



#### A young fast-growing start-up

#### **Understand.ai**



Founded: March 10th, 2017

Research dates back to 2014

**HQ: Karlsruhe (Germany)** 

Heart of a key European Automotive & Al cluster

Investment: \$3.5M seed

From Valley, UK & German entrepreneurial VCs

Team:

53 associates, combination of AI & Automotive talent

**Customers:** 

Automotive OEMs and Tier 1/2s e.g. VDA V&V-Methoden (Pegasus successor)





#### Fueling the AI Revolution

## Agenda

- 1. Where is Al used?
- 2. What is required to build an Al system?
- 3. Characteristics of Data
- 4. Training & Validation Data
- 5. Data Engine
- 6. Processes and People
- 7. Conclusion



## Where is Al used?





Al as...

## Personal Assistance

- speech to text
- night vision
- translation
- search & find
- ...





Al in...

## Automotive

- Perception
- Planning
- Routing
- Behaviour Models
- ...





Al in...

## Medicine

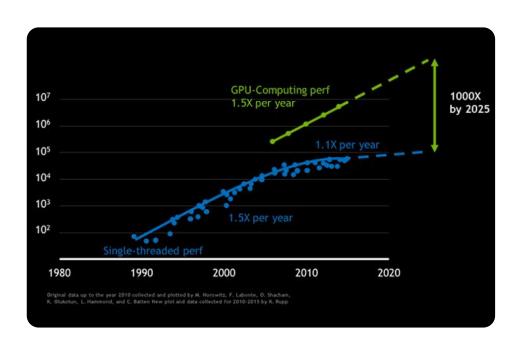
- Diagnose Diseases
- Develop drugs faster
- Personalize treatment
- Enable gene editing
- Chatbot as a personal doctor (X2.ai)
- ..



## What is required to build an Al system?



### Infrastructure

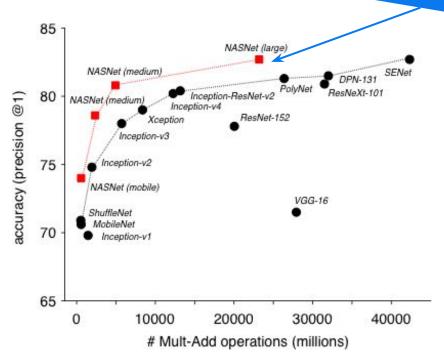






## **Algorithms**

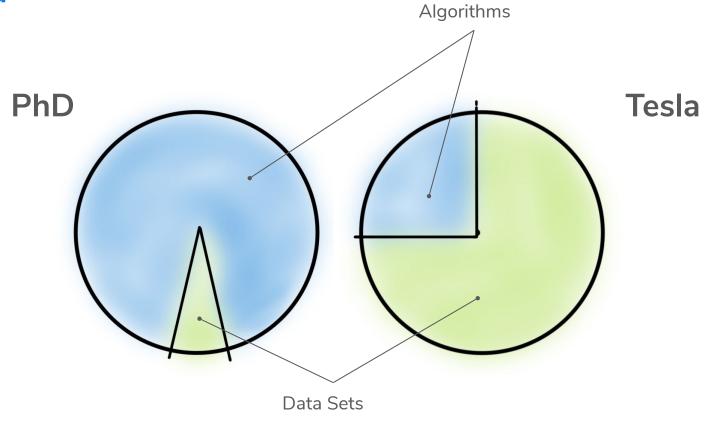
generated model performs significantly better than manually designed model





#### Amount of sleep lost over...

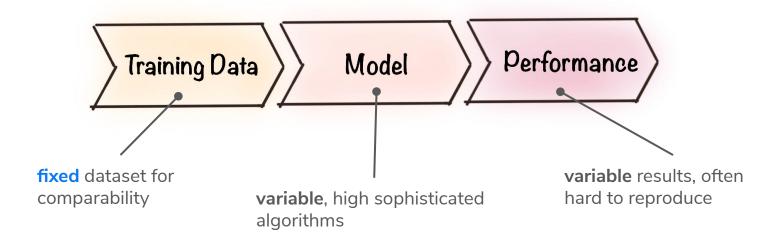
### **Data**





#### Academia versus Industry

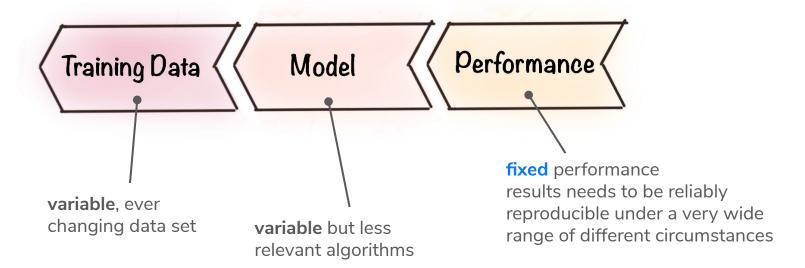
### **Academia**





## Academia versus Industry

## **Industry**





#### Industry

### **Fixed Model Performance**





## **Characteristics of Data**



#### Distorting VOC Bounding Boxes

## **Data Quality**







#### Distorting VOC Bounding Boxes

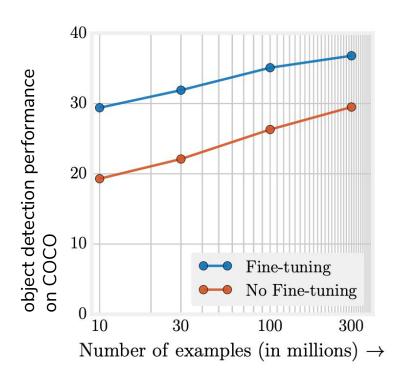
## **Data Quality**

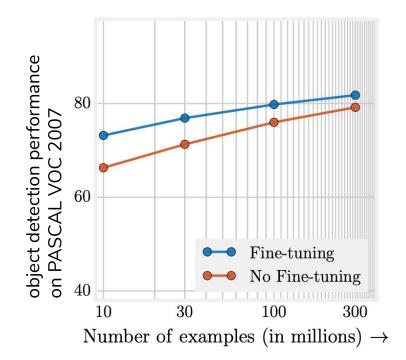
	at IoU 0.5	at IoU 0.8 industry standard
mAP VOC	0.6996	0.4626
mAP VOC 0.08	0.6794	0.2262 40,64 Ms
mAP VOC 0.13	0.6400	0.0562



#### The more the better!

## **Quantity of Data**







#### When is performance acceptable?

## **Diversity of Data**





### Weird Edge Cases:)

## **Diversity of Data**



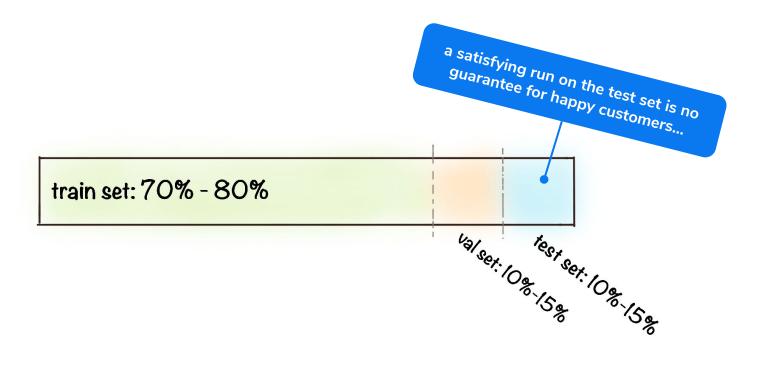


## **Training & Validation Data**



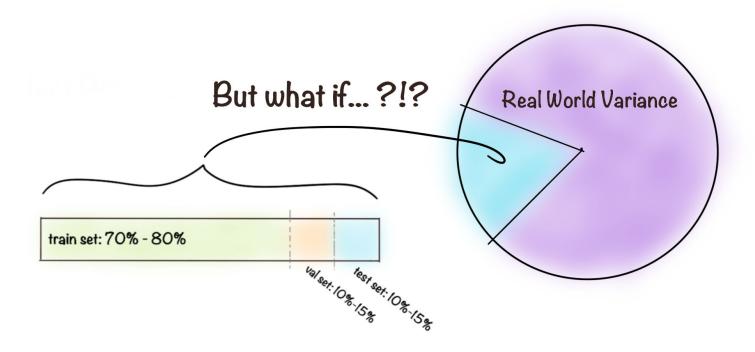
#### **Best Practice**

#### **Validation Data**





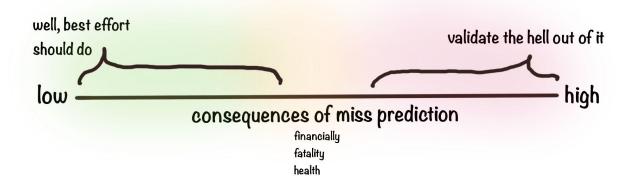
### **Validation Data**





Validation effort might be insane...

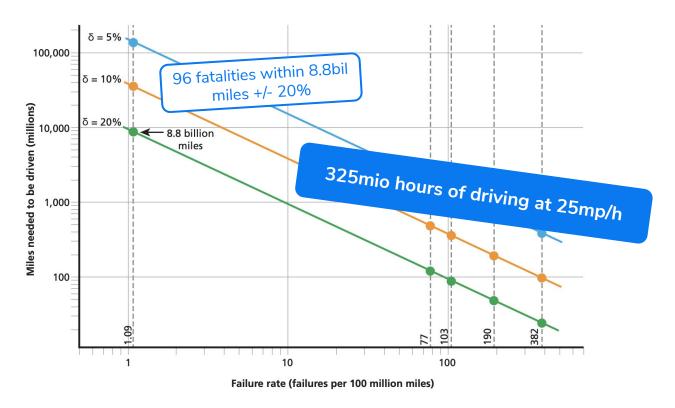
## **Required Validation Effort**



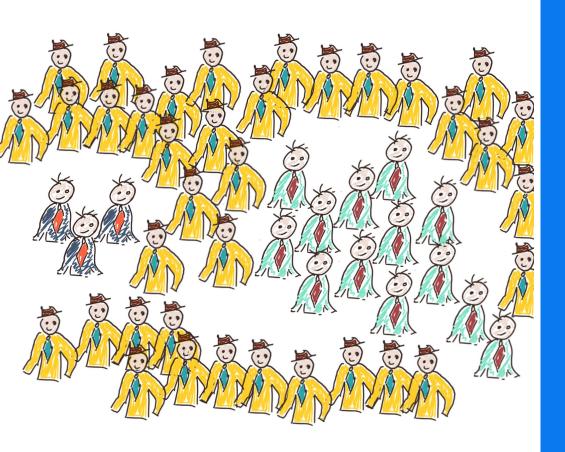


#### Be as good as a human driver

## **Validate Autonomous Driving**







## Will we all be labelers?

Tesla: 1.000 labelers

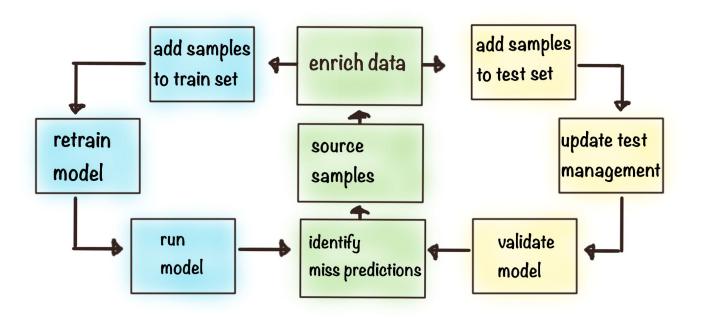
Google: 6.000 labelers

Baidu: 20.000 labelers



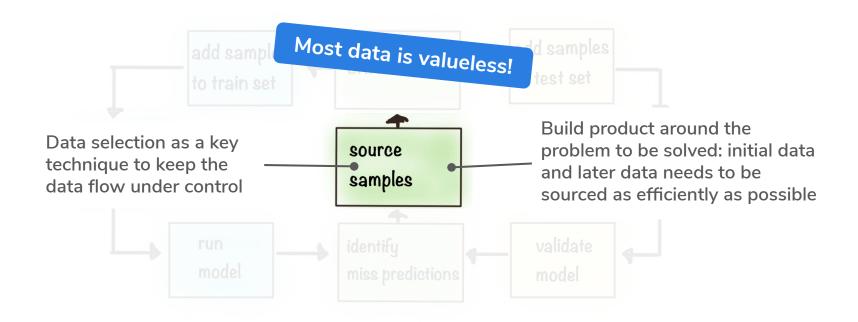
# Tooling to Create Data Sets Data Engine





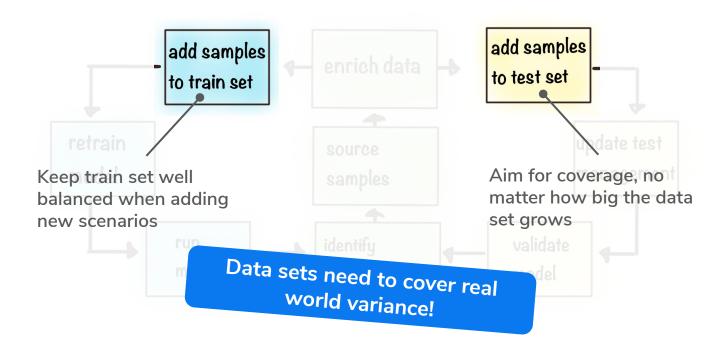


#### **Data Selection**



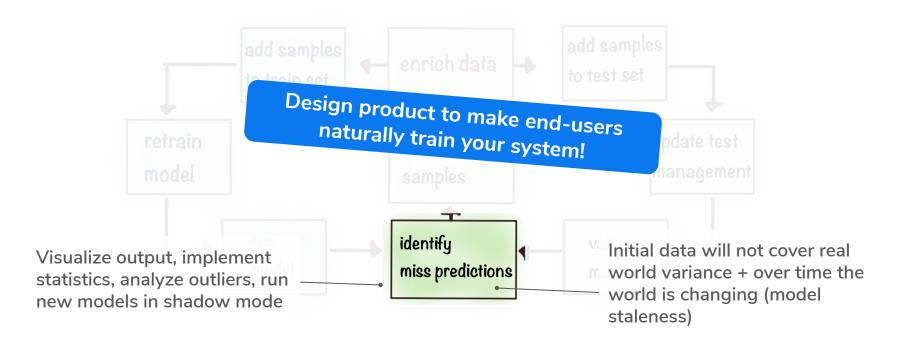


## **Training & Validation Data**





#### **Uncovered Areas**

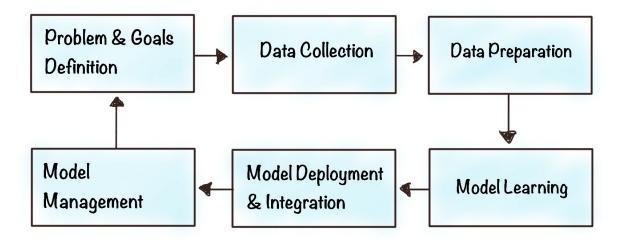




## **Processes and People**



## **Machine Learning Model Development Process**



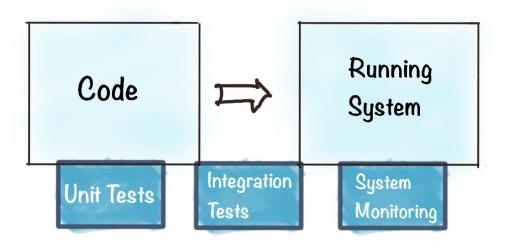


#### **Split into 3 Teams** One team to enrich data by labeling it and build annotation tools Labeling Data Collection Configuration Monitoring One team to collect, ML Algorithms condense and massage Data Selection the data as well as to Analysis Tools train and validate the algorithm Data Verification **Annotation Tools** One team to build the data pipeline and surrounding stack to host the model

Infrastructure

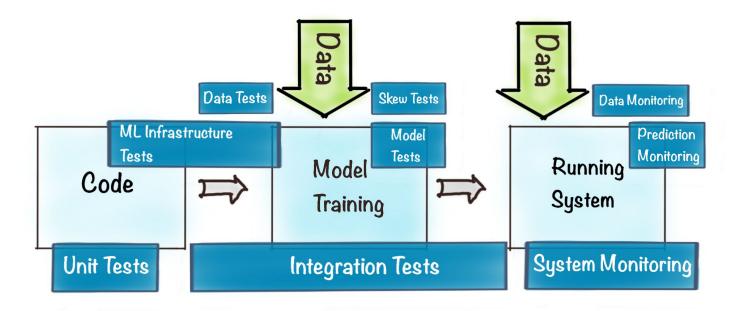


## **Traditional System Testing and Monitoring**





## **ML-Based System Testing and Monitoring**



Behavior depends on dynamic qualities of data and model configuration choices



## **Conclusion**



#### It's all in the data!

### Conclusion



**UAI** is an awesome company

Quality, Quantity and Diversity of training and validation data enable high performance Al Systems

Validation requirements might have an insane impact on effort

Build a data engine!

QA for production grade ML Systems is highly complex



# Feedback, please. Thanks!



## Software 2.0 Fueling the Al Revolution!

## Q&A



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