

MSC GEODETIC ENGINEERING

MSR-02: ADVANCED TECHNIQUES FOR MOBILE SENSING AND ROBOTICS (GEODESY TRACK)

03: SYSTEM CALIBRATION

DR. LASSE KLINGBEIL

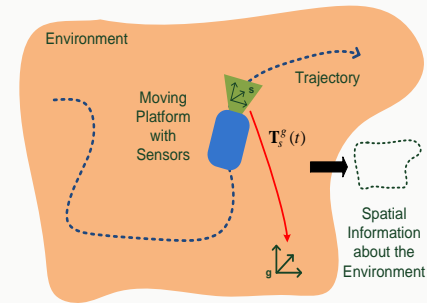
INSTITUTE FOR GEODESY AND GEOINFORMATION
UNIVERSITY OF BONN



ADVANCED TECHNIQUES FOR MOBILE SENSING AND ROBOTICS – LECTURE CONTENT

- (1) Mobile Laser Scanning
- (2) Trajectory Estimation
- (3) System Calibration**
- (4) Sensor Synchronisation
- (5) From Images to Point Clouds (SfM)
- (6) Accuracy of Point Clouds I
- (7) Accuracy of Point Clouds II
- (8) Deformation Analysis with Point Clouds I
- (9) Deformation Analysis with Point Clouds II

CHAPTER 1: MOBILE LASER SCANNING



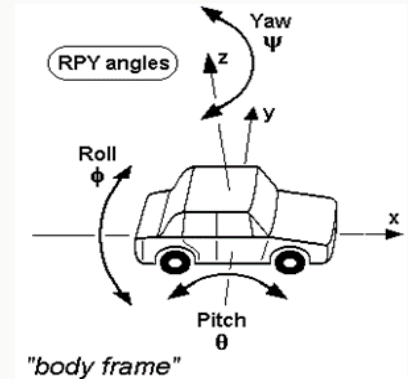
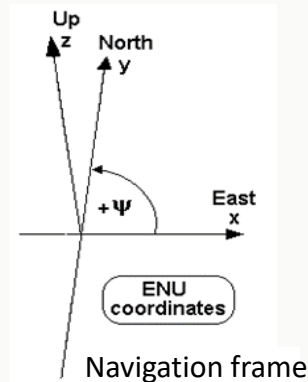
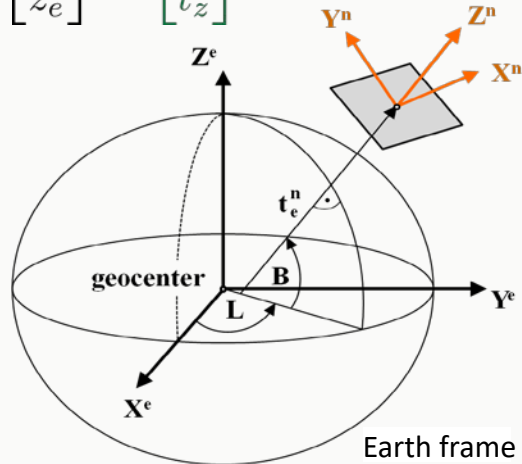
$$\mathbf{p}_{object}^{global}(t_s) = \mathbf{T}_{body}^{global}(t_s) \cdot \mathbf{T}_{sensor}^{body} \cdot \mathbf{p}_{object}^{sensor}(t_s)$$

- Review of involved **coordinate systems /frames**
- Derivation of detailed **georeferencing equation** for the example of **mobile laser scanning**

$$\begin{bmatrix} x_e \\ y_e \\ z_e \end{bmatrix} = \begin{bmatrix} t_x \\ t_y \\ t_z \end{bmatrix} + \mathbf{R}_n^e(L, B) \mathbf{R}_b^n(\phi, \theta, \psi) \cdot \begin{bmatrix} \Delta x \\ \Delta y \\ \Delta z \end{bmatrix} + \mathbf{R}_s^b(\alpha, \beta, \gamma) \cdot \begin{bmatrix} 0 \\ d \cdot \sin b \\ d \cdot \cos b \end{bmatrix}$$

CHAPTER 2: TRAJECTORY PARAMETERS

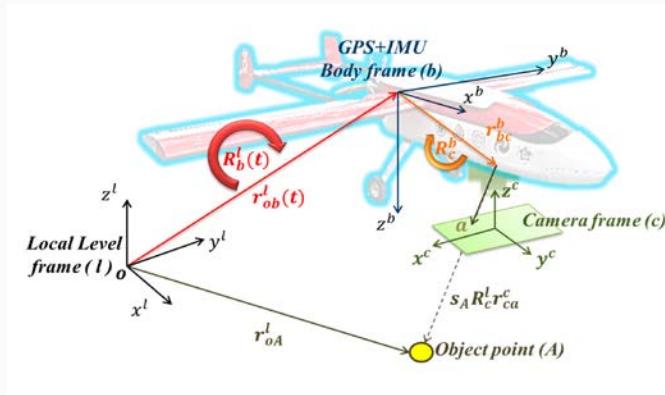
$$\begin{bmatrix} x_e \\ y_e \\ z_e \end{bmatrix} = \begin{bmatrix} t_x \\ t_y \\ t_z \end{bmatrix} + \mathbf{R}_n^e(L, B) \mathbf{R}_b^n(\phi, \theta, \psi) \cdot \begin{bmatrix} \Delta x \\ \Delta y \\ \Delta z \end{bmatrix} + \mathbf{R}_s^b(\alpha, \beta, \gamma) \cdot \begin{bmatrix} 0 \\ d \cdot \sin b \\ d \cdot \cos b \end{bmatrix}$$



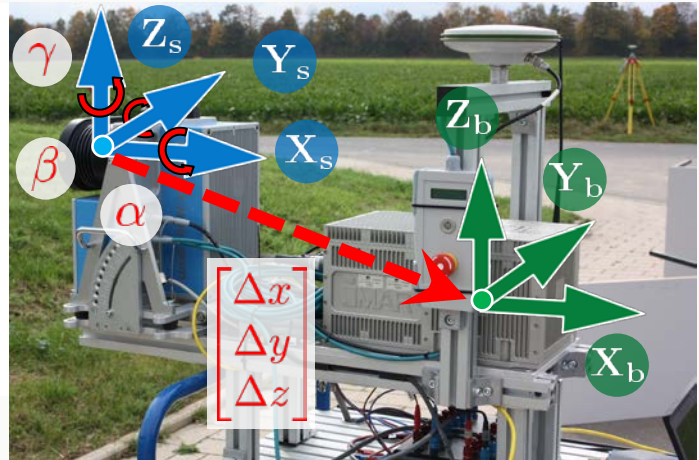
- Review of inertial navigation, strapdown integration and Kalman Filtering
- Introduced **Kalman Smoothing**
- Evaluation of **trajectory estimation**

CHAPTER 3: SYSTEM CALIBRATION

$$\begin{bmatrix} x_e \\ y_e \\ z_e \end{bmatrix} = \begin{bmatrix} t_x \\ t_y \\ t_z \end{bmatrix} + \mathbf{R}_n^e(L, B) \mathbf{R}_b^n(\phi, \theta, \psi) \cdot \begin{bmatrix} \Delta x \\ \Delta y \\ \Delta z \end{bmatrix} + \mathbf{R}_s^b(\alpha, \beta, \gamma) \cdot \begin{bmatrix} 0 \\ d \cdot \sin b \\ d \cdot \cos b \end{bmatrix}$$



From: Chiang, K.-W.; Tsai, M.-L.; Naser, E.-S.; Habib, A.; Chu, C.-H. New Calibration Method Using Low Cost MEM IMUs to Verify the Performance of UAV-Borne MMS Payloads. Sensors 2015, 15, 6560-6585.



- Overview of **system calibration** methods
- Detailed derivation of **plane based calibration**

CALIBRATION

FORMAL DEFINITION

Indication: quantity value provided by a measuring instrument or a measuring system

Operation that, under specified conditions, in a first step, establishes a **relation between the quantity values** with measurement uncertainties provided by measurement standards **and corresponding indications** with associated measurement uncertainties (of the calibrated instrument or secondary standard) and, in a second step, uses this information to establish **a relation for obtaining a measurement result from an indication**

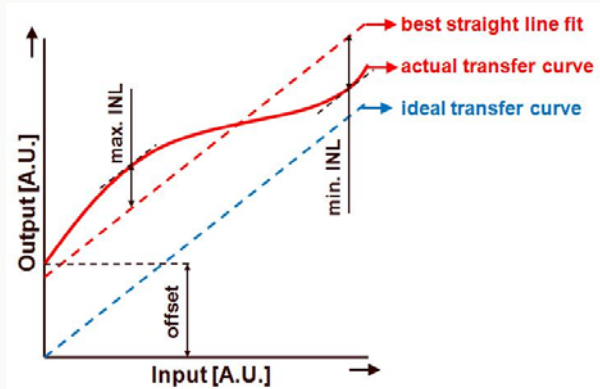
International Vocabulary of Metrology – Basic and General Concepts and Associated Terms (VIM 3rd edition)

<https://jcgm.bipm.org/vim/en/index.html>

CALIBRATION

WHAT DO WE USUALLY MEAN BY CALIBRATION

- Derive necessary parameters to receive useful information from a measurement system
- Procedure to minimize systematic errors in a measurement system



Calibration parameters:

- Constants
- Parameters of functional relationships
- Look up tables

CALIBRATION EXAMPLES

INERTIAL SENSORS

noise
↓

$$a_{P,k} = \mathbf{MS}(a_{S,k} - b_a) + \epsilon$$

True value

Temperature
↓

Sensor readings

Offset/Bias

$$\mathbf{M} = \begin{pmatrix} 1 & -\alpha_{yz} & \alpha_{zy} \\ 0 & 1 & -\alpha_{zx} \\ 0 & 0 & 1 \end{pmatrix}$$

Axis Misalignment

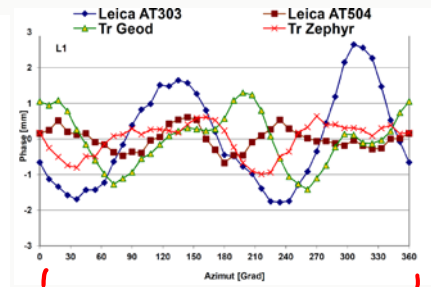
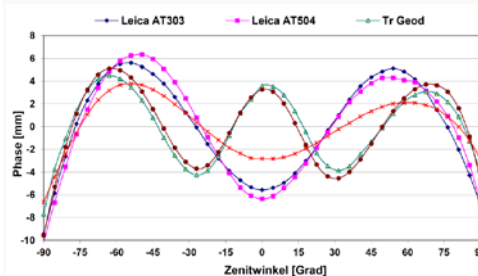
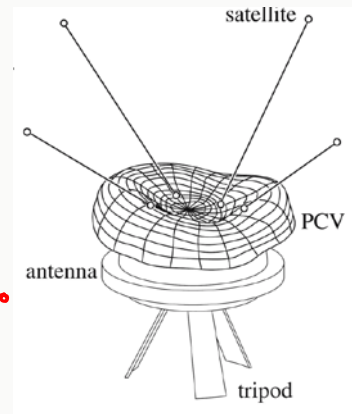
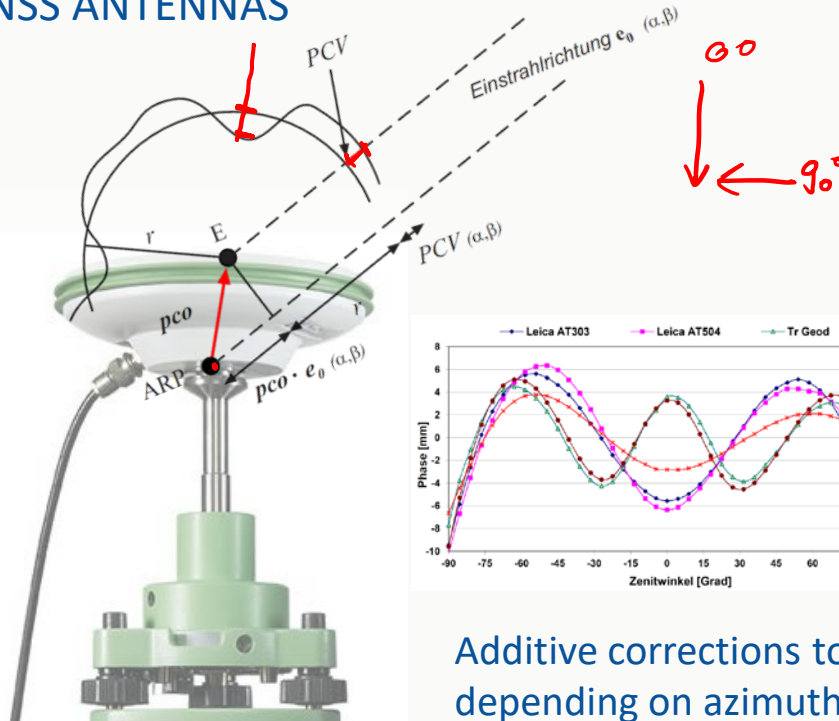
$$\mathbf{S} = \begin{pmatrix} s_{xx} & 0 & 0 \\ 0 & s_{yy} & 0 \\ 0 & 0 & s_{zz} \end{pmatrix}$$

Scale factors

Parameters can be also „calibrated over temperature“

CALIBRATION EXAMPLES

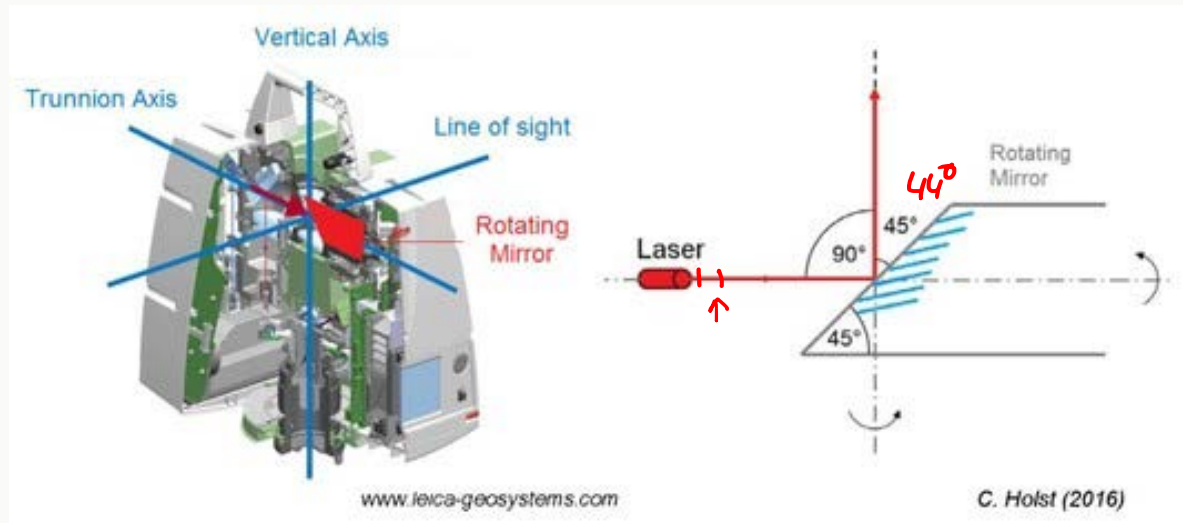
GNSS ANTENNAS



Additive corrections to phase observations depending on azimuth and zenith angles of the satellites

CALIBRATION EXAMPLES

LASER SCANNER



- Determination of misalignments between various internal components
- distance measurement offsets of laser
- ...

CALIBRATION EXAMPLES

CAMERA CALIBRATION

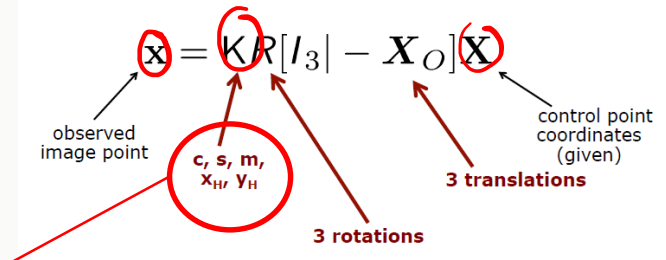
- See camera calibration lecture by C. Stachniss in this course



Zhang, A Flexible New Technique for Camera Calibration, MSR-TR-98-71

Direct Linear Transform (Recap)

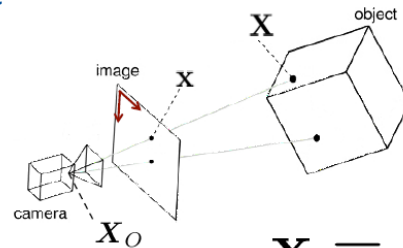
Compute the **11 intrinsic and extrinsic parameters**



Intrinsic camera parameters

- principal point
- camera constant
- scale
- sheer

Slides by Cyrill Stachniss



$$\mathbf{x} = \mathbf{P}\mathbf{X}$$

CALIBRATION

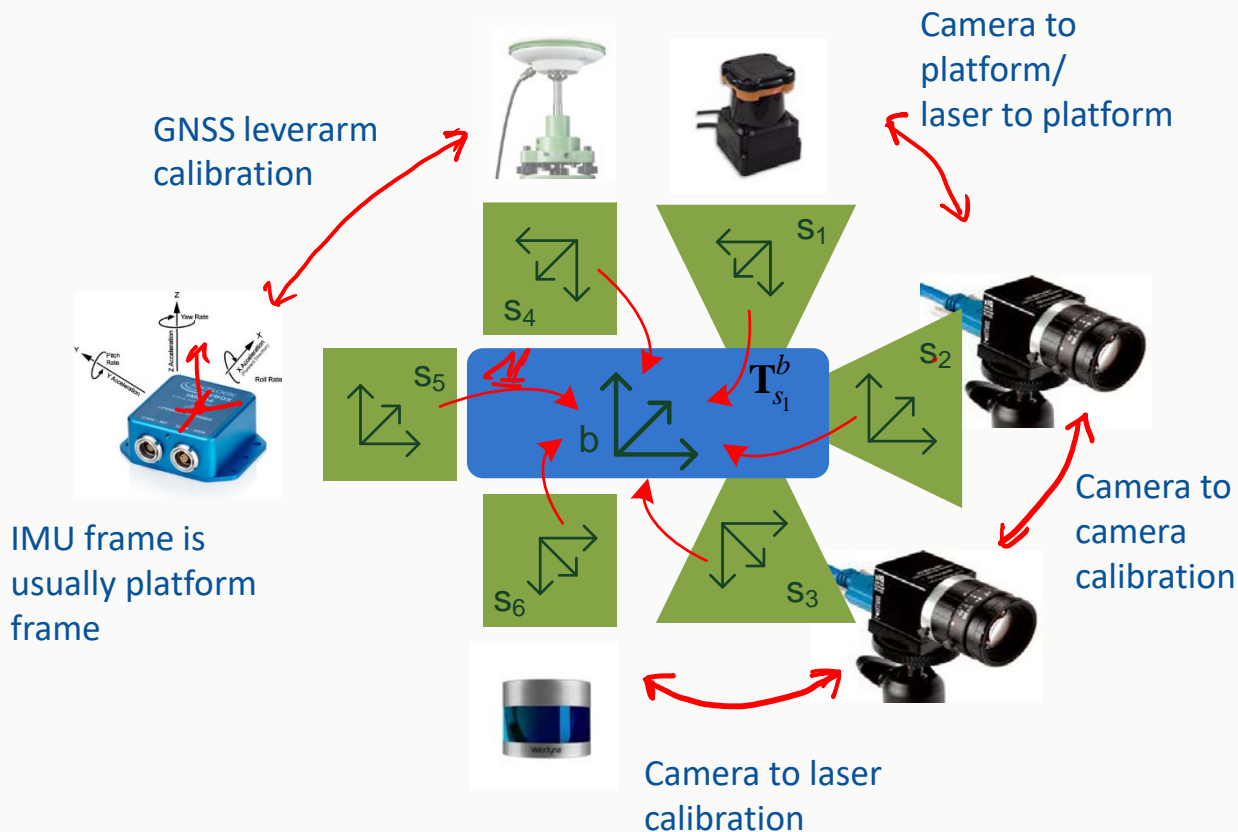
- Examples so far:
Individual **calibration of single sensors** or sensor groups
(Inertial sensors, scanner, camera, GNSS antenna, ...)

→ **Component calibration**
- Also necessary in complex multi-sensor systems:
Calibration of **geometric relationships** between the sensors

→ **System Calibration**
- Establishing a **temporal relationship** between sensor reading
can also be considered as a calibration procedure

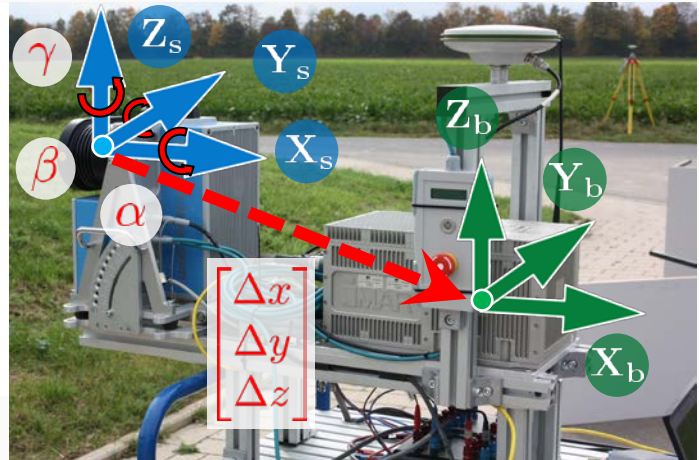
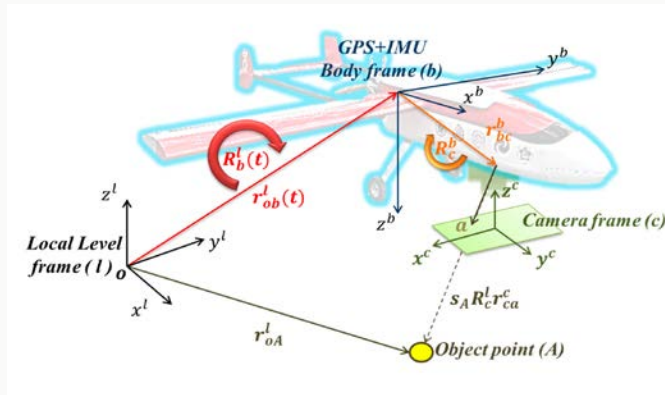
→ **Sensor synchronization (next lecture)**

SYSTEM CALIBRATION



CHAPTER 3: SYSTEM CALIBRATION

$$\begin{bmatrix} x_e \\ y_e \\ z_e \end{bmatrix} = \begin{bmatrix} t_x \\ t_y \\ t_z \end{bmatrix} + \mathbf{R}_n^e(L, B) \mathbf{R}_b^n(\phi, \theta, \psi) \cdot \begin{bmatrix} \Delta x \\ \Delta y \\ \Delta z \end{bmatrix} + \mathbf{R}_s^b(\alpha, \beta, \gamma) \cdot \begin{bmatrix} 0 \\ d \cdot \sin b \\ d \cdot \cos b \end{bmatrix}$$

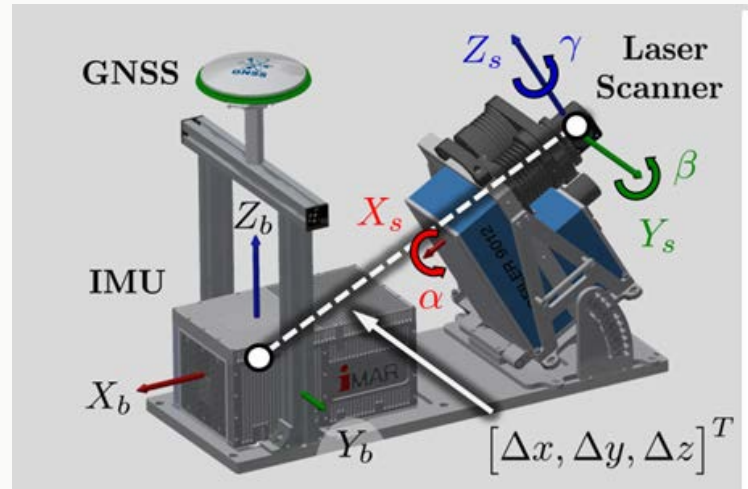
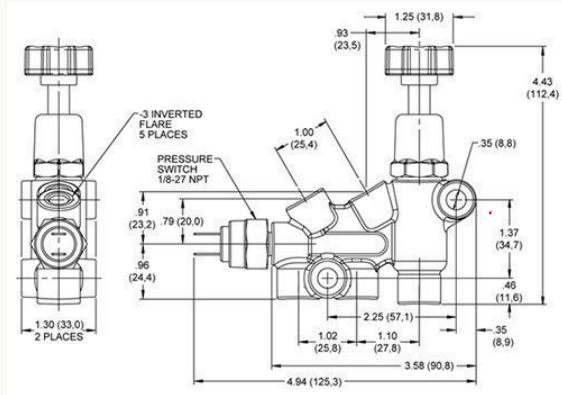


From: Chiang, K.-W.; Tsai, M.-L.; Naser, E.-S.; Habib, A.; Chu, C.-H. New Calibration Method Using Low Cost MEM IMUs to Verify the Performance of UAV-Borne MMS Payloads. Sensors 2015, 15, 6560-6585.

- Overview of **system calibration** methods
- Detailed derivation of **plane based calibration**

SYSTEM CALIBRATION - METHODS

PREVIOUS KNOWLEDGE

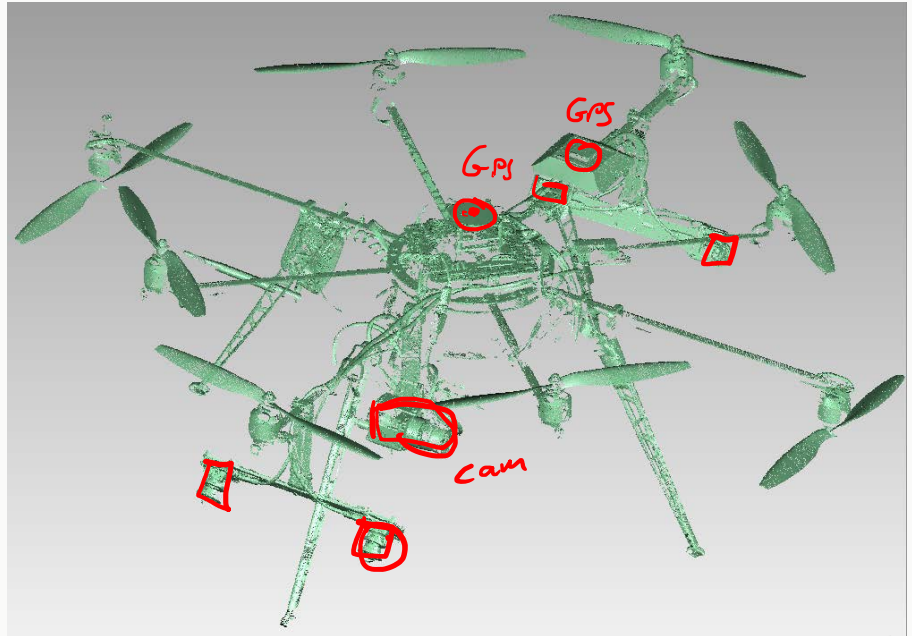


- Data from construction plan
- ➔ Might be wrong, especially for critical parameters such as angles

SYSTEM CALIBRATION - METHODS

DIRECT OBSERVATION

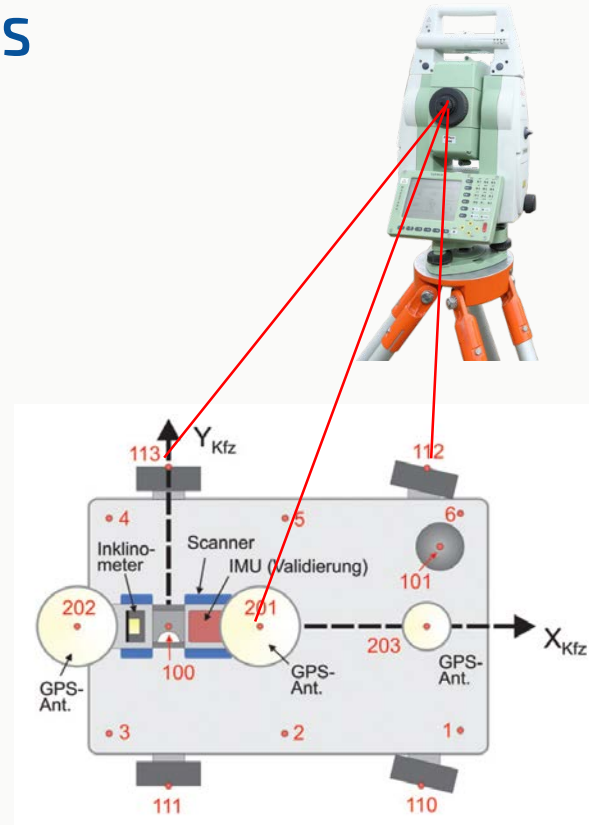
- Example:
Get parameters from accurate laser scan
- Problem:
Most points of interest are not physically visible/available, eg camera focal points
- How to deal with orientations? |



SYSTEM CALIBRATION - METHODS

DIRECT MEASUREMENT

- Example:
Use geodetic measurement equipment and methods to derive parameters
- Accurate but lot of manual work
- Also problems with non physical points of interests and orientations (cameras)

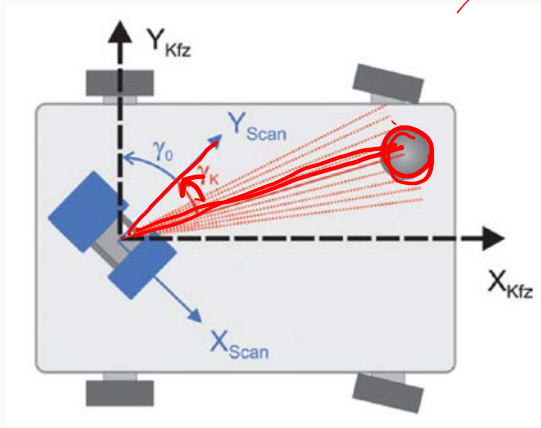


From: Christian Hesse (2007): Hochauflösende kinematische Objekterfassung mit terrestrischen Laserscannern. PhD Thesis. Uni Hannover

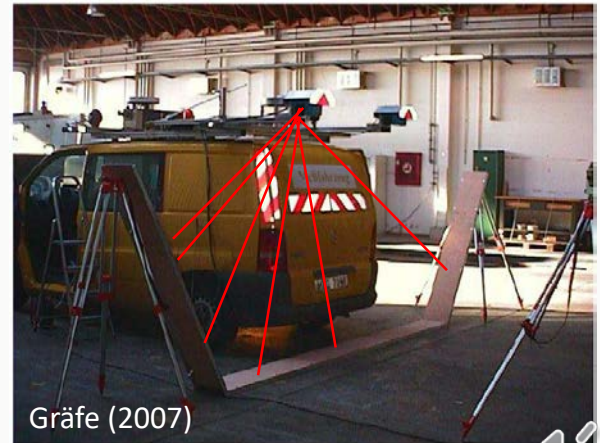
SYSTEM CALIBRATION - METHODS

INDIRECT MEASUREMENTS

- Use the **sensors**, which position/orientation parameters are needed (scanner or cameras), to **observe objects** (e.g. points, planes, spheres) **with known positions/orientations** in the or relative to the **body frame**.



From: Christian Hesse (2007): Hochauflösende kinematische Objekterfassung mit terrestrischen Laserscannern. PhD Thesis. Uni Hannover



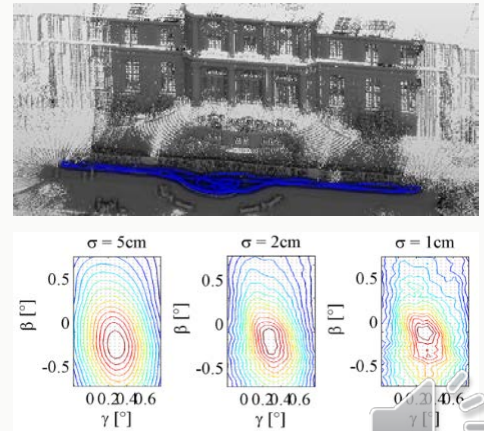
Gräfe (2007)

SYSTEM CALIBRATION - METHODS

ENTROPY BASED METHODS

- Formulate pointcloud as a Gaussian Mixture Model
- Find a measure for the ,quality' or ,compactness' or ,crispness' of the point cloud → Quadratic Renyi Entropy
- Generate a point cloud using the sensor system, trying to see same areas from multiple ,viewing conditions'
- Assume the world not to be ,too noisy'
- Minimize QRE by varying calibration parameters

More details: W. Maddern, A. Harrison, and P. Newman, "Lost in translation (and rotation): Fast extrinsic calibration for 2D and 3D LIDARs," in Proc. IEEE Int. Conf. Robot. Autom., May 2012



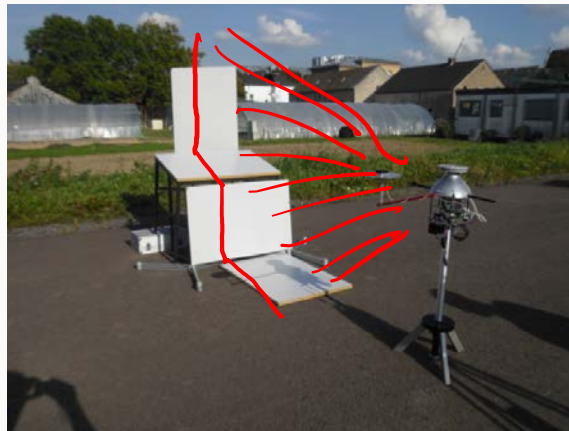
SYSTEM CALIBRATION - METHODS

INDIRECT MEASUREMENTS – PLANE BASED

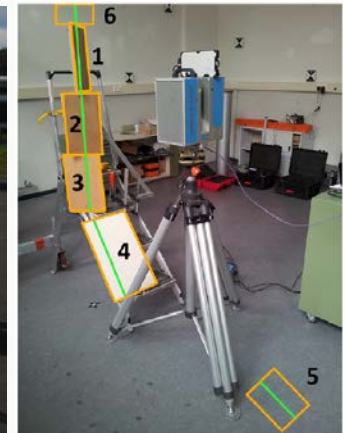
- Use arbitrary or dedicated plane setup together with an adjustment procedure to derive parameters



Dorndorf et al. (2015)



Heinz et al. (2015)



Hartmann et al. (2015)

PLANE BASED CALIBRATION

**LASER TO GNSS/IMU
(= LASER TO BODY)**



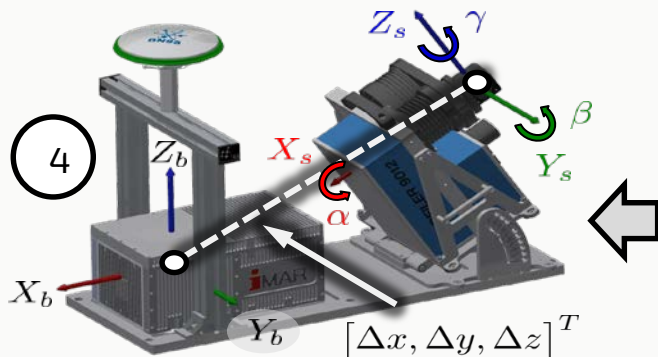
PLANE BASED CALIBRATION FOR MOBILE LASER SCANNING



Setup of planes



Reference scan of planes



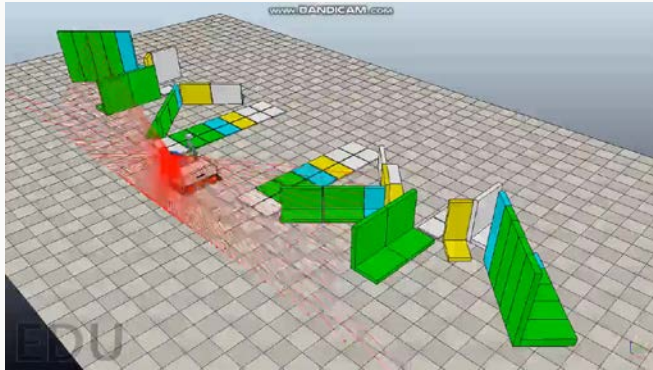
Adjustment to derive parameters



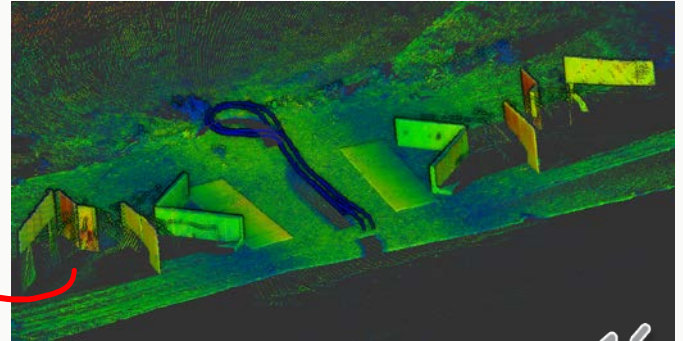
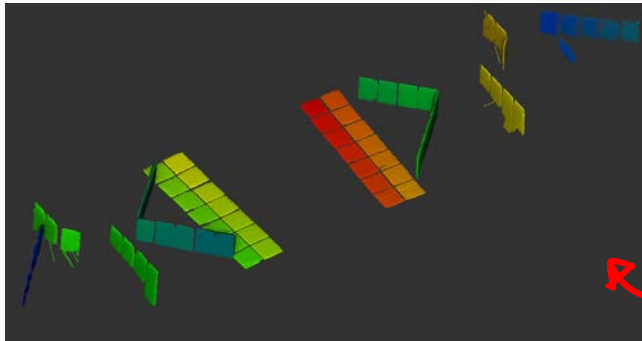
Scan with mobile scanning system



PLANE BASED CALIBRATION – MOBILE SCAN

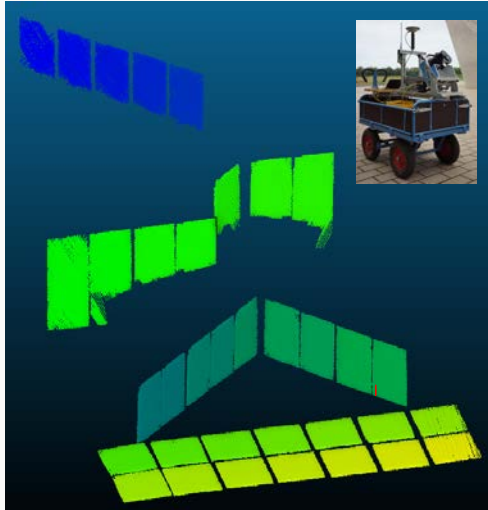


Aufnahme des Kalibrierfeldes mit zwei Durchfahrten (Hin- und Rück, ca 30 Sekunden)

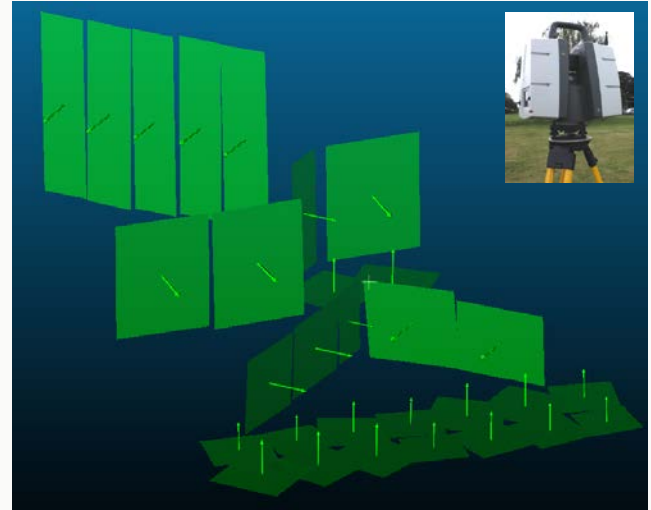


Automatisierte Zuordnung der Scanprofile zu den Referenzebenen (RANSAC)

PLANE BASED CALIBRATION



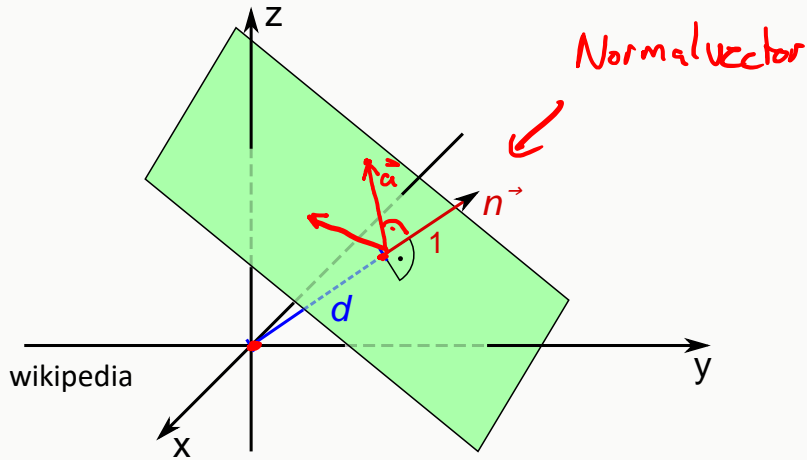
!=



Planes extracted from
mobile scan

Planes measured with static scanner

PLANE BASED CALIBRATION



Scalar product

$$\vec{a} \cdot \vec{n} = 0$$

$$\vec{x} \cdot \vec{n} = d$$

Hesse
normal form

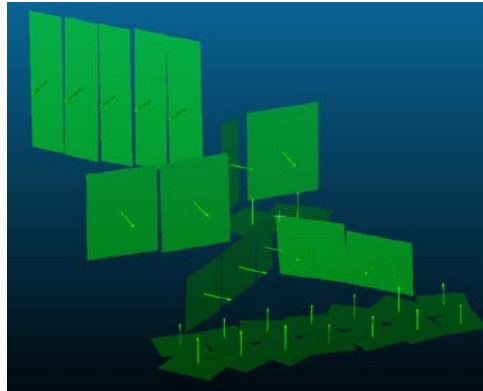
4 plane parameters
 \vec{n}, d

PLANE BASED CALIBRATION

1) ESTIMATE PLANE PARAMETERS FROM TLS SCANS

$$\underbrace{\begin{bmatrix} x_{TLS} \\ y_{TLS} \\ z_{TLS} \end{bmatrix}^T}_{\text{oss.}} \underbrace{\begin{bmatrix} n_x \\ n_y \\ n_z \end{bmatrix}}_{\text{param}} - d_p \stackrel{!}{=} 0$$

observations
parameters



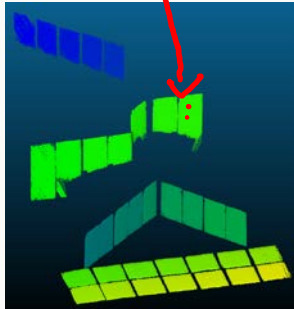
- Implicit functional relationship between parameters and observations

➔ Adjustment via Gauss-Helmert model / Least Squares
to get n, d

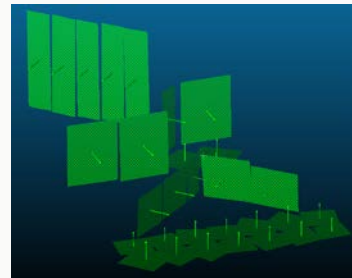
PLANE BASED CALIBRATION

2) MEASURE PLANES WITH MOBILE SYSTEM

$$\begin{bmatrix} x_e \\ y_e \\ z_e \end{bmatrix} = \begin{bmatrix} t_x \\ t_y \\ t_z \end{bmatrix} + \mathbf{R}_n^e(L, B) \mathbf{R}_b^n(\phi, \theta, \psi) \cdot \begin{bmatrix} \Delta x \\ \Delta y \\ \Delta z \end{bmatrix} + \mathbf{R}_s^b(\alpha, \beta, \gamma) \cdot \begin{bmatrix} 0 \\ d \cdot \sin b \\ d \cdot \cos b \end{bmatrix}$$



$$\begin{bmatrix} x_e \\ y_e \\ z_e \end{bmatrix}^T \begin{bmatrix} n_x \\ n_y \\ n_z \end{bmatrix} - d_p \stackrel{!}{=} 0$$



parameters from TLS plane adjustment

PLANE BASED CALIBRATION

3) ESTIMATE CALIBRATION PARAMETERS

$$\begin{bmatrix} x_e \\ y_e \\ z_e \end{bmatrix}^T \begin{bmatrix} n_x \\ n_y \\ n_z \end{bmatrix} - d_p \stackrel{!}{=} 0$$

$$\underbrace{\begin{bmatrix} t_x \\ t_y \\ t_z \end{bmatrix}}_{\substack{\text{observations} \\ \text{parameters}}} + \mathbf{R}_n^e(L, B) \mathbf{R}_b^n(\phi, \theta, \psi) \cdot \underbrace{\left(\begin{bmatrix} \Delta x \\ \Delta y \\ \Delta z \end{bmatrix} + \mathbf{R}_s^b(\alpha, \beta, \gamma) \cdot \begin{bmatrix} 0 \\ d \cdot \sin b \\ d \cdot \cos b \end{bmatrix} \right)}_{\text{TLS plane parameters}} \bigg)^T \begin{bmatrix} n_x \\ n_y \\ n_z \end{bmatrix} - d_p \stackrel{!}{=} 0$$

- Implicit functional relationship between parameters and observations
- ➔ Adjustment via Gauss-Helmert model / Total Least Squares to get Calibration parameters

PLANE BASED CALIBRATION

$$\begin{bmatrix} t_x \\ t_y \\ t_z \end{bmatrix} + \underbrace{\mathbf{R}_n^e(L, B)}_{\text{observations}} \underbrace{\mathbf{R}_b^n(\phi, \theta, \psi)}_{\text{parameters}} \cdot \left(\begin{bmatrix} \Delta x \\ \Delta y \\ \Delta z \end{bmatrix} + \underbrace{\mathbf{R}_s^b(\alpha, \beta, \gamma)}_{\text{unknown parameters}} \cdot \begin{bmatrix} 0 \\ d \cdot \sin b \\ d \cdot \cos b \end{bmatrix} \right)^T \underbrace{\begin{bmatrix} n_x \\ n_y \\ n_z \end{bmatrix}}_{\text{unknown parameters}} - d \stackrel{!}{=} 0$$

- The plane parameters could also be part of the estimated parameter vector
- A dedicated plane setup is not necessary
- **Disadvantage:** general success and accuracy is not guaranteed, some parameters may not be observable

More details in: Jan Skaloud, Derek Lichti. Rigorous approach to bore-sight self-calibration in airborne laser scanning. ISPRS Journal of Photogrammetry and Remote Sensing 61 (2006) 47–59

PLANE BASED CALIBRATION

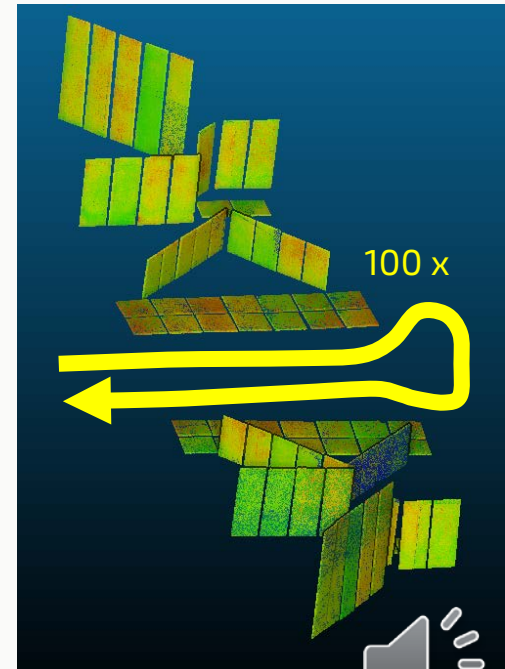
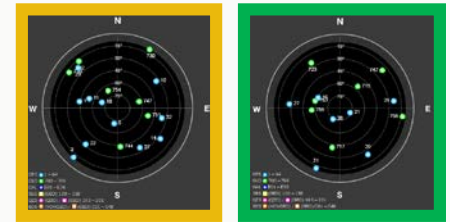
RESULTS

- Single Calibration:
as shown in figure
- 100 single calibration at different days

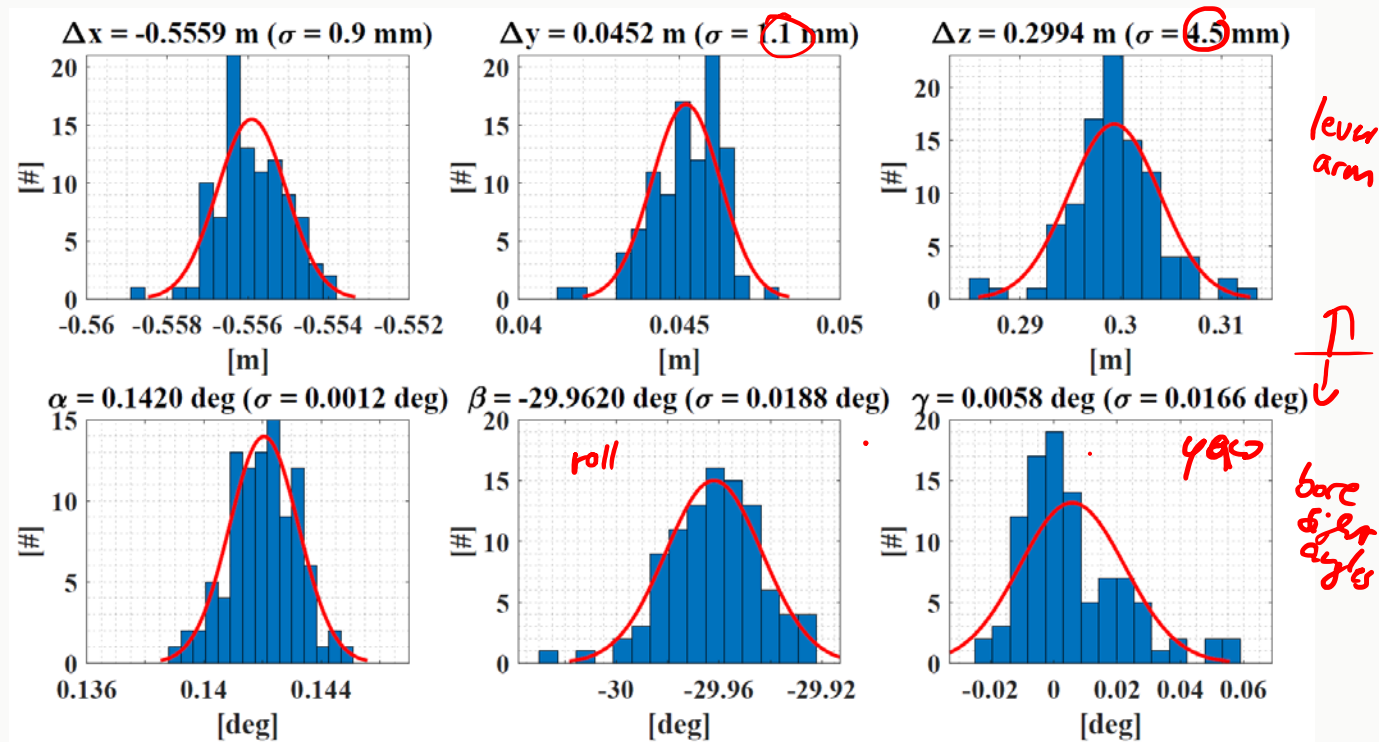
○	31.07.19, 15:40 – 15:55	(# 14)
○	05.08.19, 11:05 – 11:25	(# 22)
○	05.08.19, 12:30 – 12:50	(# 31)
○	05.08.19, 13:45 – 14:10	(# 32)

➔ reduction of systematic offsets
due to GNSS conditions

- 4 reinitializations of the IMU



PLANE BASED CALIBRATION - RESULTS

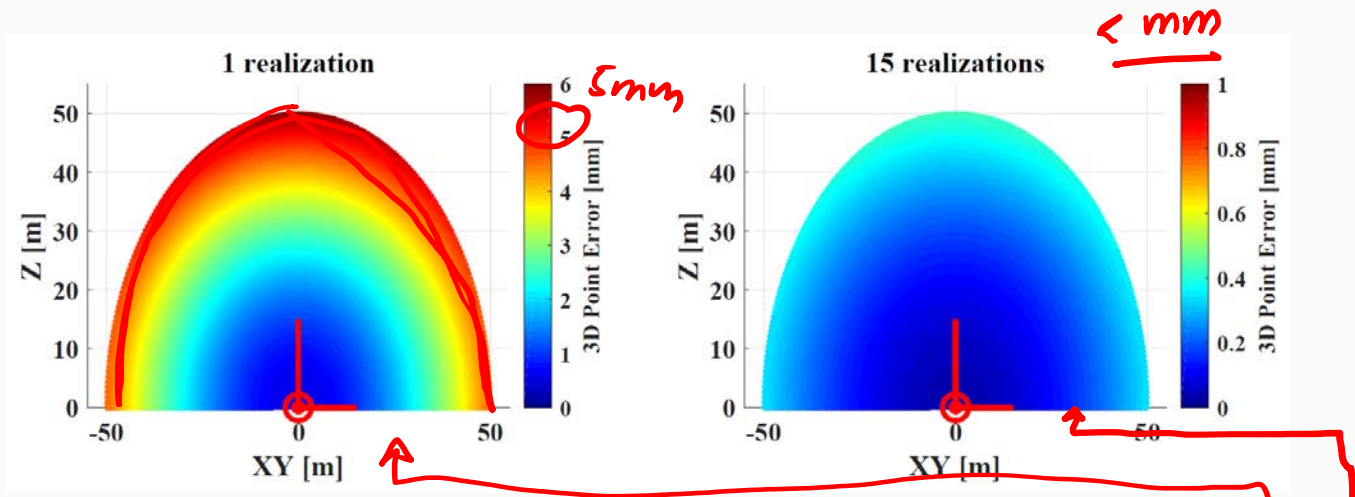


From: Heinz, E.; Holst, C.; Kuhlmann, H. Klingbeil, L. (2020). *Design and Evaluation of a Permanently Installed Plane-Based Calibration Field for Mobile Laser Scanning Systems*, Remote Sensing 2020, 12, 555, <https://doi.org/10.3390/rs12030555>.

IMPACT OF CALIBRATION ERRORS

Additional \rightarrow due to calibration

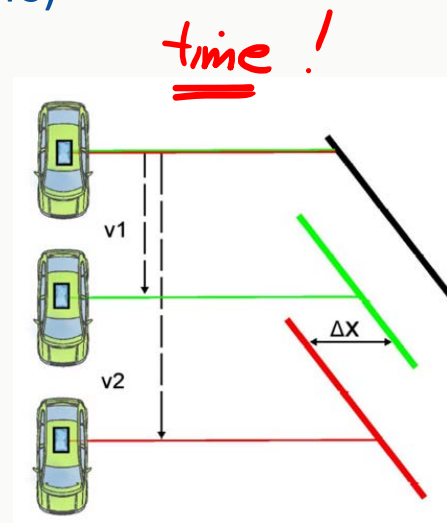
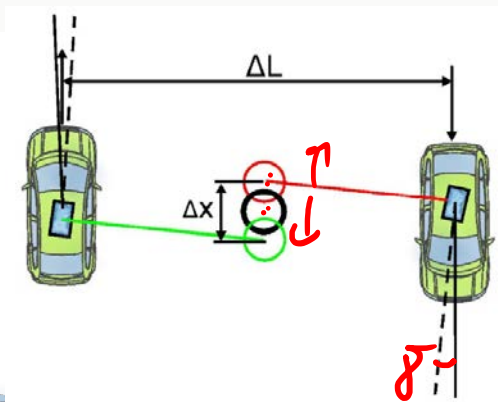
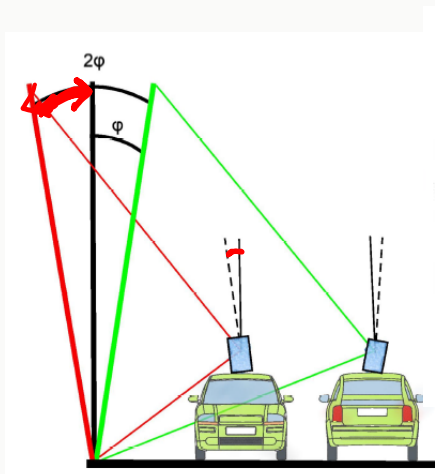
3D POINT ERROR FROM SIMULATED CALIBRATION ERRORS



Parameter	$\sigma_{\Delta x}$	$\sigma_{\Delta y}$	$\sigma_{\Delta z}$	σ_{α}	σ_{β}	σ_{γ}
Target Accuracy	1.0 mm	1.0 mm	1.5 mm	0.0050°	0.0050°	0.0050°
1 Realization	0.9 mm	1.1 mm	4.5 mm	0.0012°	0.0188°	0.0166°
15 Realizations	0.2 mm	0.3 mm	1.2 mm	0.0003°	0.0049°	0.0043°
98 Realizations	0.1 mm	0.1 mm	0.5 mm	0.0001°	0.0019°	0.0017°

IMPACT OF CALIBRATION ERRORS

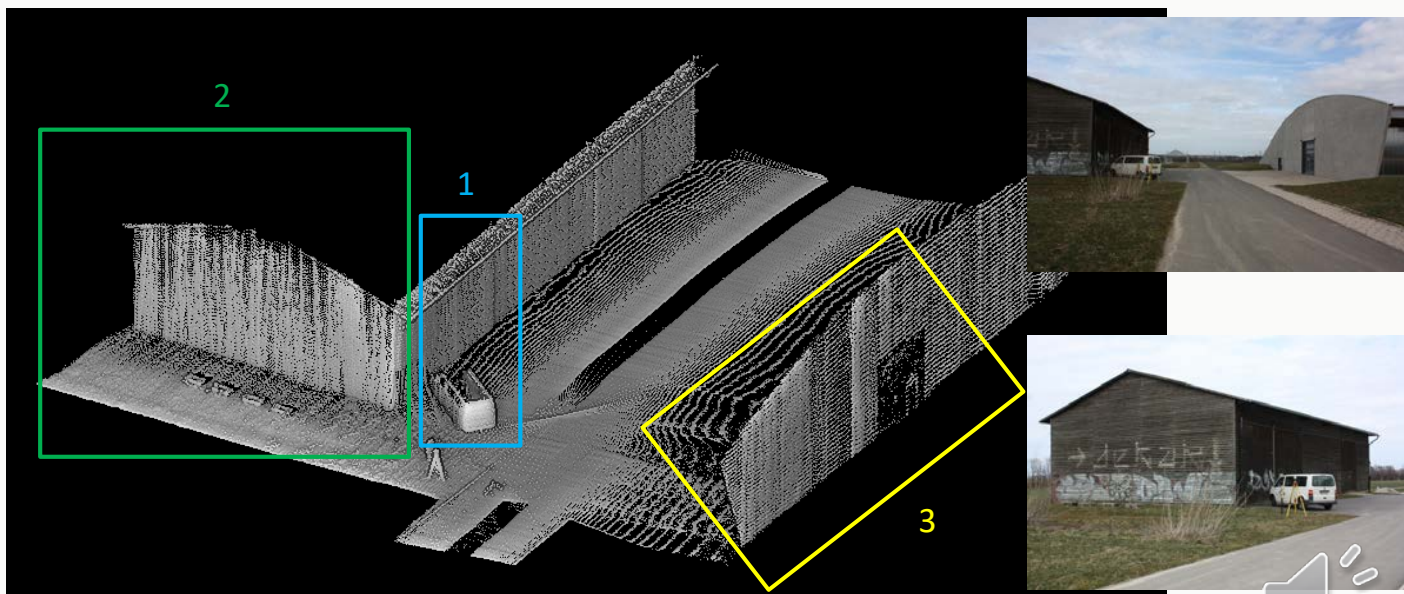
Special driving maneuvers past building facades or artificial reference structures (e.g., planes or cylinders)



From: Keller, F.; Sternberg, H. Multi-Sensor Platform for Indoor Mobile Mapping: System Calibration and Using a Total Station for Indoor Applications. *Remote Sens.* **2013**, 5, 5805-5824.

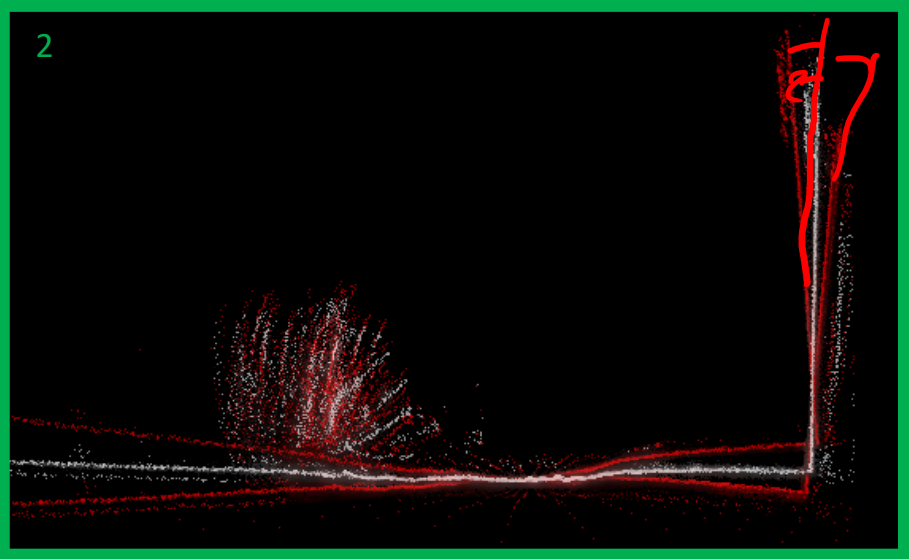
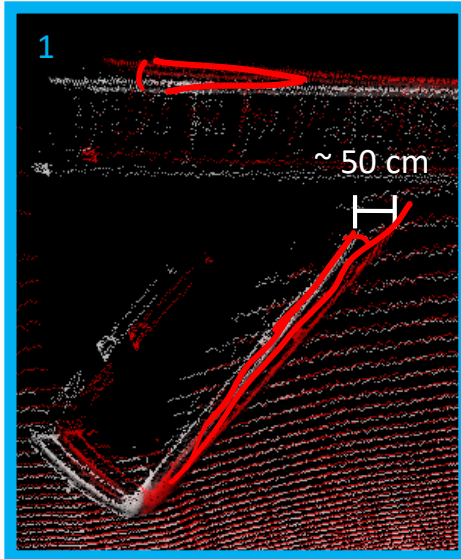
IMPACT OF CALIBRATION ERRORS

Impact of errors in the boresight angles: $\Delta\alpha$, $\Delta\beta$, $\Delta\gamma$



IMPACT OF CALIBRATION ERRORS

white : reference & truth

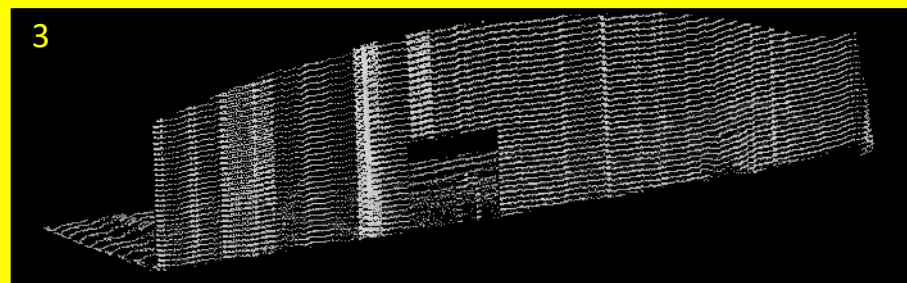


$$\Delta\gamma = 5^\circ \quad s = 5,7 \text{ m} \\ \rightarrow \Delta p = 50 \text{ cm}$$

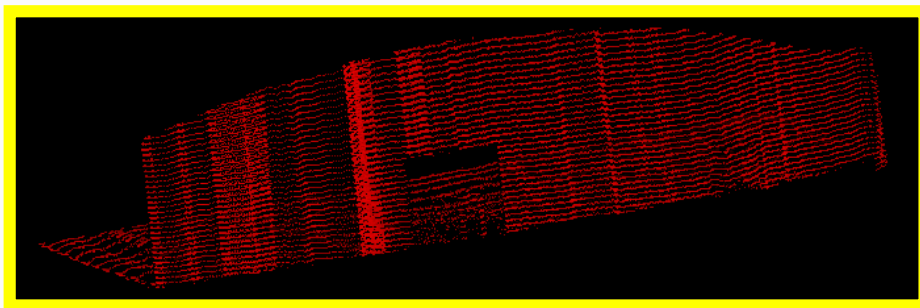
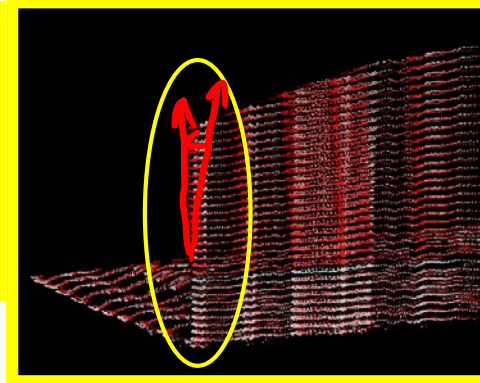
$\Delta\beta = 5^\circ \rightarrow$ Tilting of the facade when scanning in two different directions)

IMPACT OF CALIBRATION ERRORS

3



$\Delta\alpha = 5^\circ \rightarrow$ Shearing of facade



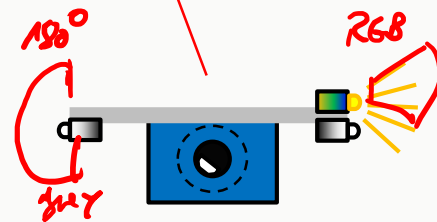
CAMERA TO LASER CALIBRATION



CAMERA TO LASER CALIBRATION



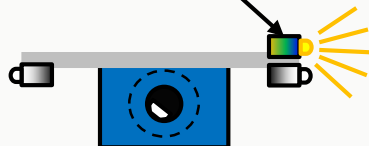
cameras



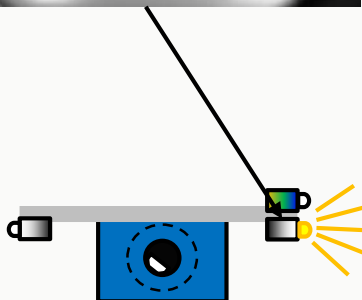
front view

CAMERA TO LASER CALIBRATION

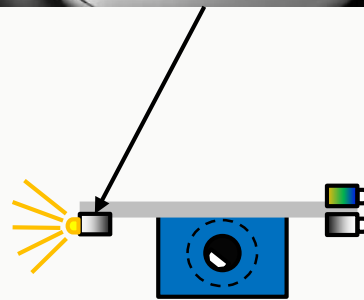
RGB



Monochromatic 1

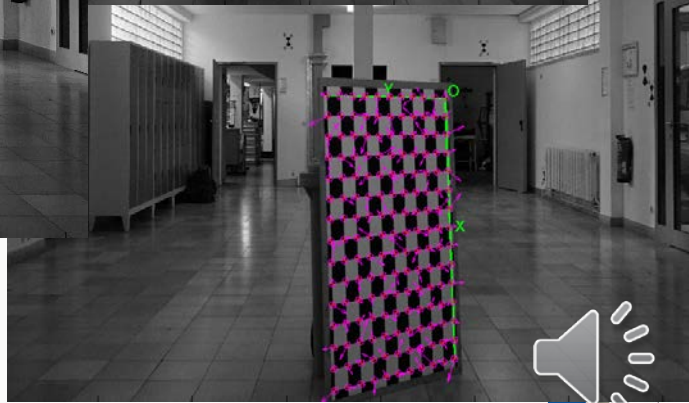


Monochromatic 2



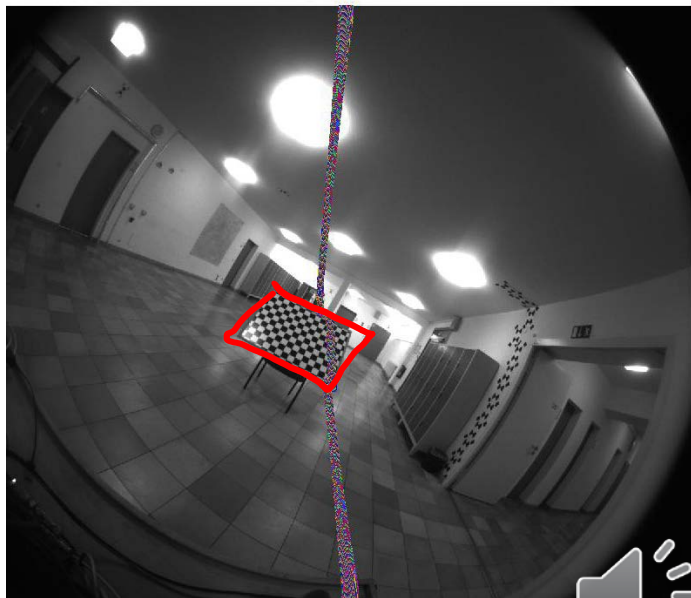
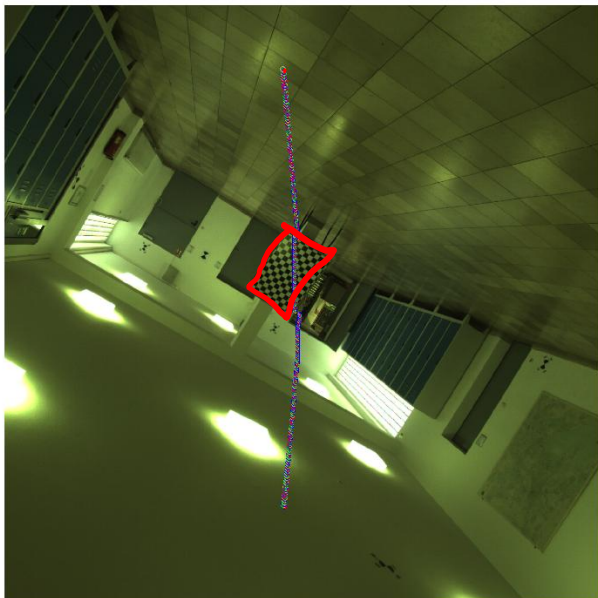
CAMERA TO LASER CALIBRATION

- Use checker board from camera calibration
(Stachniss)



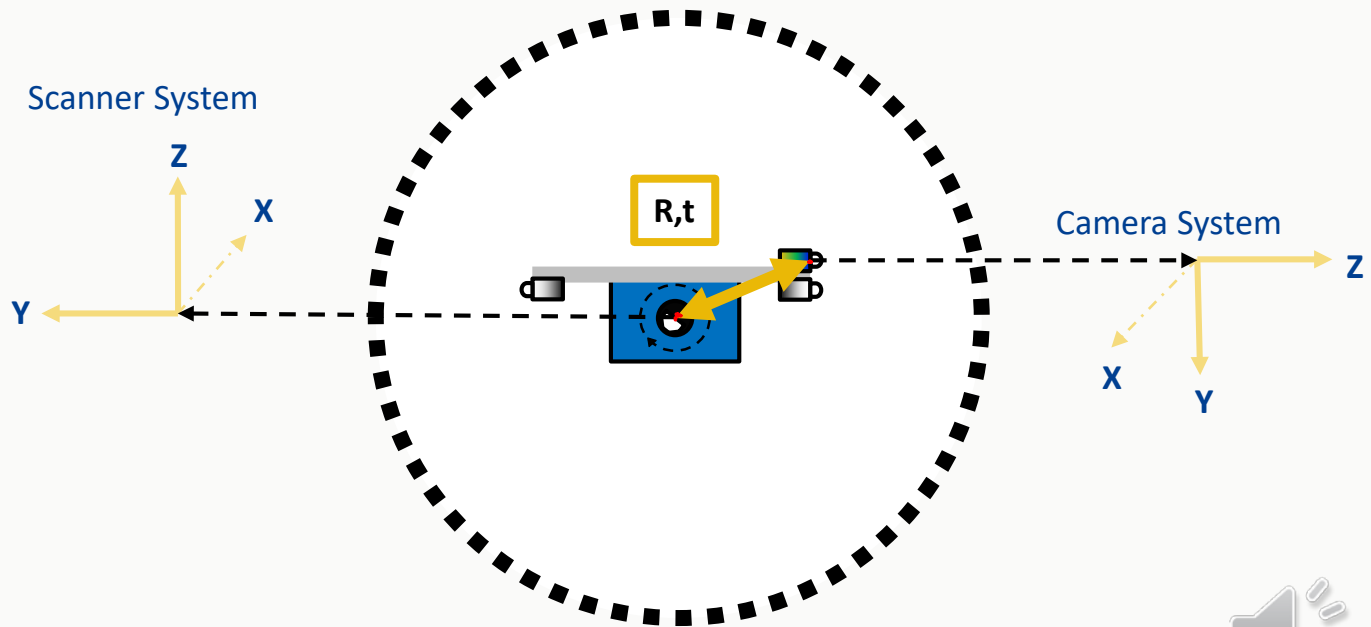
CAMERA TO LASER CALIBRATION

- Find correspondences between laser and profiles and images



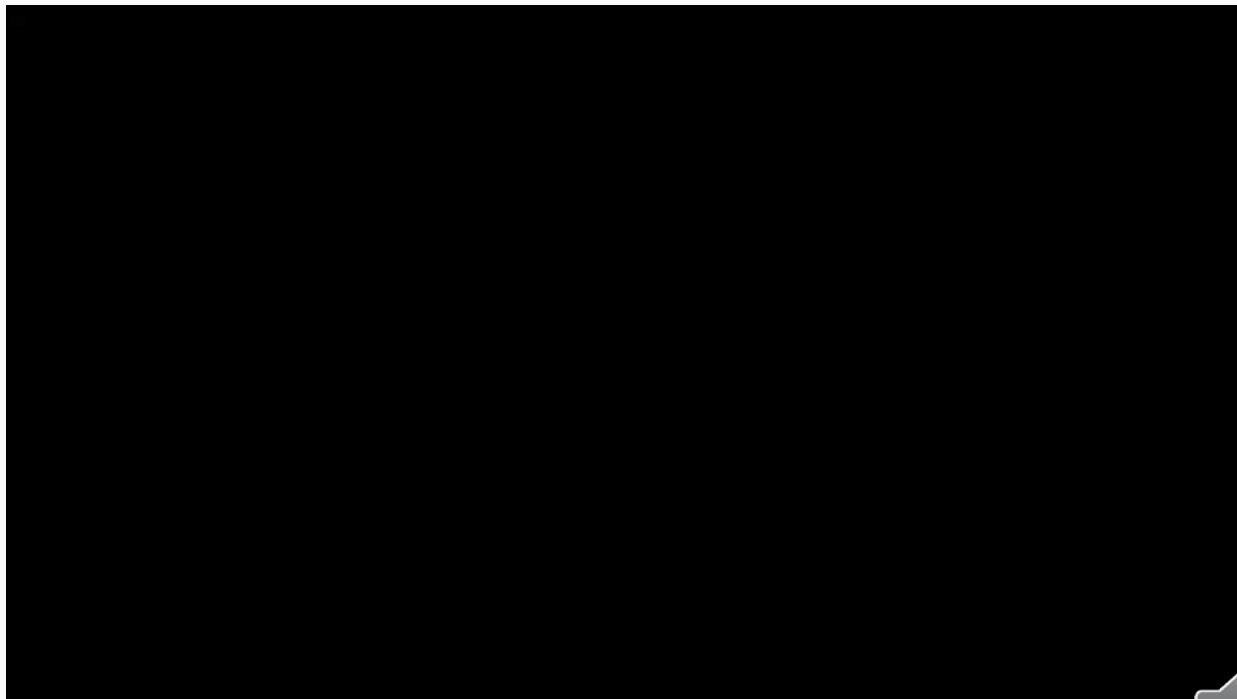
CAMERA TO LASER CALIBRATION

- Compute translation and rotation between both systems by using known point relationships



CAMERA TO LASER CALIBRATION

- Application example: colorize laser point clouds



WHAT YOU HAVE LEARNED TODAY

- What is calibration and why it is necessary?
- What are examples for calibration parameters?
- What are possible methods for system calibration?
- How is one possible procedure for plane based calibration for mobile laser scanning systems?
- What is the impact of calibration errors in mobile laser scanning systems?

THANKS

