



**KIDELTA**  
**LEARNING**

Scalable AI for Automated Driving

Final Event | March 09, 2023

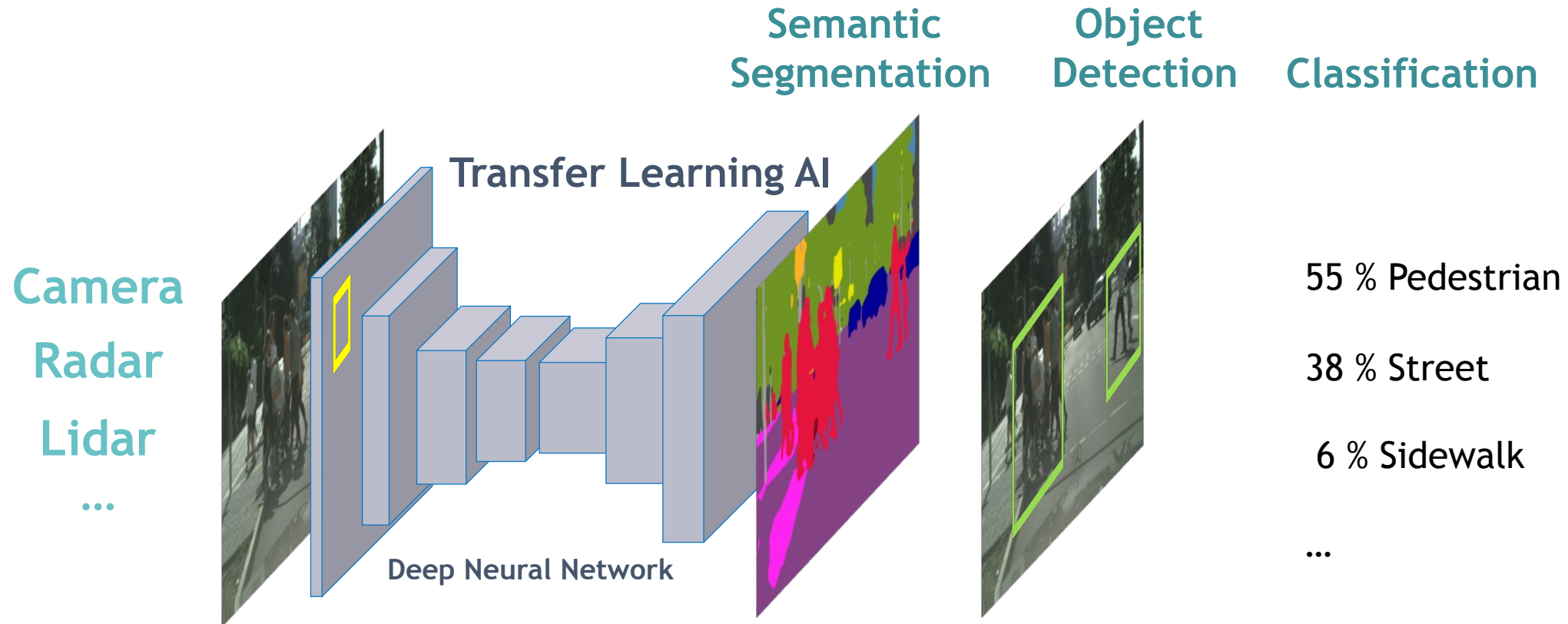
# Transfer Learning - Overview

Jens Mehnert | Bosch





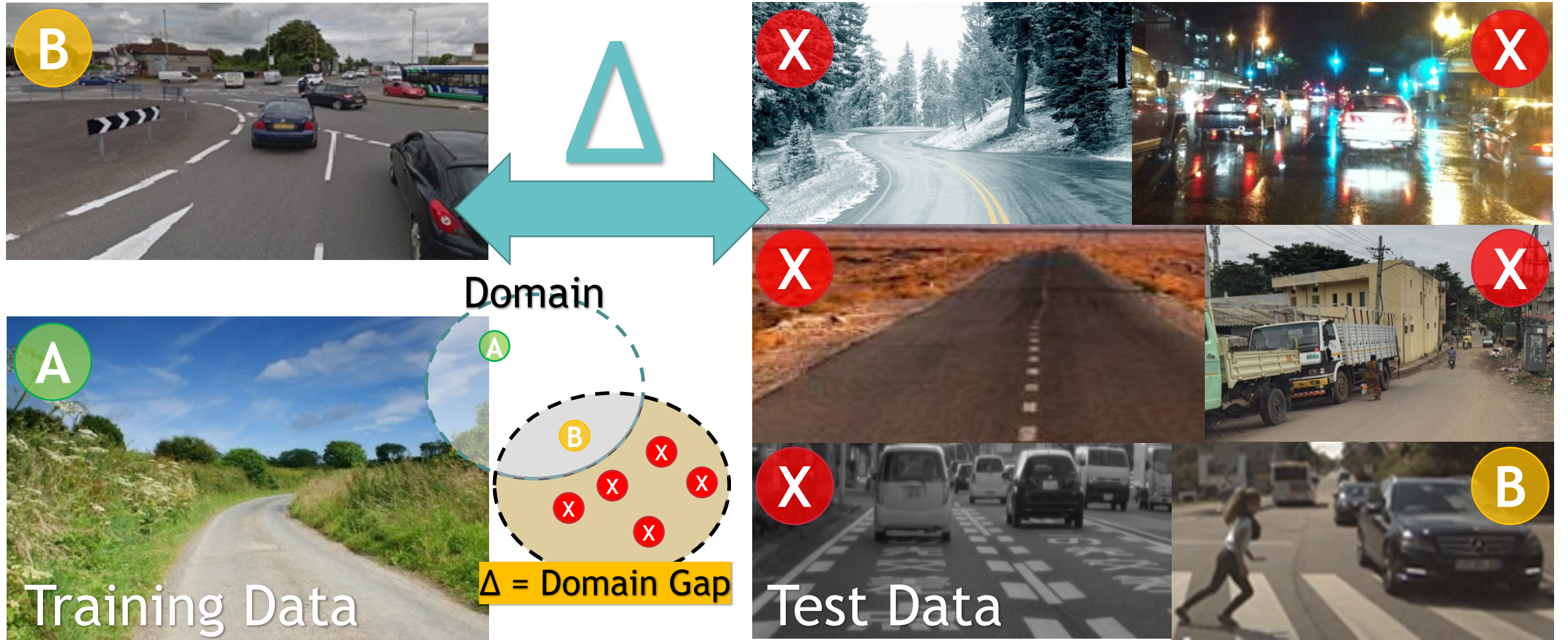
# Transfer Learning Tasks



$$f \left( \begin{array}{c} \text{Input} \\ \text{(Domain)} \end{array} \right) = \text{Output (Domain)}$$



# Transfer Learning Problem Statement



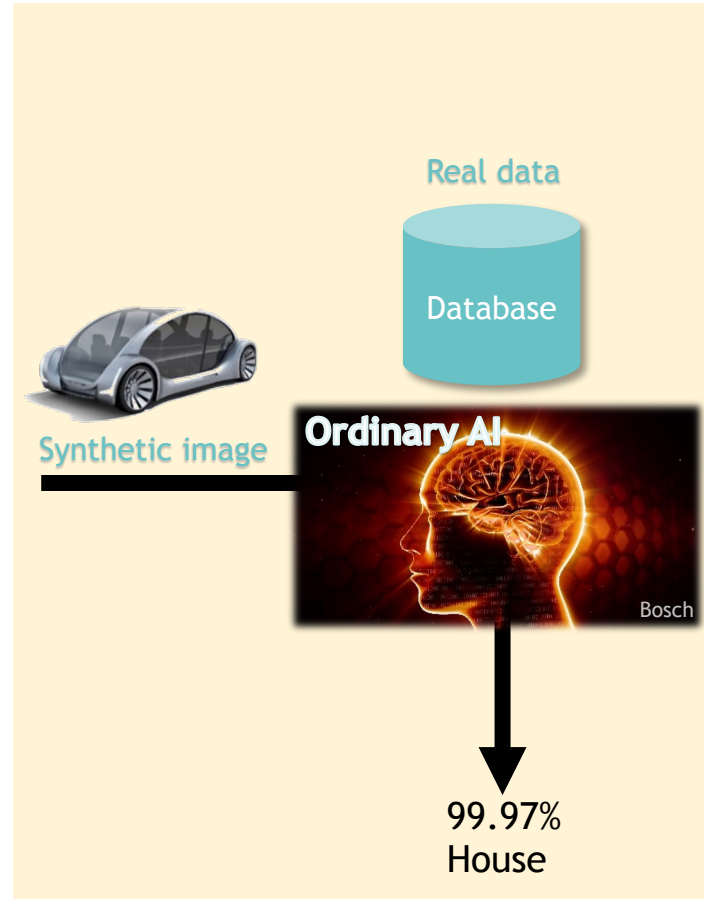
Bosch

Bosch

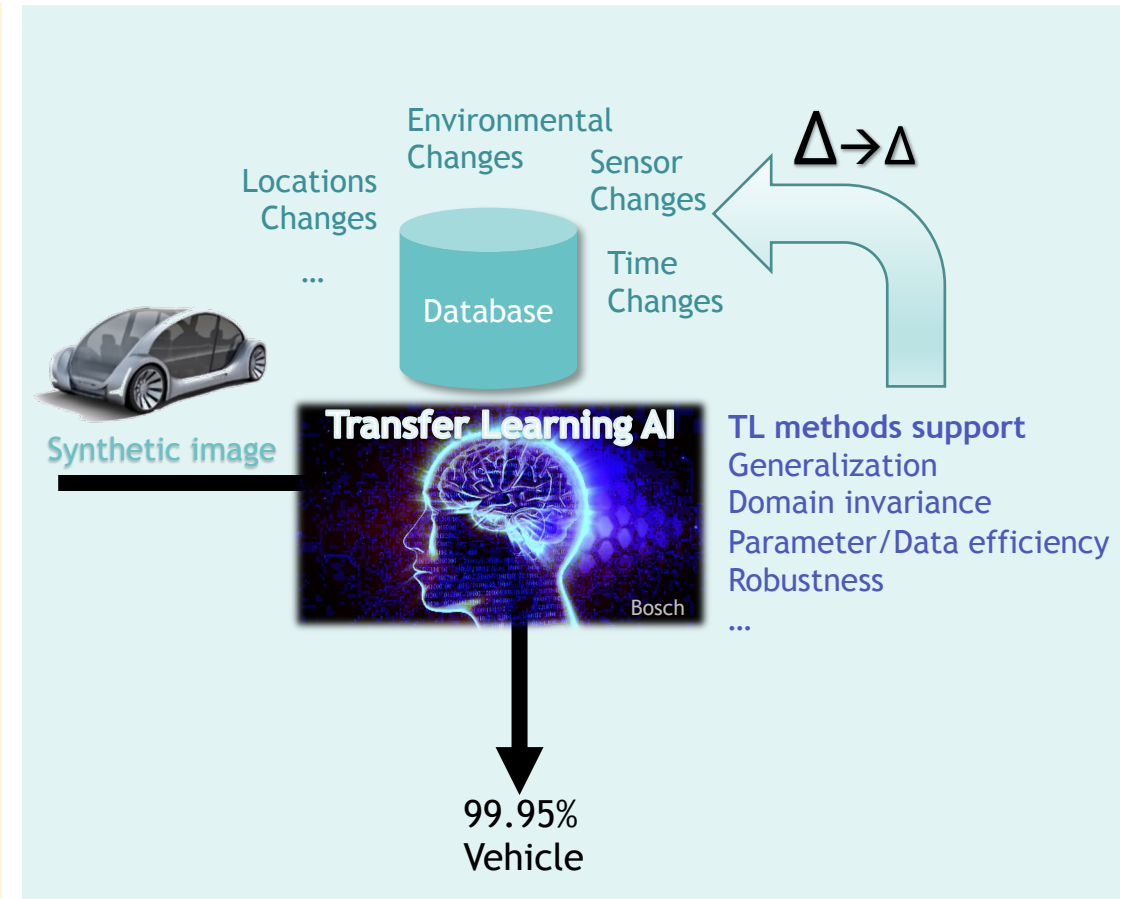
# Transfer Learning In a Nutshell



Human



AI Today



AI with Transfer Learning



# Transfer Learning In the Project



## *Continuous Learning*

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Bosch

## *Synthetic data*

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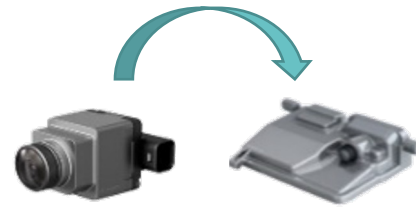
Bosch



Bosch

## *Cross-Sensor-Adaption*

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Bosch

## *Time and place adaptation*

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Bosch

## *Environmental adaptation*

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Bosch

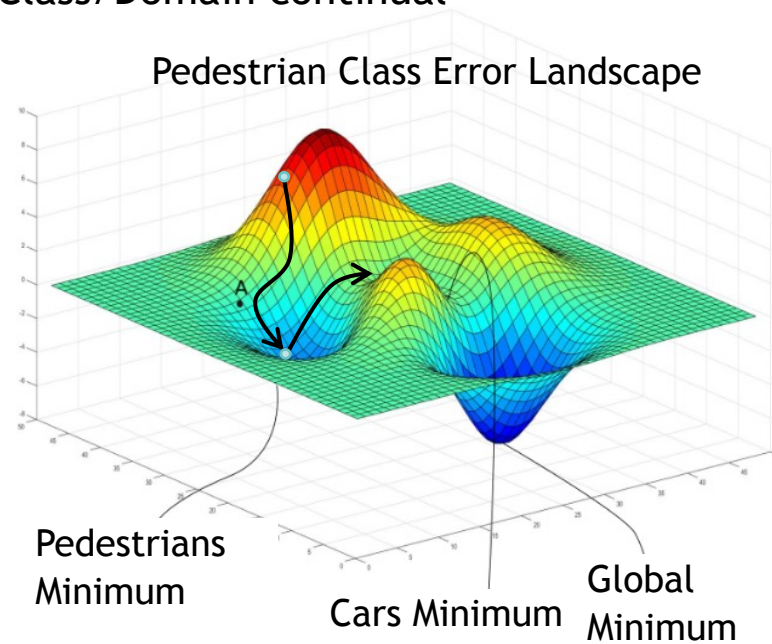


# Transfer Learning Solutions

## Continuous Learning

### Catastrophic Forgetting

- Important for transfer learning
- **Competitive relevant benchmarking**
- Class/Domain continual



### Federated Learning

- If Data and/or model(s) cannot leave a country
- **Train in a secured virtual space**

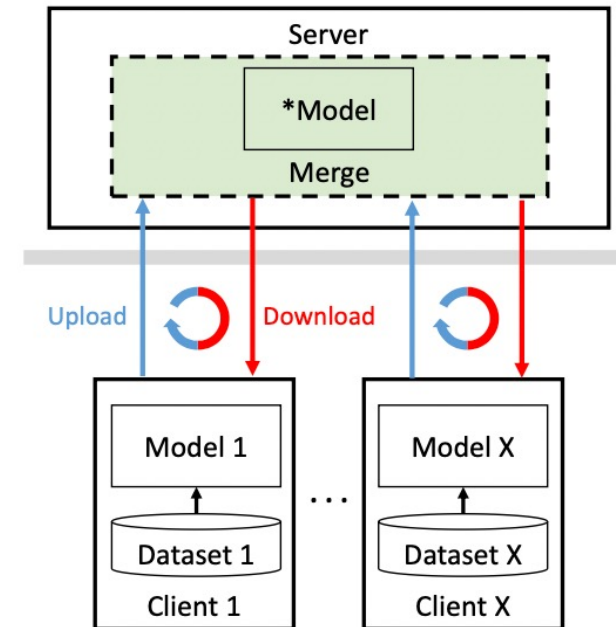


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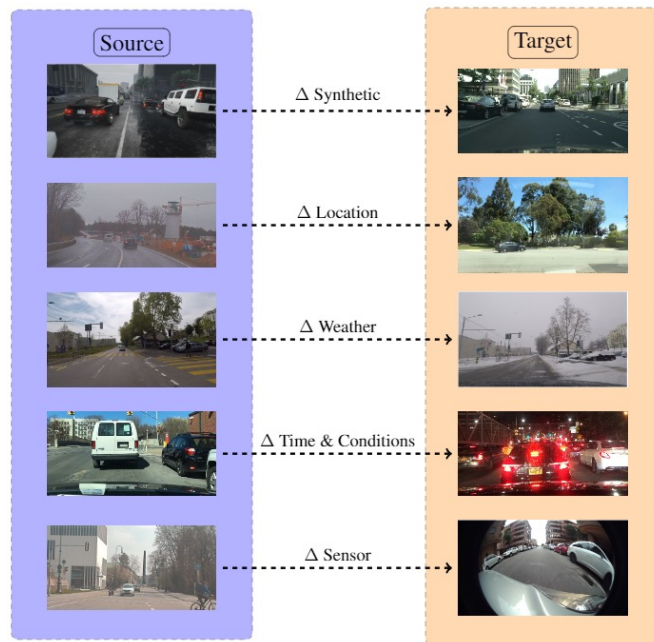


# Transfer Learning Solutions

## Synthetic data

### Causal Learning

- Avoid learning non-relevant features
- Invariant features
- Synthetic data → easy to change  $\Delta$



### Simulation to Real

- Analyse Deltas of special cases
- Transfer annotations from simulated data
- Inject the rendered objects into real scenes → More training data

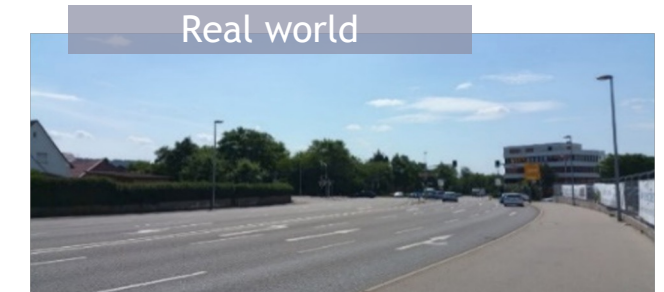


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# Transfer Learning Solutions

## Cross-Sensor Adaptation

### Knowledge Graphs

- Use arbitrary Data to improve your ML Algorithm
- Realising a better knowledge transfer (embedding)

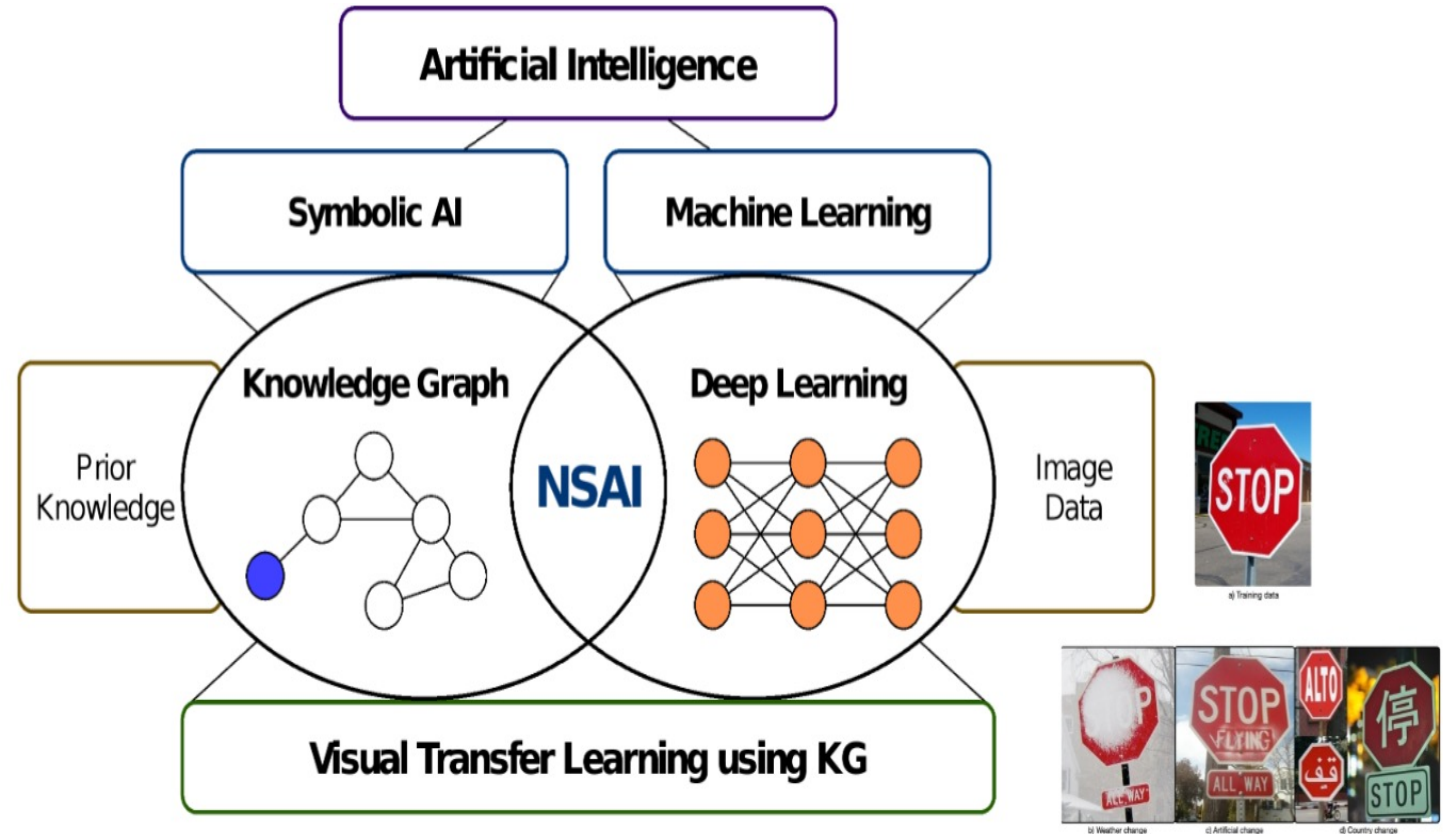


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# Transfer Learning Solutions

## Time and place adaptation / Environmental adaptation

### Robustness

- Robust against noise/corruptions
- Robust against corner cases
- Remain quality on clean data

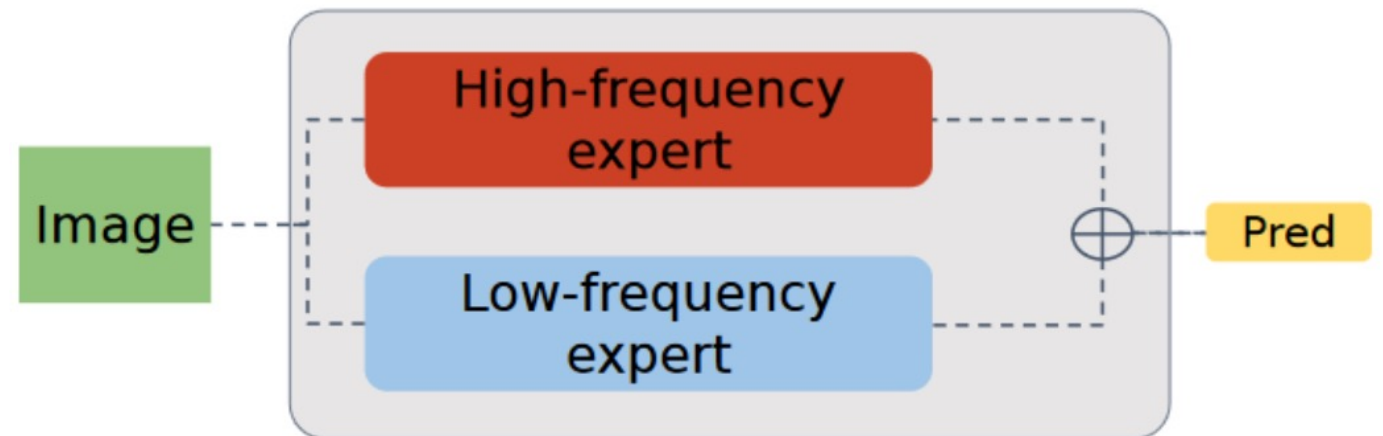
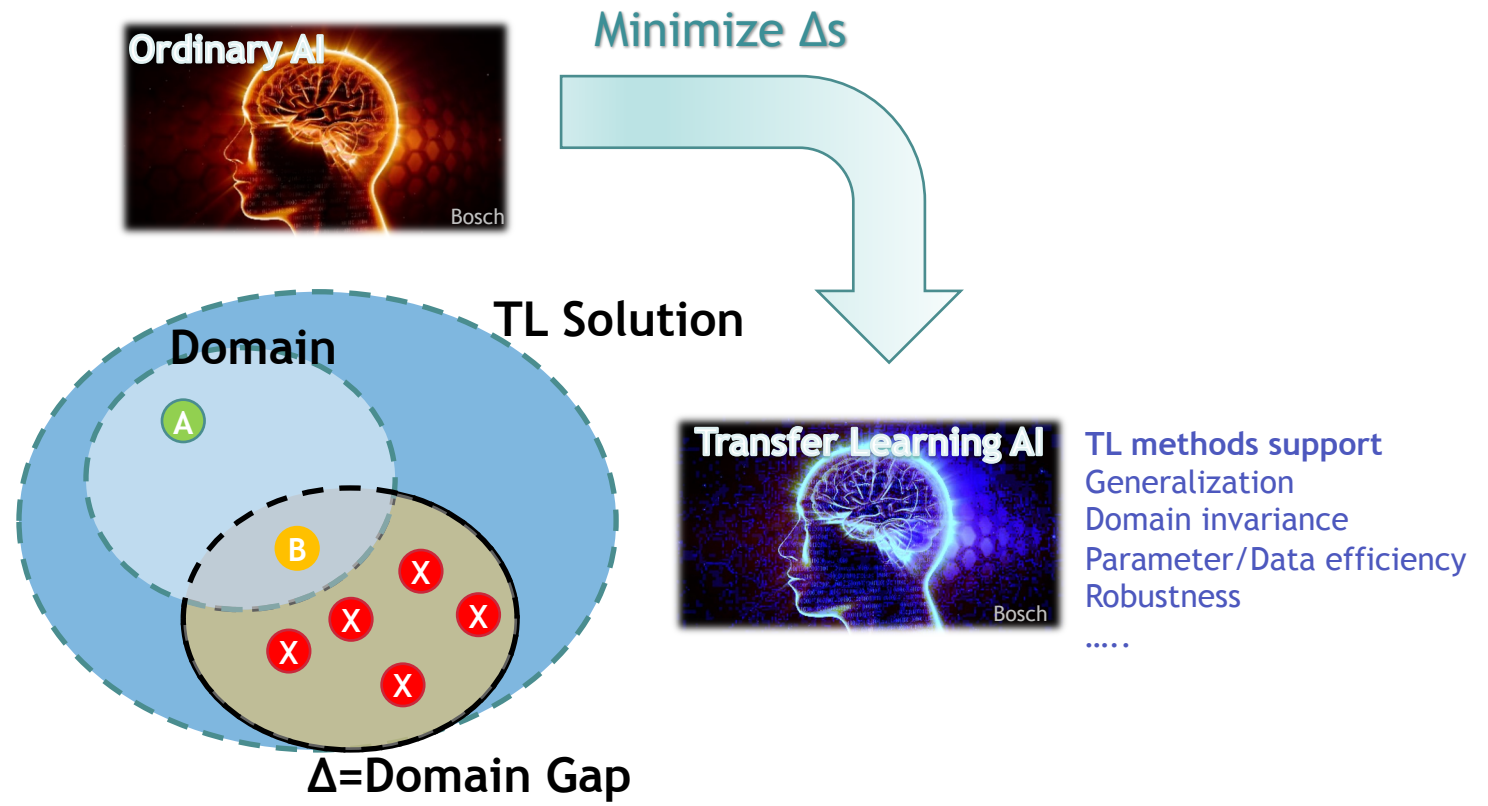
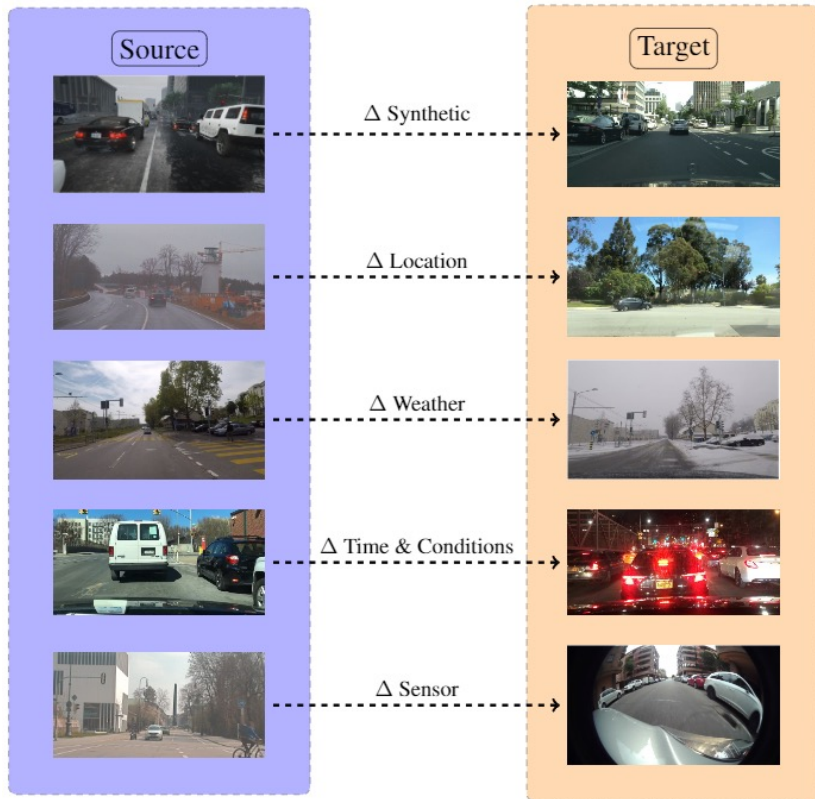


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# Summary



Too much data variation  
→ Expensive/Impossible





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KI Delta Learning is a project of the KI Familie. It was initiated and developed by the VDA Leitinitiative autonomous and connected driving and is funded by the Federal Ministry for Economic Affairs and Climate Action.



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