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### OPEN TECH THOUGHTS

11111100010

### KI IM CAE-PROZESS

Dr. Christian Simmendinger – T-Systems
4. Juli 2018



### OUTLINE

- From CAD to CAE
- Deep Learning in CAD/CAE
- Methodology & Detection Process
- Results
- Outlook

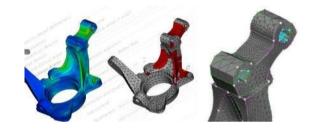


#### From CAD to CAE





Fluid Dynamics
Structural Mechanics
Acoustics
Heat Transfer

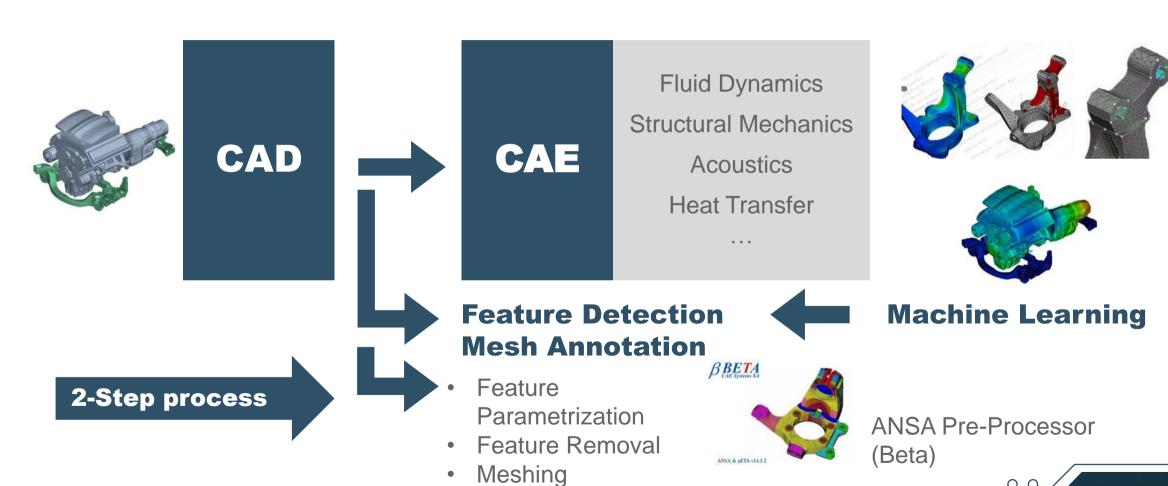




- Requires expert knowledge
- Substantial impact on algorithms, quality of results, time to solution, ressource consumption.
- Manual process, frequently outsourced.
- Long turn around times, significantly slows down the design process
- Full automation of this process has been unresolved for ~30 years



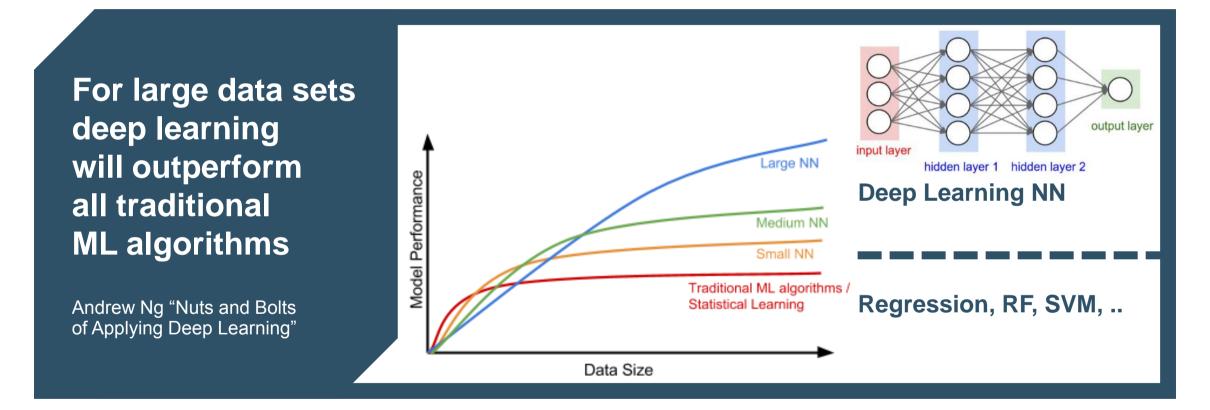
#### From CAD to CAE



### DEEP LEARNING



#### **Deep Learning - Scale**





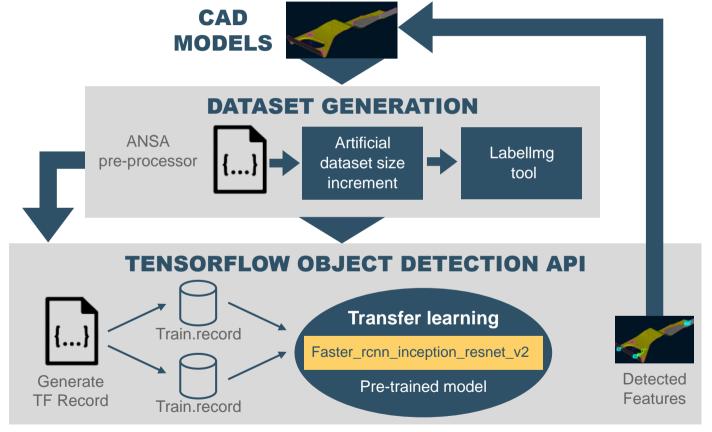
### METHODOLOGY



#### Methodology

TRAINING AND

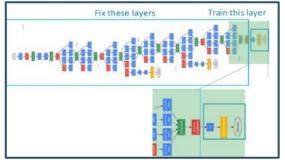
**DETECTION** 



FEATURE ANNOTATION

MULTIPLE FEATURE DETECTION

TRANSFER LEARNING



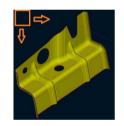
### FASTER R-CNN

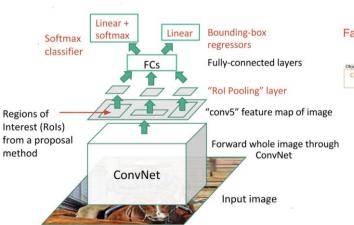


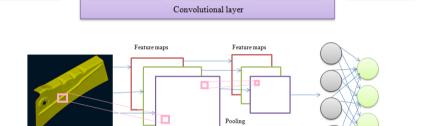
#### **Region based Convolutional Neural Networks**

#### **Faster R-CNN**

- Convolutional layer with local connectivity and spatial detection
- Rectified Linear Unit layer (ReLU)
- Max Pooling layers
- Fully connected layer
- Softmax loss layer
- Region of Interests
- Improved object detection with dedicated RP network.







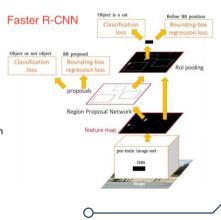
Nonlinearity

Pooling

Output

prediction

Fully connected



Convolution

Convolution

Input



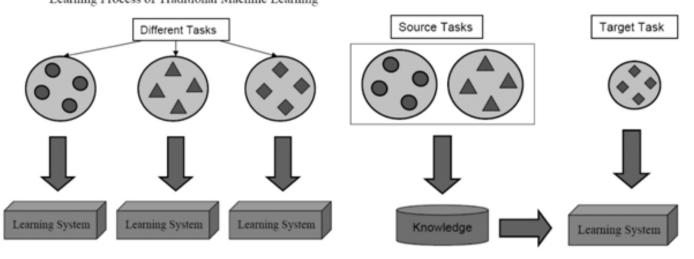
### TRANSFER LEARNING

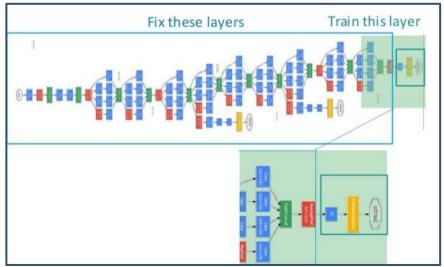


#### **Transfer Learning**

Learning Process of Traditional Machine Learning

#### Learning Process of Transfer Learning







### DEEP LEARNING FRAMEWORKS



#### **DEEP LEARNING FRAMEWORKS**

#### **TensorFlow**

- Active community: how fast can potential issues be solved.
- Provides object detection API: TensorFlow object detection API
- Availability of pretrained model Transfer Learning
- Multi-GPU support
- Availability of learning materials
- Availability of debugging tools: (tensorboard for model visualization and checkpoints)
- Performance: (primarily cuDNN support)



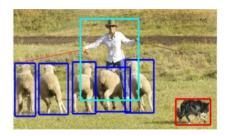
#### **TensorFlow Object Detection API**

- Small dataset, time constraints: Transfer learning
- TensorFlow object detection API:
- Part of the official TensorFlow research model.
- Provides pre-trained models.

Model name	Speed (ms)	COCO mAP[^1]	Outputs
ssd_mobilenet_v1_coco	30	21	Boxes
ssd_inception_v2_coco	42	24	Boxes
faster_rcnn_inception_v2_coco	58	28	Boxes
faster_rcnn_resnet50_coco	89	30	Boxes
faster_rcnn_resnet50_lowproposals_coco	64		Boxes
rfcn_resnet101_coco	92	30	Boxes
faster_rcnn_resnet101_coco	106	32	Boxes
faster_rcnn_resnet101_lowproposals_coco	82		Boxes
faster_rcnn_inception_resnet_v2_atrous_coco	620	37	Boxes

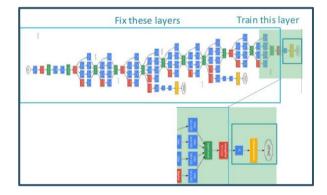


(a) Image classification



(b) Object localization

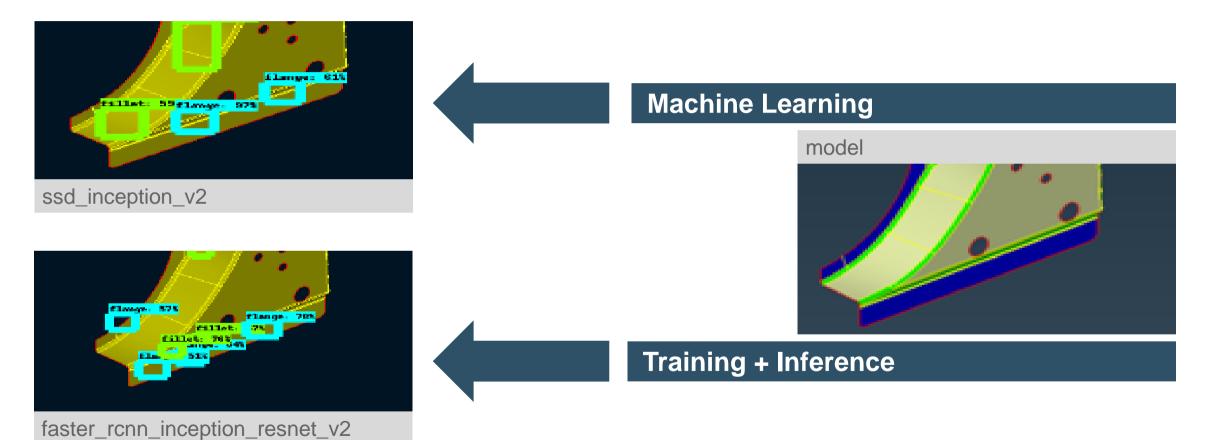
TensorFlow detection model zoo



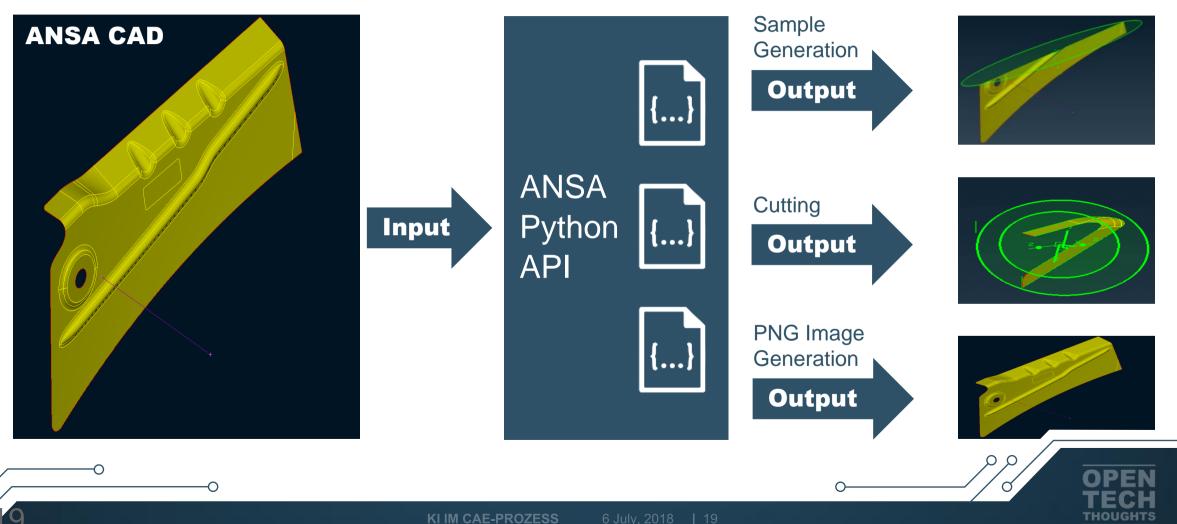
### DATASET GENERATION



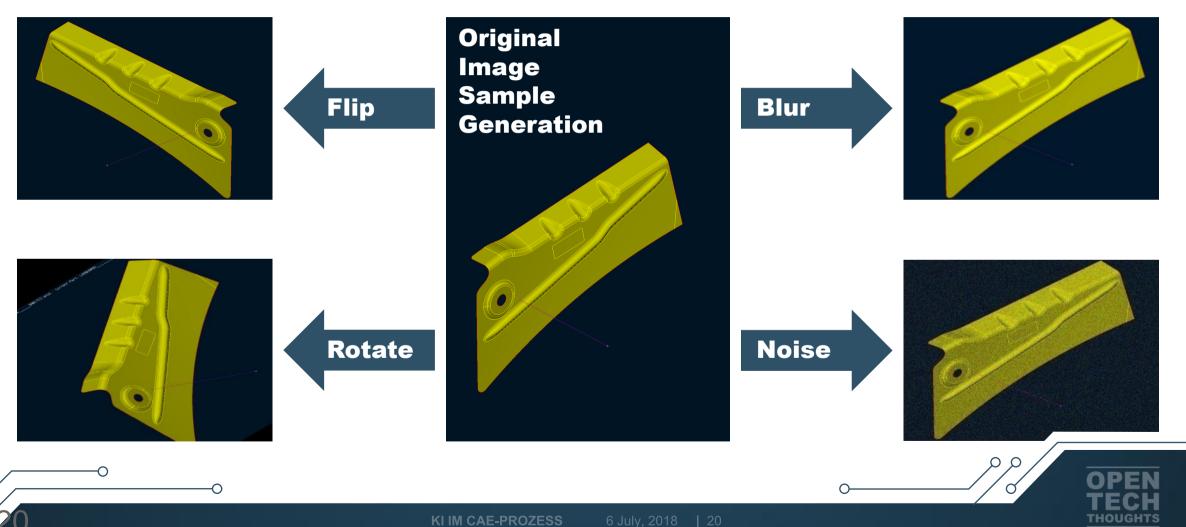
#### **Feature Detection / Feature Extraction**

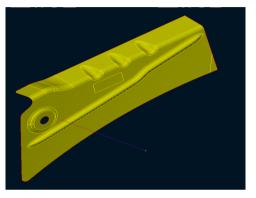


#### **Dataset Generation**



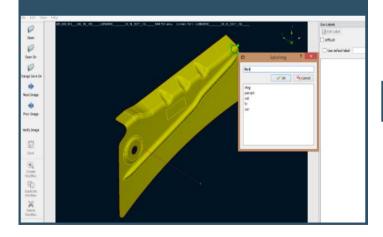
#### **Dataset Generation**

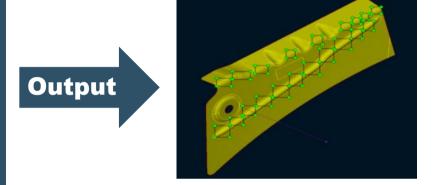






Labellmg Image Annotation Tool





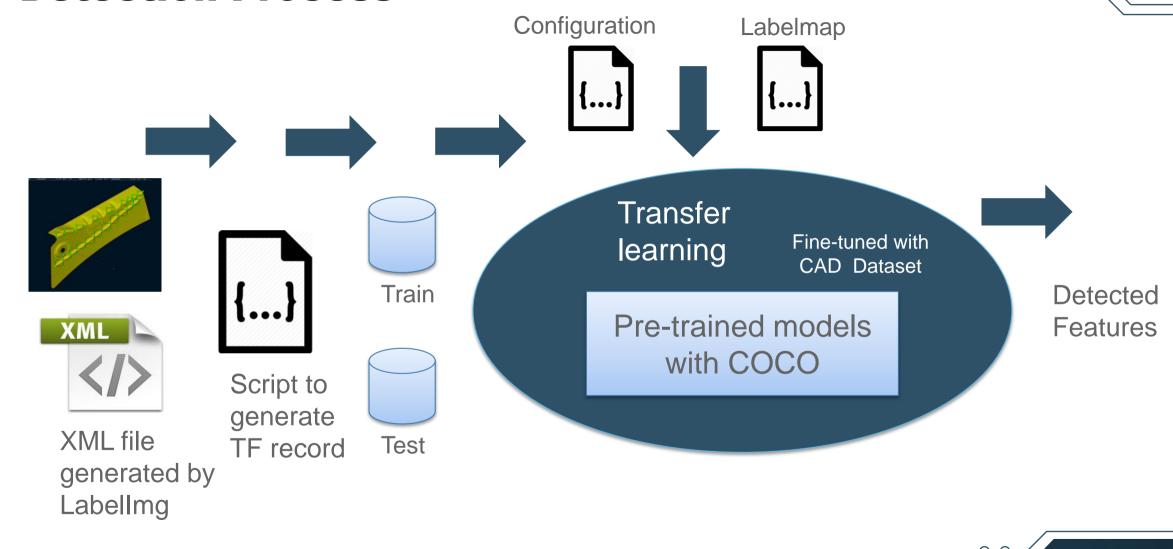




## DETECTION PROCESS



#### **Detection Process**



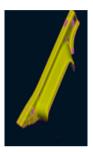
### RESULTS

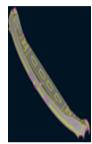


#### **Results**











Name	CAD_Model_dataset	
Total size	750 Images	
Training set	700 Images	
Test set	50 Images	
Number of Classes	3	
Classes	Fillet, Flange, Bead	

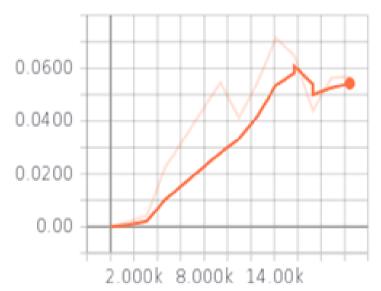








Precision/mAP@0.5IOU



ssd\_inception\_v1\_coco

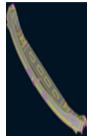


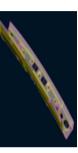
#### **Results**





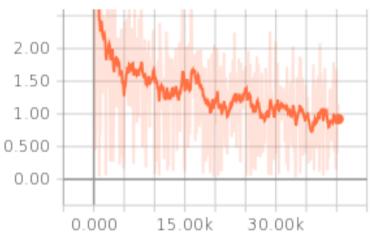




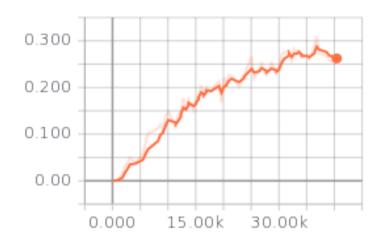


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CAL/Precision/mAP@0.5IOU



faster\_rcnn\_inception\_resnet\_v2



#### **Results**







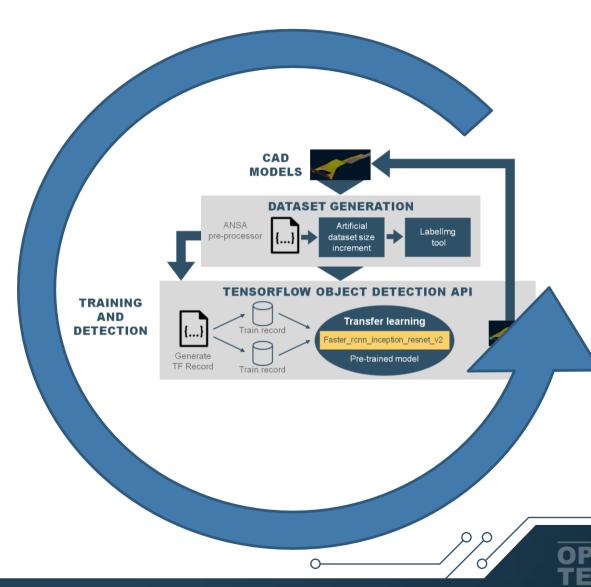


### OUTLOOK

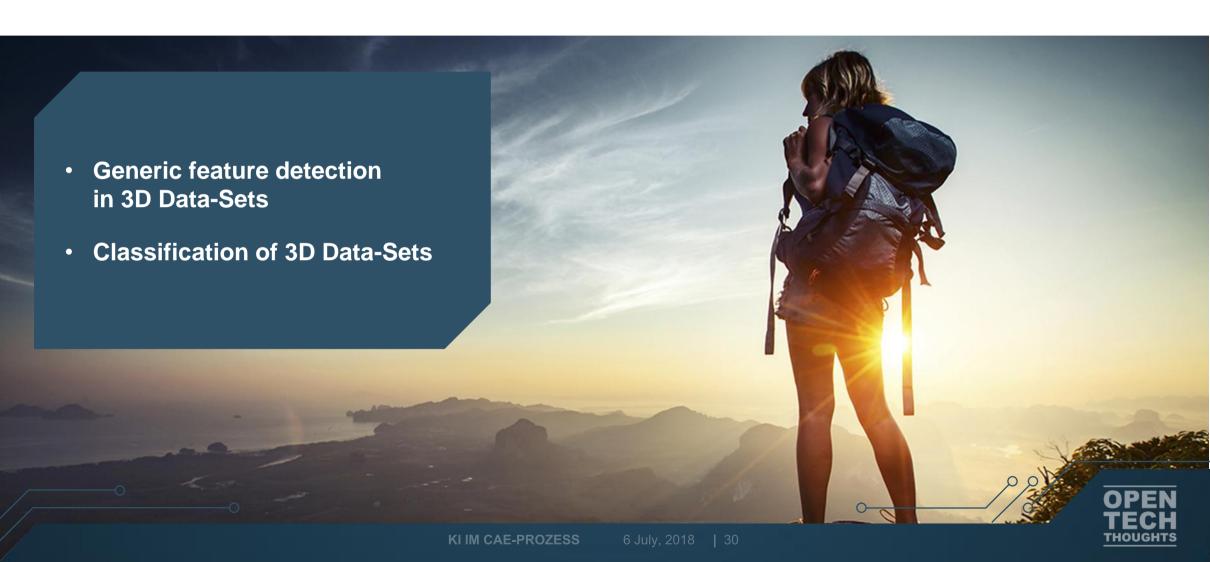


#### **Improved learning**

- Full Integration in ANSA Pre-Processing
- Improved learning via annotation and 3D model rotation



#### **Outlook**





# THANK YOU!