



# Radiometric Calibration of SkySats

using Near-Simultaneous Crossovers with Sentinel-2  
over Calibration Sites

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Monte Fitz Roy, Patagonia – March 19, 2018



# Overview

01 | Introduction to Planet SkySats

02 | Interoperability Challenges

03 | Calibration Methodology

04 | Calibration Validation

05 | Summary







# Introduction to Planet SkySats

Singapore Strait, Singapore – July 29, 2016



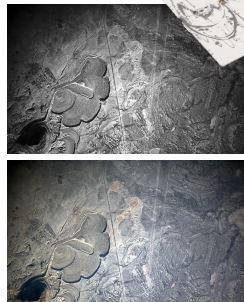
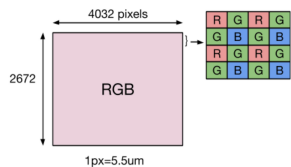




# Planet Payloads Over the Years

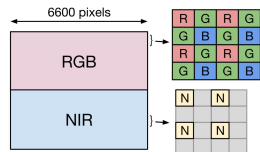
Dove Pilot (~50 satellites)

2016



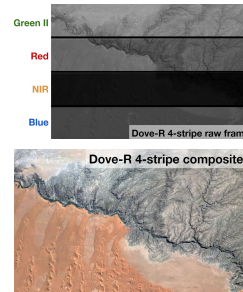
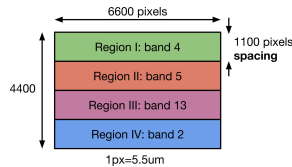
Dove (~150 satellites)

2017



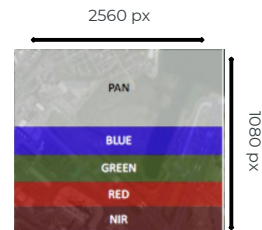
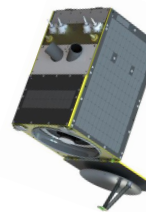
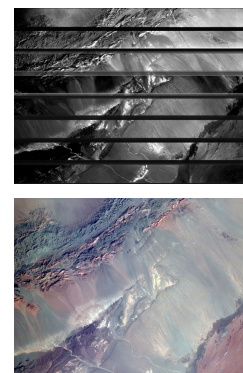
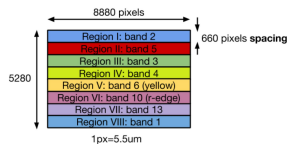
Dove-R (24 satellites)

2018



SuperDove (~120 satellites)

2019  
2020  
2021



SkySats (21 satellites)







## SkySat Collects vs. Scenes

SkySat Scene



SkySat Collect

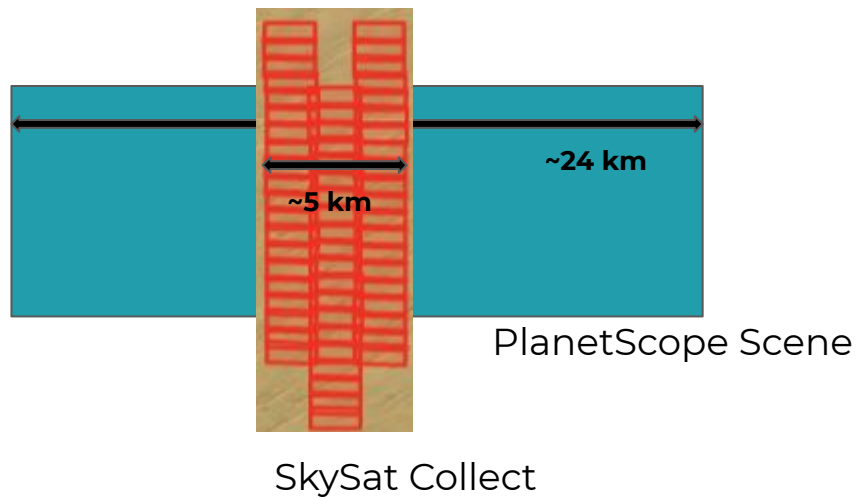




## SkySat Scenes vs. PlanetScope Scenes

### SkySat Collect

- C class - 5 km swath width
- A class - 8 km swath width
- 10 km-100 km length



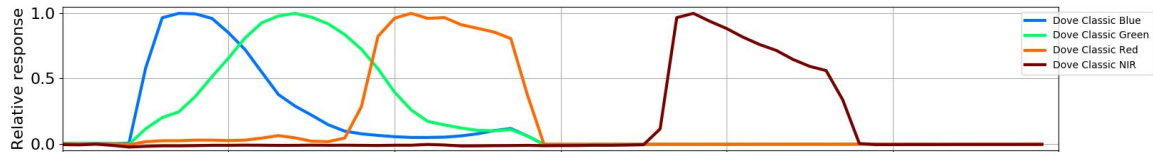




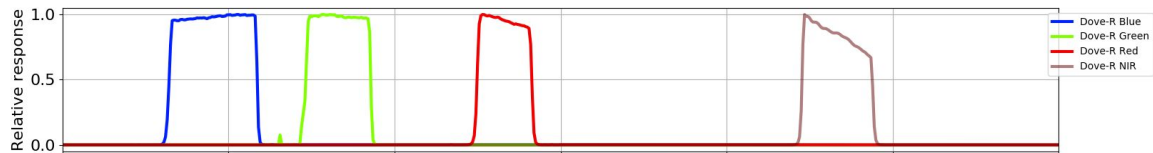
# Planet Payloads

## Over the Years

**Dove Classic**



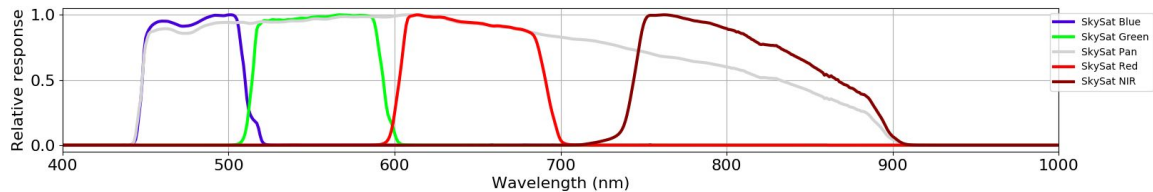
**Dove-R**



**SuperDove**



**SkySat**

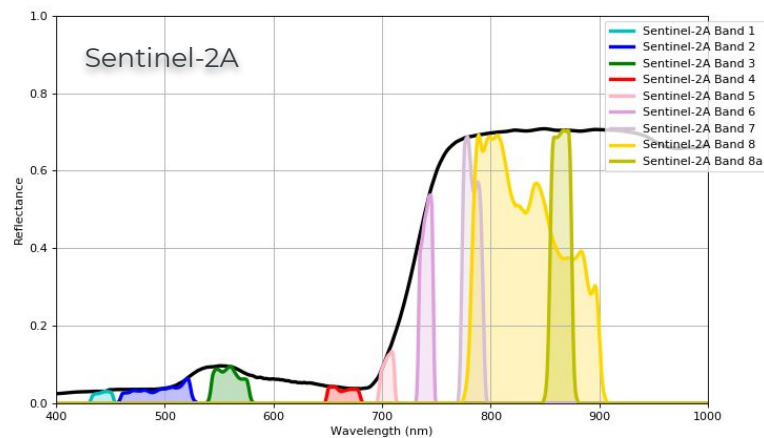
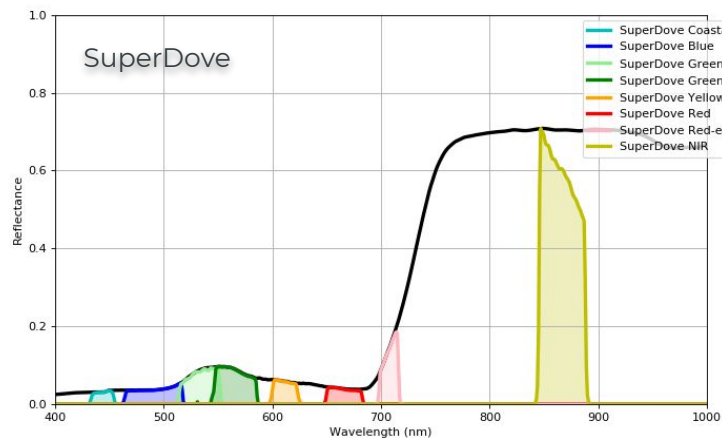




# Effects of Differing Responses

SuperDove

## A lawn grass spectrum from a spectral library



SBAF Corrections <i>SuperDove</i> → <i>Sentinel-2</i>	Coastal Blue to Band 1	Blue to Band 2	Green_ii to Band 3	Red to Band 4	Red-edge to Band 5	NIR to Band 8a
		0.992	1.019	1.053	0.9524	0.846



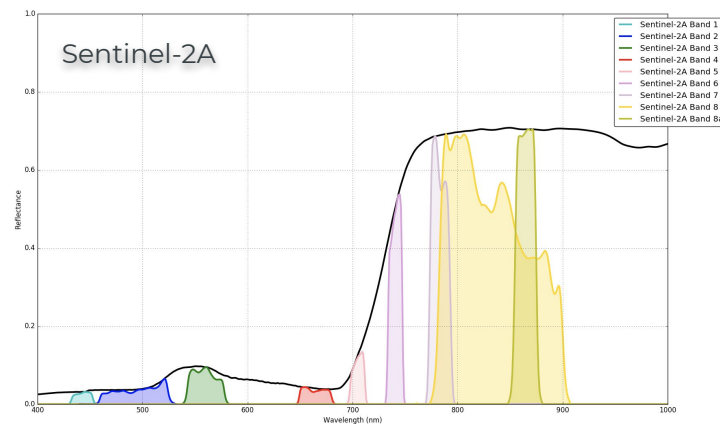
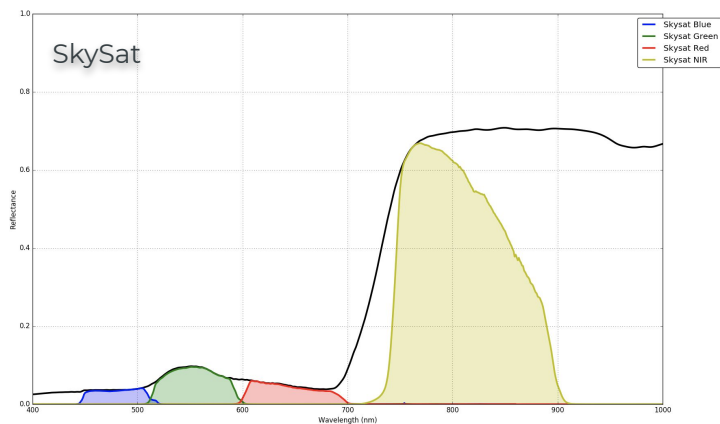




# Effects of Differing Responses

SkySat

## A lawn grass spectrum from a spectral library



SBAF Corrections <i>SkySat</i> → <i>Sentinel-2</i>	Blue to Band 2	Green to Band 3	Red to Band 4	NIR to Band 8
	0.8909	0.8993	1.1940	0.9682





# Calibration Methodology

Lake Tuborg, Canada – May 30, 2015





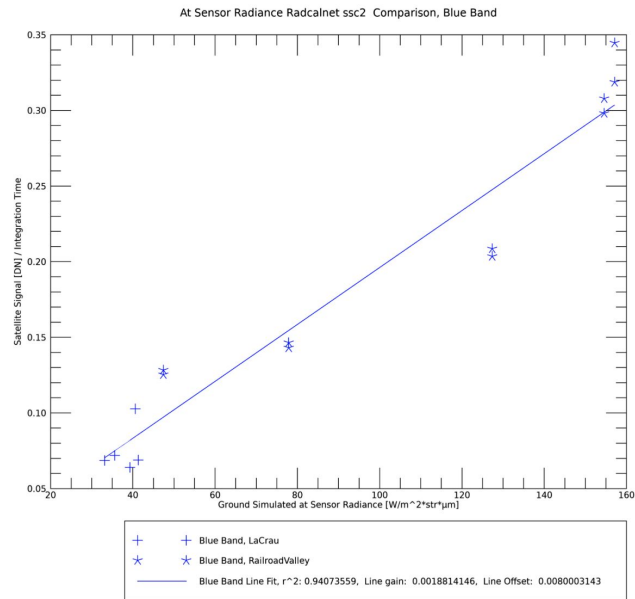
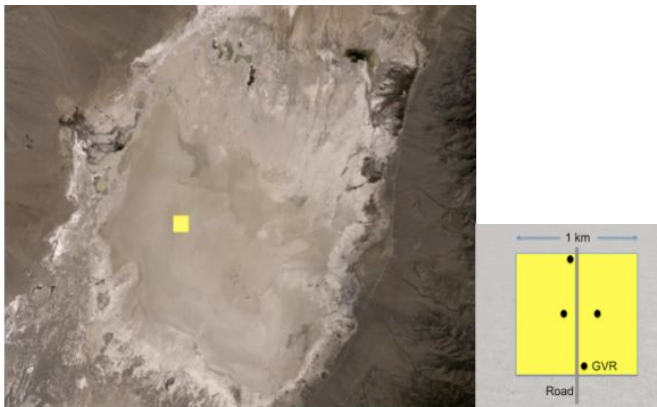


# Overview

## Original Methodology

Calibrations based on gathering a dataset of **RadCalNet** site crossovers.

$$Rad = \frac{DN}{IntTime} \cdot gain + offset$$



Original calibration done in November 2017  
Updated every 6 months

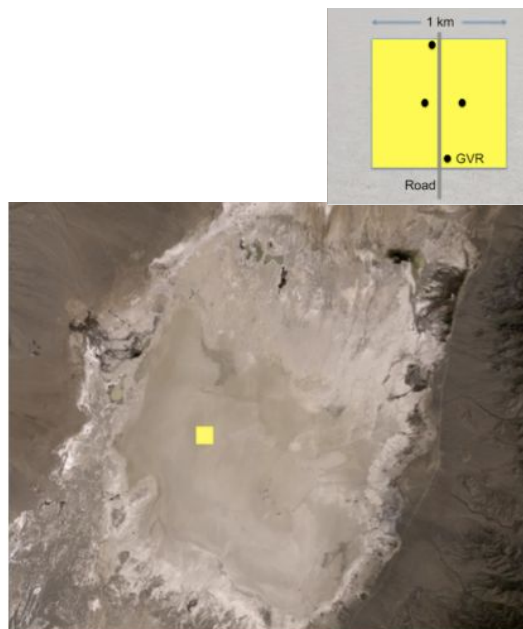


# Overview

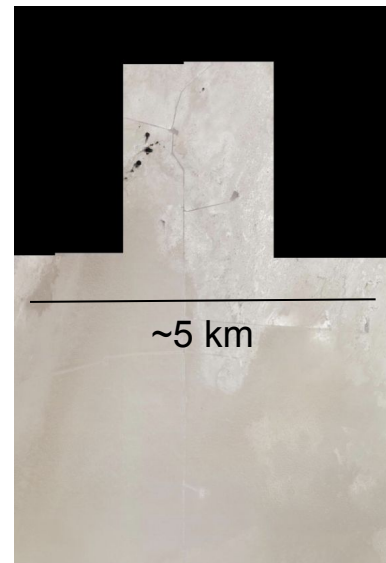
## Original Methodology

### SkySat

- Calibrations are based on gathering a dataset of **RadCalNet** site crossovers.
- As calibration site footprint is so small, calibration is only done for the central detector.
- The other 2 sensors are calibrated relative to the central sensor.



Railroad Valley and target for which RadCalNet TOAR spectra are representative



SkySat Collect over Railroad Valley

From [radcalnet.org](http://radcalnet.org)

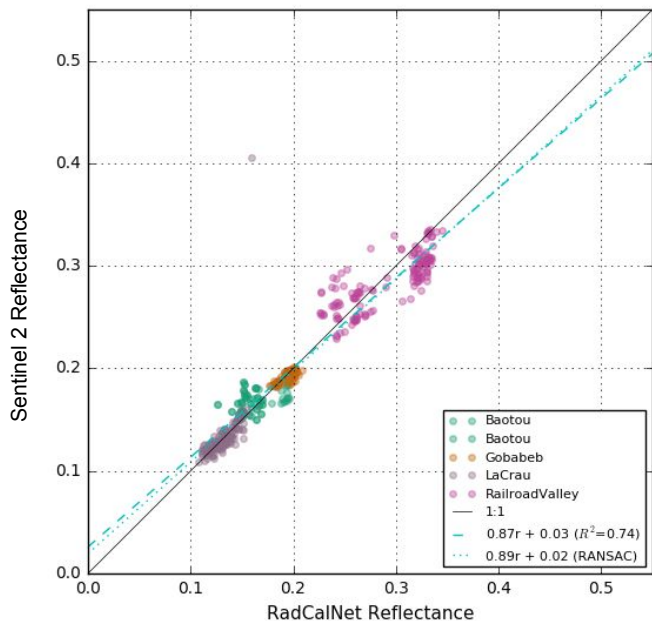




## Details

### Differences with RadCalNet

Sentinel 2 TOA Reflectance vs RadCalNet for B Band



- Differences between Sentinel 2 and RadCalNet as a reference
- For consistent **methodology** and **interoperability**, the goal is to use same reference source throughout all payloads





# Overview

## New Methodology

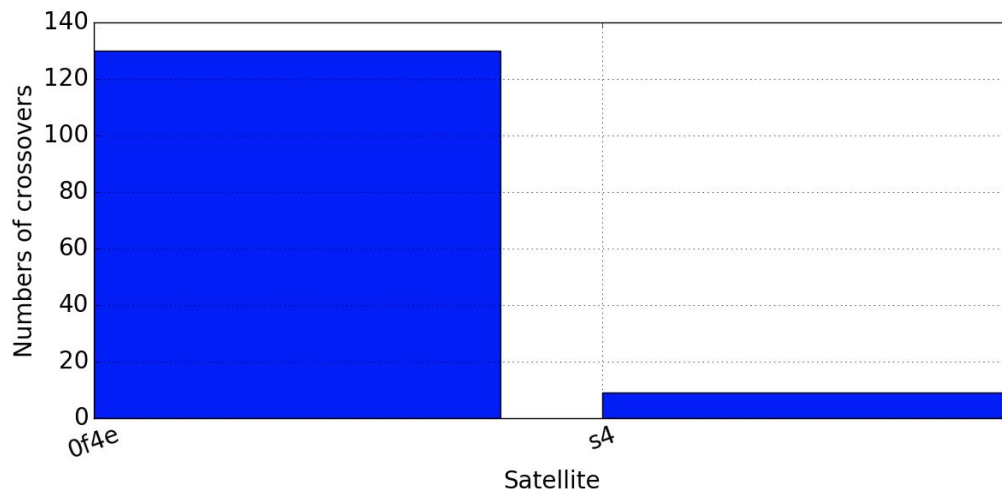
- Calibrations are based on gathering a dataset of near **simultaneous crossovers with a reference satellite**
  - A simultaneous crossover is when there is **less than three hours difference** between a reference image and a Planet image for the same point
  - Same reference satellite for all: **Sentinel-2**
- **Dove Classic/SkySat**
  - Standard set of calibration sites, “homogeneous” sample regions
  - **Hyperion spectra** for characterizing the surface reflectance to calculate SBAFs
  - Simultaneous crossovers with Sentinel-2 over standard calibration sites
- **SuperDove/Dove-R**
  - **Global** simultaneous crossovers with Sentinel-2





## Details

### Calibration Challenges

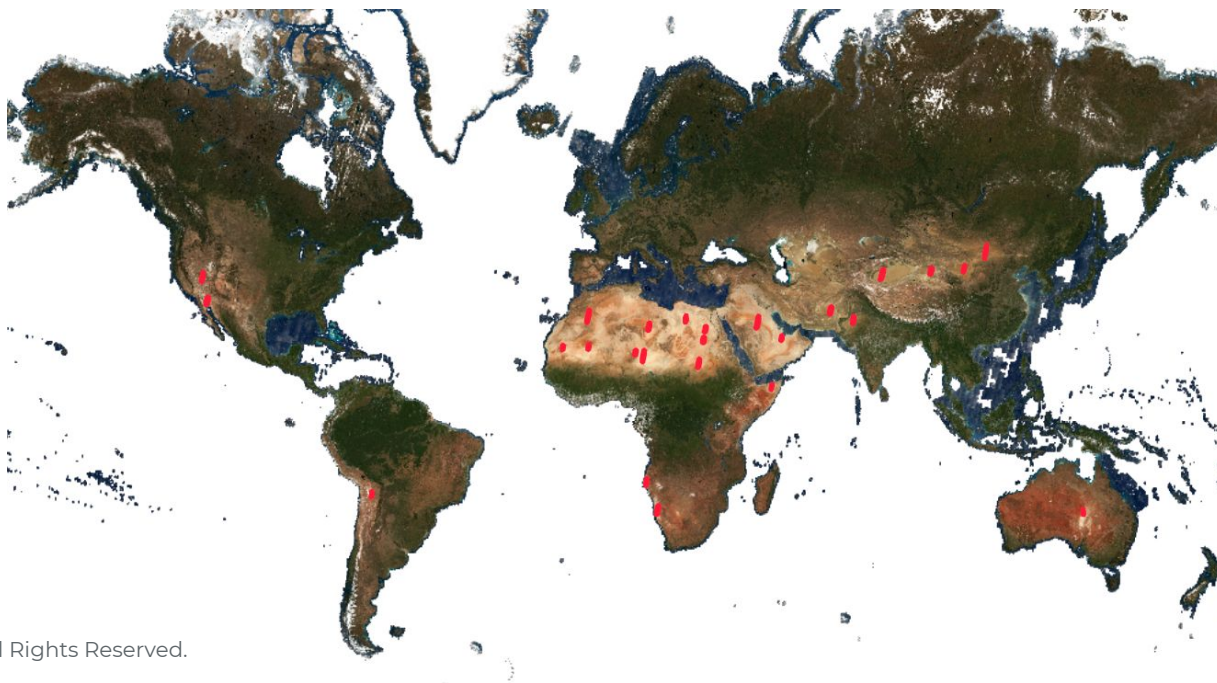


- Number of simultaneous crossovers with Sentinel 2 over calibration sites for a single Dove Classic (0f4e) compared to a single SkySat (s4) over a one month period (July 2021)
- Dove Classics crossover calibration sites regularly
- Even with daily tasking, far fewer SkySat crossovers
- Only use SkySat data taken **<10 degrees** off Nadir



## Calibration Sites

Locations of Pseudo-Invariant Calibration (PIC) sites and Rapid Eye Calibration sites



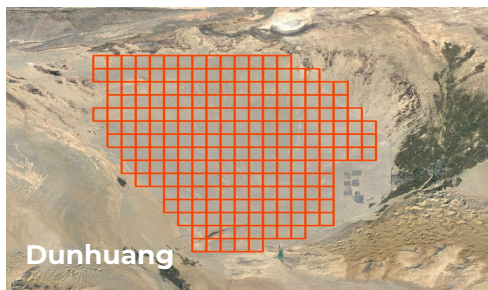




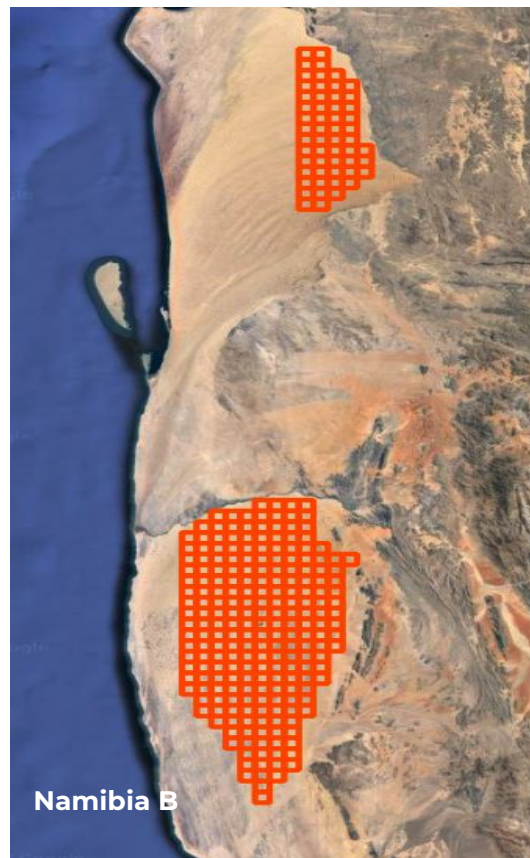
# Sample Areas / Details

## Dove Classic & SkySat

- Sample size is 1000 x 1000 Pixels (~3.5 km resolution)
- Sampling in spectrally homogenous locations within calibration site
- Spectra is characterized using Hyperion Imagery



Example  
Calibration Site  
sample grids

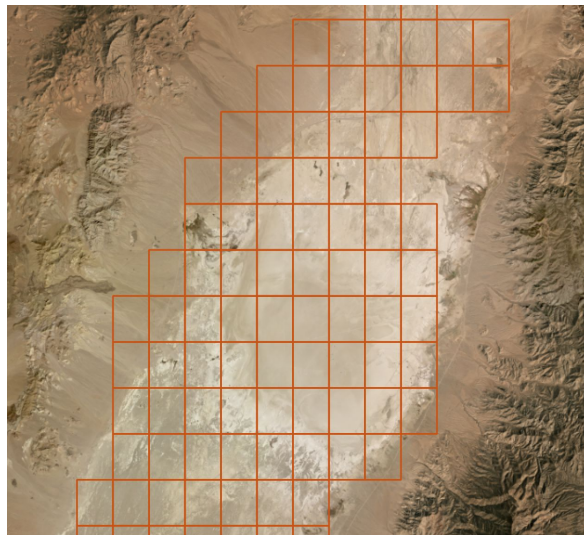




## Update Calibration / Details

RadCalNet & SkySat

- Crossovers collected and analyzed for whitelist periods
- **Existing calibrations** updated for time period they fall inside of
- Calculate gain adjustments using crossovers with Sentinel 2 over calibration sites



Railroad Valley Site  
Overlain with calibration grid

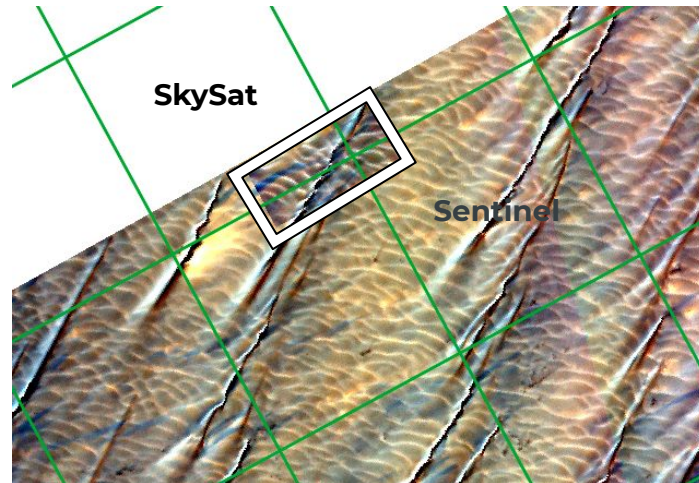
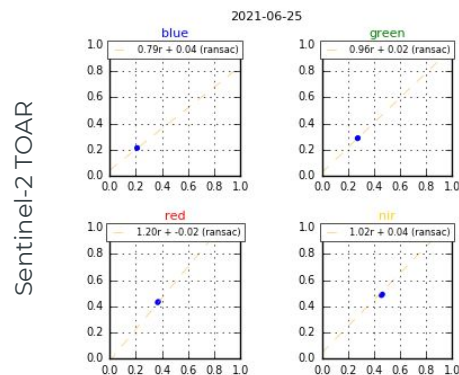


# Crossover Analysis / Details

## Dove Classic & SkySat

- Sample size is ~3.5 km x 3.5 km resolution
- Sampling in spectrally “homogenous” locations within calibration site
- Sample spectrum is characterized using Hyperion Imagery
- Statistics are gathered and recorded for each crossover, in particular the **joint mode** of the sample reflectance distribution for both the Dove and Sentinel collects.

SkySat S1 TOAR







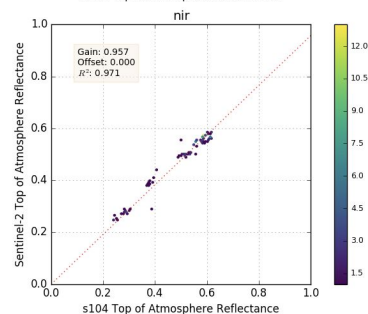
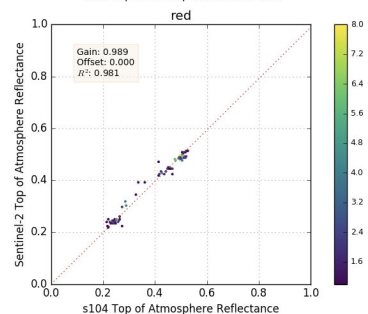
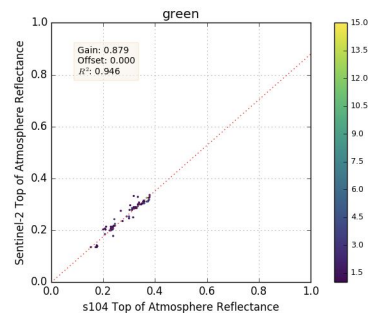
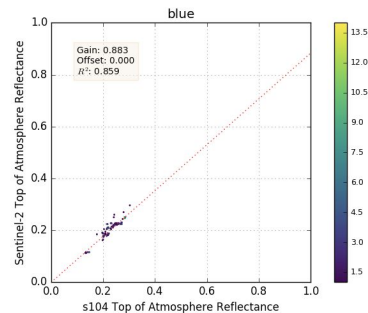
# Gain Adjustments / Details

## SkySat

Calibration gain adjustment is based on scatter plot fits of the **joint modes** from individual crossovers.

Each plot on the right represents ~130 simultaneous crossovers with Sentinel-2 of one of an individual SkySats.

SkySat s104, sensor 2  
Entire whitelist period

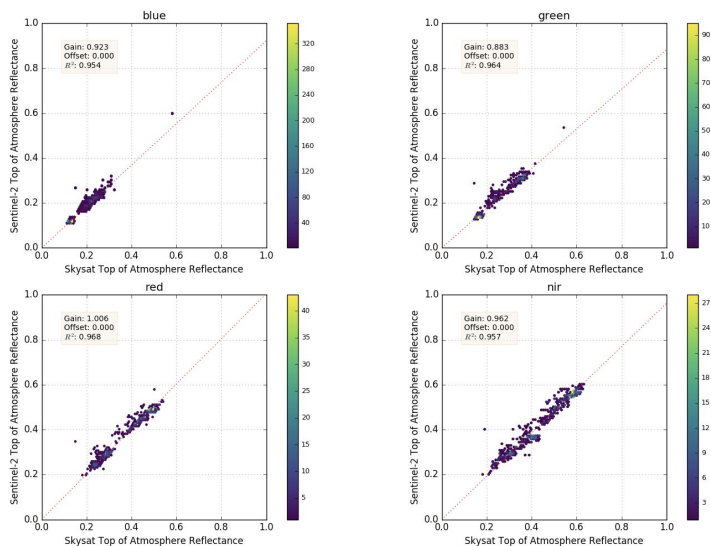




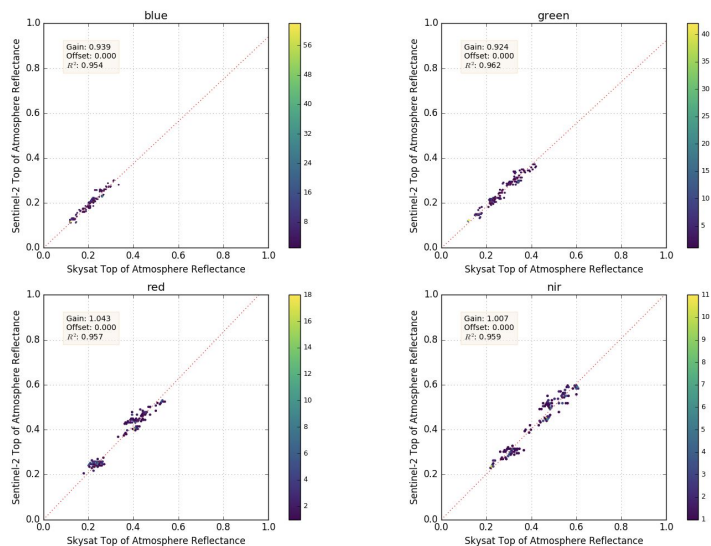
# Verification

75/25 split of data

## Calibration Data Set



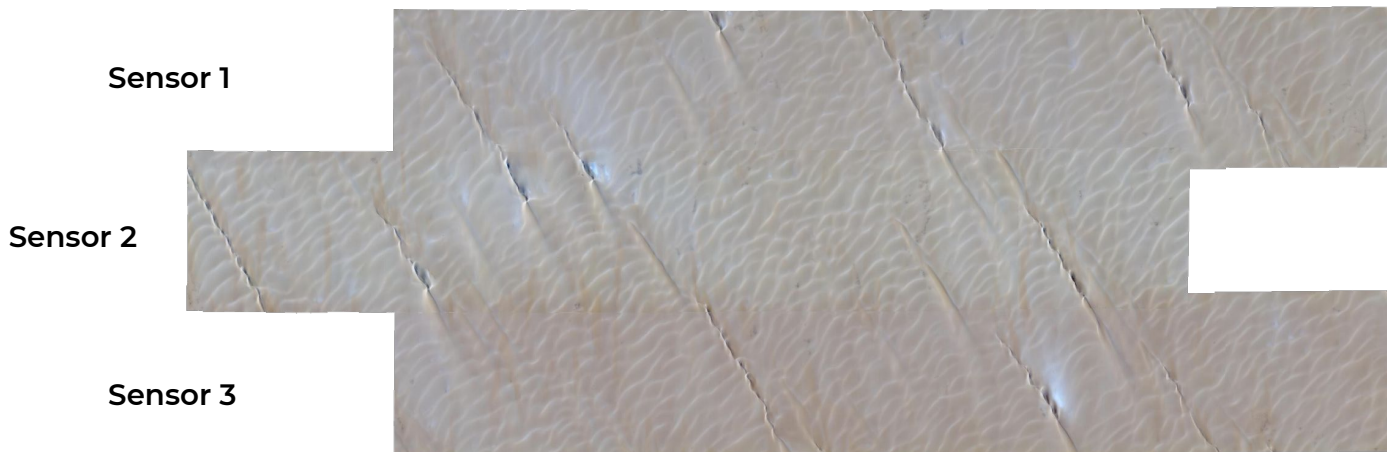
## Validation Data Set





# Sensor Differences / Details

SkySat



## SkySat s110

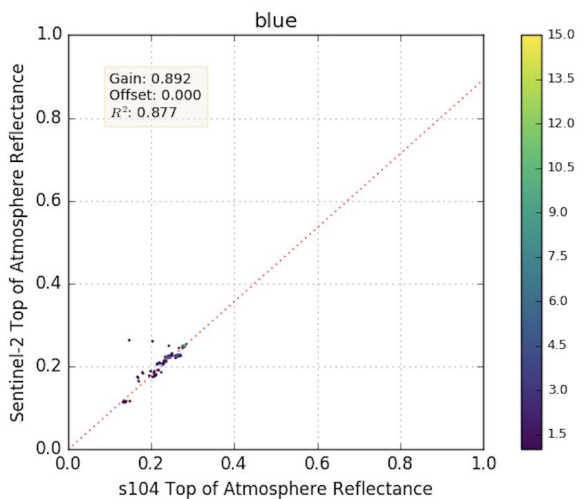
- Slight differences between three sensors on a single SkySat
- Some of the difference is due to the different geometry of the camera affecting stray light
- Goal is to remove some of the differences by calibrating each camera individually



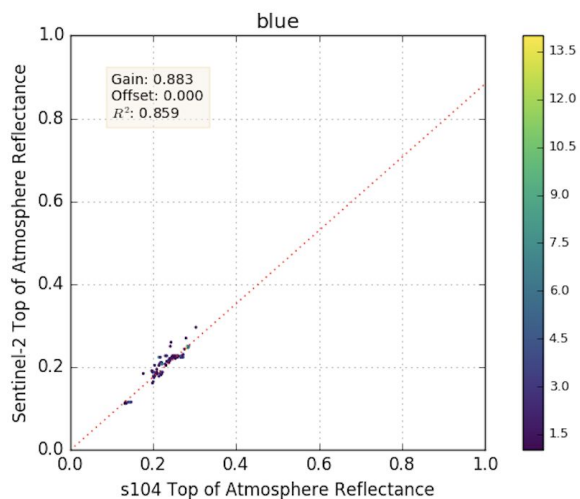
# Individual Sensors / Details

SkySat

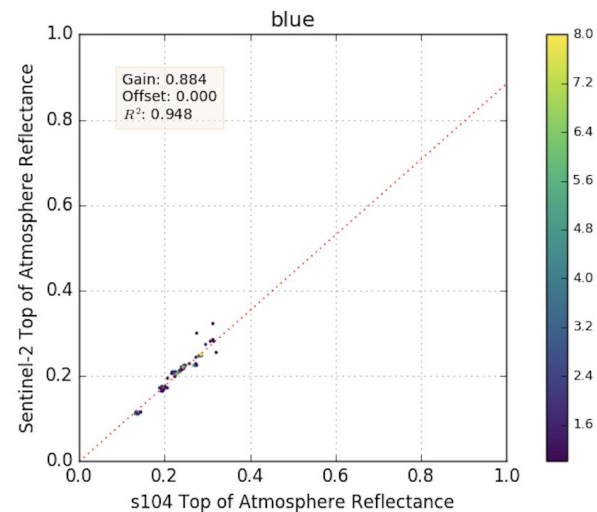
Sensor 1



Sensor 2



Sensor 3



S104 Training Data



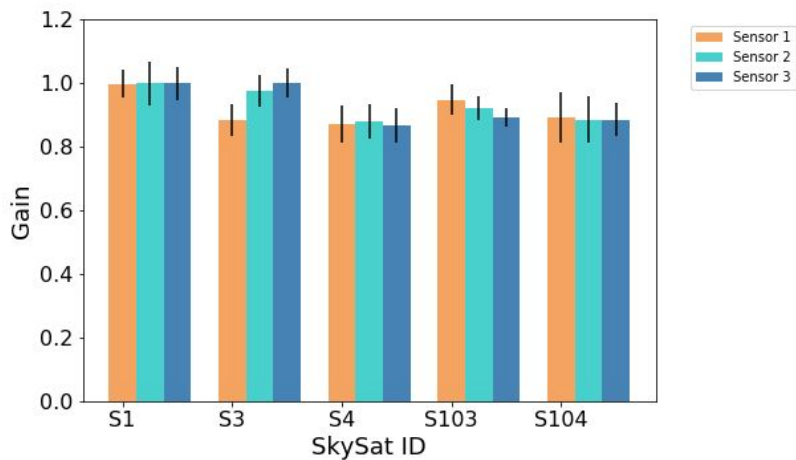




# Individual Sensors / Details

SkySat

Blue Band



Blue			
SkySat id	Sensor 1	Sensor 2	Sensor 3
s1	0.997	0.998	0.998
s2	0.883	0.975	0.999
s4	0.87	0.879	0.867
s103	0.946	0.921	0.892
s104	0.892	0.883	0.884

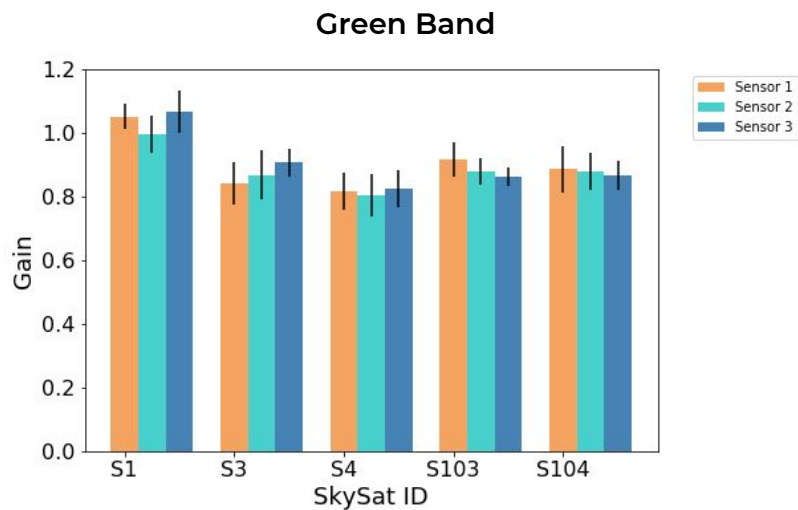
Individual sensor gains  
Error bars represent 1 sigma uncertainty





# Individual Sensors / Details

SkySat



Green			
SkySat id	Sensor 1	Sensor 2	Sensor 3
s1	1.051	0.996	1.065
s2	0.84	0.867	0.906
s4	0.816	0.803	0.824
s103	0.914	0.877	0.861
s104	0.885	0.879	0.867

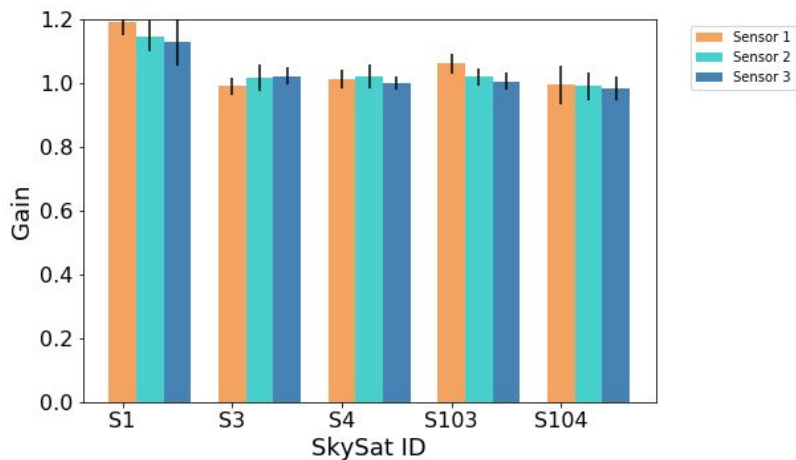
Individual sensor gains  
Error bars represent 1 sigma uncertainty



# Individual Sensors / Details

SkySat

Red Band



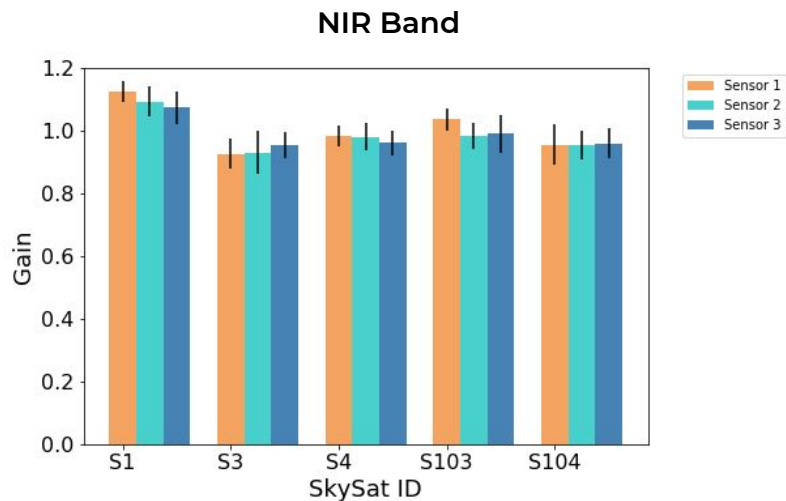
Red			
SkySat id	Sensor 1	Sensor 2	Sensor 3
s1	1.189	1.146	1.127
s2	0.989	1.016	1.022
s4	1.011	1.02	1
s103	1.06	1.019	1.005
s104	0.993	0.989	0.983

Individual sensor gains  
Error bars represent 1 sigma uncertainty



# Individual Sensors / Details

SkySat



NIR			
SkySat id	Sensor 1	Sensor 2	Sensor 3
s1	1.124	1.092	1.073
s2	0.926	0.93	0.953
s4	0.982	0.979	0.961
s103	1.035	0.981	0.99
s104	0.955	0.955	0.959

Individual sensor gains  
Error bars represent 1 sigma uncertainty

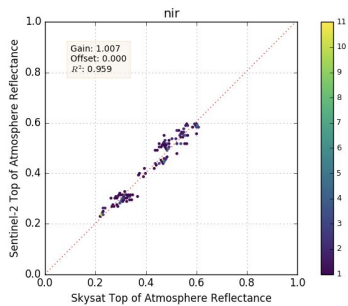
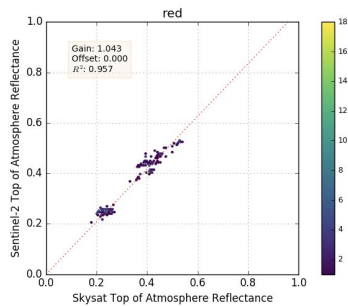
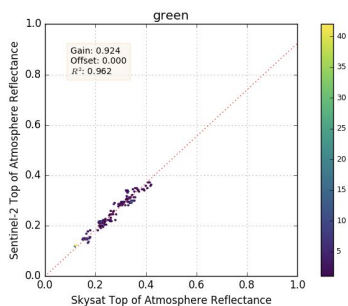
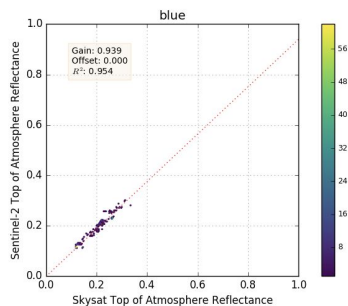




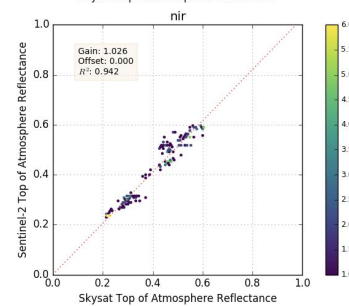
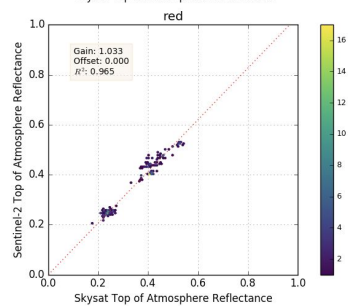
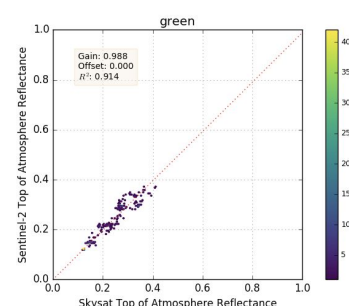
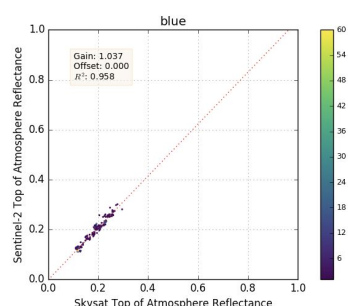
# Verification

## Original vs. Corrected

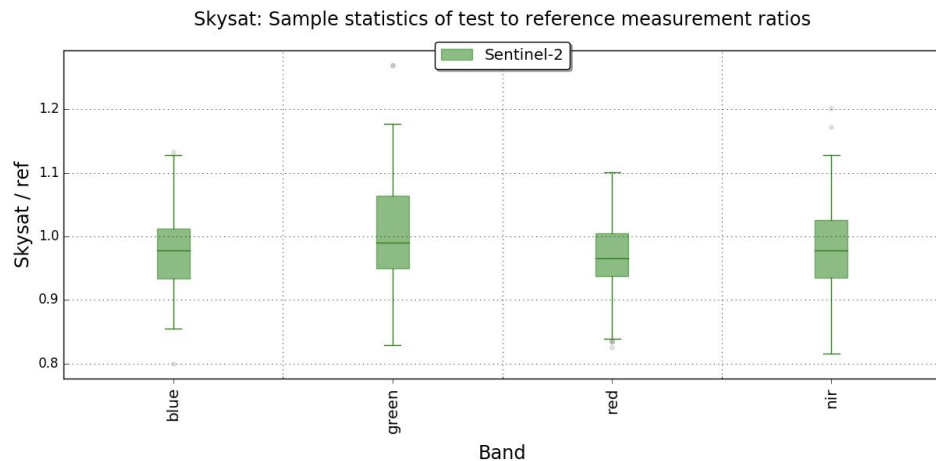
### Validation Data Set Original



### Per Sensor Corrections Applied



# + Accuracy



	Accuracy %	Uncertainty %
Blue	-2.919	5.929
Green	0.579	8.772
Red	-2.454	5.213
NIR	-3.610	6.396

Measurements of accuracy and uncertainty for the validation against Sentinel 2 reflectances



# Off Nadir Imaging

Klyuchevskaya Sopka, Russia - March 11, 2018

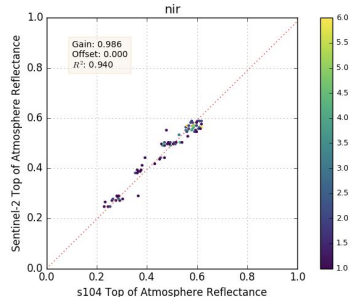
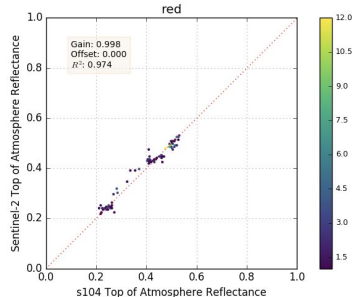
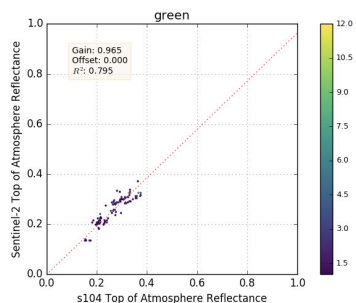
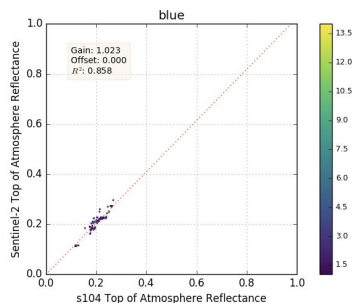




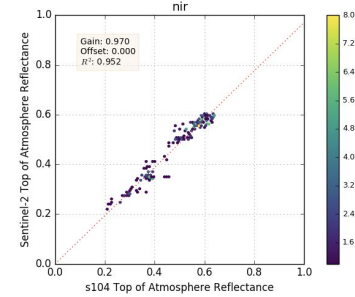
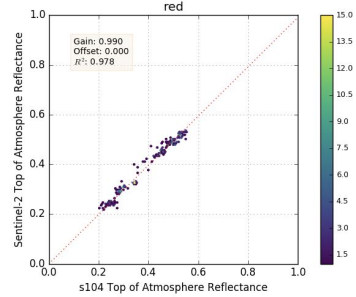
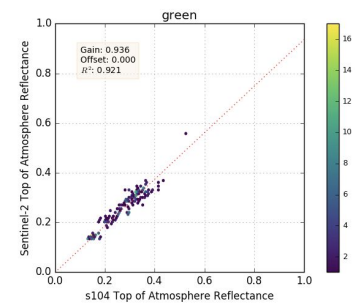
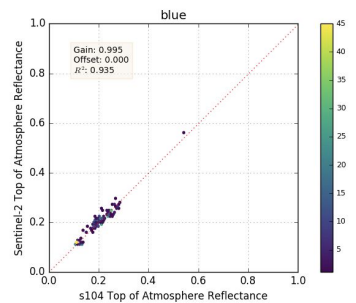
# Off Nadir Imaging

## Sentinel-2 Crossover Sites s104

10 Degrees



20 Degrees

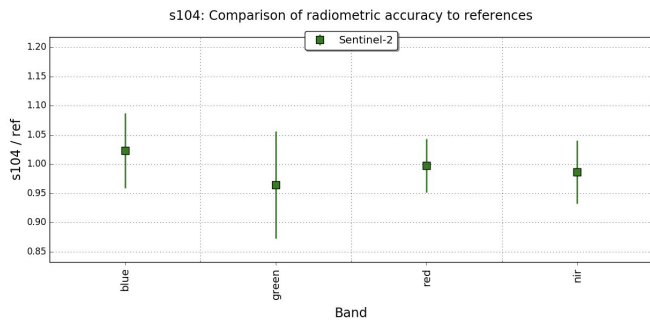




# Off Nadir Imaging

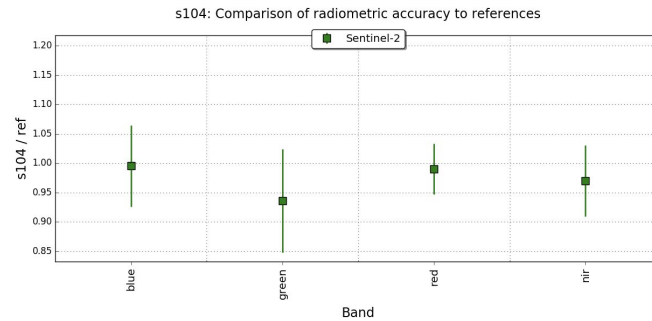
## Radiometric Accuracy to References

### 10 Degrees



	Accuracy %	Uncertainty %
Blue	-2.242	6.399
Green	3.867	9.181
Red	-0.425	4.610
NIR	1.240	5.408

### 20 Degrees



	Accuracy %	Uncertainty %
Blue	-0.791	6.881
Green	5.594	8.804
Red	0.651	4.300
NIR	3.111	6.028





# Summary

London Array Wind Farm, United Kingdom – April 17, 2016





## Summary

- Update methodology throughout Planet's fleet to use Sentinel 2 as our calibration reference
- Calibrate satellites per sensor
- Radiometric accuracy guaranteed at view angles less than 10 degrees

## Future Work

- Further BRDF characterization
- Using Planet's Fusion product as a calibration source where simultaneous crossovers are limited
  - Recently launched Block III satellites
- Further characterization of the three detectors in general imagery





Save the date: October 12-13

Planet Explore 2021 Global Connection

Scan to Register



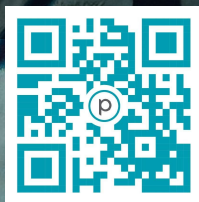
planet. | explore 2021

Virtual & accessible wherever you work  
Free to attend





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Great Barrier Reef, Australia – July 8, 2016

