



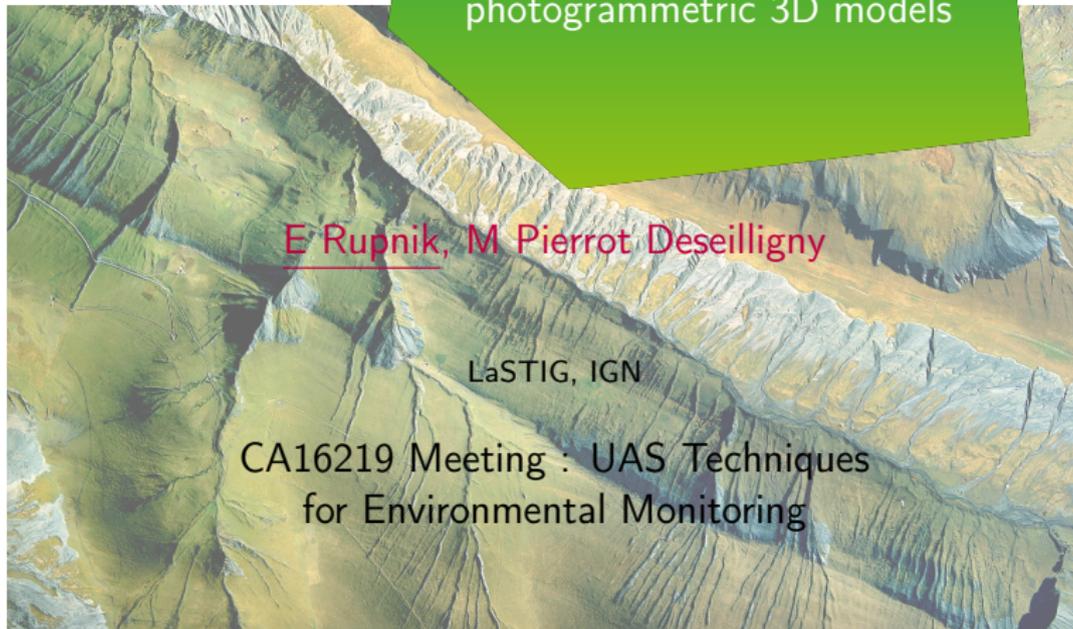
INSTITUT NATIONAL  
DE L'INFORMATION  
GÉOGRAPHIQUE  
ET FORESTIÈRE

# Accuracy estimation and optimization of UAV photogrammetric 3D models

E Rupnik, M Pierrot Deseilligny

LaSTIG, IGN

CA16219 Meeting : UAS Techniques  
for Environmental Monitoring



## UAV-photogrammetry pipeline

### Quality Analysis

- Relative orientation

- Absolute orientation

- Matching quality evaluation

  - With dense ground truth

  - W/o dense ground truth, qualitative

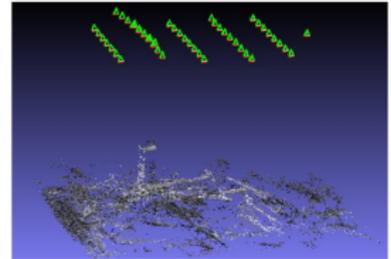
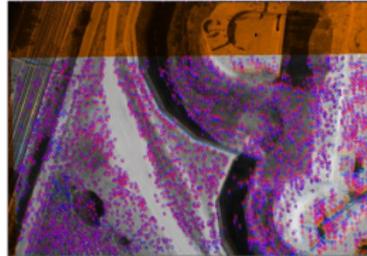
  - W/o dense ground truth, quantitative

### UAV-related research at IGN

- Hardware

- Algorithms

# UAV-photogrammetry pipeline



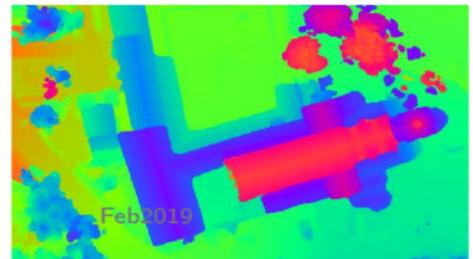
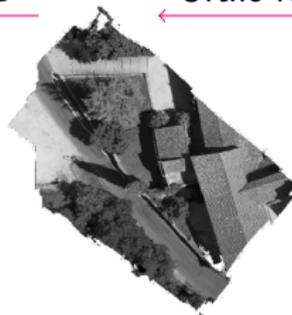
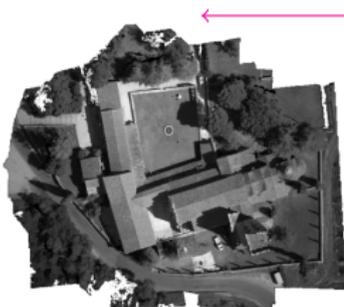
Tie-points extraction

Orientation/Calibration

Matching

Mosaicing

Ortho-rectification



1. What do we want to evaluate?:
  - ▶ only the 3D model
  - ▶ orientations
  - ▶ intermediary parameters (e.g., internal parameters)

# Quality Analysis

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2. What Ground Truth is at disposal (i.e., dense)?

# Quality Analysis

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  - ▶ intermediary parameters (e.g., internal parameters)
2. What Ground Truth is at disposal (i.e., dense)?
3. What metric to use?

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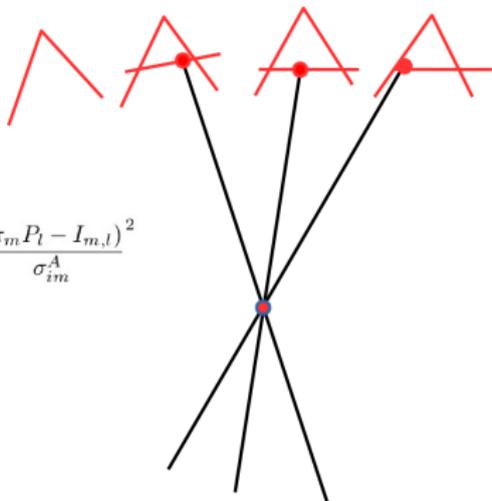
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# Relative orientation quality estimation

Classical measures:

- ▶ tie-points reprojection error (BBA  $\sigma$ )
- ▶ % of tie-points retained during BBA

$$\sum_{l=1}^Q \sum_{m=1}^{n_l} \frac{(\pi_m P_l - I_{m,l})^2}{\sigma_{im}^A}$$

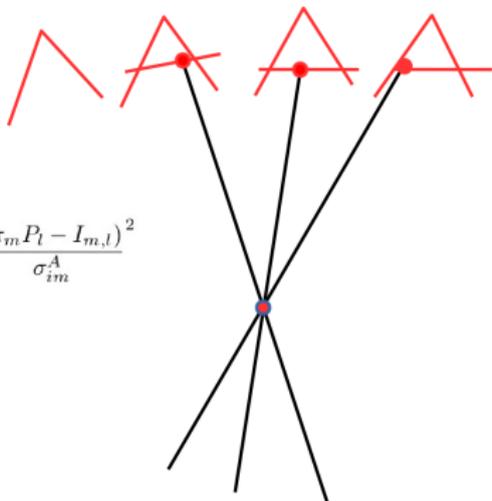


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## Disadvantage

- combines 2 error types
  - ▶ measurement error (white noise, not an issue)
  - ▶ camera modelling error (systematic, can generate bias)

## Relative orientation quality estimation

An alternative measure (also in MicMac):

- ▶ dense matching in 2 directions, i.e., epipolar and transverse (y-parallax)

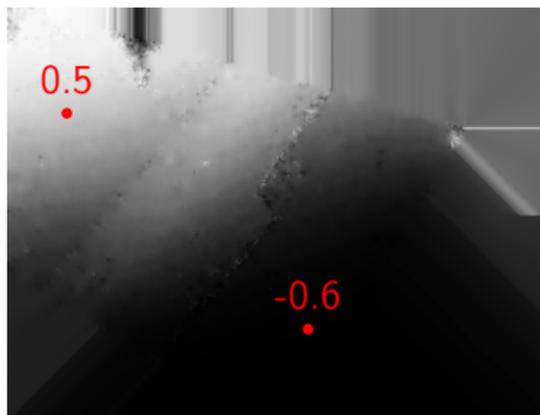


Figure: Y-parallax with high systematism.

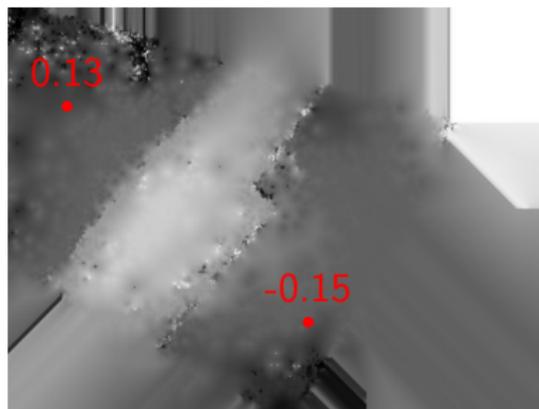


Figure: Y-parallax with low systematism.

## UAV-photogrammetry pipeline

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## Absolute orientation quality estimation

- Use Ground Control Points to evaluate accuracy

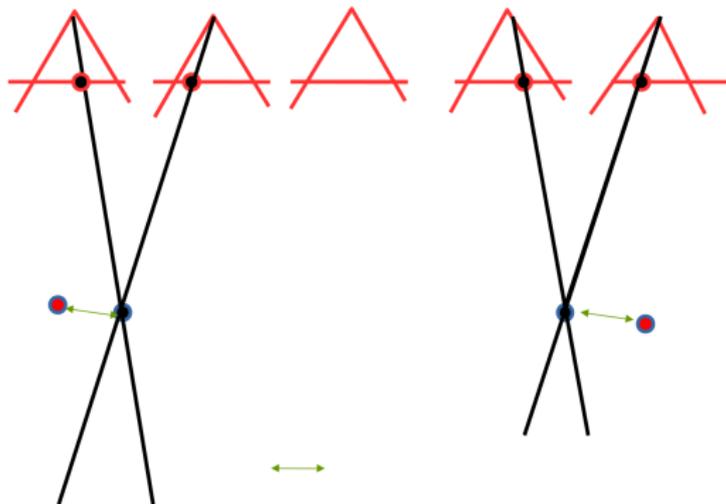
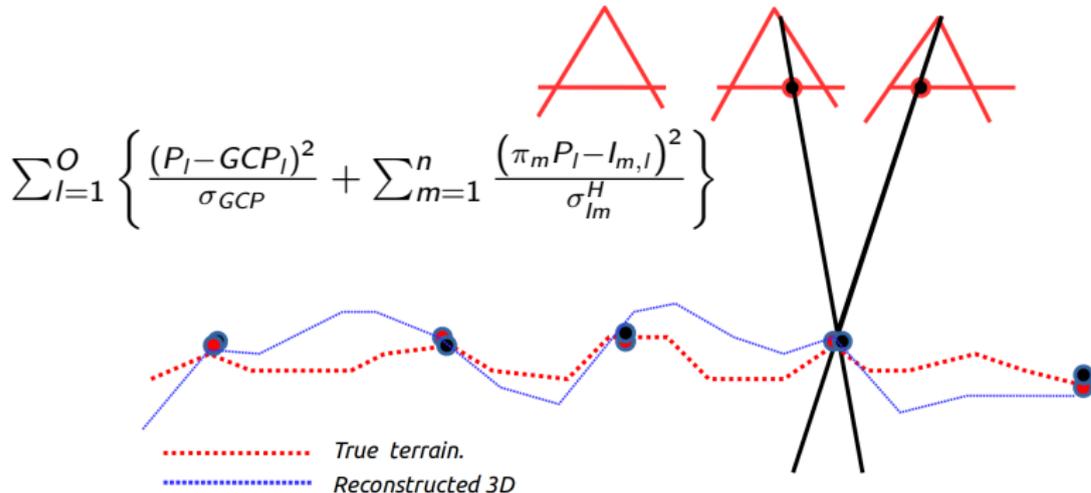


Figure: **Accuracy measure** - distances between 3D position predicted by photogrammetry and its *true* position.

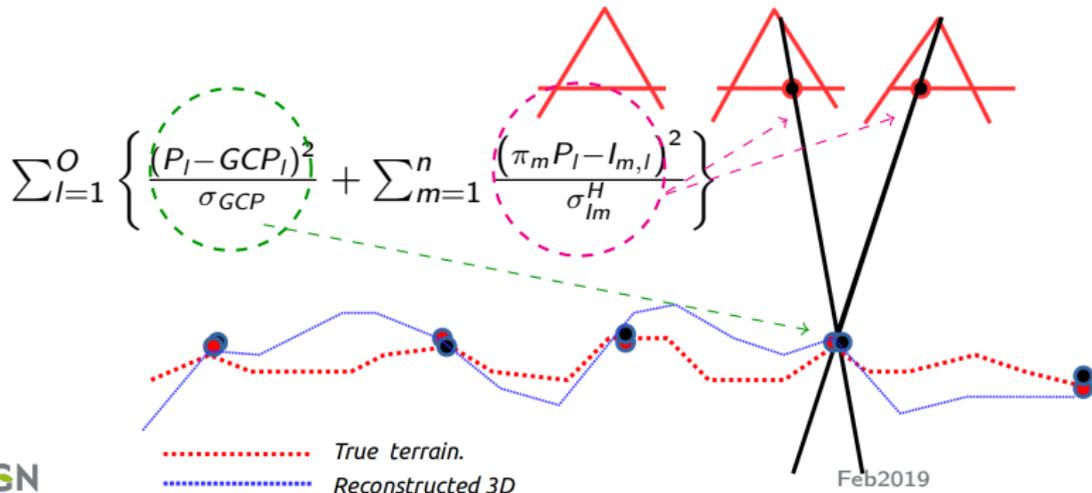
## Absolute orientation quality estimation

1. There is many more degrees of freedom (at least 6 per image) than there is constraints
2. if  $\sigma_{GCP}$  and  $\sigma_{Im}$  are set to low values, the system will *learn by heart* on the training set with risk of severe extrapolation outside the set.



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### Good practice, do not

- ▶ use all GCPs in the BBA
- ▶ evaluate the accuracy on the GCPs participating in the BBA

## Absolute orientation quality estimation

*Rules-of-thumb* for evaluating accuracy given  $\sigma_{GCP}$  and  $\sigma_{Im}$ :

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2. **with few points, e.g., 6**: Perform 6 independent computations where at each instance a GCP is alternatively removed and used as CP. Calculate final accuracy as an average of all 6 results.

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2. **with few points, e.g., 6**: Perform 6 independent computations where at each instance a GCP is alternatively removed and used as CP. Calculate final accuracy as an average of all 6 results.
3. **with minimum no of points, e.g., 4**: perform a Helmert transformation and estimate the accuracy empirically taking into account the degree of freedom; e.g. if  $\sigma = 3cm$  then
$$\sigma_{emp} = \sigma \cdot \frac{12}{5} = 7.2cm$$

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#### Matching quality evaluation

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## UAV-related research at IGN

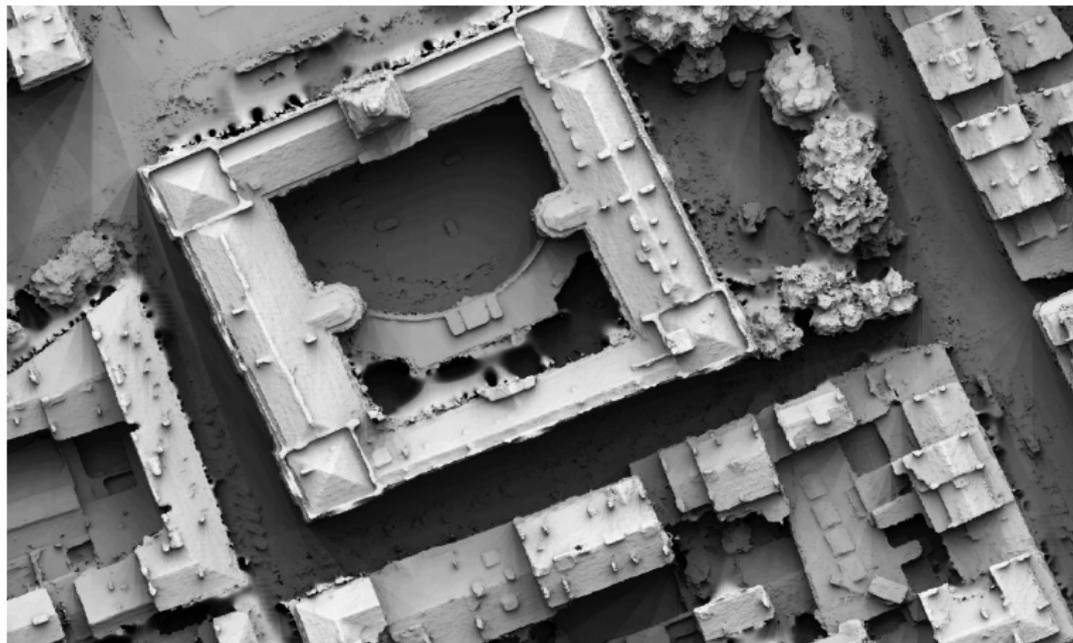
- Hardware

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# Matching quality evaluation

## With dense ground truth

- ▶ Two very different DSMs?

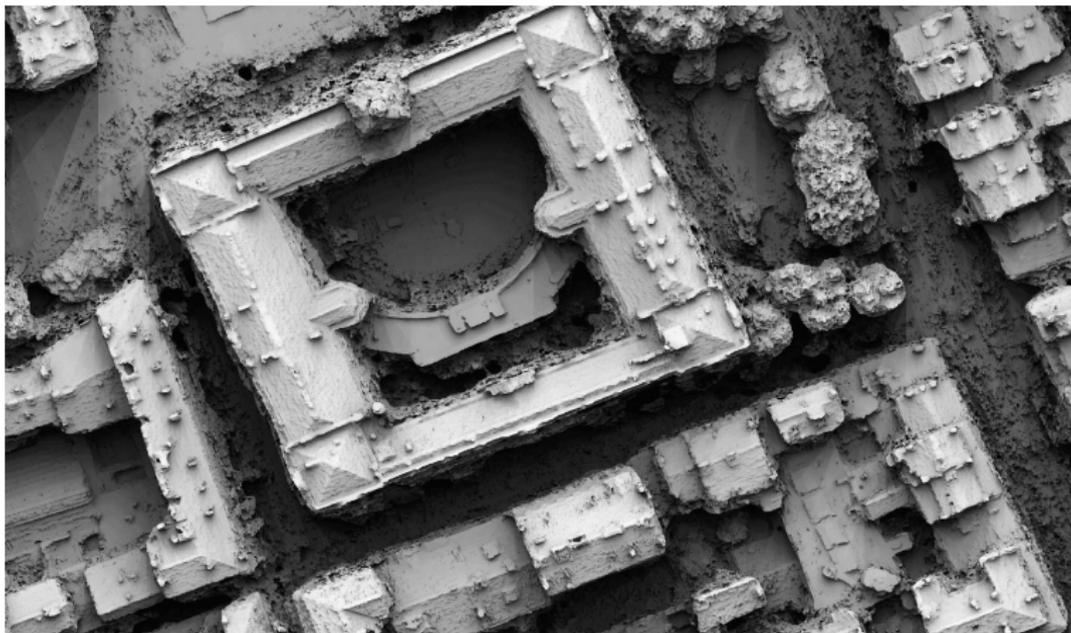


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# Matching quality evaluation

## With dense ground truth

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Figure: DSM2, EuroSDR benchmark

# Matching quality evaluation

## With dense ground truth

### ► Two very different DSMs?

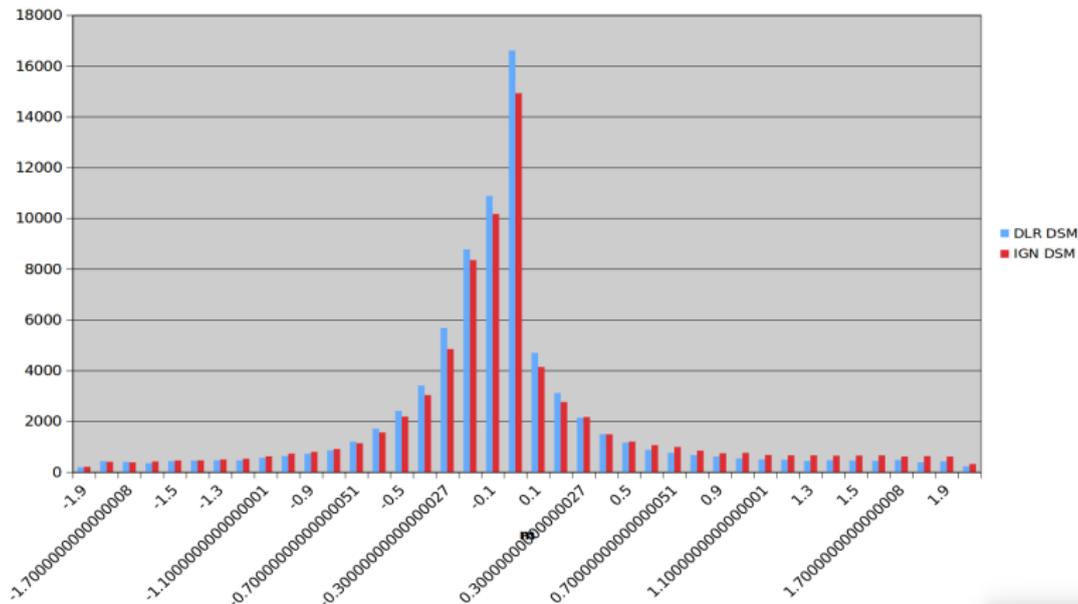
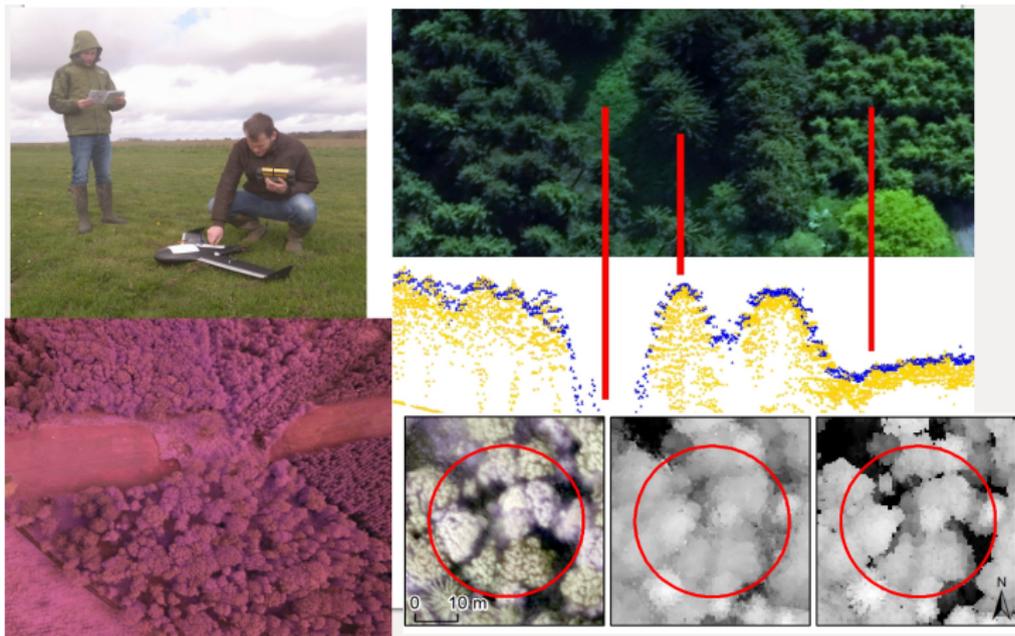


Figure:  $\Delta h$  of DSM1 and DSM2 wrt a Ground Truth

# Matching quality evaluation with dense ground truth

- ▶ Even more complicated, what do we evaluate?



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Figure: Photogrammetry in forestry applications.

## Matching quality evaluation

### With dense ground truth

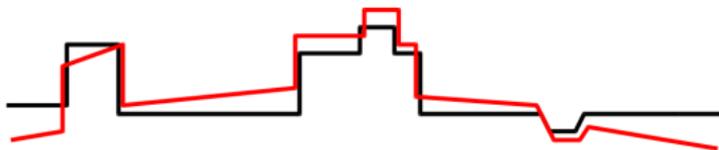
- ▶ The errors should be separated into:

# Matching quality evaluation

## With dense ground truth

- ▶ The errors should be separated into:

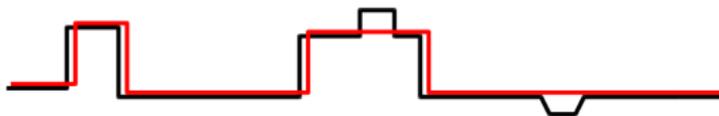
Bias (due to orientation)



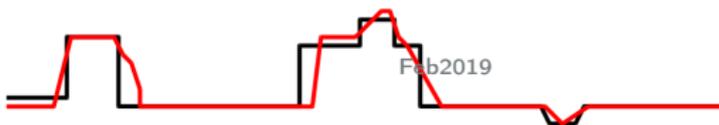
Random noise



Generalization



IGN Contour alignment



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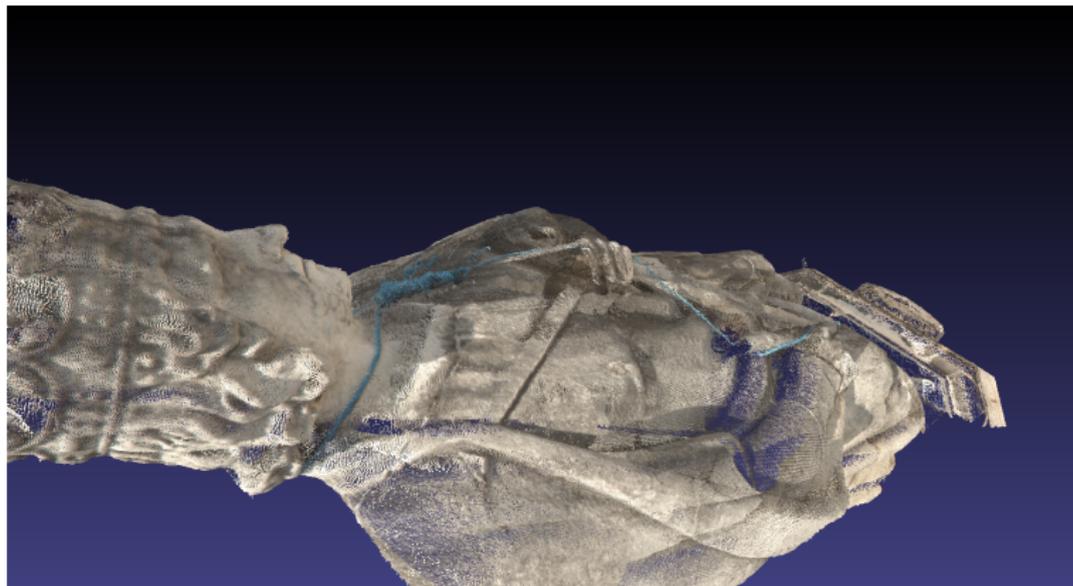
## UAV-related research at IGN

- Hardware

- Algorithms

## Matching quality evaluation W/o dense ground truth, qualitative

- ▶ Visual inspection. Yes but not on the coloured pointcloud!



## Matching quality evaluation

W/o dense ground truth, qualitative

- ▶ Visual inspection. A depth map?

## Matching quality evaluation

W/o dense ground truth, qualitative

- ▶ Visual inspection. A depth map? **No!**

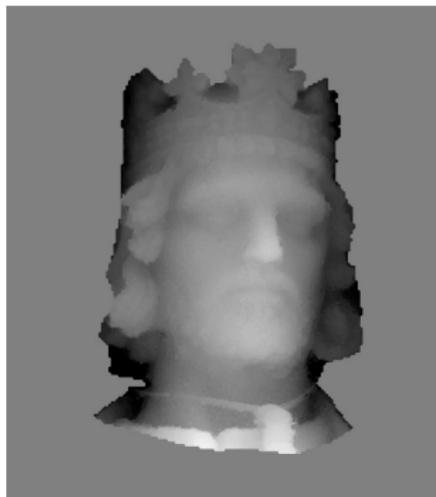


Figure: Regul  $\alpha \approx 0.01$

## Matching quality evaluation W/o dense ground truth, qualitative

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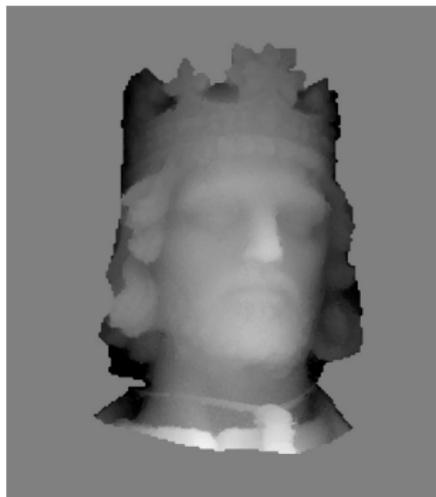


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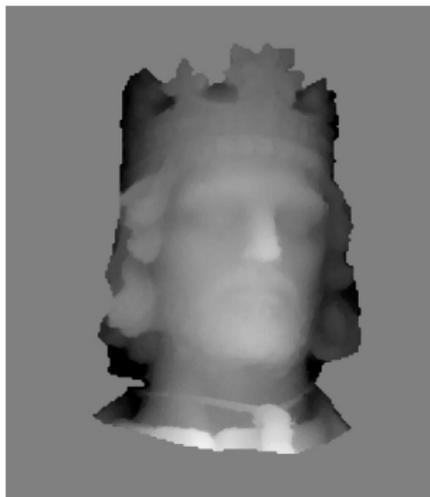


Figure: Regul  $\alpha \approx 0.05$

## Matching quality evaluation W/o dense ground truth, qualitative

- ▶ Visual inspection. A depth map? **No!**

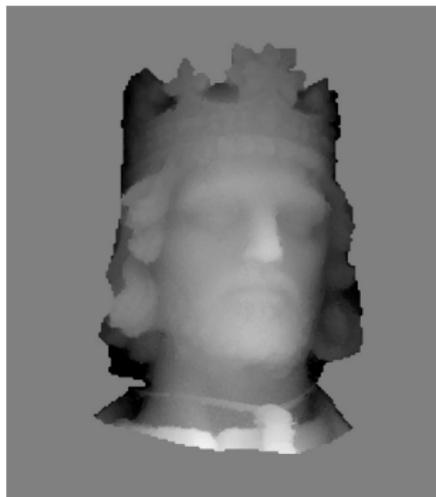


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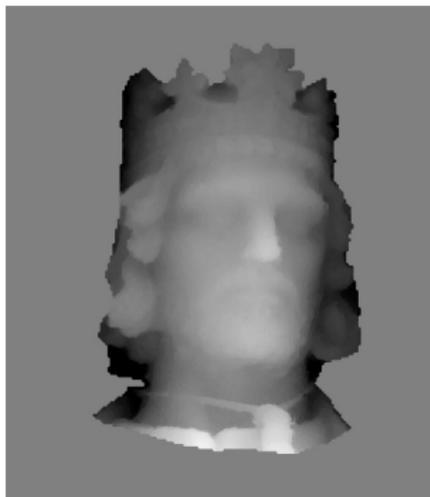


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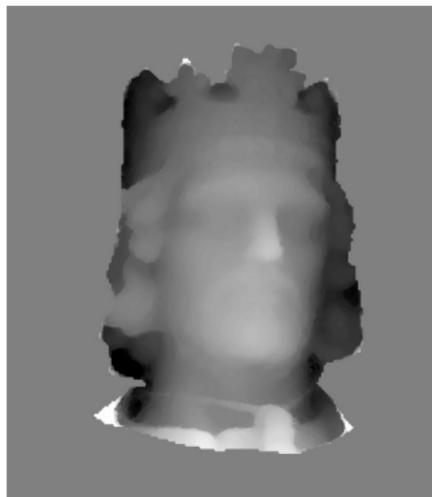


Figure: Regul  $\alpha \approx 0.1$

## Matching quality evaluation

W/o dense ground truth, qualitative

- ▶ Visual inspection. Grayshading?

## Matching quality evaluation W/o dense ground truth, qualitative

- ▶ Visual inspection. Grayshading? **Yes!**

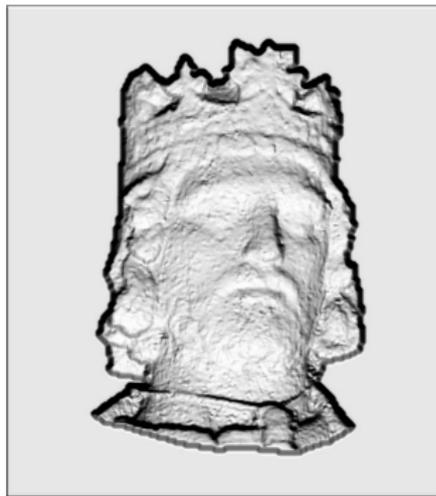


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## Matching quality evaluation W/o dense ground truth, qualitative

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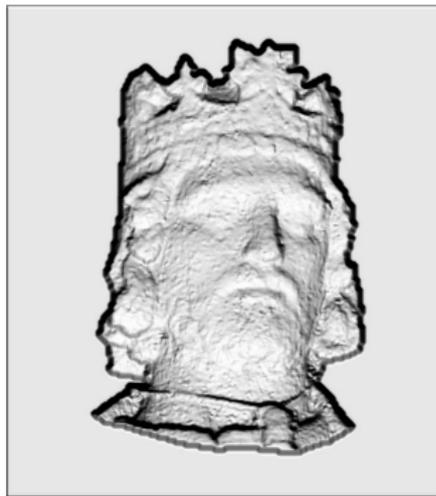


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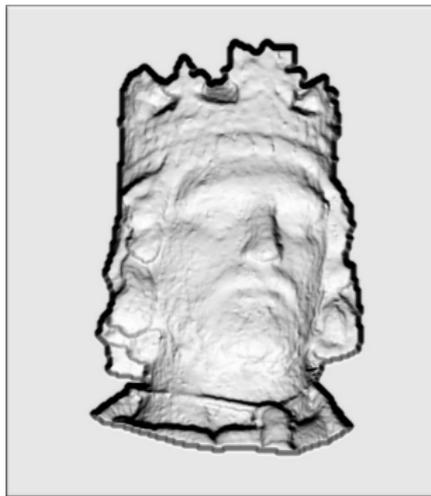


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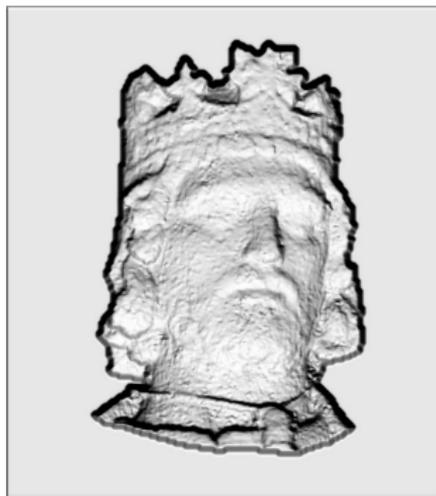


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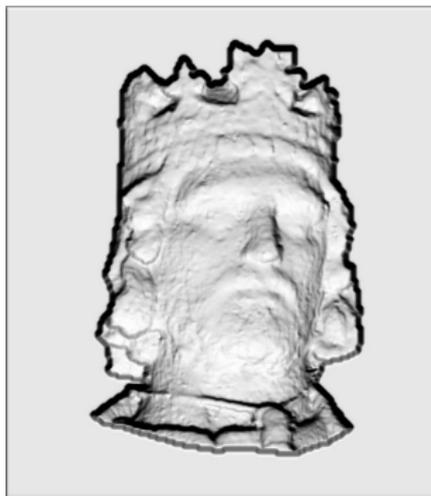


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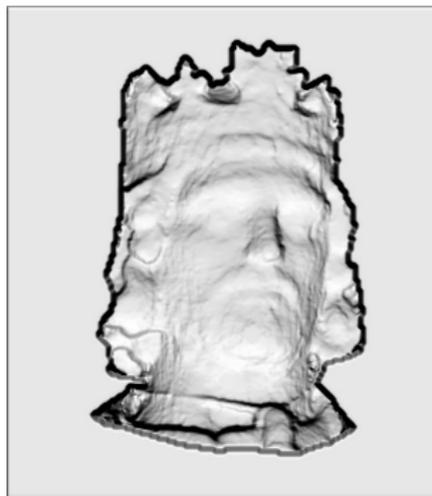


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## Matching quality evaluation

W/o dense ground truth, qualitative

- ▶ Visual inspection. Color-coded depth?

# Matching quality evaluation

W/o dense ground truth, qualitative

- Visual inspection. Color-coded depth? Perfect 3D model?

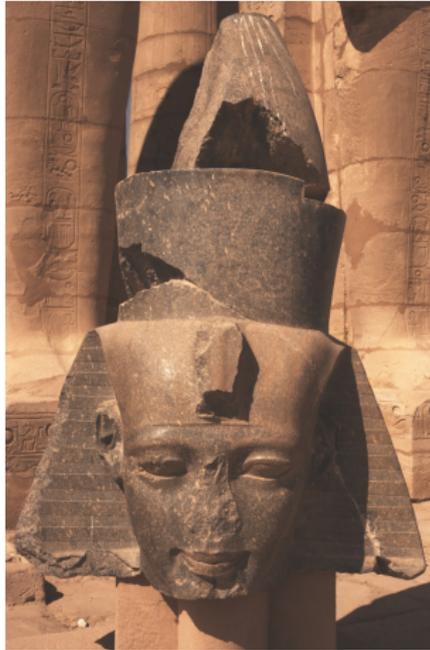
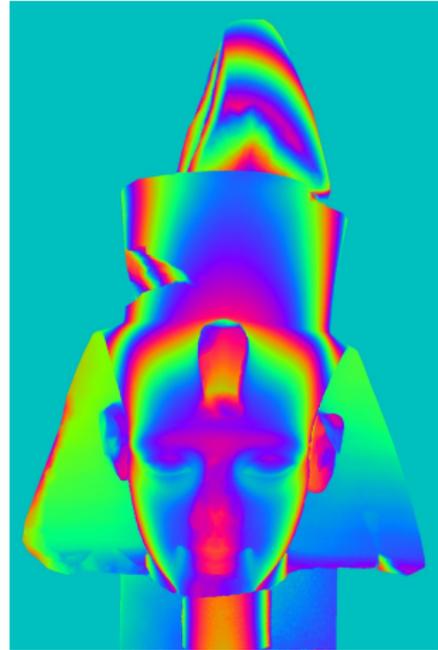


Figure: Master image.



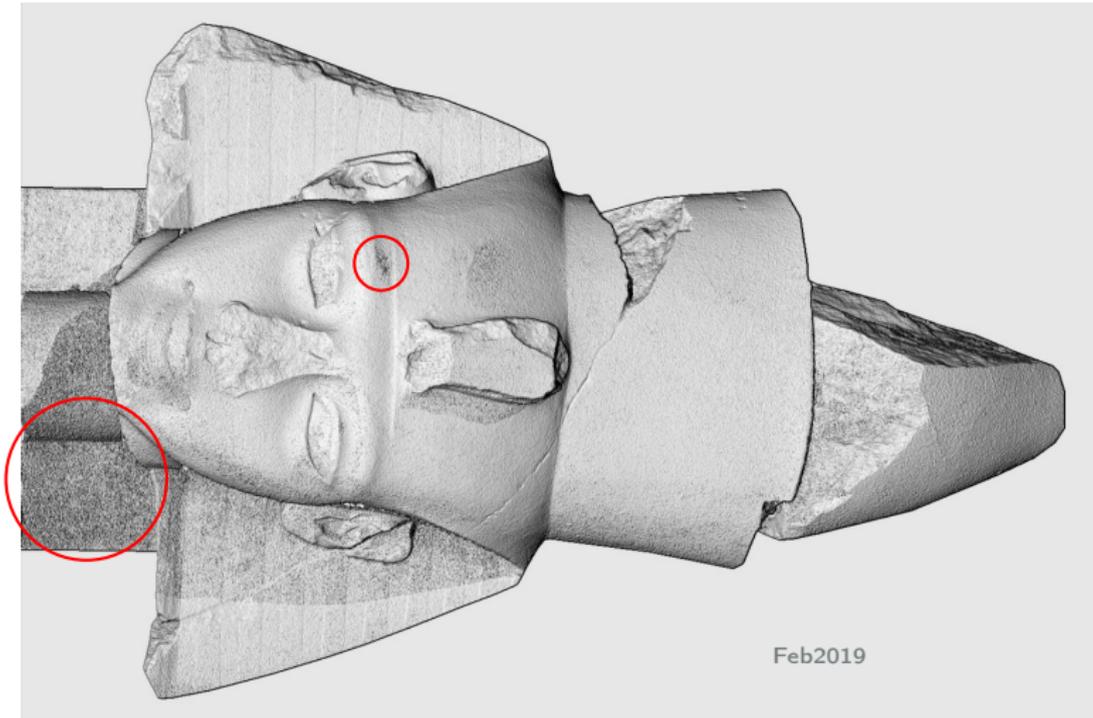
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Figure: Color-coded DSM.

# Matching quality evaluation

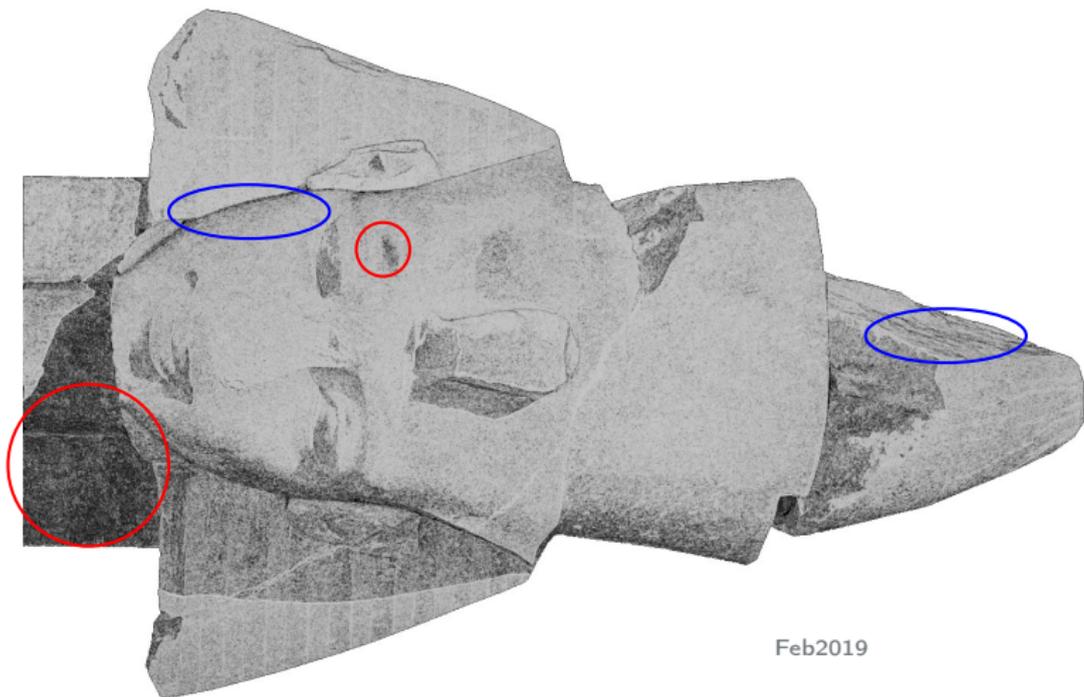
W/o dense ground truth, qualitative

- ▶ Visual inspection. Grayshading, again, reveals the quality.



## Matching quality evaluation W/o dense ground truth, qualitative

- ▶ Visual inspection. Correlation score as a quality indicator.



# Matching quality evaluation

W/o dense ground truth, qualitative

- ▶ Visual inspection. Understanding poor correlation scores.

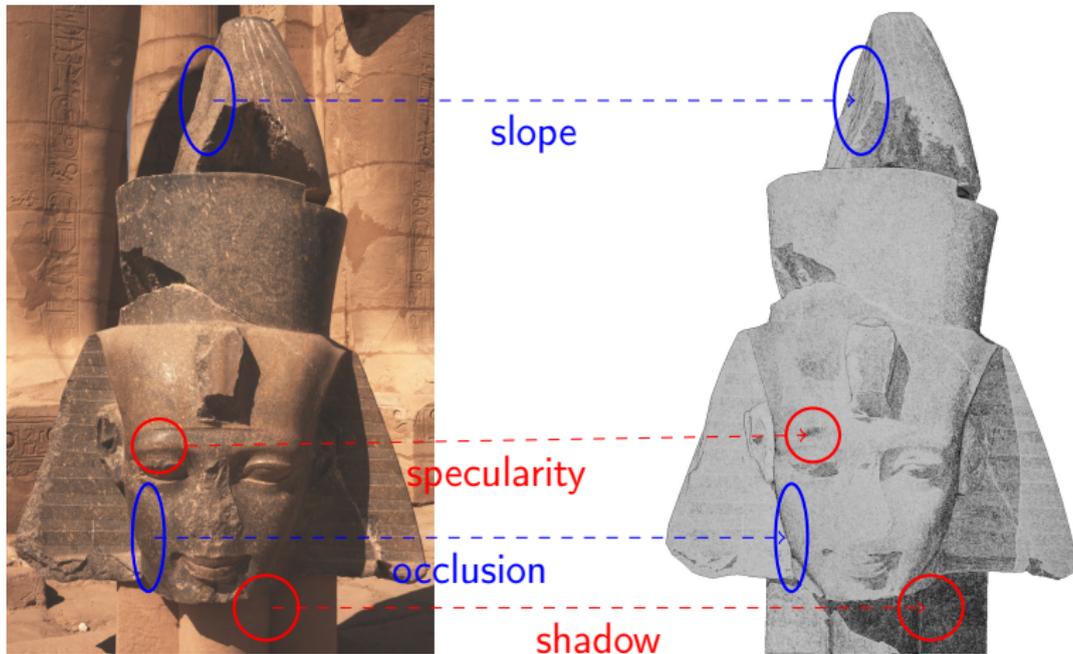


Figure: Master image.

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Figure: Corr image.

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## UAV-related research at IGN

- Hardware

- Algorithms

## Matching quality evaluation

W/o dense ground truth, quantitative

1. With many ground GPS points :
  
  
  
  
  
  
  
  
  
  
2. With stereo restitution :

# Matching quality evaluation

W/o dense ground truth, quantitative

1. With many ground GPS points :
  - + bias in Z-coordinate due to orientation
  - + - random noise
    - generalization and misalignment
    - access difficulty (e.g., trees, buildings)
2. With stereo restitution :
  - + any identifiable points can serve control
  - + no need for field measurements, complementary control
  - + bias in XYZ-coordinate
  - + - random noise
    - need to dispose of good orientations
    - manual labour



# Matching quality evaluation

## Bilans

| Error type     | CP | GPS point | Reconstructed 3D | Shaded/Correl map |
|----------------|----|-----------|------------------|-------------------|
| Bias in X, Y   | ✓  |           |                  |                   |
| Bias in Z      | ✓  | ✓         |                  |                   |
| Random noise   |    | ✓         | ✓                | ✓                 |
| Generalization |    |           | ✓                | ✓                 |
| Misalignment   |    |           | ✓                | ✓                 |

Table: Error detectability.

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# UAV-related research at IGN Hardware

## CamLIGHT:

- ▶ HR resolution
- ▶ global shutter
- ▶ weight  $\approx 300\text{g}$   
(lens dependent)
- ▶ metric camera
- ▶ operational in  
multi-sensor modes



### CamLIGHT:

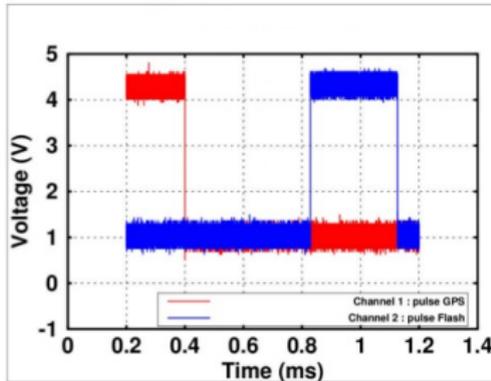
- ▶ HR resolution
- ▶ global shutter
- ▶ weight  $\approx$  300g  
(lens dependent)
- ▶ metric camera
- ▶ operational in  
multi-sensor modes
- ▶ equipped with GPS  
ublox module
- ▶ accurate  
synchronisation



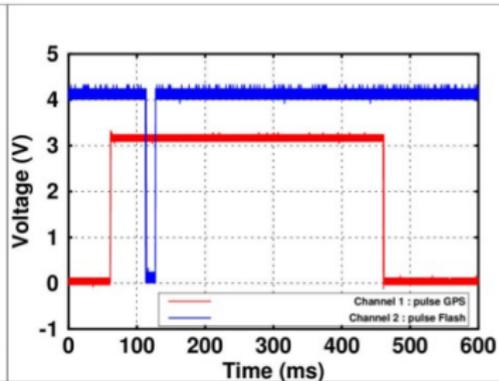
# UAV-related research at IGN Hardware

Time synchronization of sensors : **Amplitude**

### IGN CamLight



### SONY RX1



## UAV-photogrammetry pipeline

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## Selected contributions:

- ▶ Lever arm modelling, [1]
- ▶ Thermal effect modelling, [2]
- ▶ New camera models, [3]
- ▶ New tie-points computation, [4]

# UAV-related research at IGN Algorithms

## Lever arm modelling, [1]

- ▶ self-calibration method
- ▶ GCPs indispensable
- ▶  $\approx 1\text{cm}$  accuracy with 1GCP, evaluation on many CPs



**Table 1**  
Residuals on check points depending on processing strategies.

|       | Estimated parameters |                  |               |                 | MAE <sup>a</sup> (cm/px) | s <sup>b</sup> (cm) |
|-------|----------------------|------------------|---------------|-----------------|--------------------------|---------------------|
|       | Relative poses       | Absolute centers | Lever-arm     | Camera model    |                          |                     |
| $s_1$ | (Section 4.1)        | (Section 4.2)    | (Section 4.4) | (Section 4.1)   | 2.4/2.0                  | 0.8                 |
| $s_2$ |                      | Tightly coupled  | –             | –               | 0.8/0.7                  | 0.8                 |
| $s_3$ |                      | Tightly coupled  | –             | –               | 0.8/0.7                  | 0.8                 |
| $s_4$ |                      | Tightly coupled  | –             | Tightly coupled | 0.8/0.7                  | 0.7                 |
| $s_5$ |                      | Tightly coupled  | –             | Tightly coupled | 0.8/0.7                  | 0.8                 |

<sup>a</sup> Mean Absolute Error.

<sup>b</sup> Standard Deviation.

## Thermal deformation modelling, [2]

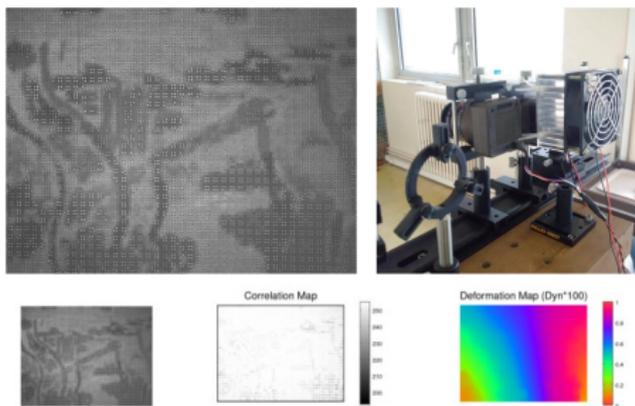


Figure: The experiment. Top: calibration field, the camera and the heater.  
Bottom: inter-epoch correlation and deformation maps.

## Thermal deformation modelling, [2]

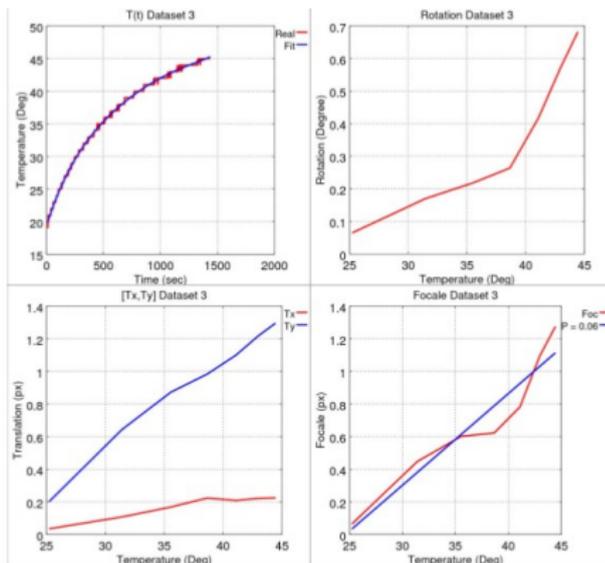


Figure: Temperature ranges and the deformations decomposed into: rotation, translation and focal length variation.

## Thermal deformation modelling, [2]

| Nom Point           | Images Brutes | Images Corrigées | Ratio C/R |
|---------------------|---------------|------------------|-----------|
| $Pt_1$ (mm)         | 5.3           | 0.2              | 24        |
| $Pt_2$ (mm)         | 5.2           | 0.9              | 5         |
| $Pt_3$ (mm)         | 5.4           | 0.7              | 7         |
| $Pt_4$ (mm)         | 4.4           | 1.9              | 2         |
| $Pt_5$ (mm)         | 5.9           | 1.6              | 3         |
| $Pt_6$ (mm)         | 4.6           | 1.1              | 4         |
| $Pt_7$ (mm)         | 5.2           | 0.1              | 390       |
| $Pt_8$ (mm)         | 5.6           | 0.1              | 82        |
| $Pt_9$ (mm)         | 5.0           | 0.6              | 7         |
| $Pt_{10}$ (mm)      | 5.5           | 0.1              | 36        |
| <b>Moyenne (mm)</b> | <b>5.2</b>    | <b>0.7</b>       | <b>7</b>  |

Figure: Residuals on CPs without and with the thermal correction.

## New camera models, [3]

- finer precision camera modelling

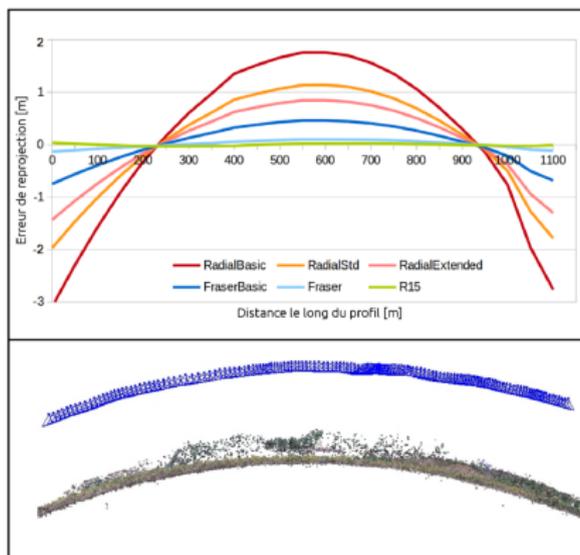
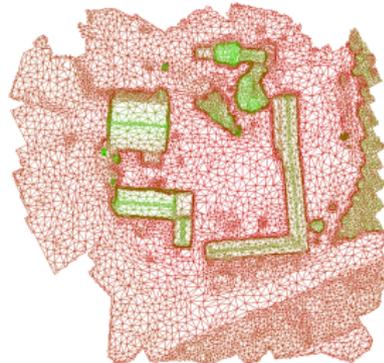
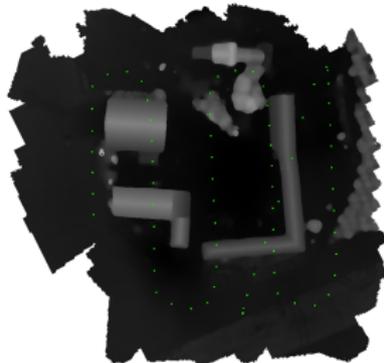


Figure: The *bending effect* with different camera models.

## Tie points computation, [4]

- ▶ more precise image measurements
- ▶ high manifold
- ▶ more homogeneous distribution

2<sup>nd</sup> iteration photogrammetry : use a rough 3D model to guide the detection of new, better tie-points.



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## Tie points computation, [4]

- ▶ more precise image measurements
- ▶ high manifold
- ▶ more homogeneous distribution

2<sup>nd</sup> iteration photogrammetry : use a rough 3D model to guide the detection of new, better tie-points.

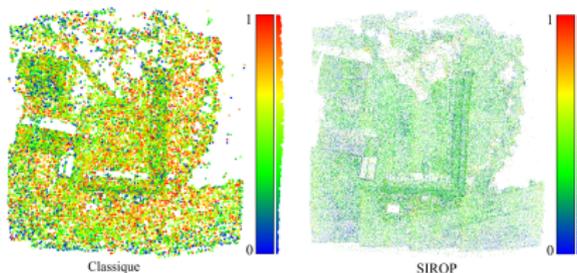
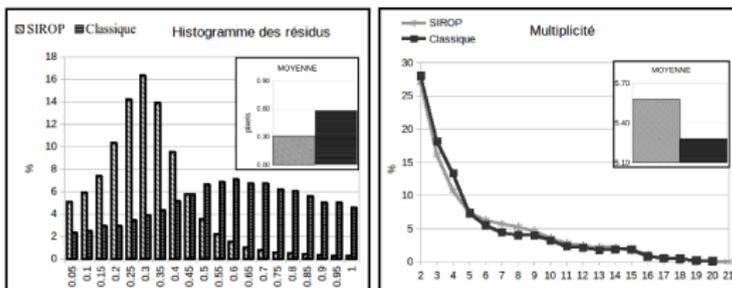


Figure: Tie-points color-coded with residuals. Left: SIFT, right: new tie-points.

## Tie points computation, [4]

- ▶ more precise image measurements
- ▶ high manifold
- ▶ more homogeneous distribution

2<sup>nd</sup> iteration photogrammetry : use a rough 3D model to guide the detection of new, better tie-points.



IGN Figure: Left: histogram of residuals for SIFT and new tie-points; right: respective points multiplicities.

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## BIENVENUE SUR LE SITE OFFICIEL DE LA CONFÉRENCE CFPT 2019



~~Du 27 au 29 août 2019~~, la SFPT (Société Française de Photogrammétrie et de Télédétection) organise sur le campus de l'INSA à Rouen (76) sa conférence annuelle.

Nous chercherons à faire un état des lieux des recherches récentes en reconnaissance des formes et perception / vision par ordinateur, métrologie, photogrammétrie et télédétection. Ces recherches peuvent être de natures diverses: méthodologiques, théoriques ou expérimentales, développement d'algorithmes, conception d'outils, de systèmes ou d'applications.

Le mardi 27 août sera consacré à des tutoriaux. La conférence se tiendra les 28 et 29 août.

## DATES IMPORTANTES

- **Soumission des papiers longs**: 19 avril
- **Soumission des papiers courts**: 13 mai

## APPEL AUX TUTORIAUX

Des tutoriaux seront organisés le 27 août. Les propositions sous forme de cours ou de manipulation de logiciels (1/2 ou 1 journée entière) sont à soumettre à [ewelina.rupnik@ign.fr](mailto:ewelina.rupnik@ign.fr) avant le **6 mai 2019**.

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Thank you for your  
attention!

E Rupnik, M Pierrot Deseilligny

