

First steps to automation of visual inspection

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Motivation & background

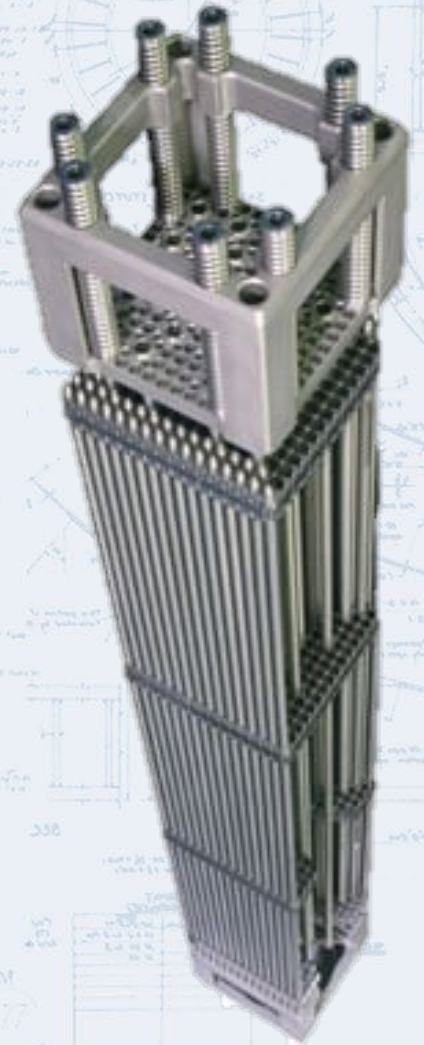
FA length ~ **4 meters**

Features of interest ~ **few millimeters**

Scan length ~ **ten minutes**

Image processing may help with:

- Visualization
- Human readability
- Automation of routine tasks
- Detection of unusual



What is controlled?

- Rod geometry
- Rod surface
- Fuel geometry
- Whatever unusual



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Student involvement

- 2018/19 – Jaroslav Knotek – diploma thesis
- 2019/20 – Jan Palášek – diploma thesis
- 2020/21 – Adam Harmanec – diploma thesis
- 2021-2023 – Tomáš Karella – doctoral activities – ongoing utility model, ongoing patent
- 2021 – Jaroslav Knotek – ongoing PhD. thesis
- 2021/22 – Ondřej Novák – diploma thesis
- 2024 – Vojtěch Bláha – ongoing diploma thesis
- 2024 – Daniil Sultanov – ongoing bachelor thesis

Data from visual inspection

Bigger context is necessary

- Spatial
 - 20 cm above or below
 - Interaction of FAs
- Temporal
 - changes from the previous inspection
- Technical
 - Comparison of same fuel designs

camera screen content



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One Image Overview

- Conversion from time domain into spatial
 - Preserving details
 - 200MB-> 20MB
- Pros
 - Faster zoomable overview
 - Effective comparison
 - Easy reference (annotated images, GUI)

One Image Overview

- Faster and more effective inspection outcomes
- Full context
- Color encoding of surface anomalies
- Geometry from metadata
 - Frame rotation -> fuel bow
 - Position of grids -> carcass growth
- Unlock for other measurements
 - Rod bow measurements
 - Rod growth measurement
 - Statistics above surface corrosion

One Image Overview ... a naïve construction

- Simple stitching
- A cut from each n-th frame
- Issues
 - Camera / FA vibrations during movement
 - Variations in Camera / FA movement speed
 - No valuable metadata
 - Impossible to do photogrammetry

One Image Overview the way to automation



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Upgrade of the scanning process

- Constant speed of the camera/fuel during recording
- One setup of lights for the whole outage
- File naming conventions and folder structure

Data in the same format!

Replicability!

Reproducibility!

OIO construction

1. Compute frame position in OIO – “camera speed”
2. Compensate camera tilt and vibrations
3. Rectify lens distortion
4. Register frames
5. Merge images

OIO - Camera speed estimation

$$\Delta = \max_{\Delta \in \langle a, b \rangle} \sum_x \sum_y F_i(x, y + \Delta) * F_{i+k}(x, h + y) \text{ px}$$

$$v = \frac{h + \Delta}{\frac{k}{\text{fps}}} \text{ px/s}$$



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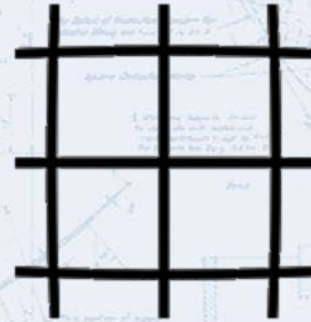
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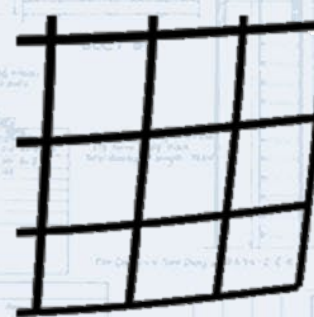
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OIO – lens distortion handling



vs.



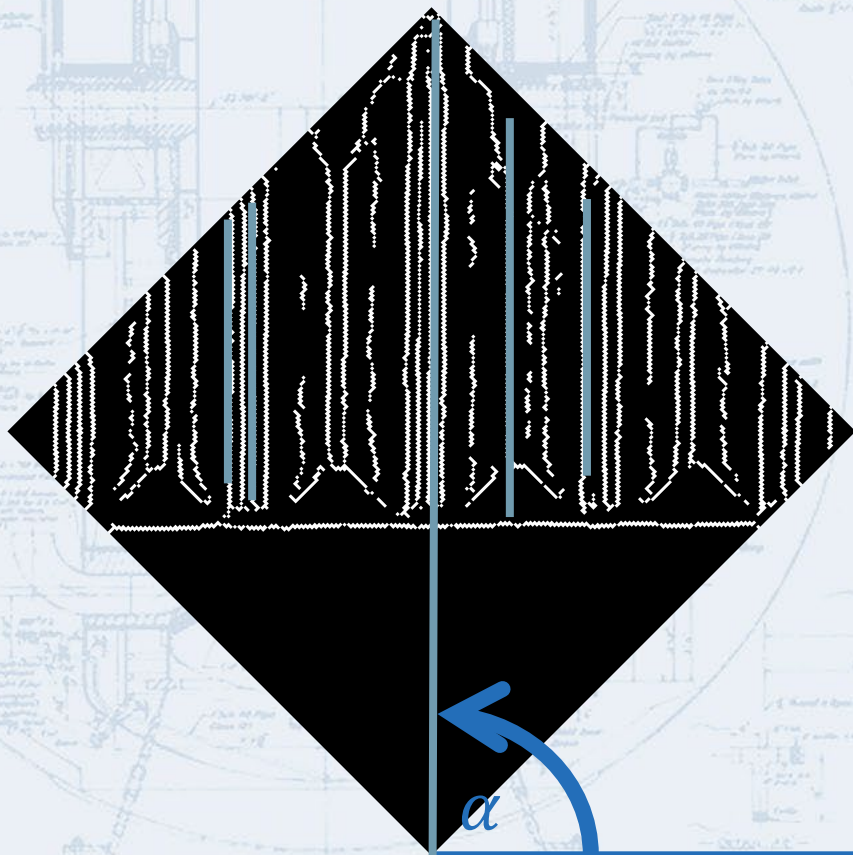
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Frame rotation estimation



Prevailing direction of rods

- Edges
- Hough lines
- Median angle



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Frame rotation – edge detector – blur

$$B_{ij} = \frac{1}{2\pi\sigma^2} e^{-\frac{(i-k+1)^2 + (j-k+1)^2}{2\sigma^2}}$$

$$1 \leq i, j \leq (2k + 1)$$



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Frame rotation – edge detector

$$e(x, y) = \sum_{dx=0}^2 \sum_{dy=0}^2 f(dx, dy)g(x + dx, y + dy)$$

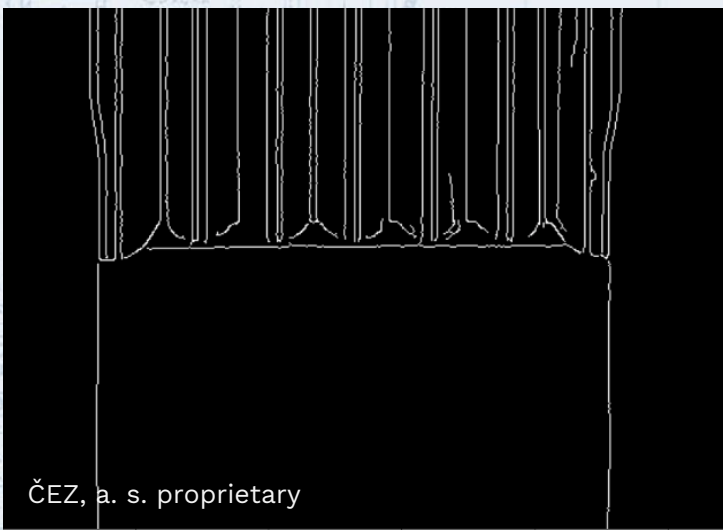
1	0	-1
2	0	-2
1	0	-1

1	2	1
0	0	0
-1	-2	-1



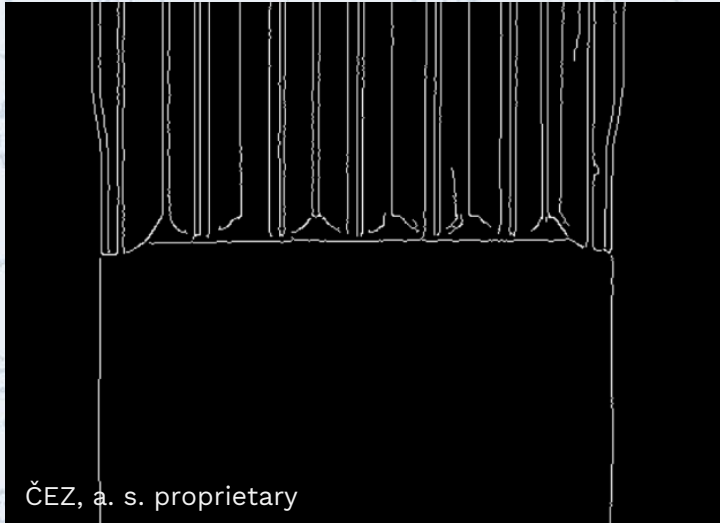
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ČEZ, a. s. proprietary

Frame rotation – Hough lines



$$[x_1, y_1], [x_2, y_2]$$

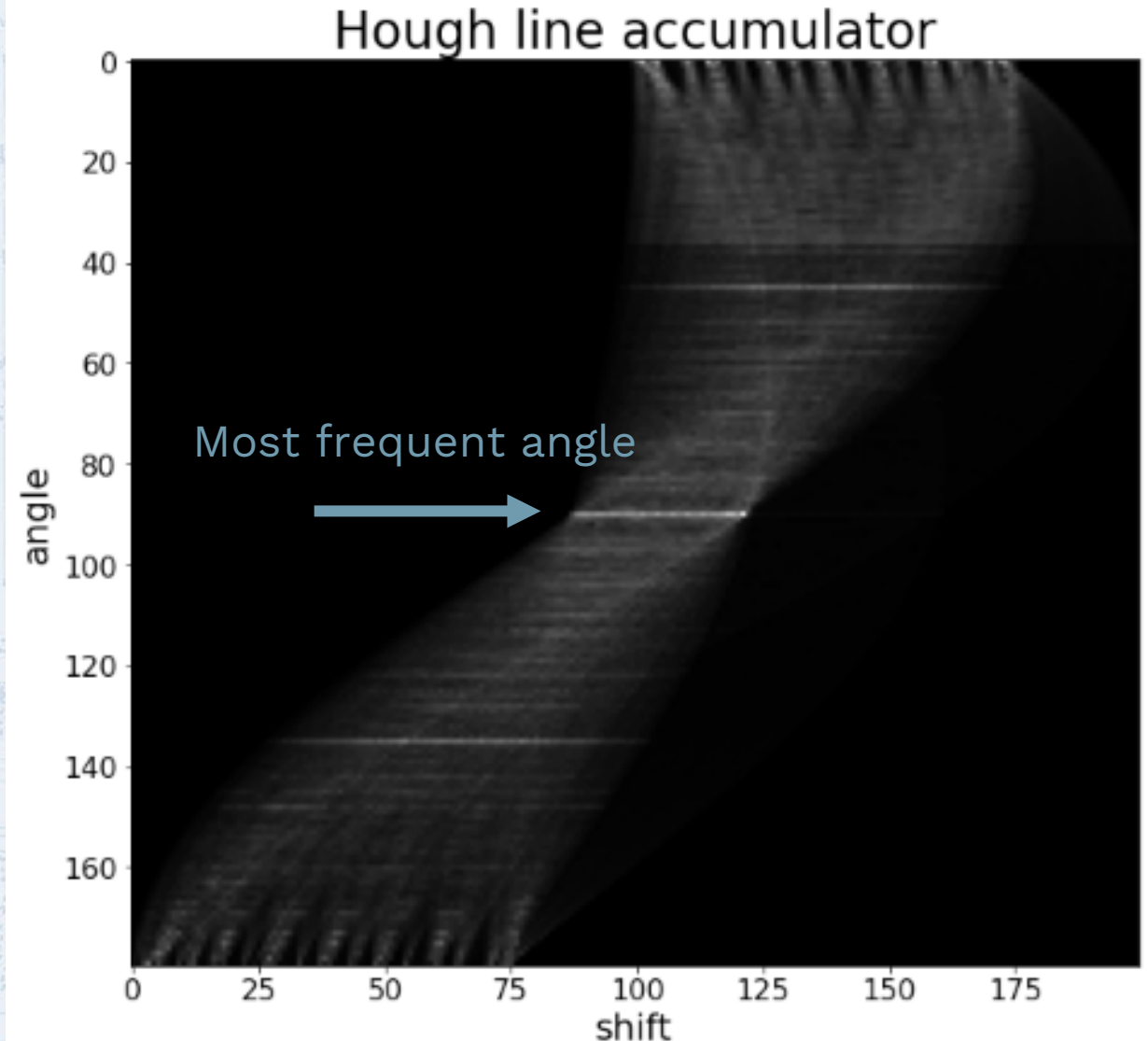
$$b = \frac{x_1 y_2 - x_2 y_1}{x_2 - x_1},$$

$$a = \frac{y_1 - b}{x_1},$$

$$\alpha = \text{tg } a$$

For every point pair +1 in accumulator

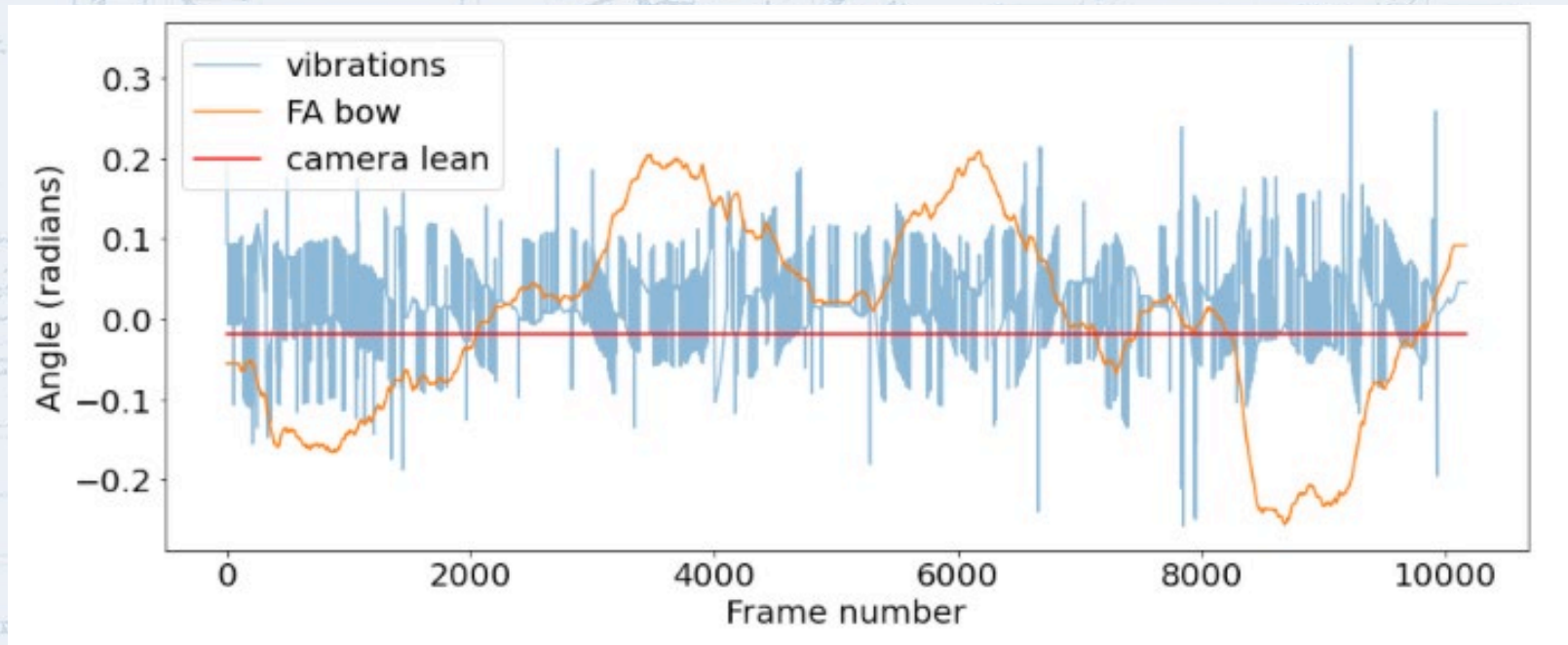
Most frequent angle



Frame rotation – decomposition

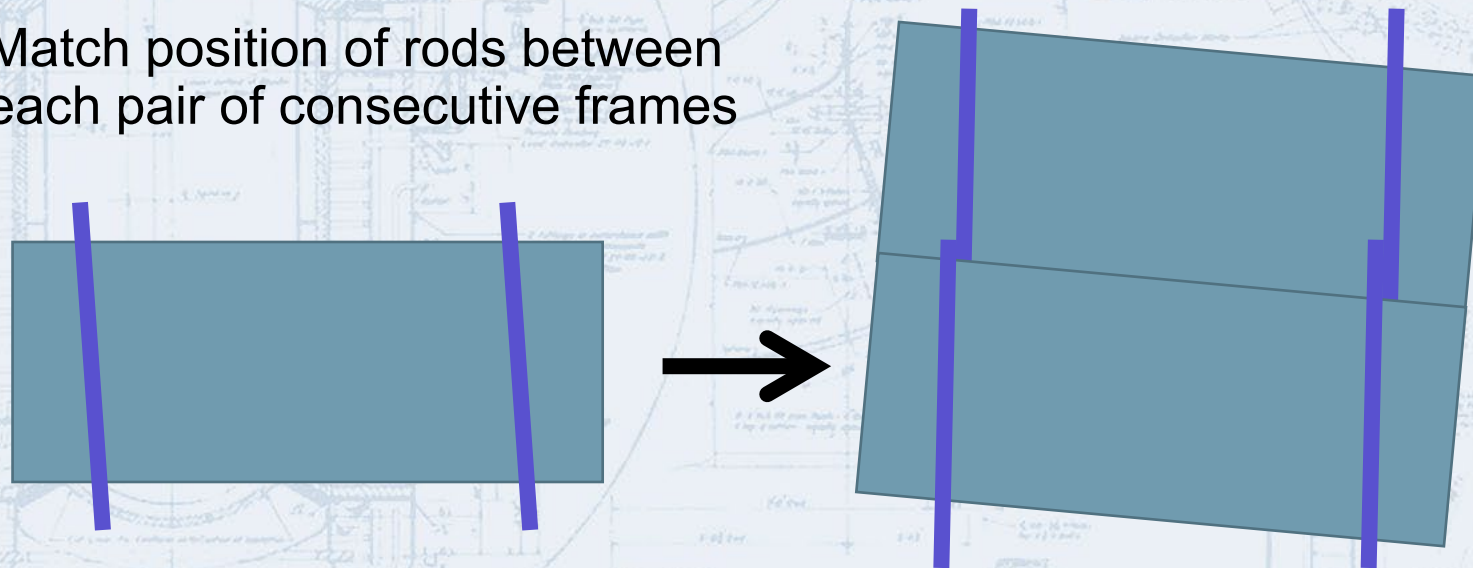
Computed values split to:

- **Camera lean** – the mean value of computed angles – **we want to remove this**
- **Fuel assembly deformation** – low frequency angle changes – **we want to keep this in image**
- **High frequency vibrations** – camera / FA movement – **we want to remove this**

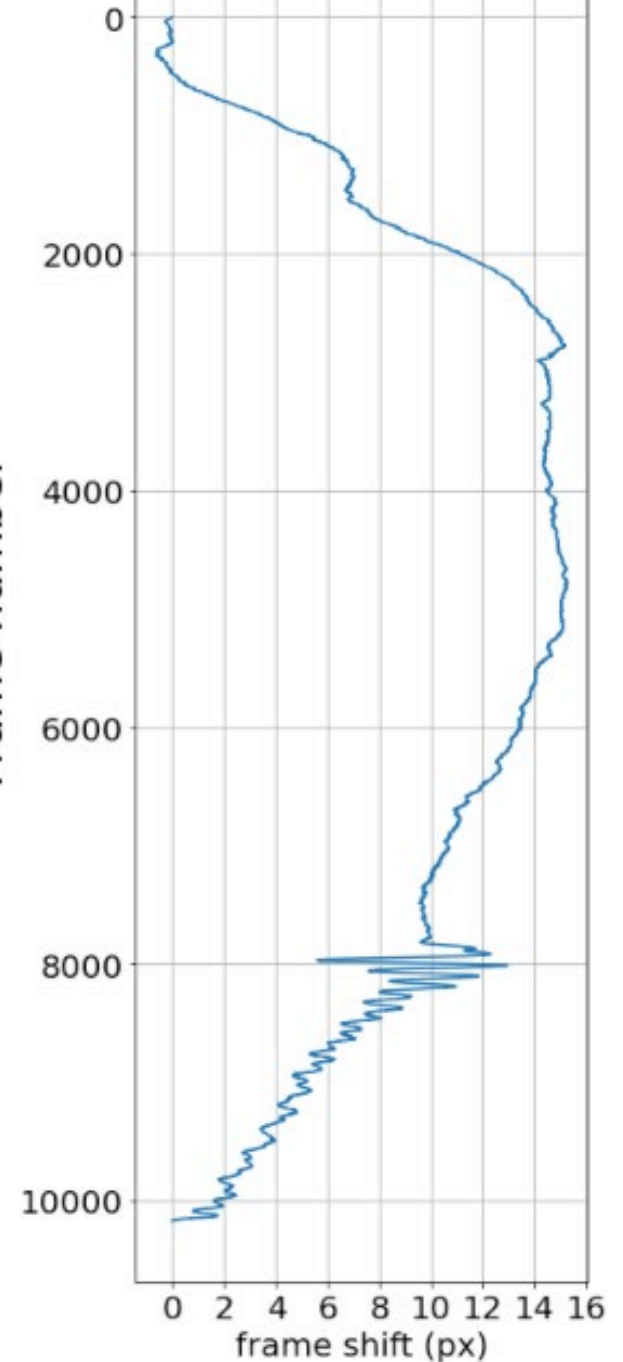


X-shift compensation

Match position of rods between each pair of consecutive frames

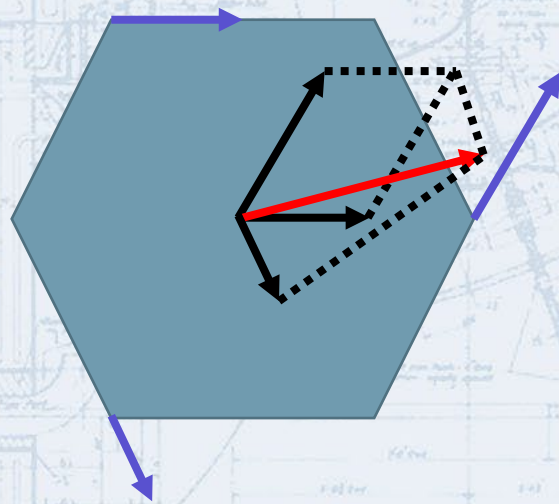


Frame number

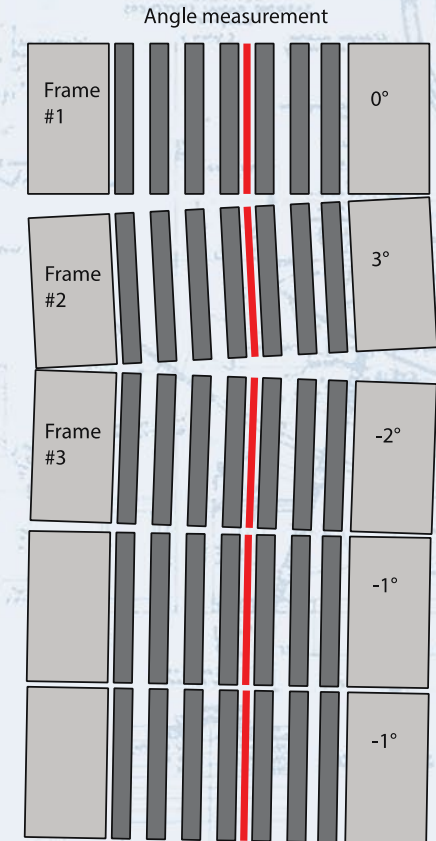


One image overview – side products

Directions of rods in each frame & X-shift compensation → FA bow estimate



!!! Applicable only when FA is fixed



Digital image processing and geometry measurements



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Relative Rod Growth

Correct position →

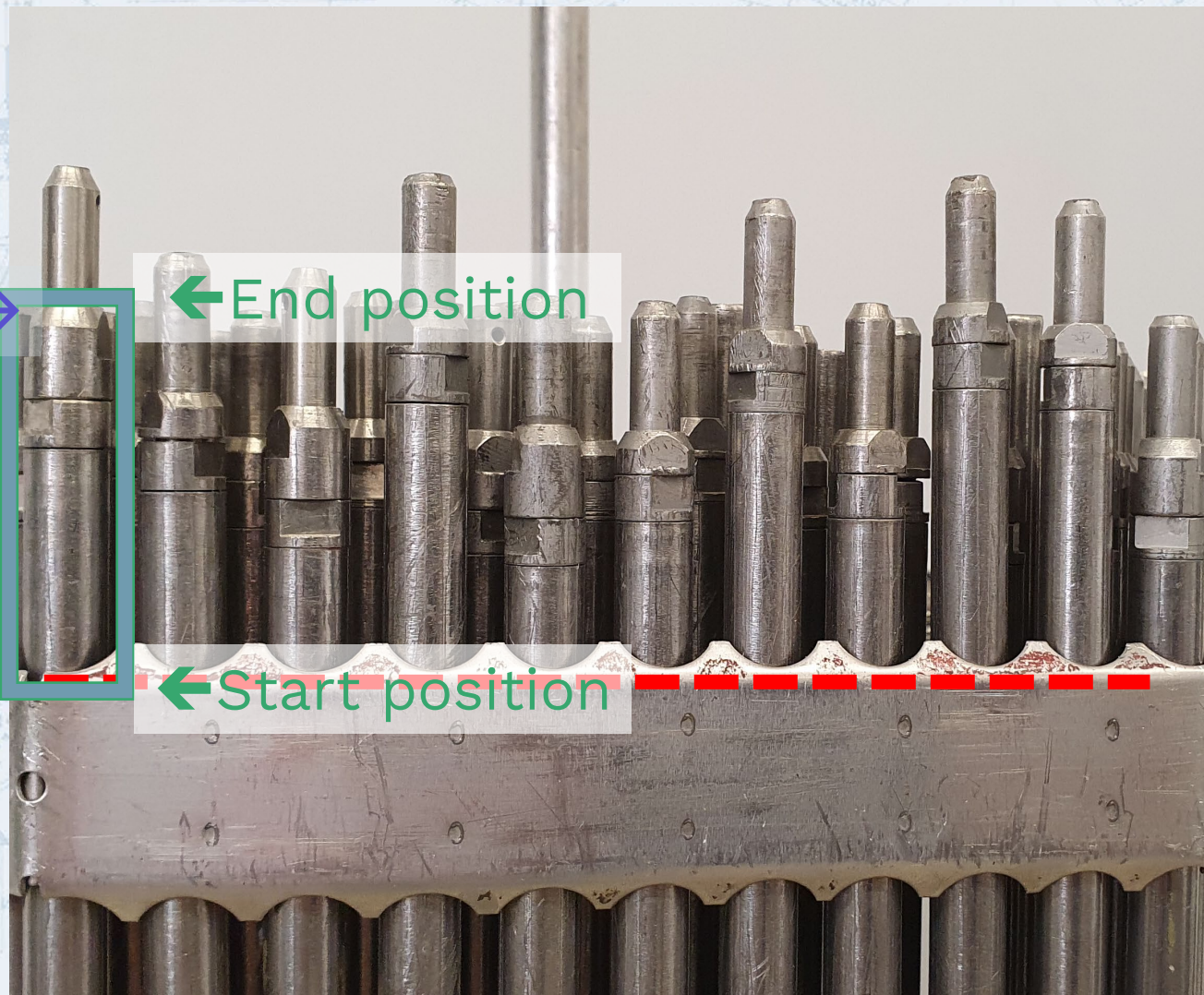
← End position

← Start position



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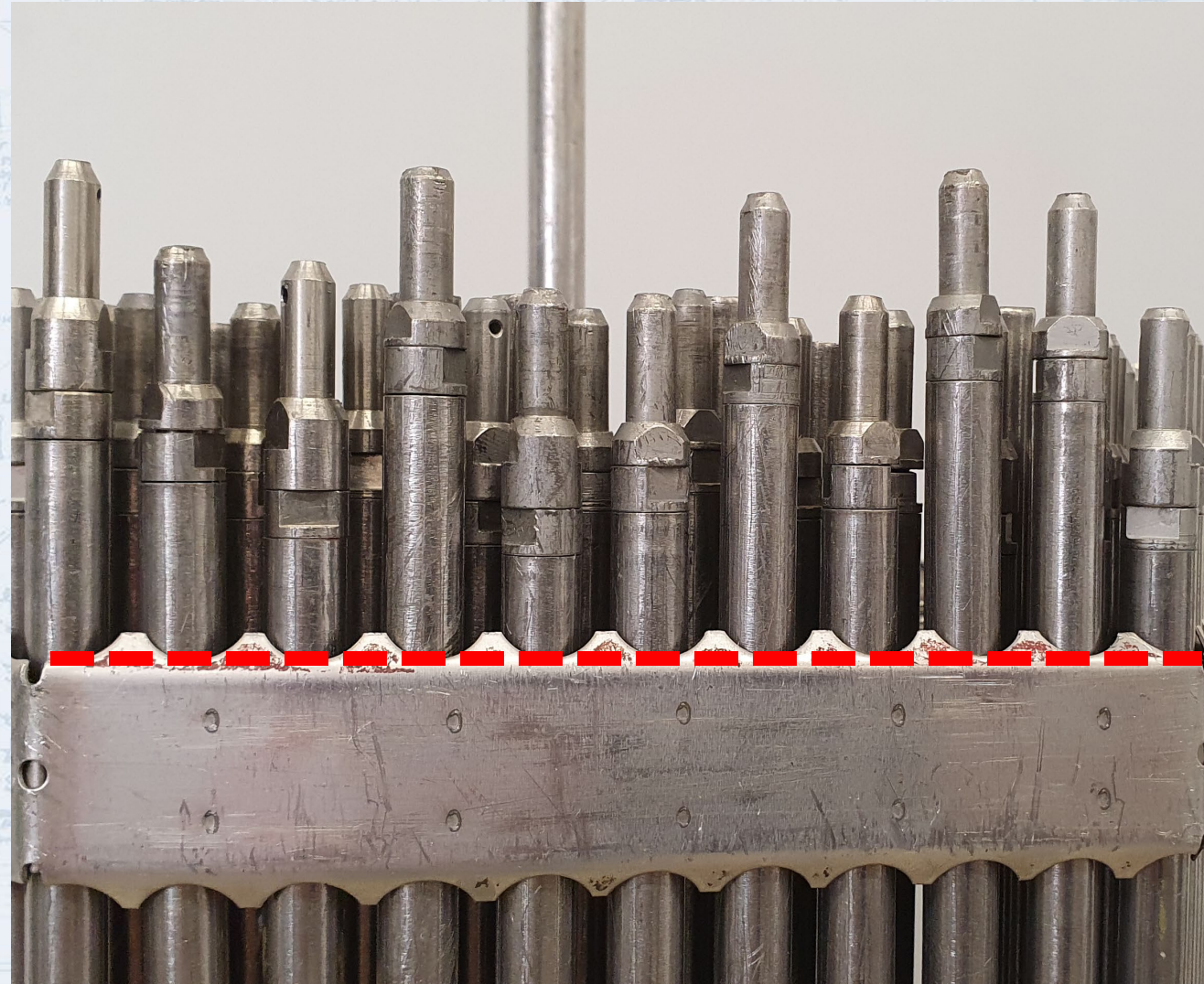


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Relative Rod Growth spacer grid detection

The lightest row in area of the grid

$$Y = \operatorname{argmax}_{y \in \{y_1, \dots, y_2\}} \sum_{x=0}^{\text{width}} I(x, y)$$

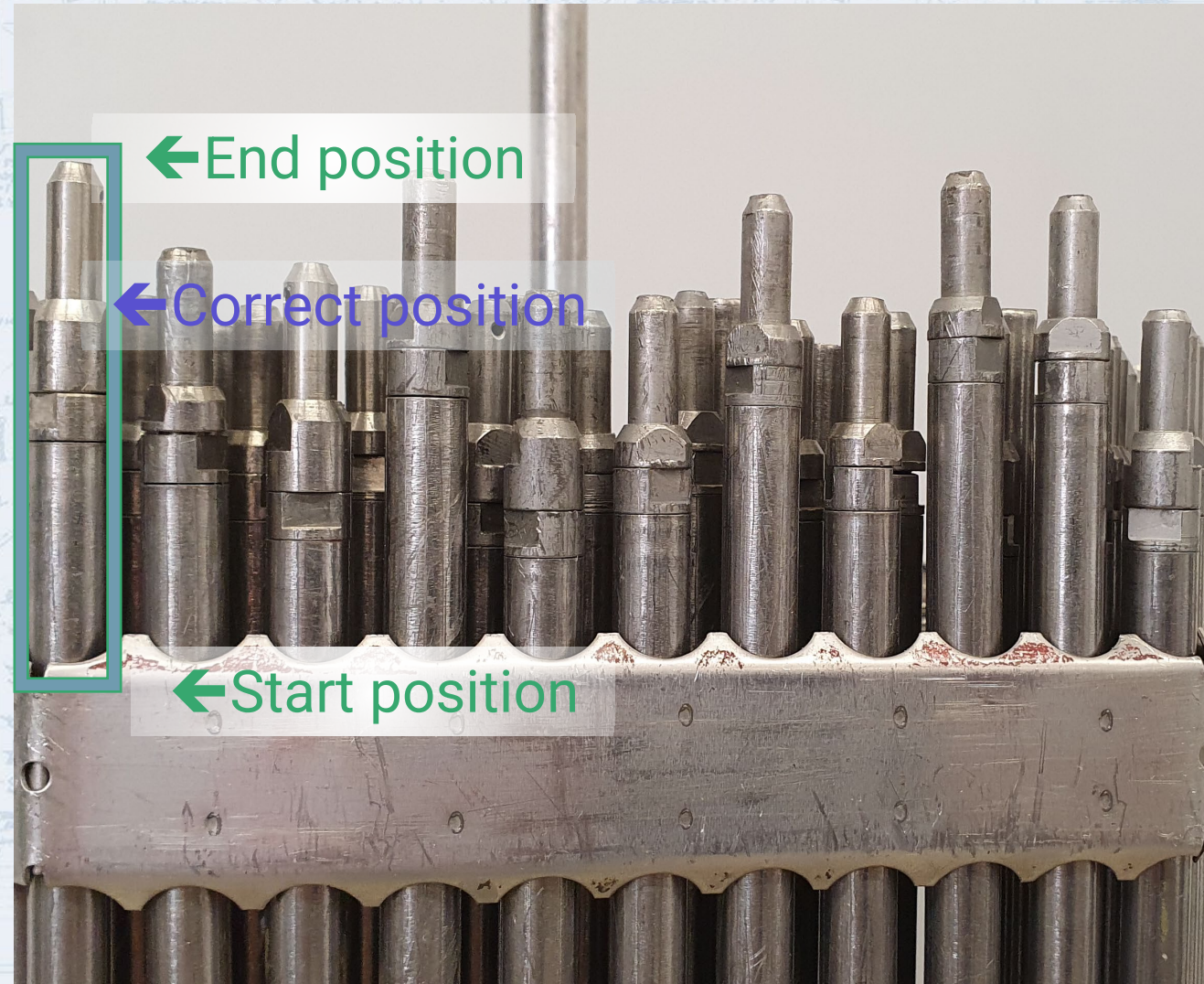


Relative Rod Growth weld position

A line with the highest sum
intensity:

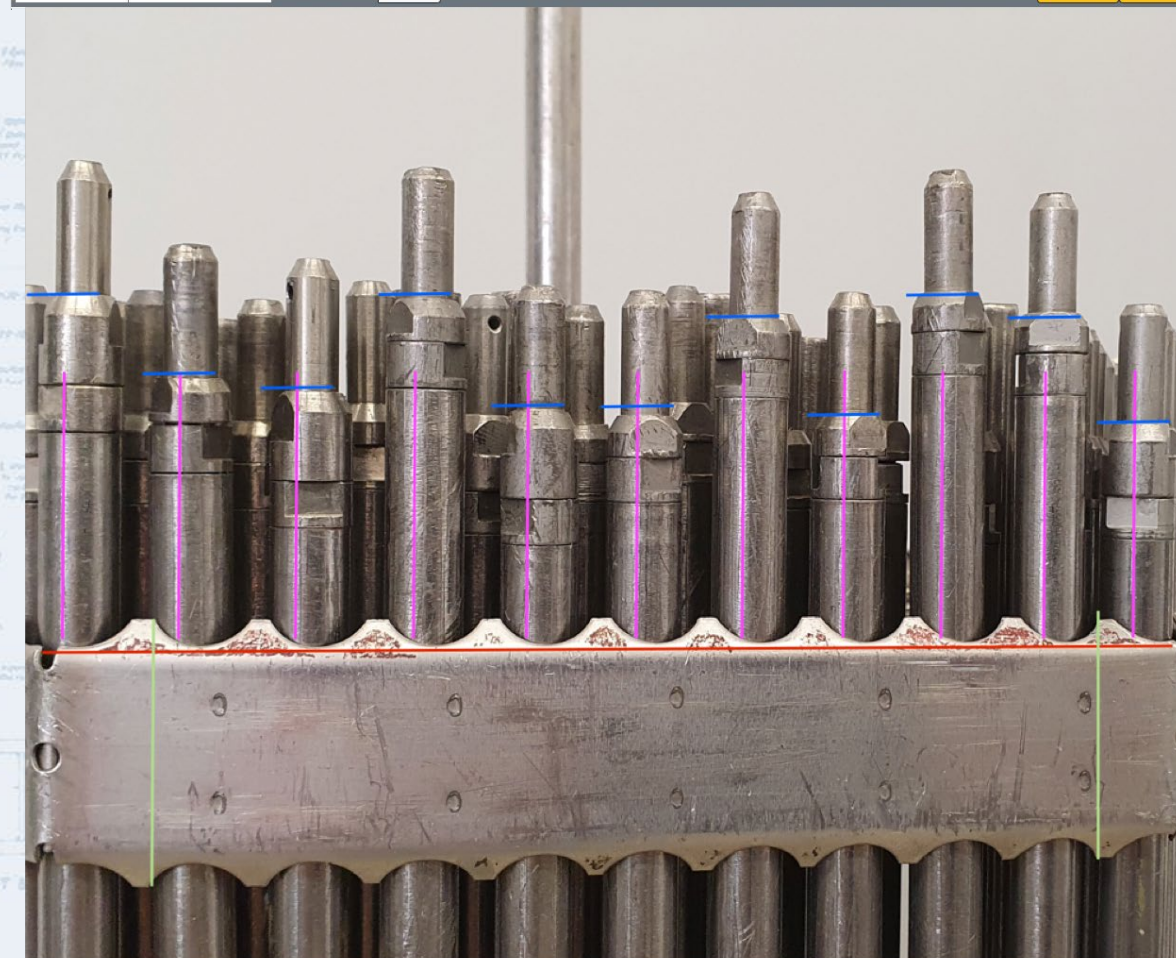
$$h = \max_y \sum_{x=0}^{rod_width} I(x, y)$$

New approach based on convolutional
neural network in progress...



Relative Rod Growth summary

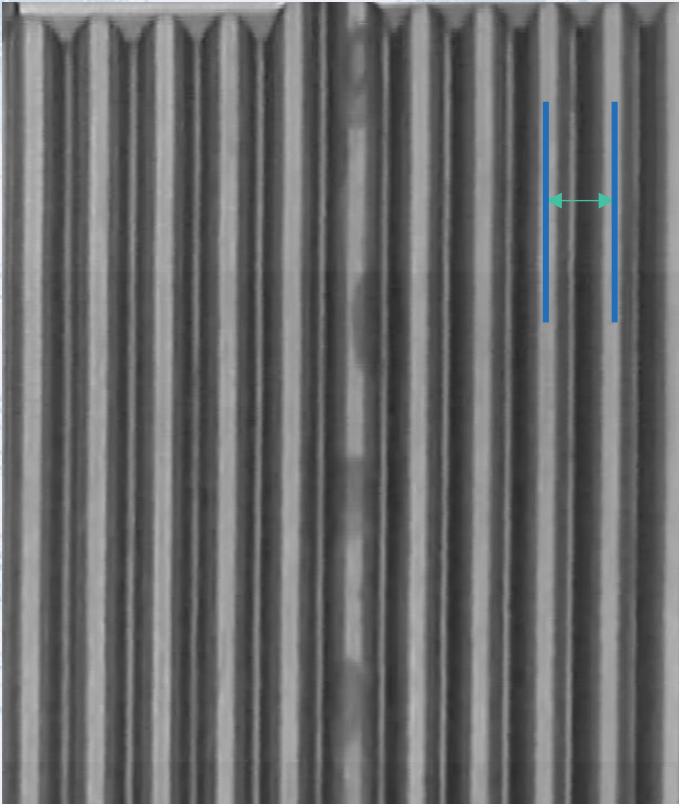
- 87% of images correctly processed
- >> 90% of overall rods correctly detected
- → GUI for manual correction



Grid at:	404px										
Angle distance [px]:	411px										
px/mm:	4.79										
Rods positions:	51,	112,	173,	234,	295,	364,	425,	487,	548,	609,	670,
Ward to grid distance [px]:	44,	55,	48,	136,	54,	57,	61,	59,	62,	60,	62,
Ward to grid distance [mm]:	9.18,	11.47,	10.01,	28.37,	11.27,	11.89,	12.73,	12.31,	12.93,	12.52,	12.93,

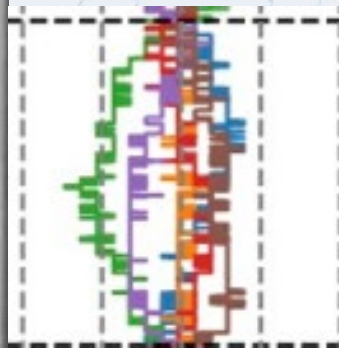
Rod bow measurement

... a DIP approach



Rod center to rod center measurements

- Track rod center positions
- Measure distance between rods
- Develop UI for fixing the errors



Calibration

- Average of all measured distances = default distance

Alerting

- Customized e.g., less than 1mm



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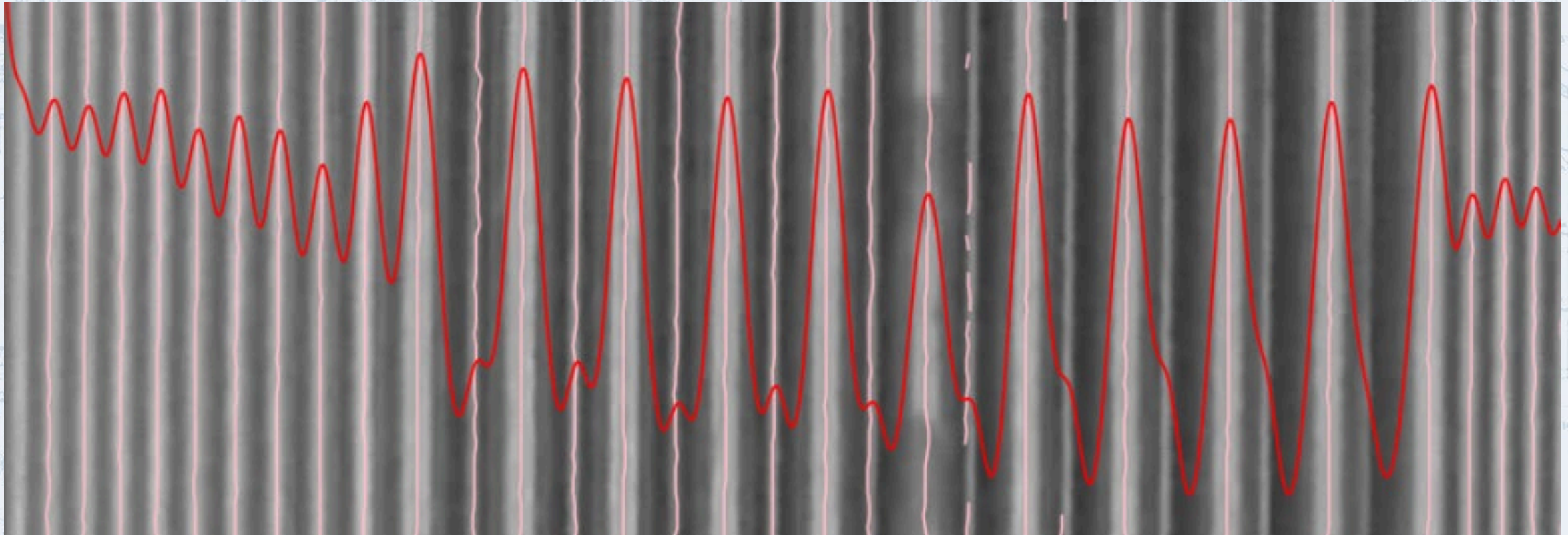


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Rod Bow

The rod center detection



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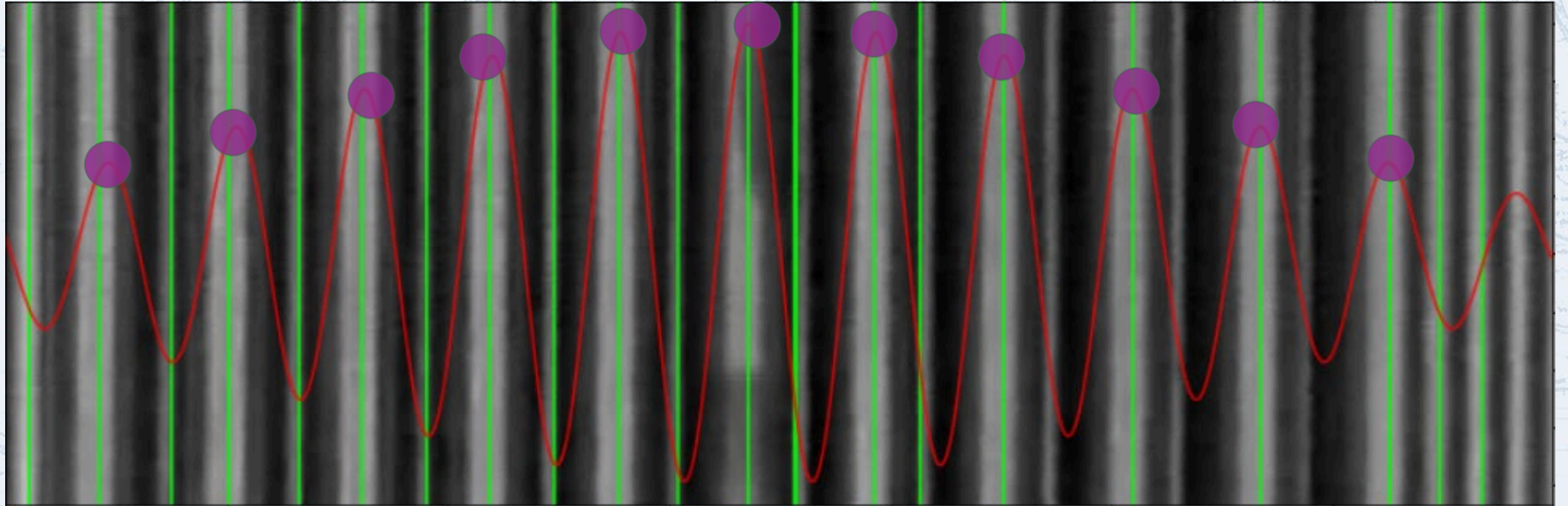
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Rod Bow

The rod center detection



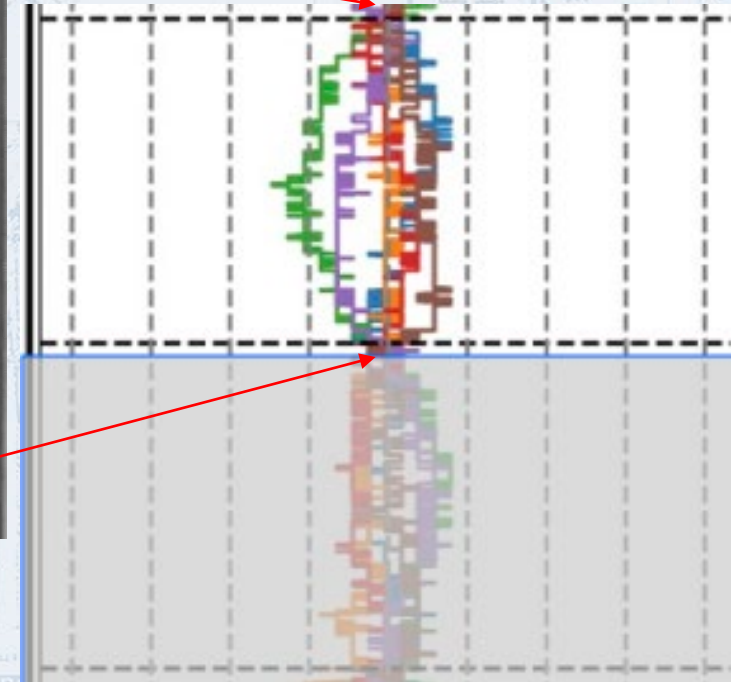
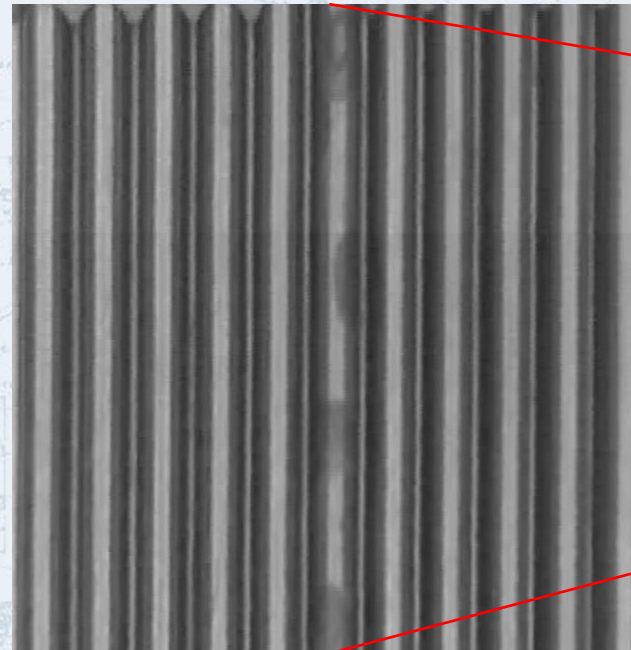
$$\operatorname{argmax}_{S, \bar{x}, \sigma, d} \sum_s^S \cos(ds(x)) \operatorname{pdf}_{\sigma}(s(x))$$

Rod bow – GUI for fixing errors



Rod Bow our achievements

- Precision >90%
- Recall >99%
- Reports according to customer requests



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Spacer Grid segmentation

Motivation

- Unlock of automation for grid / rod processing
- Filtration of SG images by shape variance



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SG segmentation

Focus on the shape of the boundary

1. Mechanism of boundary detection
2. Definition of a normal shape
3. Computation of boundary divergence



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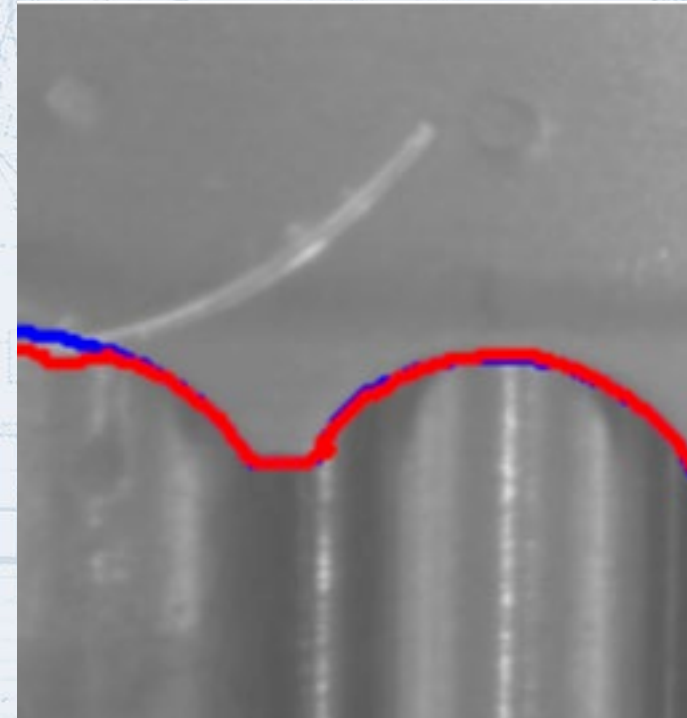


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SG segmentation

- ResU-Net
- + Manual labeling
- Own error metrics (line distance)



Skeleton measurement

Based on camera speed

campaign	fuel	side	grid 1	grid 2	grid 3	grid 4	grid 5	grid 6	...
2023	XY-01	face 1	4000	3600	3200	2800	2400	2000	...
		face 2	4002	...					
		face 3	3999						
		face 4	...						
		average	4000	3592.3	...				
		standard deviation	± 2.6	± 3.2	± 1.5	...			

grid 1

grid 2

grid 3

grid 4

Changes in a screening procedure

Fixed camera speed

- Recording only when camera speed is stable
- No stopping
- No PTZ
- No changes in the procedure during whole PP outage

Video sequence beginning/end extension

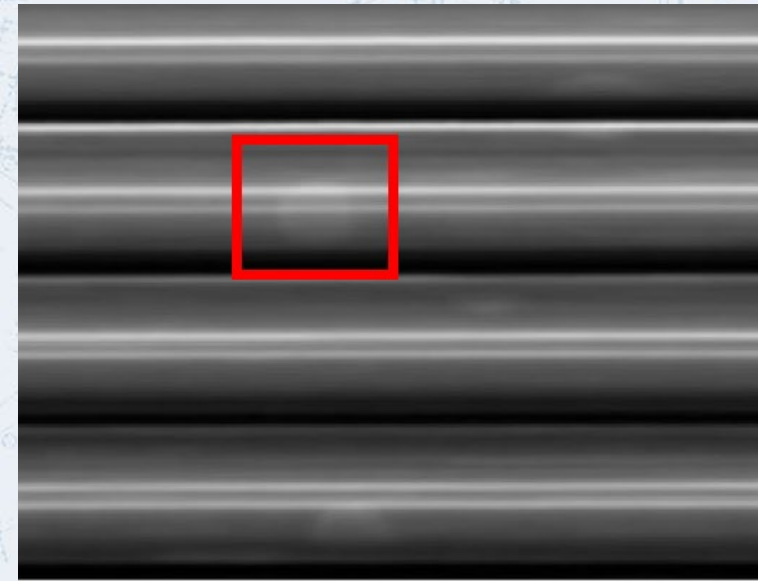
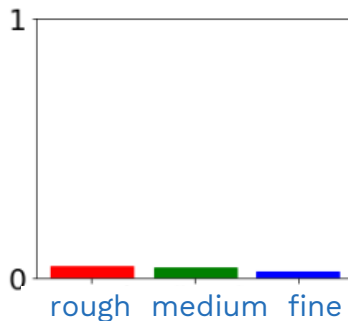
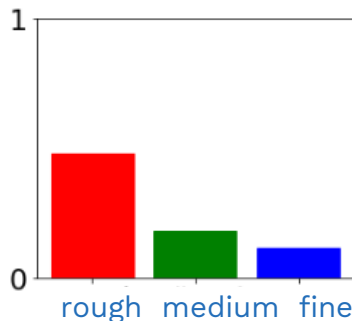
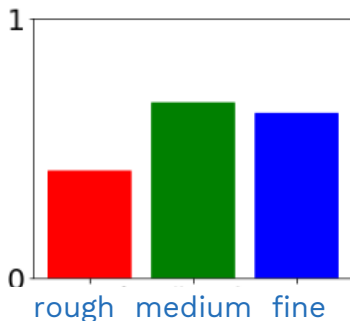
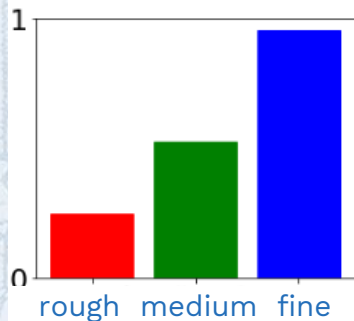
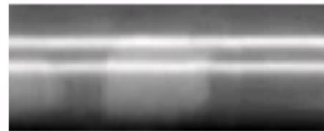
- Start of recording above FA and end of recording below
- Camera speed must be stable
- Merged pixels must be in center of the frame

Lens setup

- Fixed for whole outage
- Calibration before screening
 - All peripheral rods must be in view during recording

Analytics

Data in unified format enables deeper insight



DIP incorporation – summary

- Automated processing, reproducibility
 - Normalization of video acquisition process
 - ... across power plants
- Unlock for non-biased monitoring



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Thank you



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