



NATIONAL GEOSPATIAL-INTELLIGENCE AGENCY
Know the Earth... Show the Way... Understand the World

WorldView-3 Absolute Geolocation Accuracy Evaluation

Paul Bresnahan (contractor), Evan Brown, and Luis Henry Vazquez
NGA Image Quality Office (TVQ)

Joint Agency Commercial Imagery Evaluation Workshop
5-7 May 2015



Approved for public release, 15-349



Outline

- Background
- Evaluation
- Results



WorldView-3



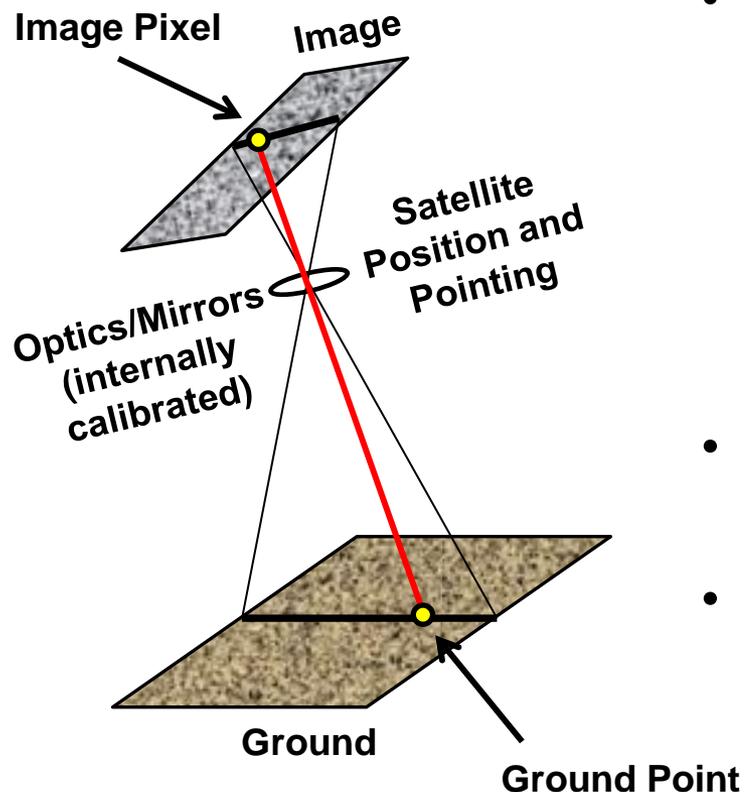
- Owned by DigitalGlobe (DG)
- Launched: 13 August 2014
- Direct geo-location
 - GPS receiver on-board used to determine orbital position
 - Inertial Reference Units and Star Trackers used to determine pointing direction
 - Sensor and its relationship to GPS and star trackers are highly calibrated

© DigitalGlobe

<https://www.digitalglobe.com/sites/default/files/styles/satellite/public/WorldView-3.png>



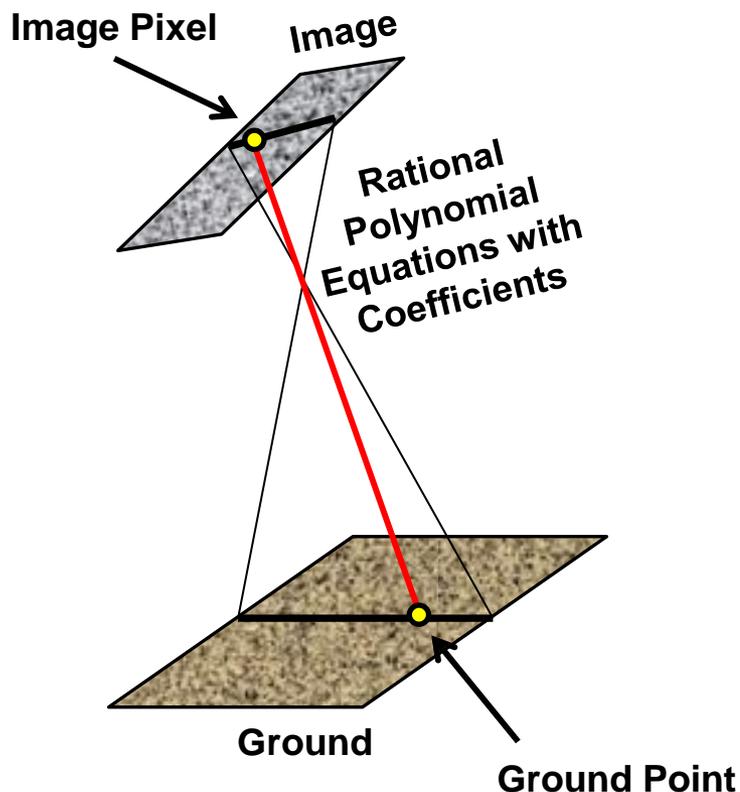
Physical Sensor Model (PM)



- Relates ground positions to image pixels by modeling geometry of imaging
 - Includes input of calibrated sensor parameters such as focal length and detector locations
 - Includes input of satellite position and pointing at any given time
- These inputs conveyed via image metadata
- Sensor models can also predict ground point errors using input uncertainties
 - Known as Error Propagation



Rational Polynomial Coefficients (RPC) Model

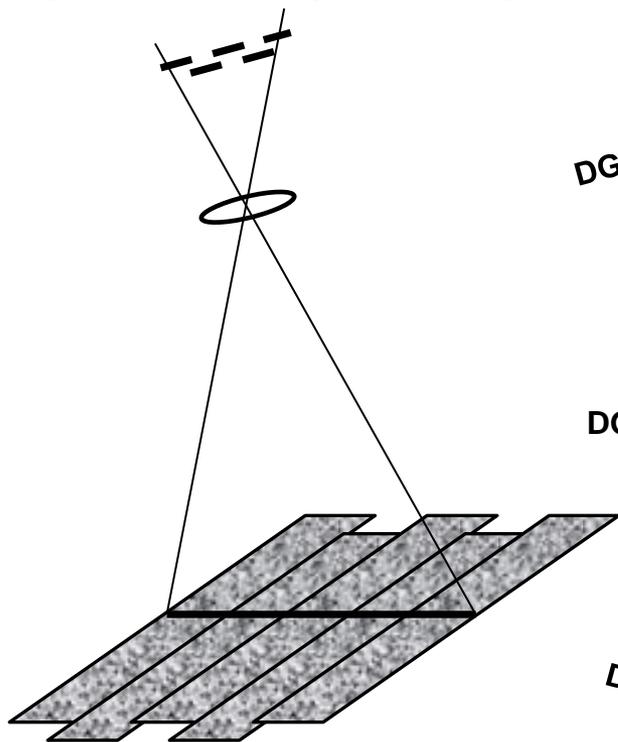


- Relates image pixels to ground positions, but using ratio of 3rd order polynomial equations
$$\text{image line} = f_1(\text{lat}, \text{long}, \text{height})$$
$$\text{image sample} = f_2(\text{lat}, \text{long}, \text{height})$$
- Coefficients fit to physical sensor model by DigitalGlobe
- “Replaces” physical sensor model
- Simpler model for software lacking complicated physical sensor model



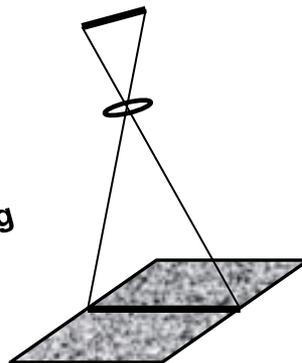
Geometry of Product Processing

Staggered Pushbroom Array
(what is actually collected)

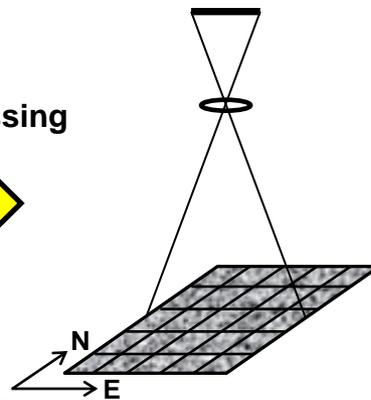
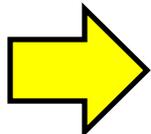


- Multiple, overlapping “sub-images”
- Not available from DG

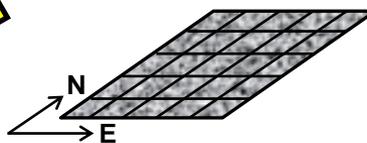
DG Processing



DG Processing



DG Processing



Only these two processing levels evaluated.

Basic 1B Product

- Synthetic Pushbroom Array
- Image not on map grid (i.e., “raw”)
- Sensor model data available for geolocation:
 - 1) Pushbroom physical model
 - 2) RPC replacement model

Ortho-Ready Standard 2A Product

- Plane rectified to fixed height (average elevation)
- On map grid, but terrain relief distortion not removed if geolocating using corner coordinates
- But, RPC replacement model data available for geolocation comparable to Basic 1B

Orthorectified Image

- To terrain (or surface) model
- On map grid, although objects not in model are not fully corrected



Geolocation Accuracy Metrics

- **Predicted Accuracy**

- Horizontal: Circular Error 90% (CE90)
- Vertical: Linear Error 90% (LE90)
- Applications:
 - Accuracy specifications
 - Error Propagation: Predicted accuracy of point ground coordinates from uncertainty of inputs and collection geometry

- **Estimated Accuracy from Sample Statistics**

- TAGGS ground-surveyed points used as check points
- Horizontal Error 90% (HE90) → used to verify WV03 CE90
- Vertical Error 90% (VE90) → used to verify WV03 LE90



Outline

- Background
- Evaluation
- Results



Test Data

- 1st Test Dataset
 - 51 Basic 1B Stereo Pairs (panchromatic)
 - 3 OR2A “Stereo Pairs” made from same input images as 3 of Basic 1B Stereo Pairs (panchromatic)
- 2nd Test Dataset
 - 33 Basic 1B Stereo Pairs (panchromatic)
- Each stereo mate tested as a “mono” image
 - Grouped into “more nadir” and “more off-nadir” sets
- 8 Cases Total
 - Stereo, more nadir mono, and more off-nadir mono sets tested using both PM and RPC
 - Mono sets tested for horizontal accuracy
 - Stereo tested for horizontal and vertical accuracy



Evaluations Performed

- **Geolocation**

- Absolute Geolocation Accuracy

- “What is the accuracy performance of the WV03 satellite?”

- Error Propagation

- “How realistic are accuracy predictions for ground points?”

- **Geolocation Consistency Check**

- Basic 1B vs. Ortho-Ready 2A (OR2A)

- “Do OR2A products have comparable geolocation as Basic 1B products?” (Done for 3 stereo pairs)

- RPC Fit

- “Does the RPC model provide a comparable ground point geolocation as the physical sensor model?”

- Assessed 2 ways



Ground Truth

- Terminal Aeronautical Global Navigation Satellite System (GNSS) Geodetic Survey (TAGGS) Program
- Provides accurately-surveyed coordinates for aerodromes
 - Runways
 - Navigation aids
 - Vertical obstructions
 - Ground Control Points (GCPs)
- Supports safety of air navigation
- Typically 0.25m (1σ) accuracy in each coordinate direction

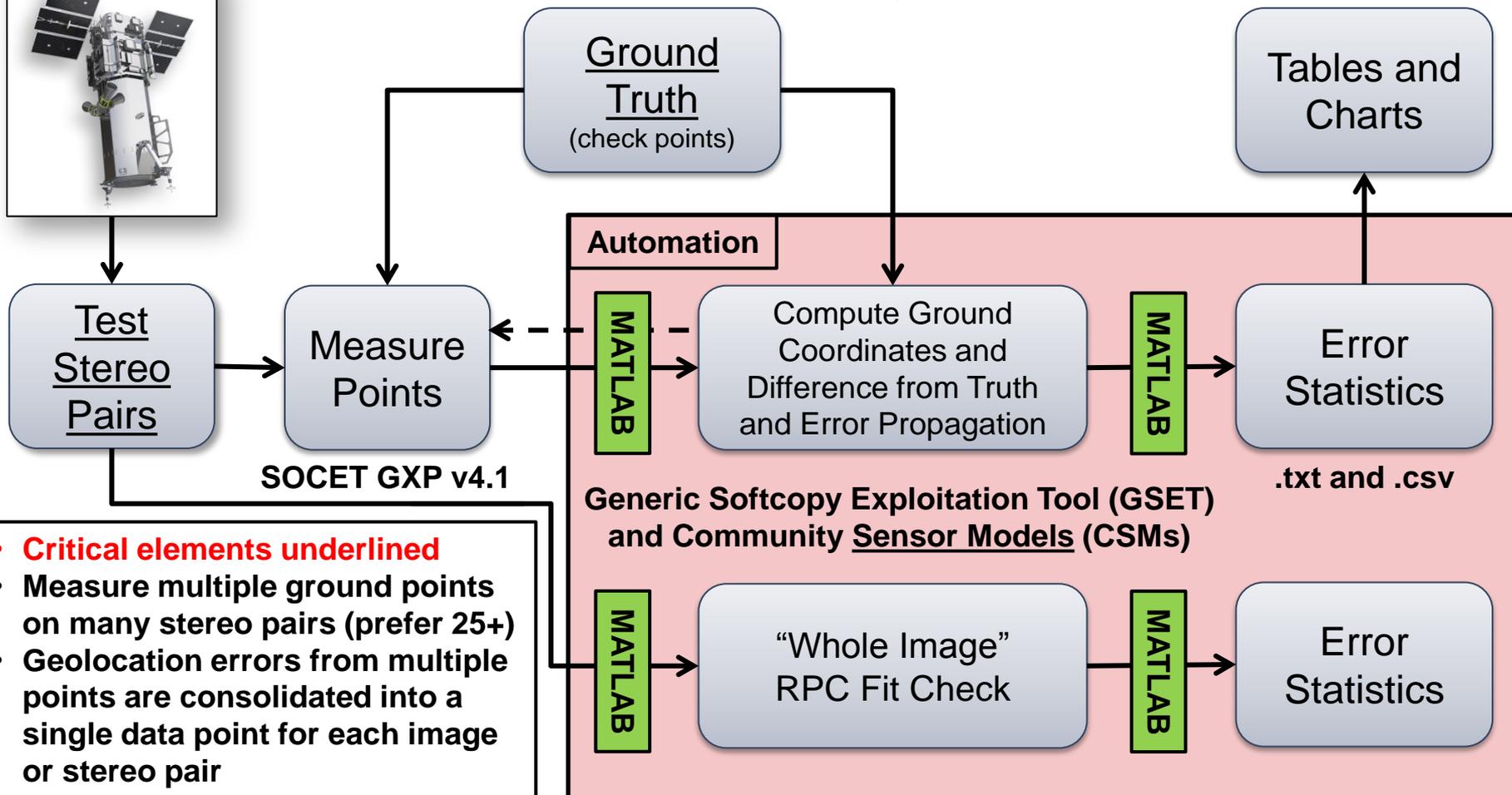
<http://earth-info.nga.mil/GandG/geosurveys/TAGGS.html>



Geolocation Analysis Testing Process

Ground Surveys:

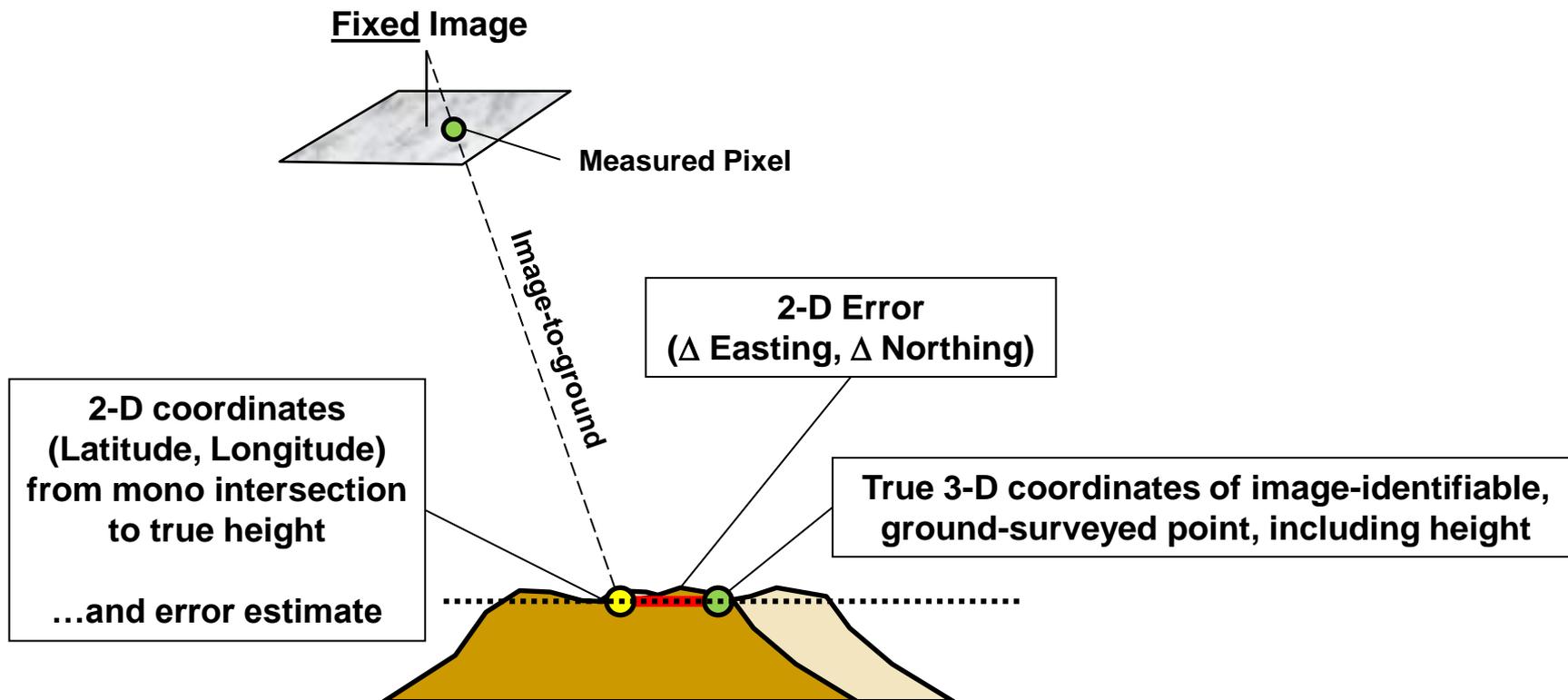
Terminal Aeronautical GNSS Geodetic Surveys (TAGGS)



- **Critical elements underlined**
- Measure multiple ground points on many stereo pairs (prefer 25+)
- Geolocation errors from multiple points are consolidated into a single data point for each image or stereo pair

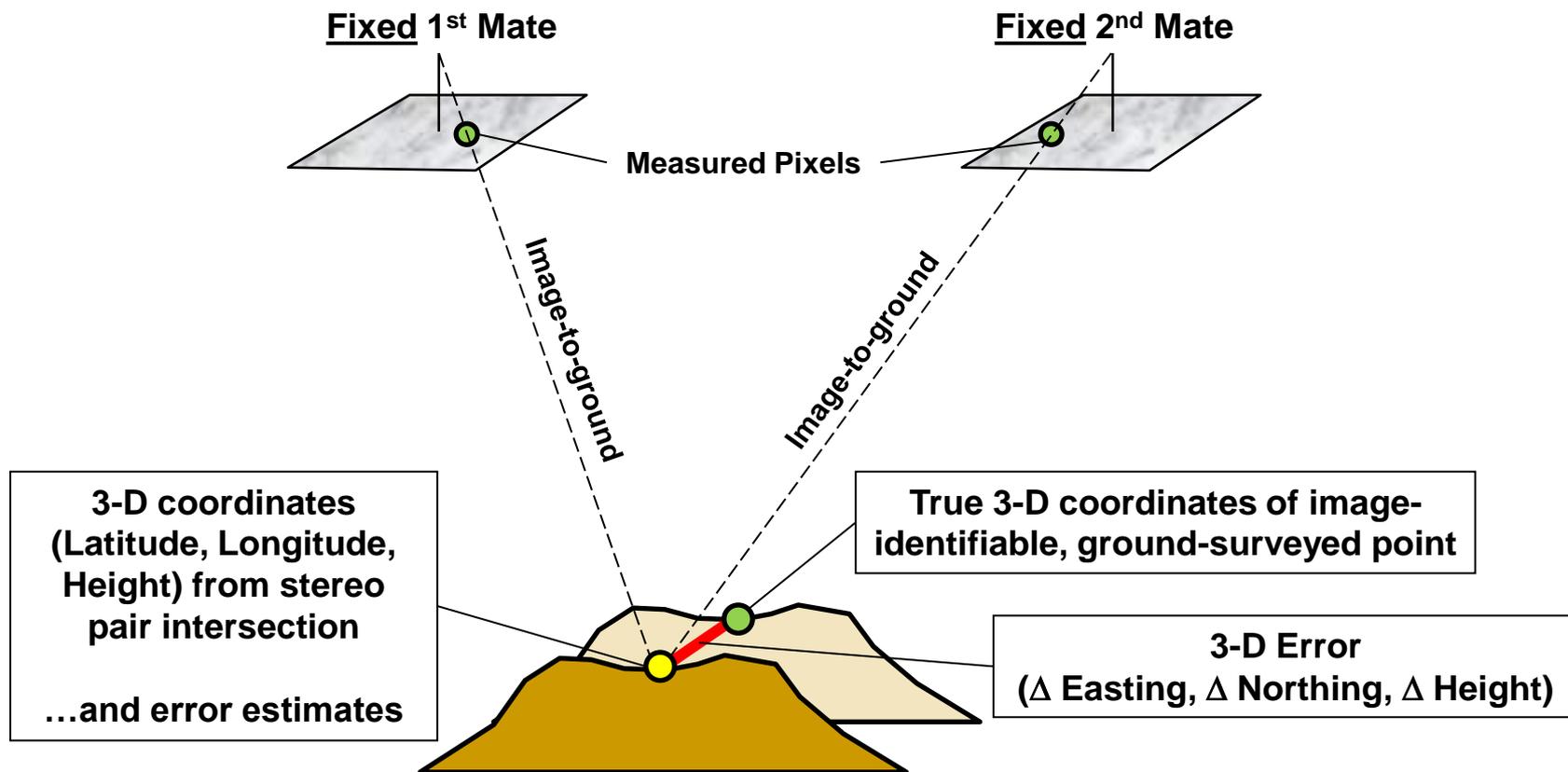


Mono Intersection





Stereo Intersection





Consolidated Errors

- Test sites have varying number of check points
- To weight each image or stereo pairs equally, consolidate errors into single data point for each image and stereo pair
- Use error centroid
 - Compute mean “ Δ Easting” and “ Δ Northing” values
 - Convert into horizontal “ Δ Radial” value
 - Compute mean “ Δ Height” value (stereo pair only)
 - Convert into “absolute-value Δ Height” value
- “ Δ Radial” and “absolute-value Δ Height” values used to estimate HE90 and VE90



Non-Parametric 90% Error Estimation

- Mono and Stereo HE90 values estimated by sorting “ Δ Radial” error from each image/stereo pairs by magnitude and cutting off at 90%
- Stereo VE90 values estimated by sorting “absolute-value Δ Height” error from each stereo pair by magnitude and cutting off at 90%
- Cutoff formula = $0.9n + 0.5$ in which n is number of image/stereo pairs
- HE90/VE90 values linearly interpolated to cutoff position
- Done separately for Physical Model and RPC support data
- Non-parametric confidence estimated as well



Fictitious Example (90th Percentile Estimator)

Given an ordered sample set as follows (n=25):

$X_{(1)}=14.1, X_{(2)}=14.5, X_{(3)}=14.6, X_{(4)}=14.7, X_{(5)}=14.8, X_{(6)}=15.3,$
 $X_{(7)}=15.4, X_{(8)}=15.6, X_{(9)}=15.7, X_{(10)}=16.0, X_{(11)}=16.1, X_{(12)}=16.1,$
 $X_{(13)}=16.2, X_{(14)}=16.5, X_{(15)}=16.7, X_{(16)}=16.8, X_{(17)}=17.1, X_{(18)}=17.1,$
 $X_{(19)}=17.3, X_{(20)}=17.7, X_{(21)}=17.8, X_{(22)}=17.9, X_{(23)}=18.3, X_{(24)}=18.6,$
 $X_{(25)}=20.1$

Estimated 90th percentile is $X_{(23)}$ data point (18.3)

This is a simplified example in which the 90th percentile falls exactly at an ordered data point

If $n = 33$ instead of $n = 25$, the 90% position would be $0.9 \cdot 33 + 0.5 = 30.2 \rightarrow$ linearly interpolate between $X_{(30)}$ and $X_{(31)}$ values



Outline

- Background
- Evaluation
- Results



WV03 Absolute Geolocation Accuracy Results

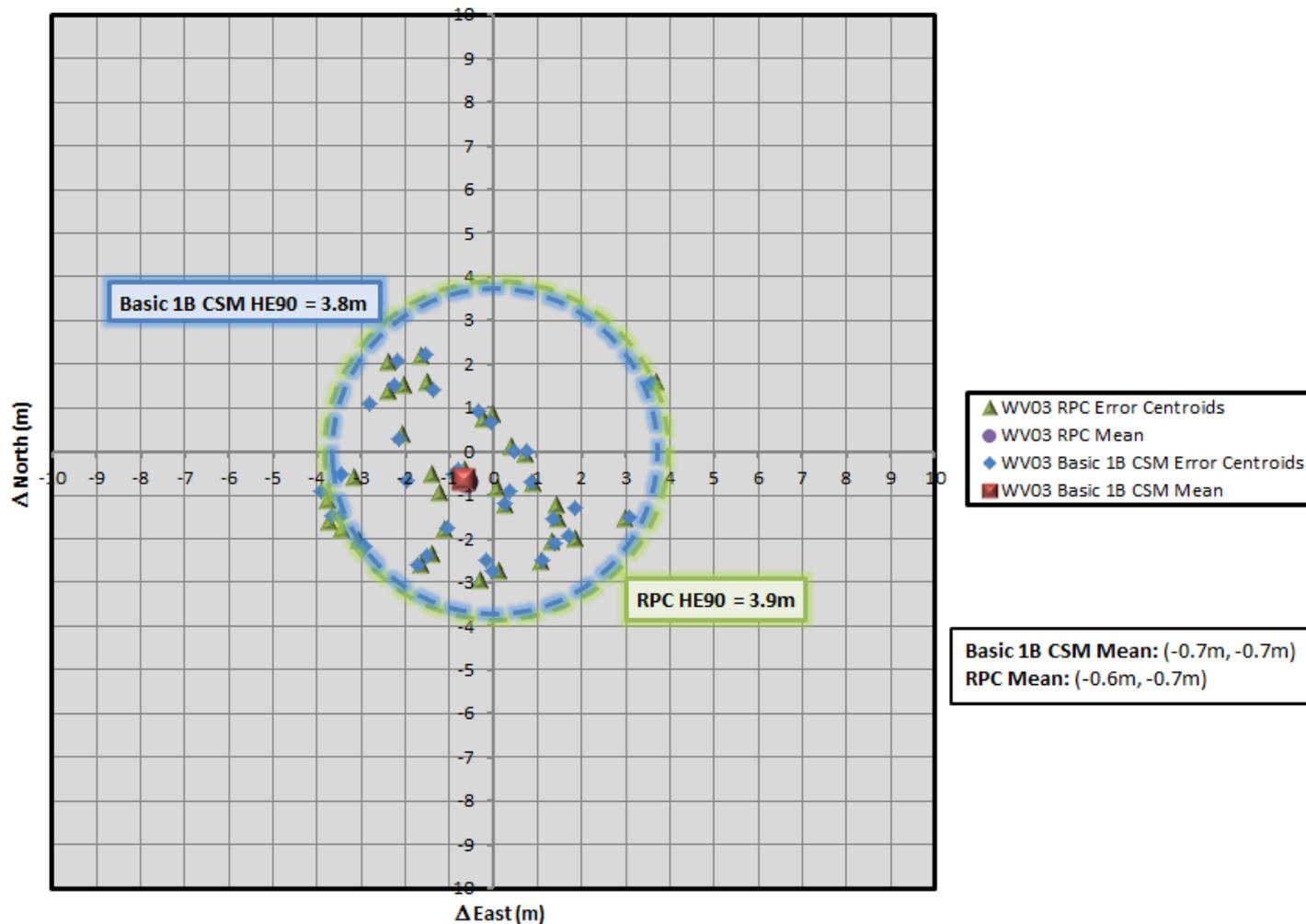
Sample size of 33 WorldView-3 Basic 1B Stereo Pairs (Physical Model)		
	Estimated Value	Confidence Statements
Sample Mono HE90	3.8 m	> 96% confidence that True CE90 < 4.1m
Sample Stereo HE90	3.7 m	> 96% confidence that True CE90 < 4.3m
Sample Stereo VE90	2.7 m	> 96% confidence that True LE90 < 5.0m

Sample size of 33 WorldView-3 Basic 1B Stereo Pairs (RPC)		
	Estimated Value	Confidence Statements
Sample Mono HE90	3.9 m	> 96% confidence that True CE90 < 4.1m
Sample Stereo HE90	3.8 m	> 96% confidence that True CE90 < 3.9m
Sample Stereo VE90	2.7 m	> 96% confidence that True LE90 < 6.3m

- Similar results between PM and RPC models
 - One way to assess RPC fit

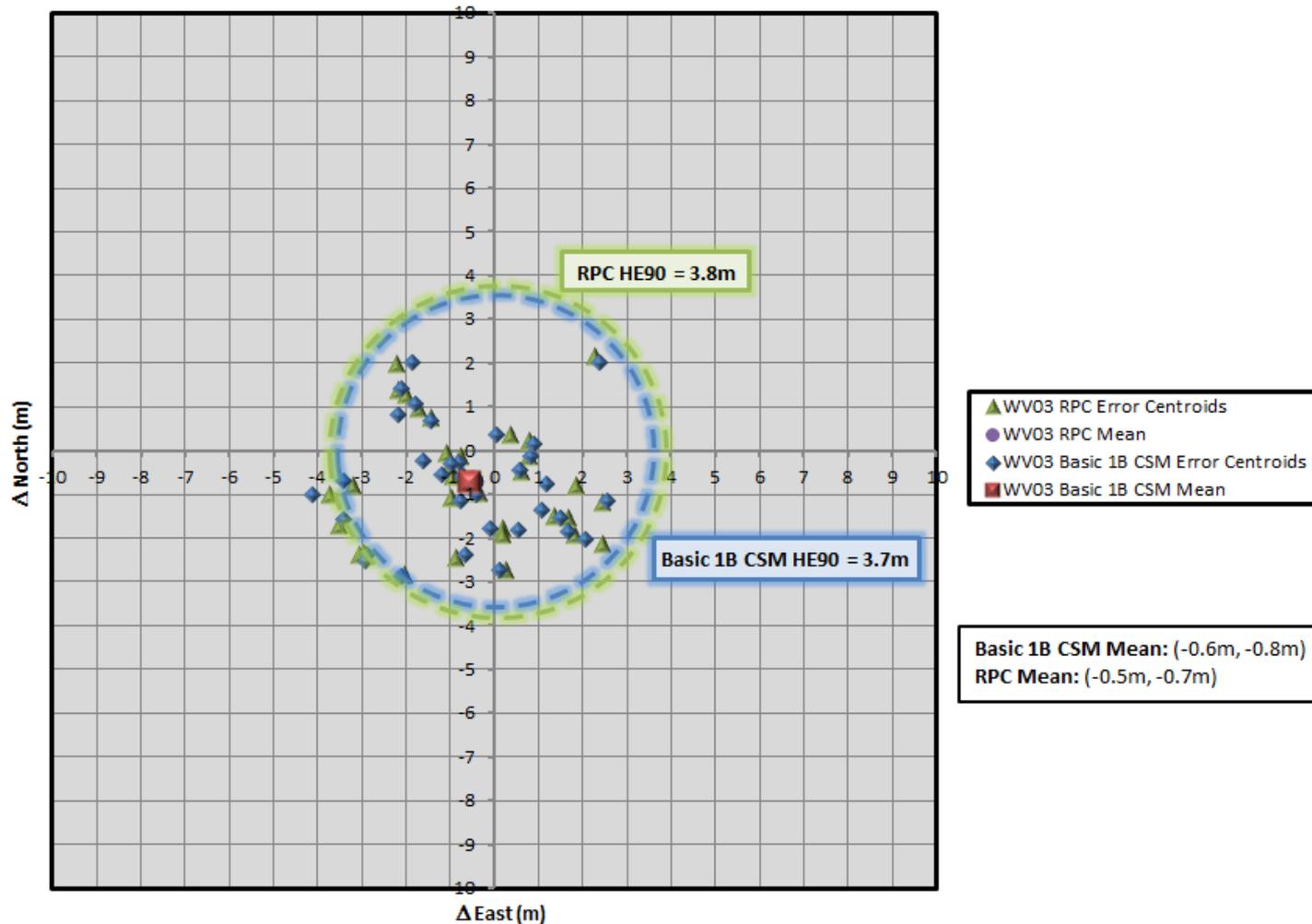


WV03 Basic 1B Mono Geolocation Accuracy (More Nadir Mates)



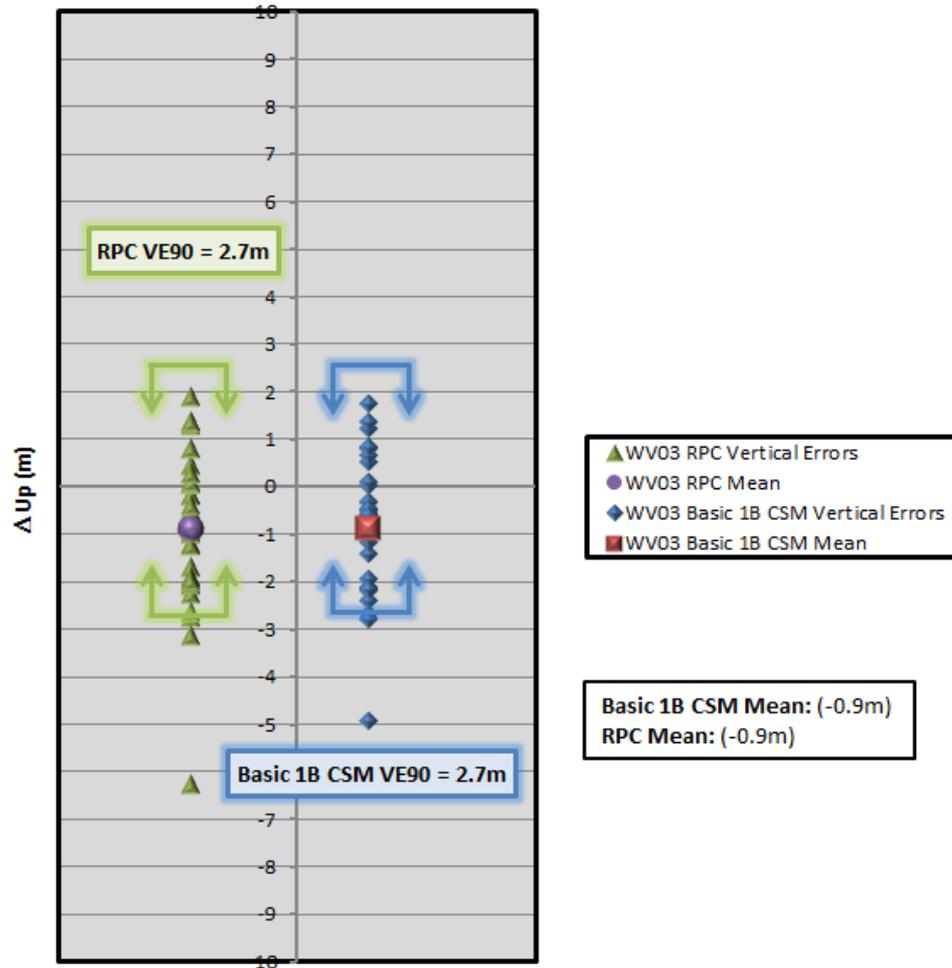


WV03 Basic 1B Stereo Geolocation Accuracy (Horizontal)





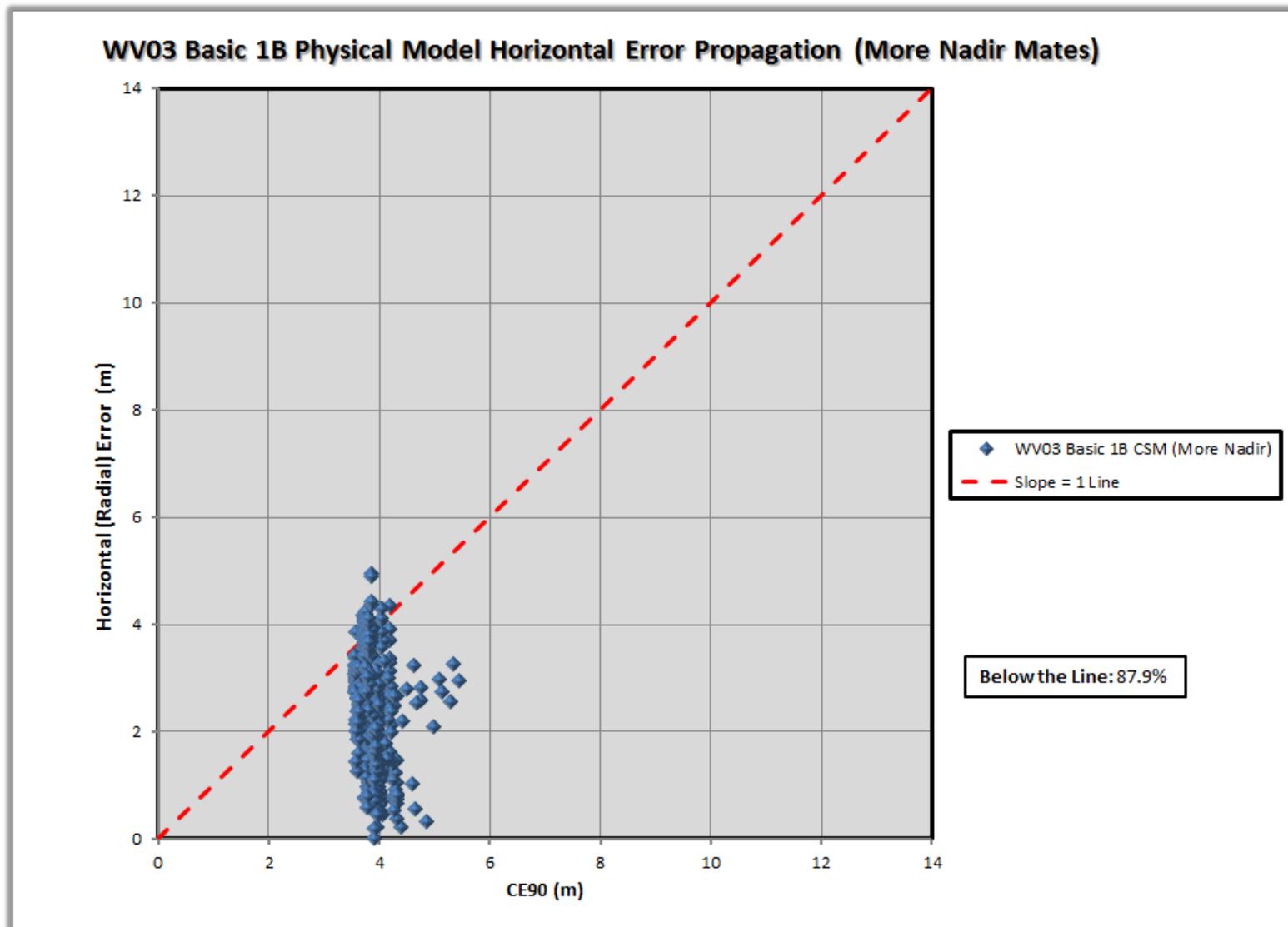
WV03 Basic 1B Stereo Geolocation Accuracy (Vertical)

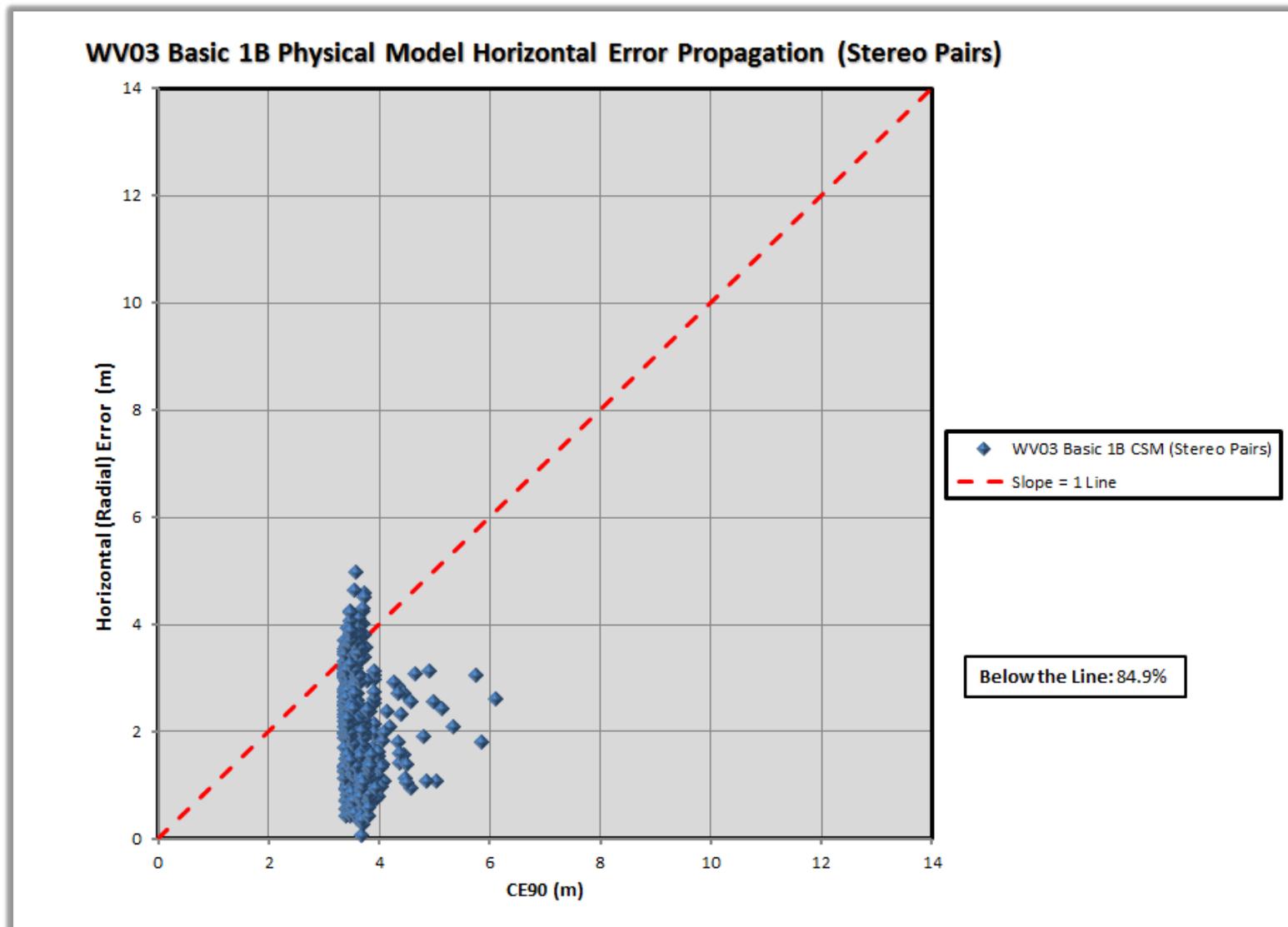


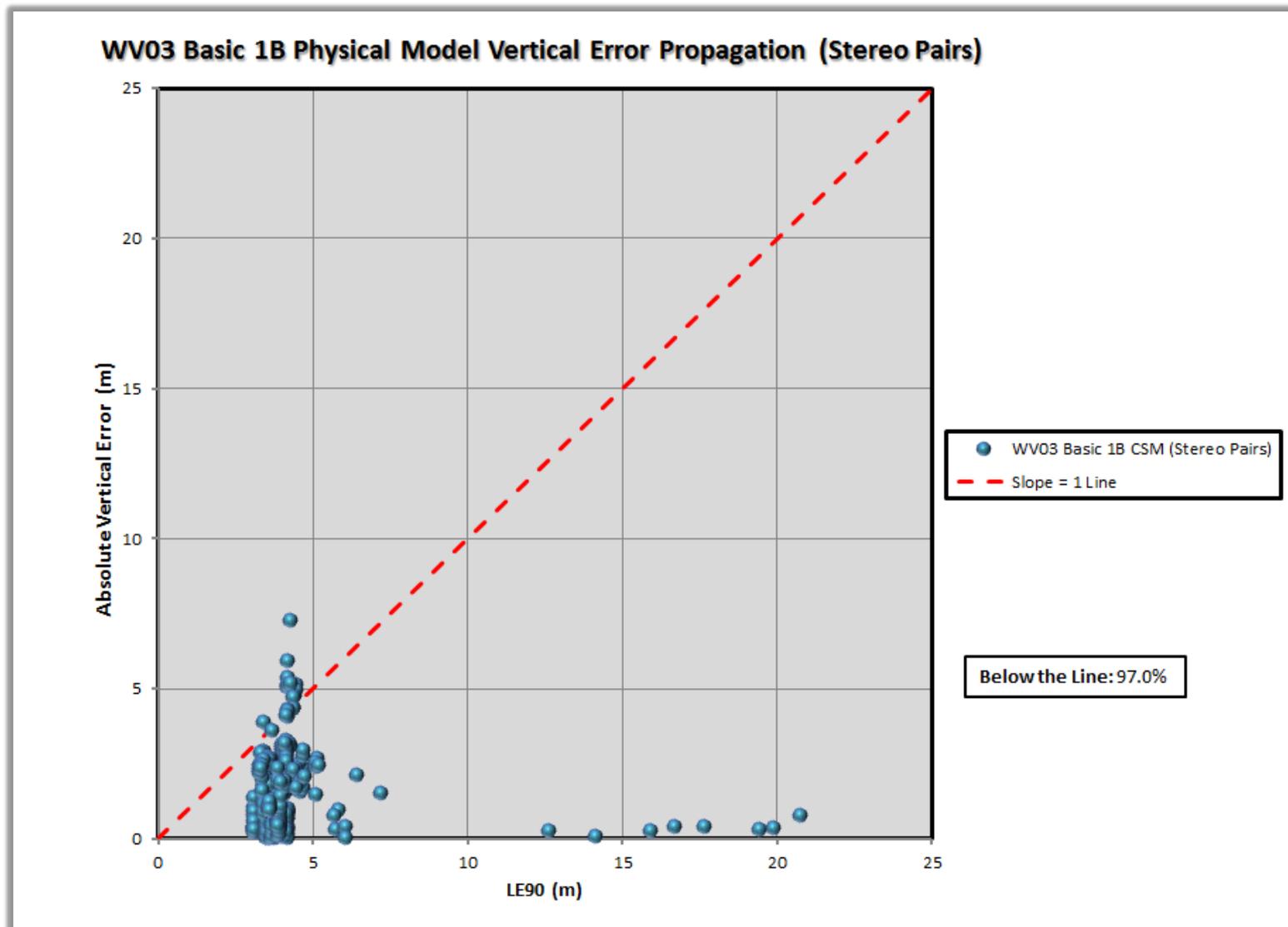


WV03 Error Propagation Analysis

- Realism of predicted accuracy of ground coordinates visualized through a plot
 - Measured errors on y-axis
 - Predicted 90% errors on x-axis
 - If prediction is realistic, measured errors should be less than predicted errors 90% of the time
 - Demarked by slope = 1 line
- For brevity, showing only 3 Physical Model cases
 - More nadir mono horizontal
 - Stereo horizontal
 - Stereo vertical









WV03 Error Propagation Summary

Error Propagation (% Below Slope = 1 Line)		
All 507 Points	Physical Model	RPC
More Nadir Mono Horizontal	85.2%	64.1%
More Off-Nadir Mono Horizontal	91.3%	72.0%
Stereo Horizontal	80.9%	64.3%
Stereo Vertical	96.7%	84.4%

Error Propagation (% Below Slope = 1 Line)		
Based on Ave for 33 Images	Physical Model	RPC
More Nadir Mono Horizontal	87.9%	69.7%
More Off-Nadir Mono Horizontal	87.9%	78.8%
Stereo Horizontal	84.9%	72.7%
Stereo Vertical	97.0%	90.9%

- Ideally values should be 90%

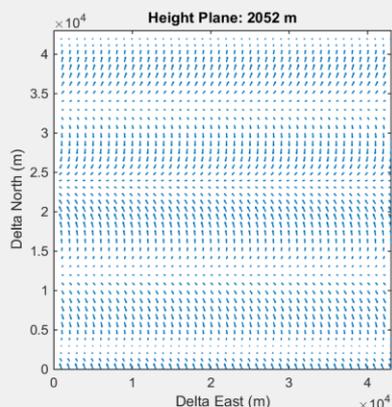
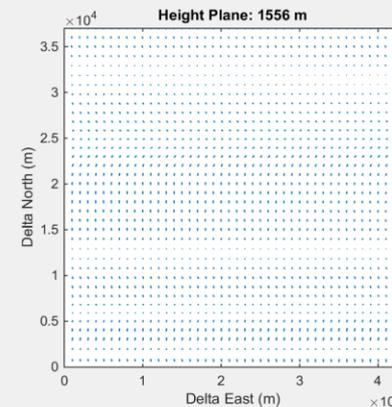
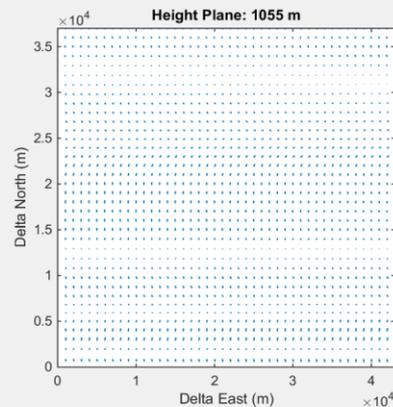
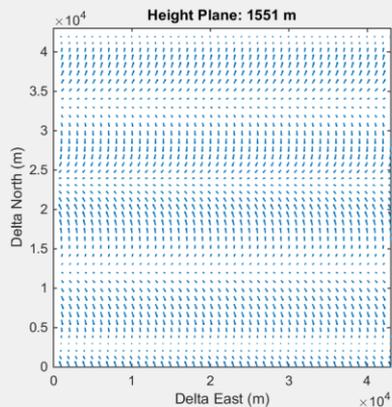
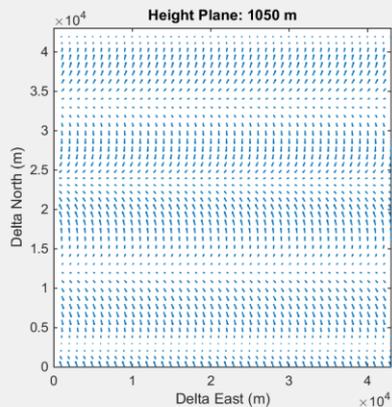


“Whole Image” RPC Fit Analysis

- Goal is to confirm that RPC support data provides comparable geolocation as Physical Sensor Model parameters
 - RPC parameters were fit to Physical Model by DigitalGlobe
- Methodology
 - Create a pixel grid across image with uniform spacing in row and column
 - Separately for RPC and the Physical Model, determine horizontal ground coordinates for each pixel grid location at each of three elevation planes near ground
 - Determine the difference in horizontal ground coordinates at each grid location for each elevation plane
 - Estimate overall statistics, including maximum differences



Jomo Kenyatta, Kenya

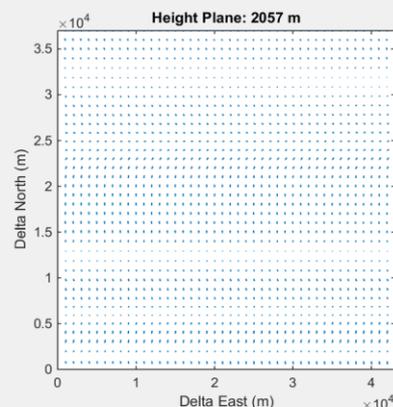


KE-Jomo-Kenyatta-Kenya
14DEC20080217-P1BS-500233720010-01-P001

Height Plane: 1050 m
mean:(0.0m, 0.0m)
max:(0.3m, 0.7m)
min:(-0.3m, -0.7m)
max mag: 0.8m

Height Plane: 1551 m
mean:(0.0m, 0.0m)
max:(0.3m, 0.7m)
min:(-0.3m, -0.7m)
max mag: 0.8m

Height Plane: 2052 m
mean:(0.0m, 0.0m)
max:(0.3m, 0.7m)
min:(-0.3m, -0.7m)
max mag: 0.8m



KE-Jomo-Kenyatta-Kenya
14DEC20080306-P1BS-500233720020-01-P001

Height Plane: 1055 m
mean:(0.1m, 0.1m)
max:(0.2m, 0.4m)
min:(-0.1m, -0.3m)
max mag: 0.4m

Height Plane: 1556 m
mean:(0.1m, 0.1m)
max:(0.2m, 0.4m)
min:(-0.1m, -0.3m)
max mag: 0.4m

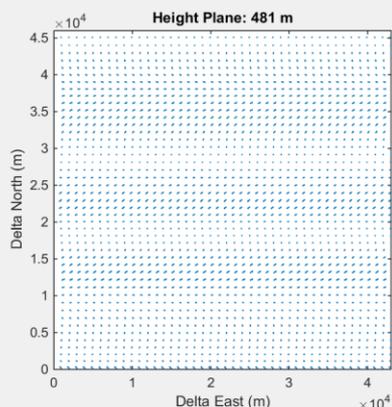
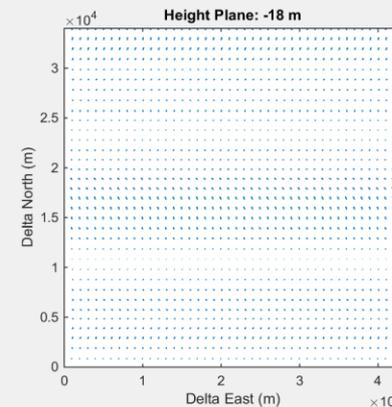
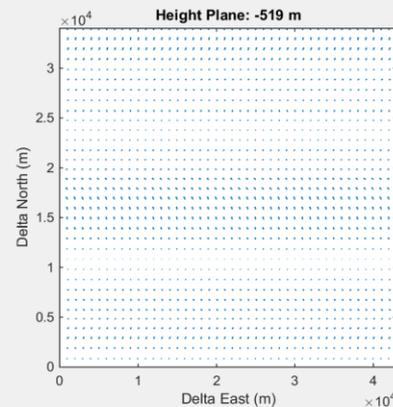
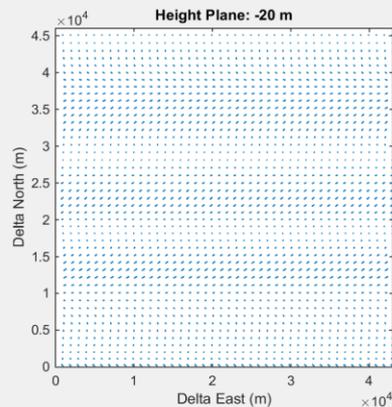
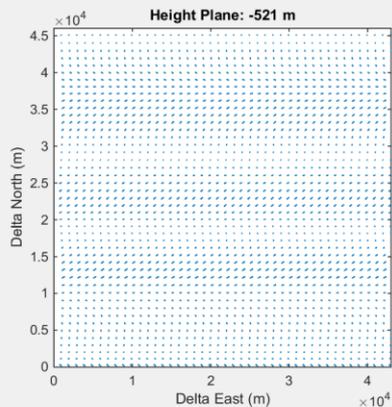
Height Plane: 2057 m
mean:(0.1m, 0.1m)
max:(0.2m, 0.4m)
min:(-0.1m, -0.3m)
max mag: 0.4m

More Nadir

More Off-Nadir



Masirah Island, Oman

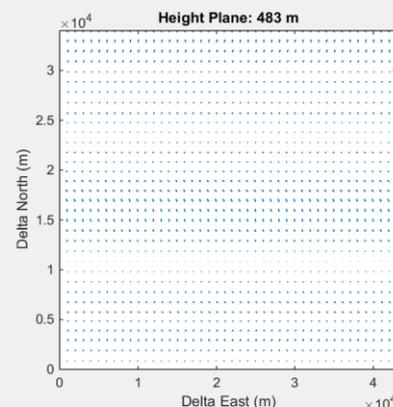


OM-Masirah-Island-Oman
14DEC21063506-P1BS-500233724010-01-P001

Height Plane: -521 m
mean:(0.1m, 0.0m)
max:(0.4m, 0.3m)
min:(-0.3m, -0.3m)
max mag: 0.5m

Height Plane: -20 m
mean:(0.0m, 0.0m)
max:(0.4m, 0.3m)
min:(-0.3m, -0.3m)
max mag: 0.5m

Height Plane: 481 m
mean:(0.0m, 0.0m)
max:(0.4m, 0.3m)
min:(-0.3m, -0.3m)
max mag: 0.5m



OM-Masirah-Island-Oman
14DEC21063555-P1BS-500233724020-01-P001

Height Plane: -519 m
mean:(0.0m, 0.1m)
max:(0.2m, 0.3m)
min:(-0.2m, -0.2m)
max mag: 0.3m

Height Plane: -18 m
mean:(0.0m, 0.1m)
max:(0.2m, 0.3m)
min:(-0.2m, -0.2m)
max mag: 0.3m

Height Plane: 483 m
mean:(0.0m, 0.1m)
max:(0.2m, 0.3m)
min:(-0.2m, -0.2m)
max mag: 0.3m

More Nadir

More Off-Nadir



Ortho-Ready 2A Product Geolocation Consistency Results

- From first test set
 - 3 OR2A “stereo pairs” compared to corresponding Basic 1B stereo pairs
- Geolocation errors compared ($\Delta\Delta$)
- Differences are small

Test Site	Basic 1B Product	Ortho-Ready 2A Product	Mono Mates		Stereo Pairs		
			$\Delta\Delta$ E (m)	$\Delta\Delta$ N (m)	$\Delta\Delta$ E (m)	$\Delta\Delta$ N (m)	$\Delta\Delta$ U (m)
BO_El_Trompillo_Bolivia	14SEP08141129-P1BS-500167188010_01_P001	14SEP08141127-P2AS-500167237010_01_P001	-0.06	-0.04	0.53	-0.13	0.31
BO_El_Trompillo_Bolivia	14SEP08141217-P1BS-500167188020_01_P001	14SEP08141215-P2AS-500167237020_01_P001	0.02	-0.01			
OM_Seeb_Oman	14AUG29063533-P1BS-500167159010_01_P001	14AUG29063532-P2AS-500167235010_01_P001	0.02	0.02	0.01	0.03	0.02
OM_Seeb_Oman	14AUG29063633-P1BS-500167159020_01_P001	14AUG29063633-P2AS-500167235020_01_P001	0.02	0.03			
TN_Sidi_Ahmed_Tunisia	14AUG30100117-P1BS-500167158010_01_P001	14AUG30100117-P2AS-500167236010_01_P001	-0.01	0.03	0.48	-0.12	0.03
TN_Sidi_Ahmed_Tunisia	14AUG30100218-P1BS-500167158020_01_P001	14AUG30100218-P2AS-500167236020_01_P001	0.03	0.03			



Summary

- Using 33 Basic 1B stereo pairs (2nd dataset)...
 - Absolute geolocation accuracy estimated between 3.7-3.9 meters for HE90 and 2.7 m for VE90
 - Error propagation analyzed
 - RPC model geolocation is not exactly the same as the PM but is comparable
- From 1st dataset
 - OR2A products have comparable geolocation to Basic 1B products



Backups



RPC Generation from Physical Model

Physical Sensor Model (e.g., Pushbroom):

line = $f_1(X,Y,Z)$ and sample = $f_2(X,Y,Z)$
in terms of physical sensor model parameters

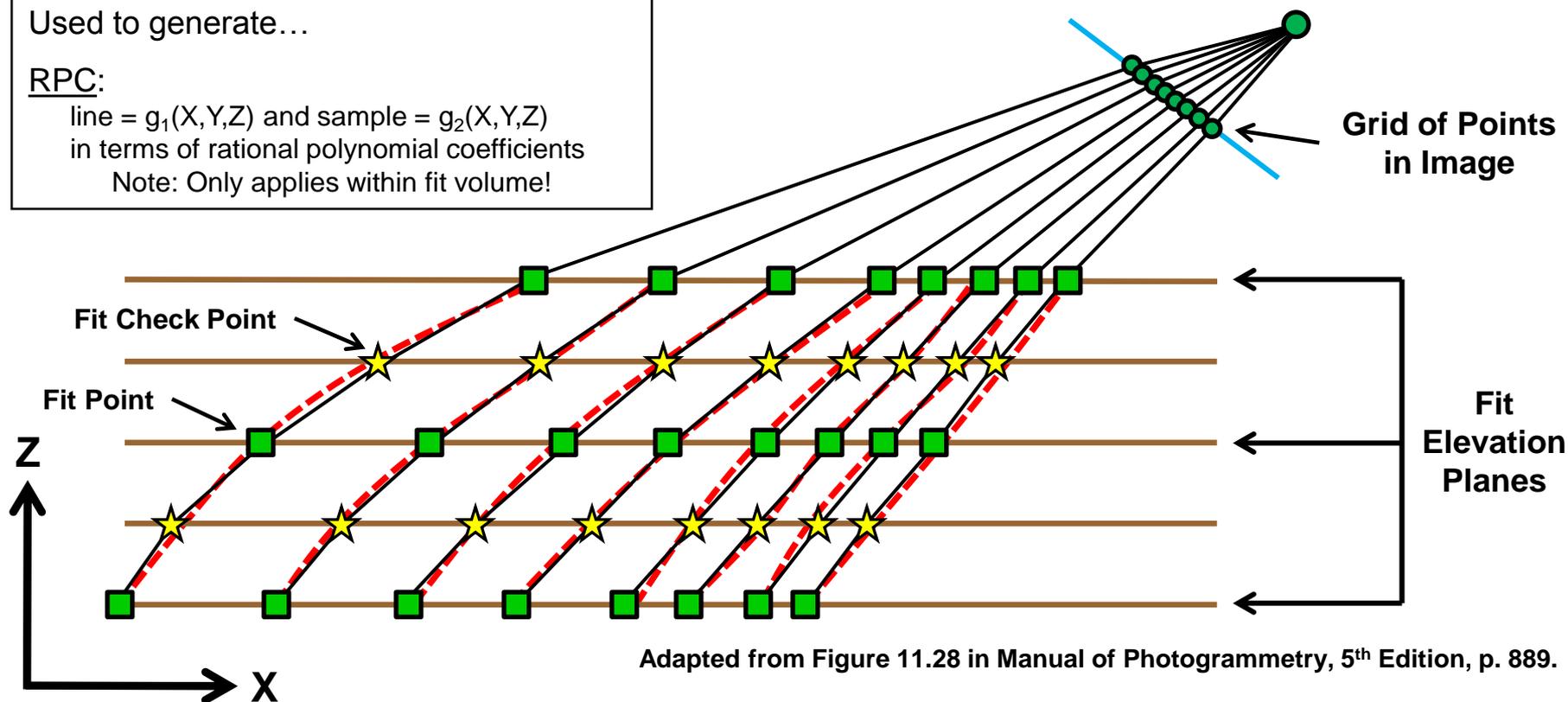
Used to generate...

RPC:

line = $g_1(X,Y,Z)$ and sample = $g_2(X,Y,Z)$
in terms of rational polynomial coefficients

Note: Only applies within fit volume!

RPC is generated by DigitalGlobe



Adapted from Figure 11.28 in Manual of Photogrammetry, 5th Edition, p. 889.



Non-Parametric 90th Percentile Estimator for Ordered Statistics

Given n ordered data points $x_{(1)}, x_{(2)}, \dots, x_{(n)}$, where $x_{(i)} = \Delta r_{(i)}$ for HE90 and $x_{(i)} = \text{abs}(\Delta h_{(i)})$ for VE90.

$$\text{HE90 or LE90} = (1 - f) * x_{(i)} + f * x_{(i+1)}$$

with

$i =$ integer part of $0.9 * n + 0.5$, and

$f =$ fractional part of $0.9 * n + 0.5$.



Confidence Statements for Non-Parametric CE90/LE90

- Given independent and identically-distributed data points X_1, X_2, \dots, X_n
- Ordered data points are $X_{(1)}, X_{(2)}, \dots, X_{(n)}$ for n data points
- Probability that actual CE90 (or LE90) \leq a given k^{th} ordered data point is at least the value given by binomial distribution, i.e.,

$$P(x_{0.9} \leq X_{(k)}) \geq \sum_{i=0}^{k-1} \binom{n}{i} (0.9)^i (1 - 0.9)^{n-i}$$

- Confidence statement for every ordered data point
- Does not depend upon parent population distribution

Reference: Equation 3.2.43 on page 147 of W. J. Conover, *Practical Nonparametric Statistics*, 3rd Edition, John Wiley and Sons, Inc., New York, 1999.



Fictitious Example (Confidence)

Given an ordered sample set as follows (n=25):

$X_{(1)}=14.1, X_{(2)}=14.5, X_{(3)}=14.6, X_{(4)}=14.7, X_{(5)}=14.8, X_{(6)}=15.3,$
 $X_{(7)}=15.4, X_{(8)}=15.6, X_{(9)}=15.7, X_{(10)}=16.0, X_{(11)}=16.1,$
 $X_{(12)}=16.1, X_{(13)}=16.2, X_{(14)}=16.5, X_{(15)}=16.7, X_{(16)}=16.8,$
 $X_{(17)}=17.1, X_{(18)}=17.1, X_{(19)}=17.3, X_{(20)}=17.7, X_{(21)}=17.8,$
 $X_{(22)}=17.9, X_{(23)}=18.3, X_{(24)}=18.6, X_{(25)}=20.1$

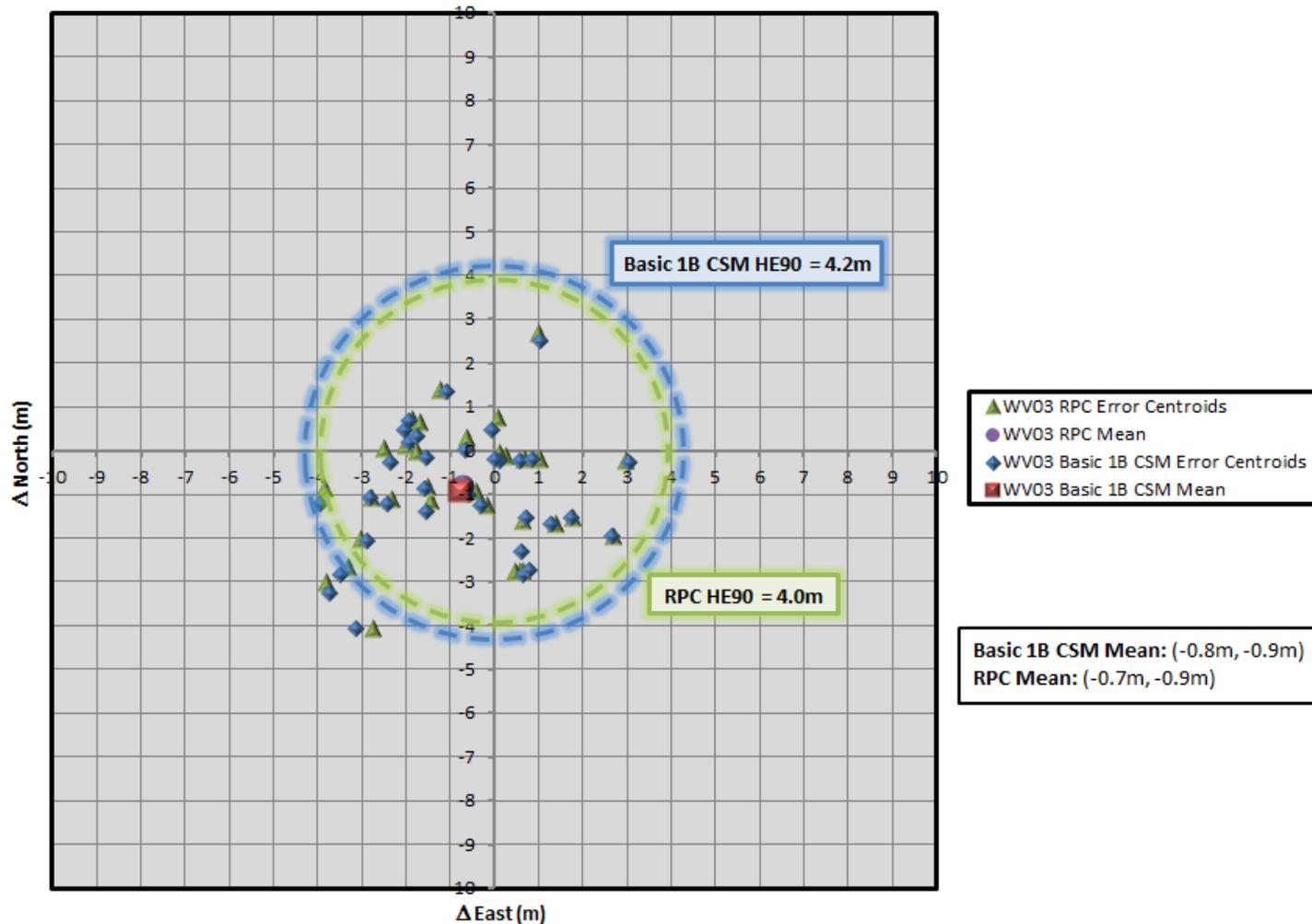
Estimated HE90 (or VE90) is $X_{(23)}$ data point (18.3)

A statement can be made for each ordered data point: $x_{(k)}$:

- The confidence that actual CE90 (or LE90) \leq the value 17.7 is $\geq 3\%$.
- The confidence that actual CE90 (or LE90) \leq the value 17.8 is $\geq 10\%$.
- The confidence that actual CE90 (or LE90) \leq the value 17.9 is $\geq 24\%$.
- The confidence that actual CE90 (or LE90) \leq the value 18.3 is $\geq 46\%$.
- The confidence that actual CE90 (or LE90) \leq the value 18.6 is $\geq 73\%$.
- The confidence that actual CE90 (or LE90) \leq the value 20.1 is $\geq 93\%$.



WV03 Basic 1B Mono Geolocation Accuracy (More Off-Nadir Mates)





NATIONAL GEOSPATIAL-INTELLIGENCE AGENCY

Know the Earth... Show the Way... Understand the World

nga.mil | [@nga_geoint](https://twitter.com/nga_geoint) | facebook.com/natlgeointagency

