Algorithm

- The Coarse balancing step is a global operation and performs an initial balance on the entire image based on all images in the mosaic



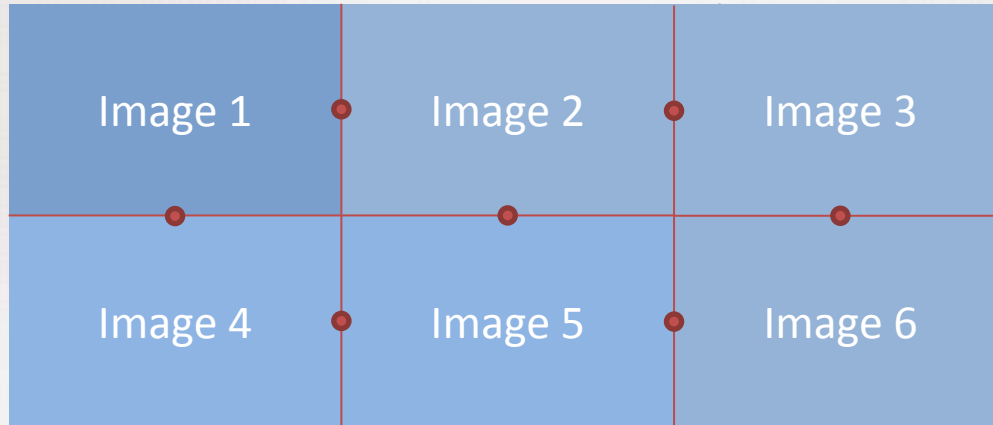
# New Colour Balancing Algorithm

- This improves the balancing of the images for the final step (local balance)
- The **global mean** and **sigma** are preserved to ensure the natural appearance of the images is retained



# New Colour Balancing Algorithm

- The final step uses the coarse balancing results and further refines the colours along the edges only
- A set of coefficients is created for each overlap region and then blended

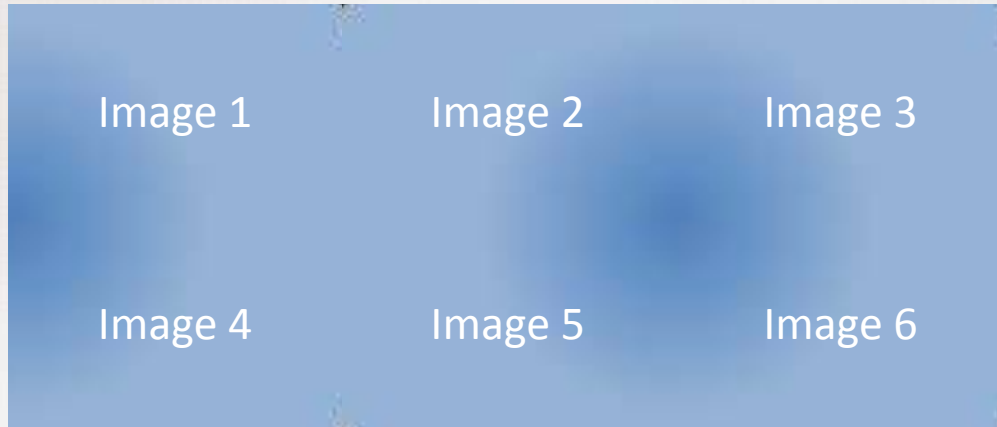


- Calculation and use of band specific gain and bias coefficients for color balancing




# New Colour Balancing Algorithm

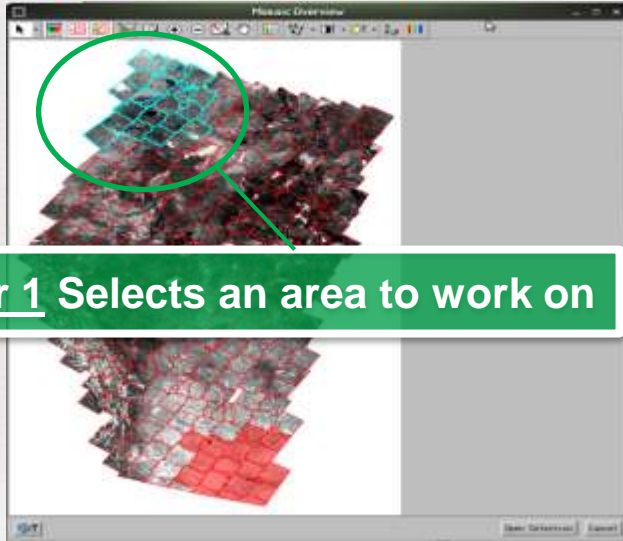
- Only pixels along the edges are further adjusted and then blended into the rest of the mosaic
- This improves the balancing and image fidelity



# Interactive Tools – Mosaic Tool

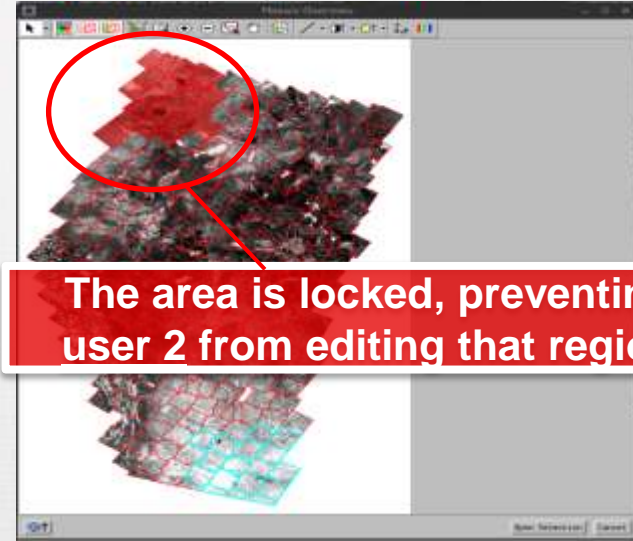
Multiple users on separate machines can quality check and edit different regions of the same mosaic at the same time

 **User 1**



**User 1** Selects an area to work on

 **User 2**



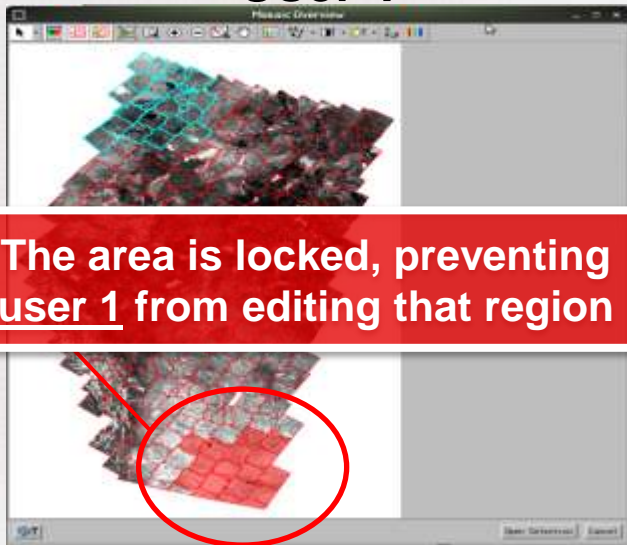
The area is locked, preventing user 2 from editing that region

# Efficient Editing Tools

Multiple users on separate machines can quality check and edit different regions of the same mosaic at the same time



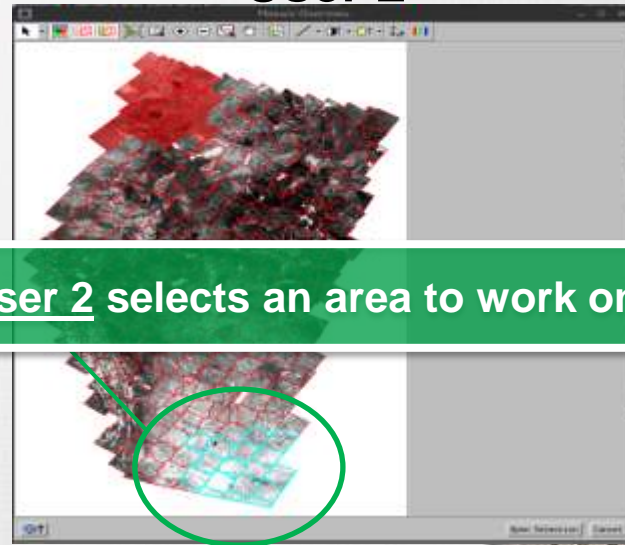
**User 1**



The area is locked, preventing user 1 from editing that region



**User 2**



User 2 selects an area to work on



## Big Data Processing Architectures



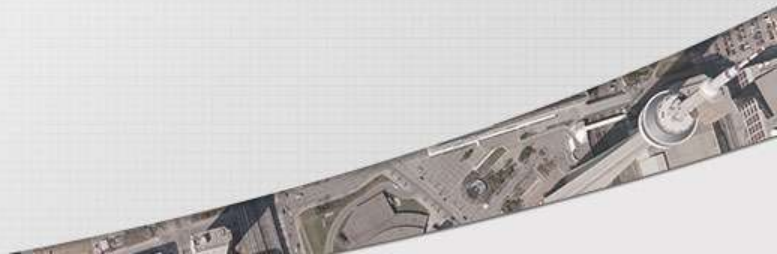
# Performance – Metrics

## GXL-Satellite

Ingest → GCP Collection → Bundle Adjustment → Pansharp → Ortho → Mosaicking

| Sensor:        | Output:     | Area:                               |
|----------------|-------------|-------------------------------------|
| RapidEye*      | 840 GB/day  | 1 400 000 km <sup>2</sup> /day (5m) |
| WV-2 (4-node)  | 1200 GB/day | 256 000 km <sup>2</sup> /day (0.5m) |
| Ikonos (Cloud) | 3 TB/day    | 600 000 km <sup>2</sup> /day (1.0m) |

\*RapidEye data cannot be pansharpended



# Performance – Metrics

## GXL-Aerial

Ingest → DEM Extraction → Ortho → Mosaicking

| Ortho-Mosaic: | UltraCam X      | UltraCam Xp     |
|---------------|-----------------|-----------------|
| Project:      | 3300 Images     | 4500 Images     |
| Total Time:   | 17.5 Hours      | 52.5 Hours      |
| Output:       | 1.8 TB/day      | 1.1 TB/day      |
| Speed:        | 4500 Images/day | 2000 Images/day |

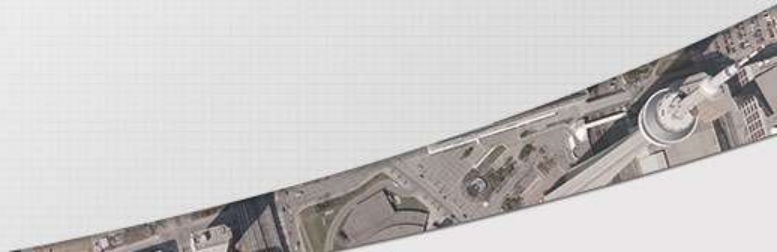


# Performance – Method Overview

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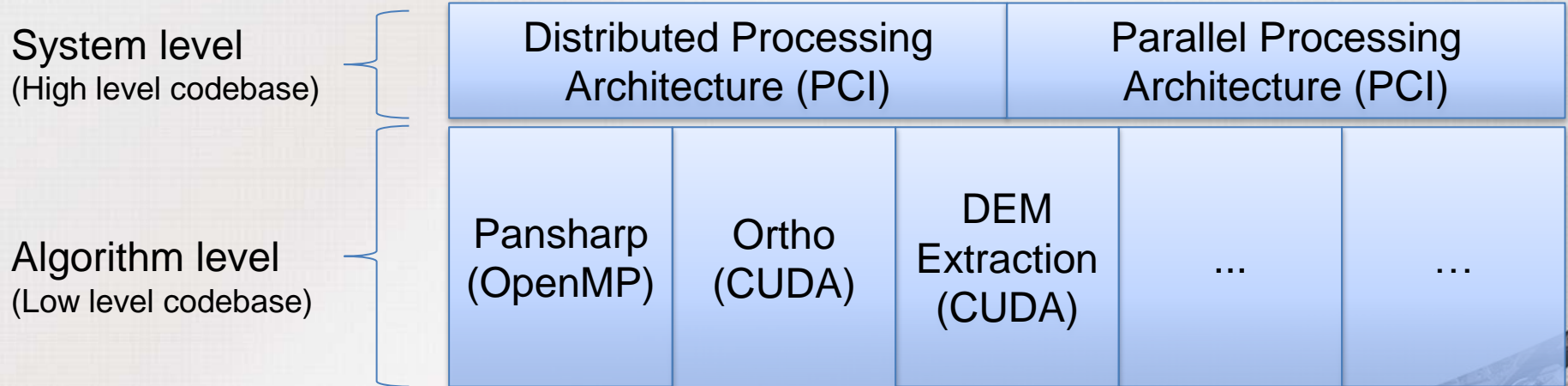
The GXL's industry leading throughput is a result of well thought-out code implemented at both the algorithm and system levels

- Multi-threaded functions (Algorithm level)
- GPU Processing (Algorithm level)
- Parallel processing (System level)
- Distributed processing (System level)



# Performance – Method Overview

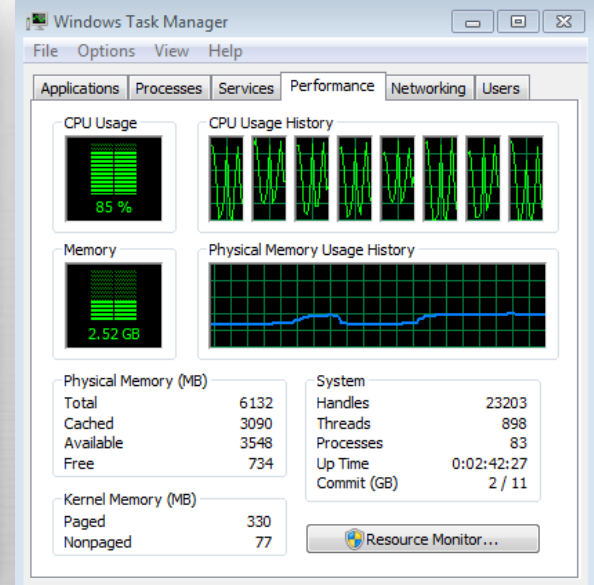
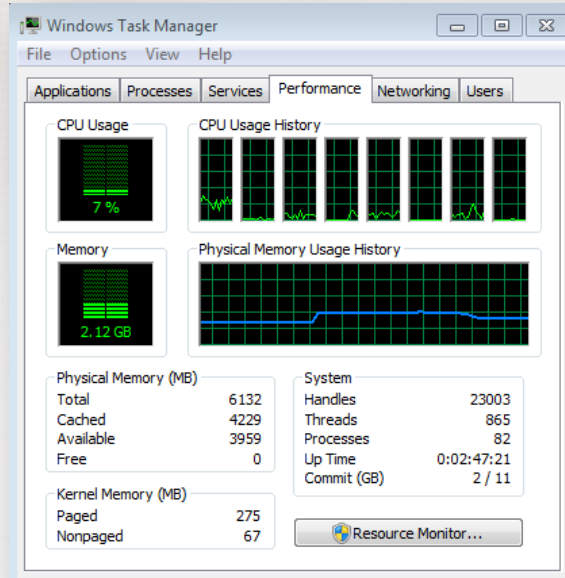
Strong emphasis on processing speed at all levels of code





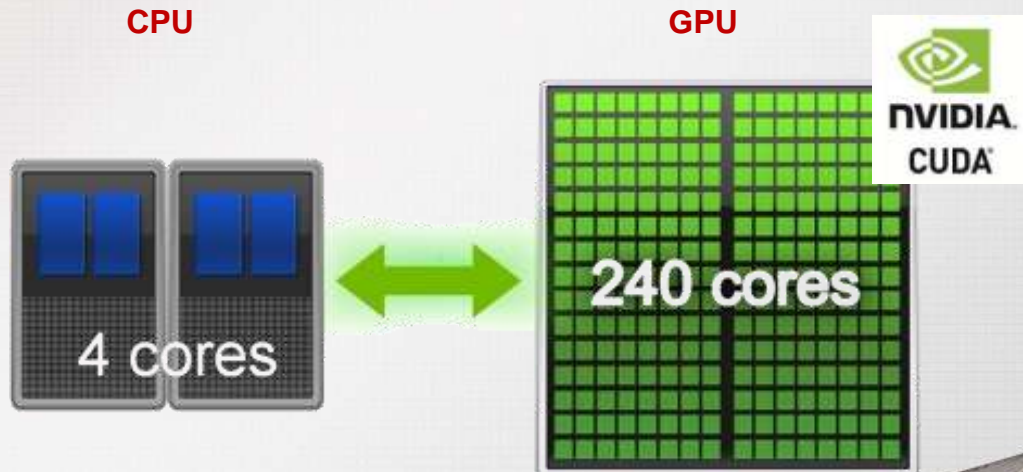
# Performance - Multi-Threaded Processing

Many of the GXL algorithms are programmed using OpenMP standards to take advantage of modern multi-core CPUs



# Performance - GPU Processing

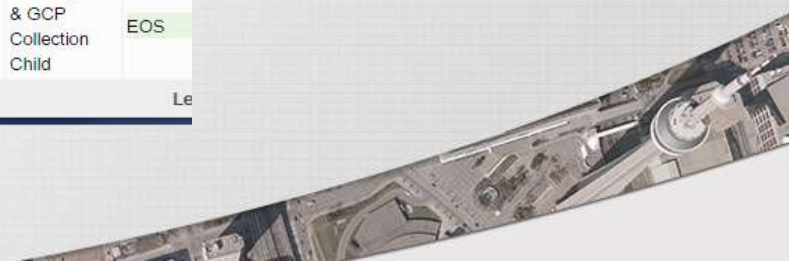
- A GPU contains hundreds of cores capable of performing hundreds of identical parallel processes on different chunks of data.
- GPU processing can significantly improve the net processing speeds of certain algorithms



# Performance - Parallel Processing

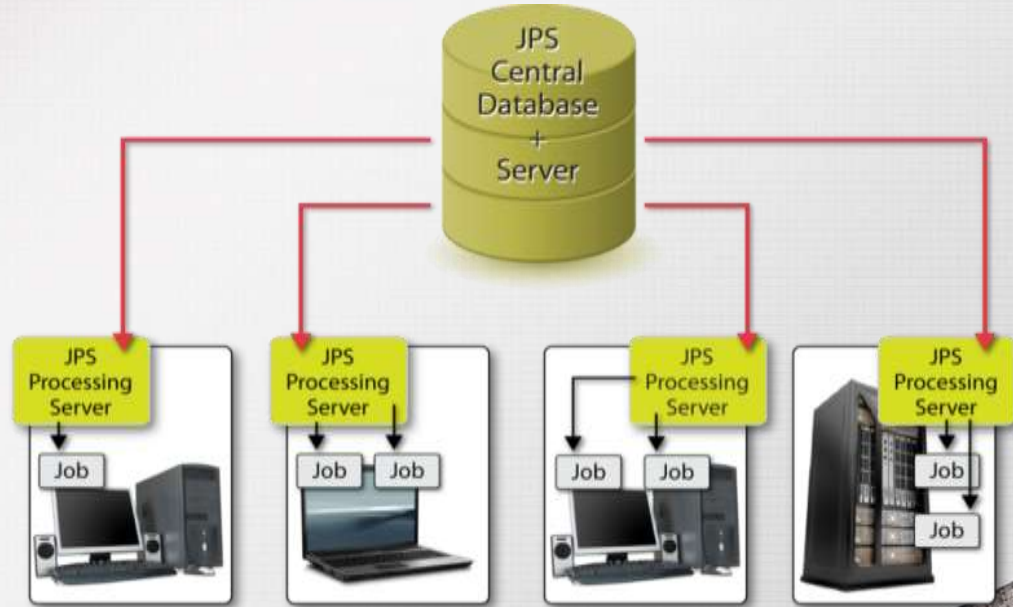
| ID   | Children | State   | Elapsed  | Status                                 | User Comment                 | User | Priority | Title                              | Server |
|------|----------|---------|----------|--|------------------------------|------|----------|------------------------------------|--------|
| 3562 | 0        | Ready   |          | K3_20130506182405_05174...             | Data Ingest & GCP Collection | sma  | 50.0     | & GCP Collection Child             |        |
| 3561 | 0        | Ready   |          | K3_20130506182405_05174...             | Data Ingest & GCP Collection | sma  | 50.0     | Data Ingest & GCP Collection Child |        |
| 3560 | 0        | Running | 00:00:03 | Pyramiding: K3_20130506182405_05174... | Data Ingest & GCP Collection | sma  | 50.0     | Data Ingest & GCP Collection Child | EOS    |
| 3559 | 0        | Running | 00:00:03 | Pyramiding: K3_20130501182829_05101... | Data Ingest & GCP Collection | sma  | 50.0     | Data Ingest & GCP Collection Child | EOS    |
| 3558 | 0        | Running | 00:00:03 | Pyramiding: K3_20130501182829_05101... | Data Ingest & GCP Collection | sma  | 50.0     | Data Ingest & GCP Collection Child | EOS    |

3 jobs running in parallel



# Performance - Distributed Processing

GXL Processes can be autonomously distributed among all active processing servers in the cluster

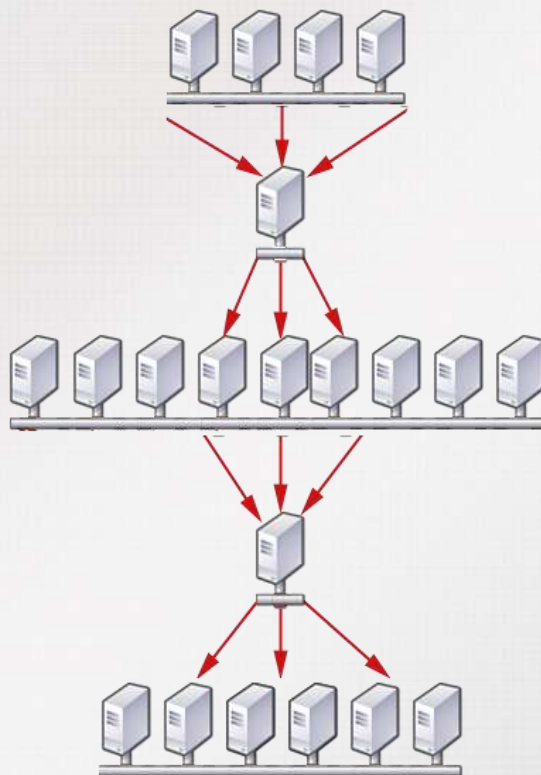


# Performance – Cloud Processing

The Cloud's scalable architecture is perfect for GXL

Add nodes when you need them...

Take them away when you don't...



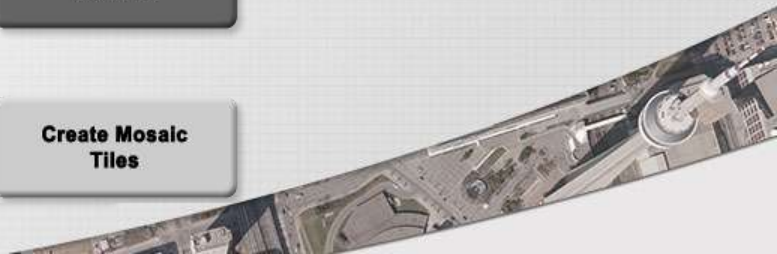
**Ingest & Collect Tie-Points**

**Block Bundle (Align Images)**

**Ortho Correct & Pan Sharpen**

**Global Colour Balance**

**Create Mosaic Tiles**

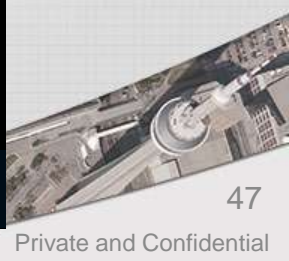
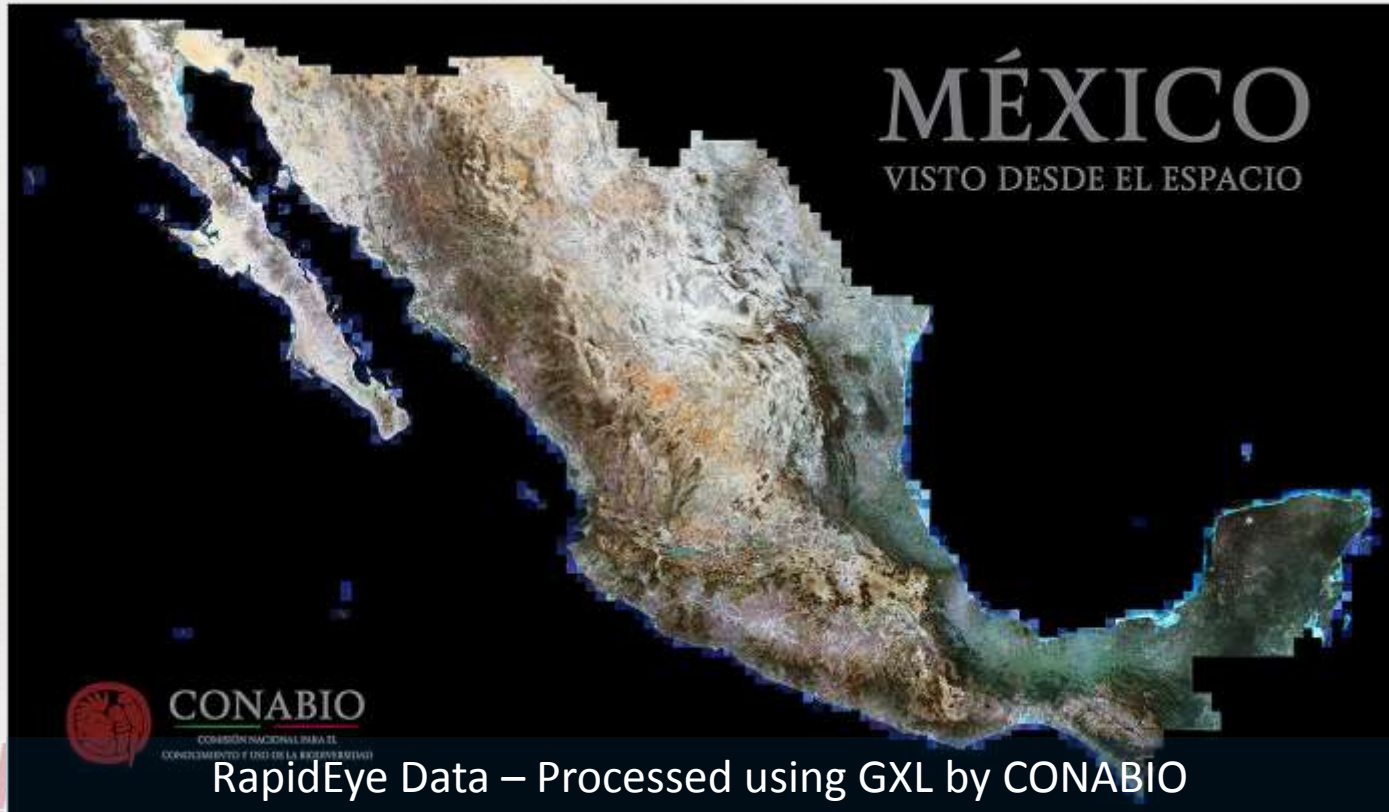




## Success Stories



# Conabio's Mosaic of Mexico



# Conabio's Mosaic of Mexico

Automatic  
Mosaicking

Mosaic Editing

Mosaic Polishing

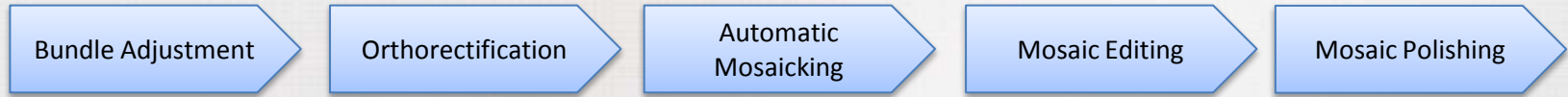
| Component                | Specification            |
|--------------------------|--------------------------|
| Sensor                   | Rapideye                 |
| Input Images             | 25,000                   |
| Images Used (Cloud free) | 4,338                    |
| Image Resolution         | 5m                       |
| Operator                 | 1                        |
| Coverage Area            | 1,972,550km <sup>2</sup> |
| Disk Size                | >1TB                     |



# Esri's Ortho-Mosaic of the World



# Esri's Ortho-Mosaic of the World



| Component                | Specification              |
|--------------------------|----------------------------|
| Sensor                   | Ikonos                     |
| Input Images             | >100,000                   |
| Images Used (Cloud free) | >100,000                   |
| Image Resolution         | 1m                         |
| Operator                 | 3-4                        |
| Coverage Area            | >50,000,000km <sup>2</sup> |
| Disk Size                | N/A                        |



# PCI's Challenge

Process over 4000 UltraCamX images in one weekend on a laptop with the GXL



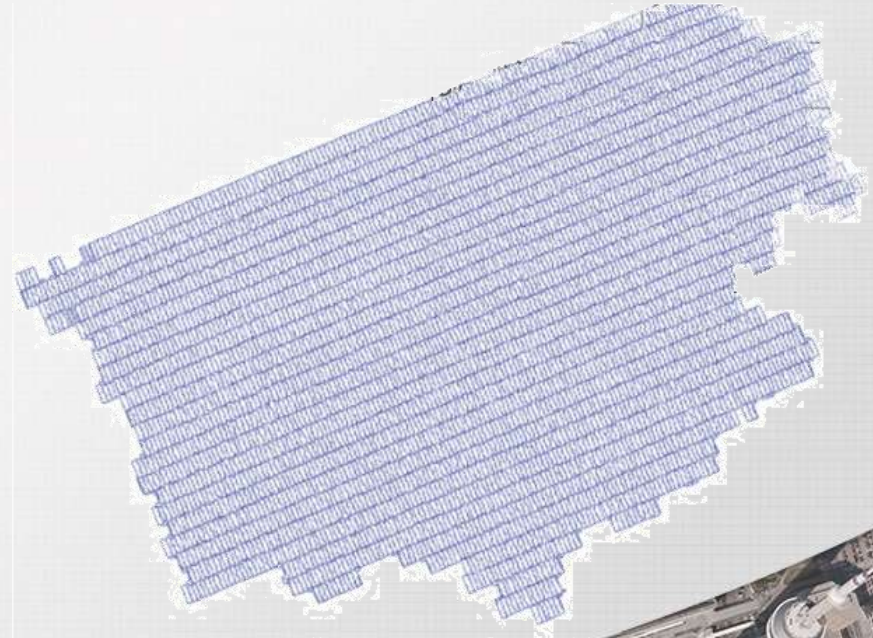
# Processing Computer Details

| Components             | Specification          |
|------------------------|------------------------|
| Laptop                 | ASUS G75V              |
| CPU                    | Intel 3610QM (4 cores) |
| GPU                    | Nvidia 670M            |
| RAM                    | 24GB                   |
| Internal Disk          | 256GB SSD + 480GB SSD  |
| External USB 3.0 Disks | 2x 2TB                 |
| Software               | GXL 2014               |



# PCI's Challenge

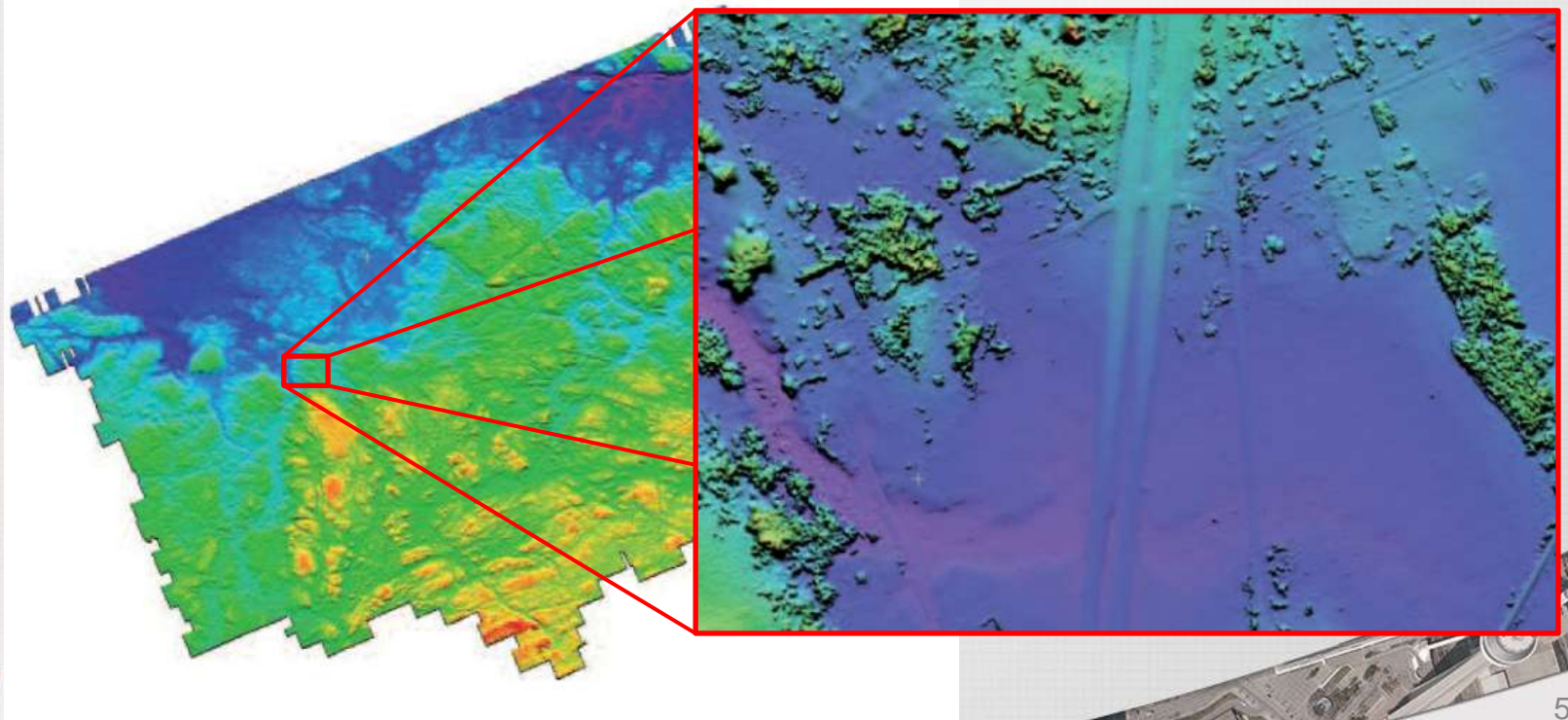
| Component                    | Specification            |
|------------------------------|--------------------------|
| Camera                       | UltraCamX Large Format   |
| Image Size                   | 14430 x 9420 pixels      |
| Image Characteristics        | 8 bit, 3 band TIF Format |
| Ground Sample Distance (GSD) | 20cm                     |
| Overlap                      | 70/30                    |



# PCI Challenge

| Processing Step  | Output Disk Size    | Processing Time    |
|--|---------------------|--------------------|
| Data Ingest  | <20GB               | 14m 12s            |
| DSM Extraction   | 63GB                | 29h 51m 45s        |
| DSM to DTM   | 50GB                | 3h 20m 58s         |
| Orthorectification   | 460GB (cropped 30%) | 9h 59m 16s         |
| Color Balancing & Cutline Generation                       | <20GB               | 1h 53m 24s         |
| Mosaic Tile Generation<br>(172 5km x 5km tiles @ 20cm GSD) | 269GB               | 7h 19m 24s         |
| <b>Totals</b>  | <b>1242GB</b>       | <b>52h 38m 20s</b> |

# PCI Challenge



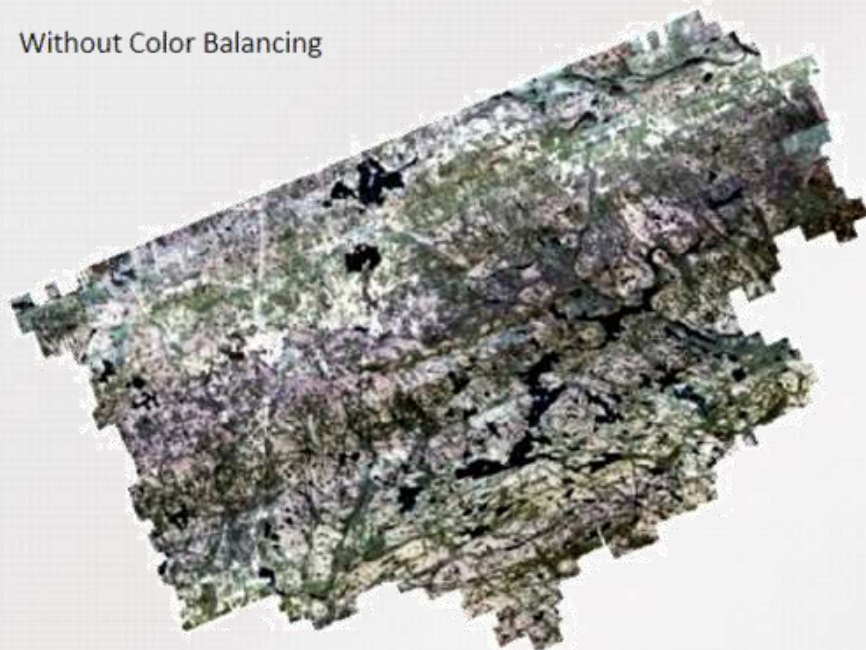
# PCI Challenge



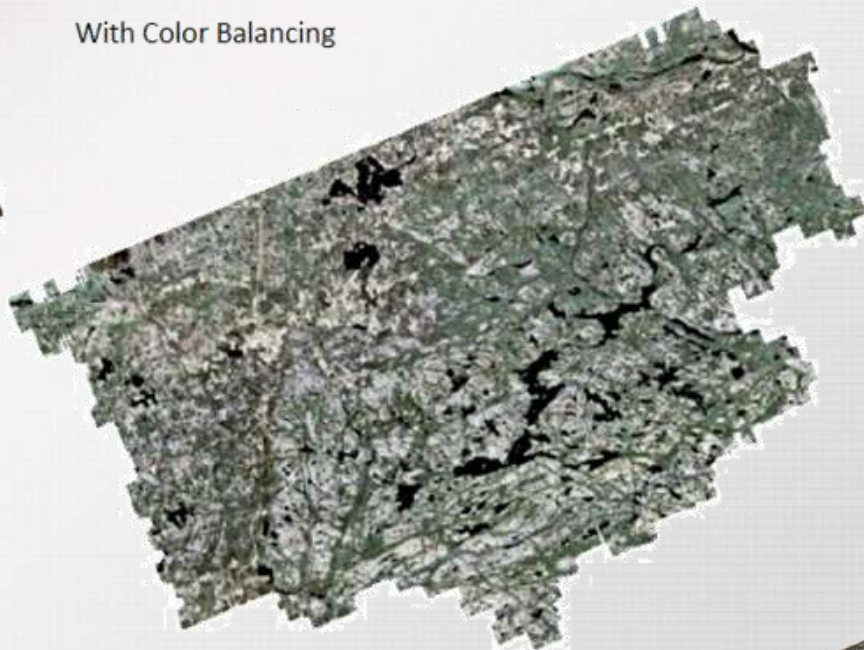


# PCI Challenge

Without Color Balancing



With Color Balancing



# Contact PCI Geomatics

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[info@pcigeomatics.com](mailto:info@pcigeomatics.com)

