#### Future of Remote Sensing and Data Quality Panel discussion at JACIE 2020

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# Pixels / Services vs Orbit / Ground

- In Orbit
  - WorldView Legion
  - Why Quality Matters
- On the Ground
  - Interoperability and ARD
    - Absolute radiometric calibration
    - Atmospheric Compensation (AComp)
    - Registration
  - Advanced Products
    - High Definition (HD)
    - The Earth in 3D

# In Orbit WorldView Legion



# **Our next-generation satellites**

WorldView Legion is a fleet of six high-performing satellites that expands our ability to revisit the most rapidly changing areas on Earth to better inform critical, time-sensitive decisions.

- Launches in 2021
- Will enable up to 15 revisits per day
- Triples Maxar capacity to collect 30 cm imagery
- Triples our overall capacity over high-demand areas
- Highest image quality and geometric accuracy available
- Simultaneous tasking, image and downlink with customer ground stations



CAPACITY

MAXAR





# **Satellite specifications**

	Launch 1	Launch 2
Number satellites	2	4
Orbit	SSO	MIO
Resolution Panchromatic 8-band multispectral NIIRS rating	29 cm 1.16 m 5.9	34 cm 1.36 m 5.7
Spacecraft size and mass	Size: 3 m tall x 2 m x 2 m (not including width of solar array) Wet mass: < 750 kg	
Sensor bands	Panchromatic: 450-800 nm 8 multispectral Coastal: Blue: 400-450 nm Blue: 400-510 nm Green: 510-580 nm Yellow: 585-612 nm Red: 630-690 nm Red Edge 1: 695-715 nm Red Edge 2: 730-750 nm Near-IR: 770-895 nm	
Swath width	At nadir: 9 km	
Geolocation accuracy (CE90)	< 5 m CE90 without ground control points	

## Enabling up to 15 revisits per day



#### High revisit areas



## Low latency matters for an intelligence advantage

Reducing the time between collection and delivery makes intelligence more actionable.





# *In Orbit* Why Quality Matters



#### X

## Native resolution matters for detailed insight

Legion class



1.5 m GSD NIIRS 3.4 © 2020 Maxar Technologies

Company Proprietary – External Recipients

1.0 m GSD

NIIRS 4.0

0.5 m GSD NIIRS 5.0

0.3 m GSD NIIRS 5.7





#### X

## Native resolution matters for detailed insight

# of Objects Detected

![](_page_10_Figure_3.jpeg)

![](_page_10_Picture_4.jpeg)

#### Spectral richness matters for seeing hidden details

![](_page_11_Picture_2.jpeg)

![](_page_11_Picture_4.jpeg)

## **Geolocation accuracy matters for precision mapping**

![](_page_12_Picture_2.jpeg)

**5 M ACCURACY** 

![](_page_12_Picture_4.jpeg)

![](_page_12_Picture_5.jpeg)

# High agility matters for challenging collections

WorldView Legion will dramatically slew to collect the maximum number of images and at the most extreme angles.

![](_page_13_Picture_3.jpeg)

![](_page_13_Picture_5.jpeg)

# Monitoring throughout the day

Increased collection opportunities over areas of high interest, unlocking monitoring and change-detection capabilities.

![](_page_14_Picture_3.jpeg)

#### **Analytics at scale**

Combining the most advanced geospatial analytics and expertise available with a continuous feed of current imagery will equip customers with unrivaled insights and answers for a competitive edge. This wave of fresh, detailed content will redefine how we enable significantly more accurate, comprehensive, and timely pattern-of-life and human geography analysis.

EL PASO TEXAS | AUGUST 14 2019

![](_page_15_Picture_4.jpeg)

EL PASO TEXAS | NOVEMBER 18 2019

![](_page_15_Picture_6.jpeg)

On the Ground Interoperability and ARD

![](_page_16_Picture_3.jpeg)

# **CEOS CARD4L**

calibration, traceability, surface reflectance, accuracy, uncertainty

# CEOS ANALYSIS READY DATA

CEOS Analysis Ready Data for Land (CARD4L) are satellite data that have been processed to a minimum set of requirements and organized into a form that allows immediate analysis with a minimum of additional user effort and interoperability both through time and with other datasets.

![](_page_17_Figure_4.jpeg)

# **Absolute radiometric calibration**

- We employ the reflectance-based vicarious calibration approach developed by the University of Arizona in the late 80's and employed by NASA and other international agencies
- This method uses in-situ measurements of surface reflectance (of spectrally and spatially homogenous targets) and atmospherics in a radiative transfer model to predict at-sensor radiance for validation and calibration efforts
- Many measurements/dates are used in a regression to determine required adjustments to the pre-launch calibration

![](_page_18_Picture_4.jpeg)

![](_page_18_Figure_5.jpeg)

![](_page_18_Figure_6.jpeg)

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#### X

# **Radiometric agreement with Landsat 7/8**

- RadCalNet data are given at Nadir. MAXAR sensors will typically have an ONA of 5 30 degrees. Variation in ONA will increase the variability in MAXAR data due to surface BRDF and longer atmospheric path and < 10% is considered good</li>
- GeoEye-1, WorldView-2, and WorldView-3 data shows good correlation with Landsat 7 & 8 data, shown here at Railroad Valley, NV, USA RadCalNet site
- WV02 is showing a relative difference of < 6%, and WV03 and GE01 are < 5%. Comparable Landsat bands are within 5%

![](_page_19_Figure_5.jpeg)

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![](_page_19_Picture_6.jpeg)

# **Atmospheric Compensation (AComp)**

![](_page_20_Figure_1.jpeg)

# **ASD Spectrometer Measurements**

Measurements at equinox:

- asphalt surfaces (mainly large roads and parking lots)
- concrete
- tar materials (running tracks, basketball and tennis courts)
- sand (beach volleyball courts)

![](_page_21_Picture_8.jpeg)

![](_page_21_Figure_9.jpeg)

180°

(e)

![](_page_21_Picture_11.jpeg)

13875

# Validation (1/2)

![](_page_22_Figure_1.jpeg)

![](_page_22_Figure_2.jpeg)

![](_page_22_Figure_3.jpeg)

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X

# Validation (2/2)

![](_page_23_Figure_2.jpeg)

![](_page_23_Figure_3.jpeg)

![](_page_23_Figure_4.jpeg)

#### ARD as a stack of images ...

![](_page_24_Picture_2.jpeg)

![](_page_24_Picture_4.jpeg)

## **Orthorectification without/with registration**

![](_page_25_Picture_2.jpeg)

![](_page_25_Picture_3.jpeg)

![](_page_25_Picture_5.jpeg)

# **Orthorectification without/with registration**

![](_page_26_Picture_1.jpeg)

![](_page_26_Picture_3.jpeg)

# **Orthorectification without/with registration**

![](_page_27_Picture_2.jpeg)

object detection/identification

no calibration

surface reflectance

## **ARD:** There is no one-size-fits-all solution

![](_page_28_Figure_4.jpeg)

![](_page_28_Picture_5.jpeg)

![](_page_28_Picture_6.jpeg)

#### no calibration

surface reflectance

MAXAR

## **ARD:** There is no one-size-fits-all solution

![](_page_29_Figure_4.jpeg)

(a)

X

![](_page_29_Picture_5.jpeg)

volumetric scattering (b)

![](_page_29_Picture_7.jpeg)

(c)

BRDF:

- sun-viewing geometry
- material
- tering structure

![](_page_29_Figure_12.jpeg)

![](_page_29_Figure_13.jpeg)

# **ARD: READY for what?**

- users in established markets (agriculture, maritime) are very familiar with data (either optical/hyperspectral, SAR, LiDAR, etc..), and expect greatest quality in terms of sensor calibration, accuracy, and uncertainty
- users in new markets (insurance, finance) often do not necessarily understand (or care) about these characteristics, and all they need are insights.
  - If insights are not available when needed, then no application will be impactful

#### Factory output **Customer segments**

- Financial Services
- Retail
- Manufacturing

![](_page_30_Figure_9.jpeg)

Insight

0

![](_page_30_Picture_10.jpeg)

in "all" parking lots

![](_page_30_Picture_11.jpeg)

Image of parking lot

![](_page_30_Picture_14.jpeg)

# **ARD: Different needs**

- Civil Government vs Industry vs Intelligence
  - different missions, timelines, requirements
  - different users and skills

Key characteristics for datasets

![](_page_31_Picture_5.jpeg)

![](_page_31_Picture_6.jpeg)

MAXAR

# **On the Ground - Advanced Products High Definition (HD)**

![](_page_32_Picture_3.jpeg)

# **High Definition**

- The HD technology is a proprietary technique developed by Maxar that improves the visual clarity ("acutance") of an image
- The improved clarity means there is less visual clutter and pixelation that can distract or confound interpretation by human eyes or computer algorithms
- By using this technology, Maxar enables faster and more accurate data extraction from images collected by our satellite constellation.

#### 11.12.2020 | Earth Intelligence

Introducing 15 cm HD: The Highest Clarity From Commercial Satellite Imagery

By: Chris Formeller, Senior Imagery Product Manager, Maxar Technologies

Read Time: 3 minutes

![](_page_33_Picture_8.jpeg)

![](_page_33_Picture_12.jpeg)

![](_page_34_Picture_1.jpeg)

![](_page_34_Picture_2.jpeg)

![](_page_34_Picture_4.jpeg)

![](_page_34_Picture_7.jpeg)

![](_page_35_Picture_1.jpeg)

![](_page_35_Picture_2.jpeg)

![](_page_35_Picture_4.jpeg)

![](_page_36_Picture_1.jpeg)

#### Native (30 cm)

![](_page_36_Picture_4.jpeg)

![](_page_37_Picture_1.jpeg)

# Native (30 cm)

![](_page_37_Picture_4.jpeg)

# How to measure quality and improvements?

- Question:
  - Compared to 50 cm native resolution imagery, can HD imagery objectively improve the outcomes of detecting objects using machine learning?

- Methodology:
  - Holding everything constant except HD processing, train two new object detection models and compare performance

![](_page_38_Picture_7.jpeg)

# **Imagery Sources and Preparation**

- 11 catalog images at native 50 cm resolution
  - ~50% WorldView2, ~50% GeoEye1
- Two versions of each image strip prepared: one at 50cm (native resolution) and one at 25cm (HD)
- All images prepared in the same way:
  - 50cm and HD image pairs are pixel aligned and consistently colored (AComp, DRA, Ortho, all consistent)
- Random spatial sample of image chips from used to cover geographic and image variability

![](_page_39_Picture_7.jpeg)

40

![](_page_39_Picture_10.jpeg)

# **Model Training**

- Model architecture
  - Faster RCNN Model
- Model training
  - Separate models trained on both HD and native resolution using same model parameters

![](_page_40_Figure_5.jpeg)

(IOU: intersect-over-union)

![](_page_40_Picture_8.jpeg)

41

# *On the Ground - Advanced Products* The Earth in 3D

![](_page_41_Picture_3.jpeg)

WorldView Legion's agility and stereo capabilities will substantially increase our ability to model the Earth in 3D.

![](_page_42_Picture_3.jpeg)

MAXAF

![](_page_43_Picture_3.jpeg)

![](_page_43_Picture_5.jpeg)

![](_page_44_Picture_3.jpeg)

![](_page_44_Picture_5.jpeg)

![](_page_45_Picture_3.jpeg)

![](_page_45_Picture_5.jpeg)

![](_page_46_Picture_3.jpeg)

![](_page_46_Picture_5.jpeg)

# Thank you!

![](_page_47_Picture_1.jpeg)

![](_page_47_Picture_2.jpeg)

![](_page_47_Picture_3.jpeg)