

MLOps NLP Study Sessions

TRANSFER LEARNING

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**Hey, my name is
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AGENDA

Presentation

QA session, discussion

Break

Discussion

Chat

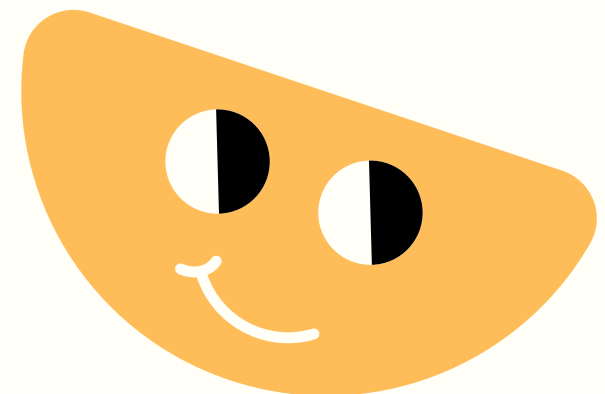
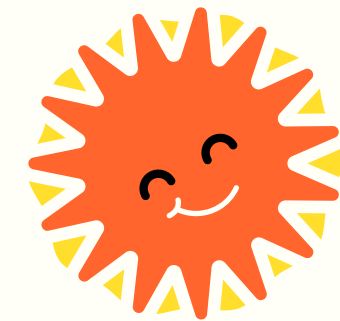
25 min

15 min

10 min

20 min

20 min



WHAT IS TRANSFER LEARNING?

Traditional ML

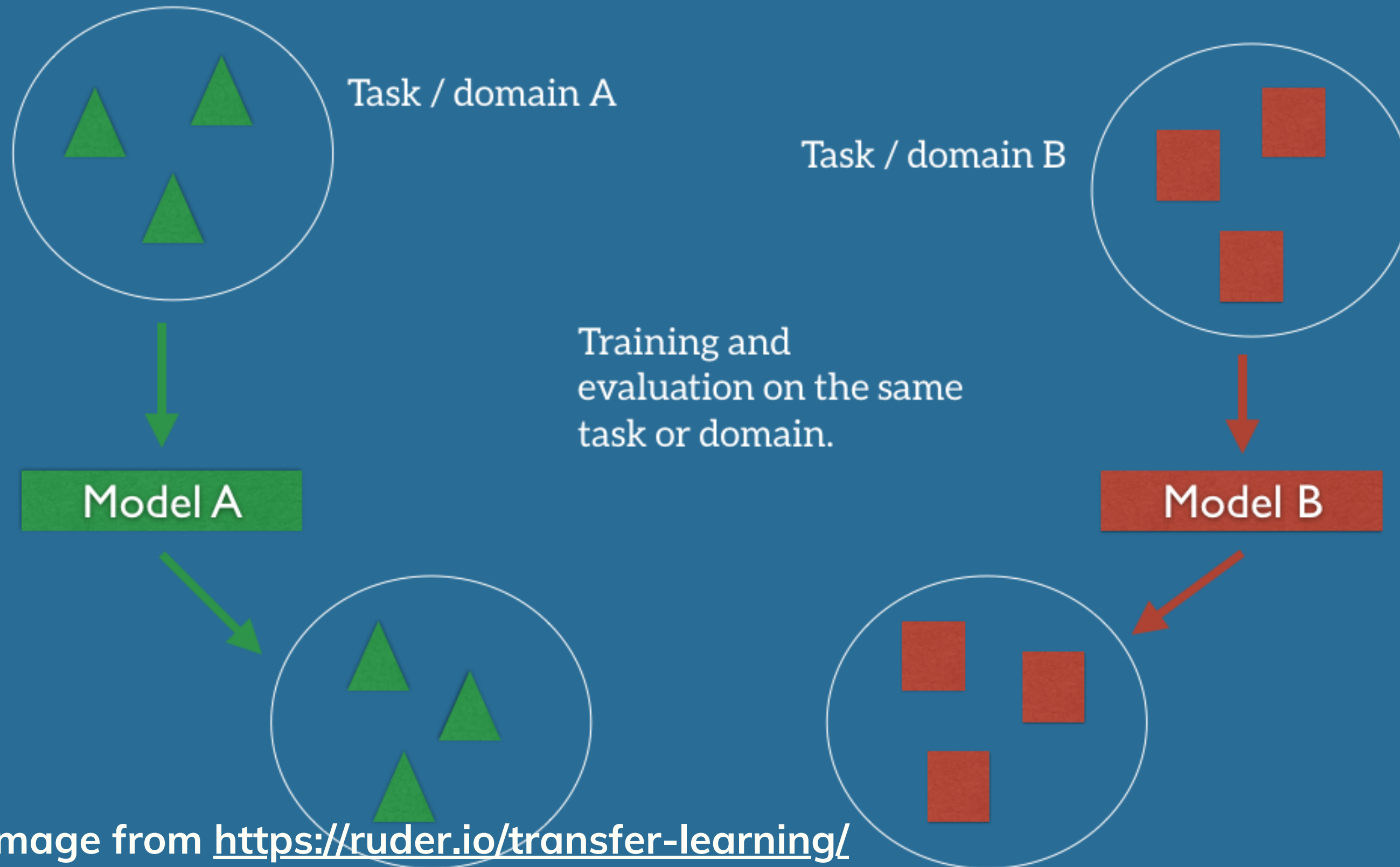
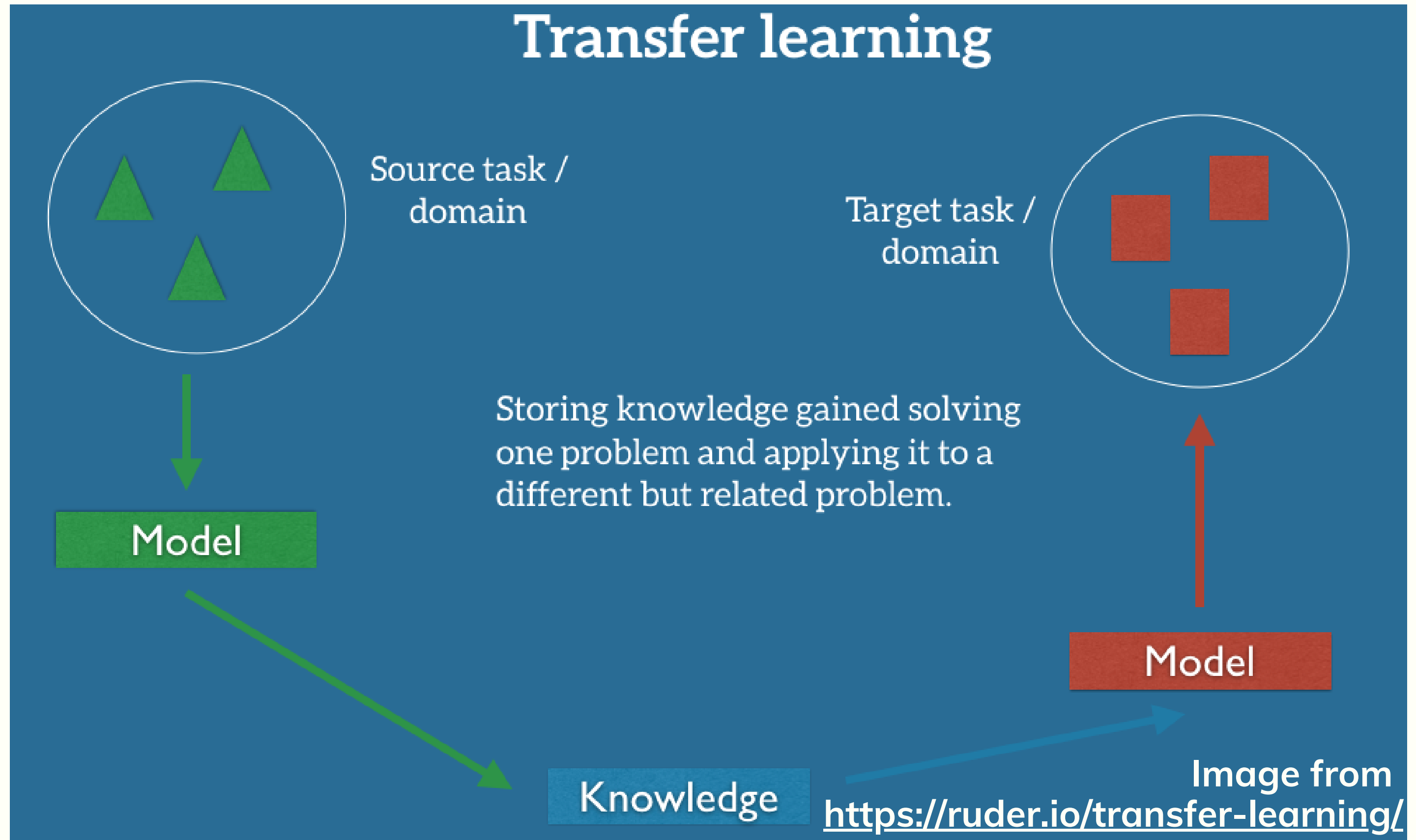
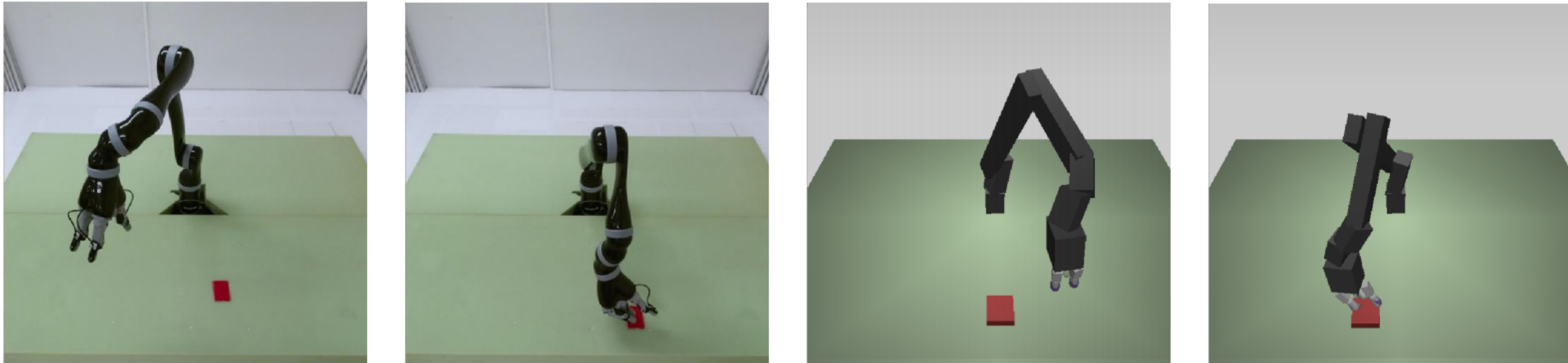


Image from <https://ruder.io/transfer-learning/>





from "Sim-to-Real Robot Learning from Pixels with Progressive Nets",
Rusu et al., 2016, <https://arxiv.org/abs/1610.04286>

Domain 1

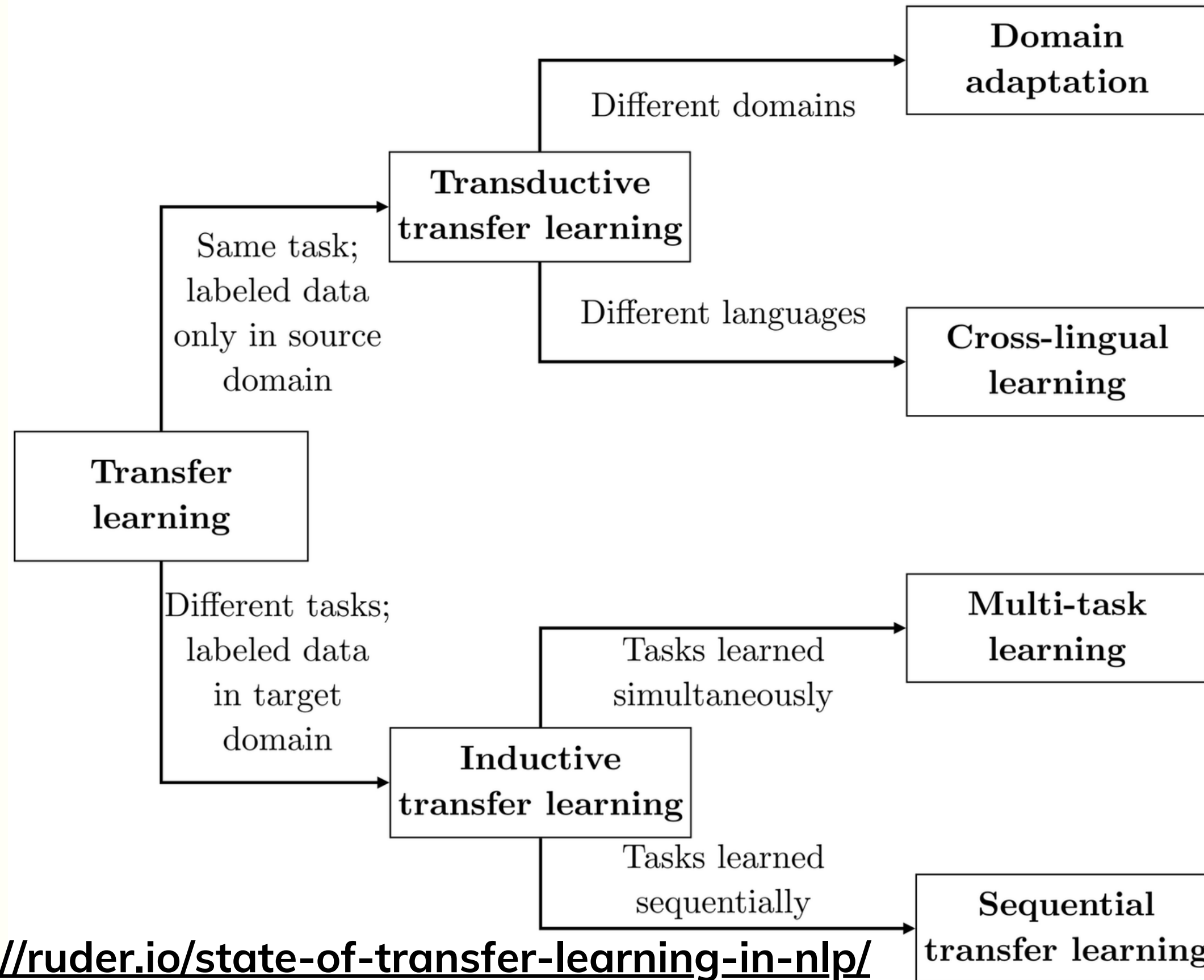


Domain 2



from "Return of Frustratingly
Easy Domain Adaptation",
Sun et al., 2016,
<https://arxiv.org/abs/1511.05547>

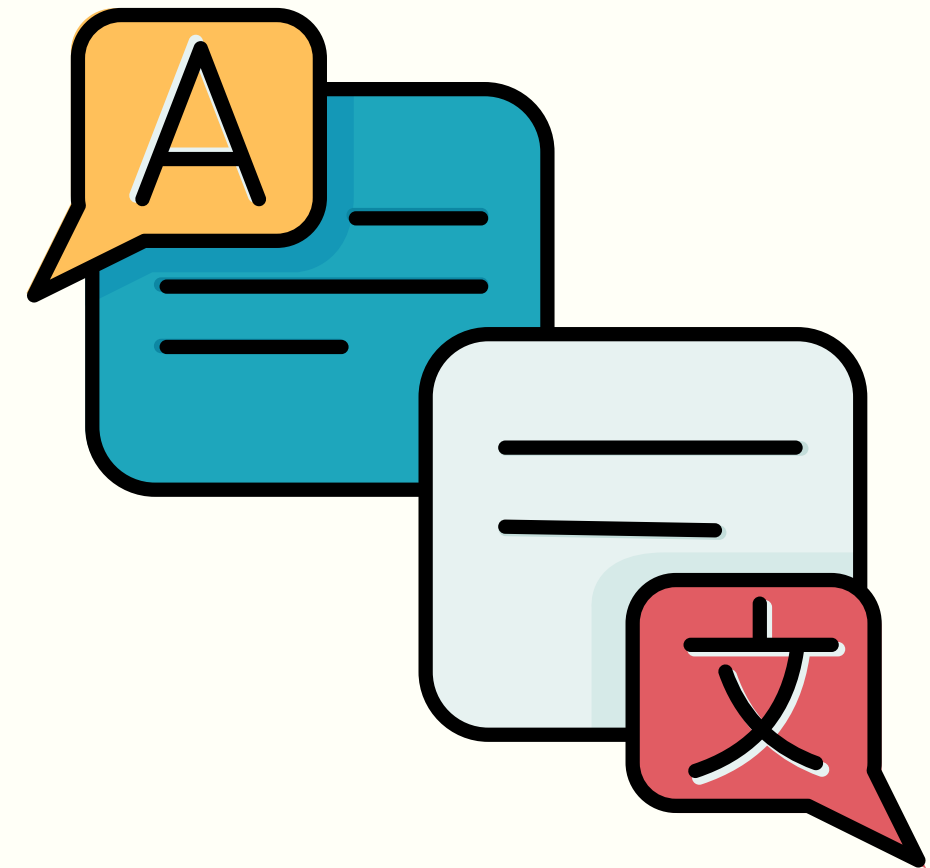
TRANSFER LEARNING IN NLP



from <https://runder.io/state-of-transfer-learning-in-nlp/>

Trends

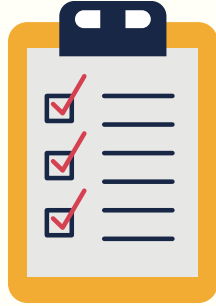
- Contextualized word representations
- Language modeling (probability distribution over strings of text)
- Large scale models
- Choice of pre-training and target tasks





Pre-training

- **Self-supervised**
 - large training data
 - distributional hypothesis
 - language model-ish
 - efficient algorithms
- **Supervised**
 - lack of data
 - task-specific
 - machine translation



Target task

- Usually supervised
- Common NLP tasks
 - sentence / document classification
 - sentence pair classification
 - natural language generation
 - structured prediction
 - word-level tasks

Adaptation

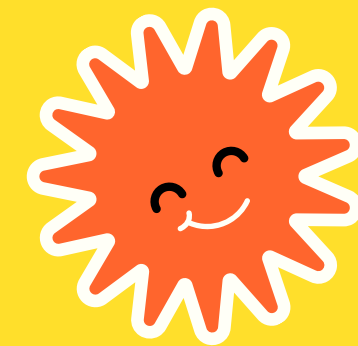
- **Architectural modifications**
 - keep internal structure
 - change internal structure
- **Optimization schemes**
 - feature extraction
 - fine-tuning
- **Getting more signal**
 - sequential adaptation
 - multi-task fine-tuning
 - data slicing, distilling, etc.



SOURCES

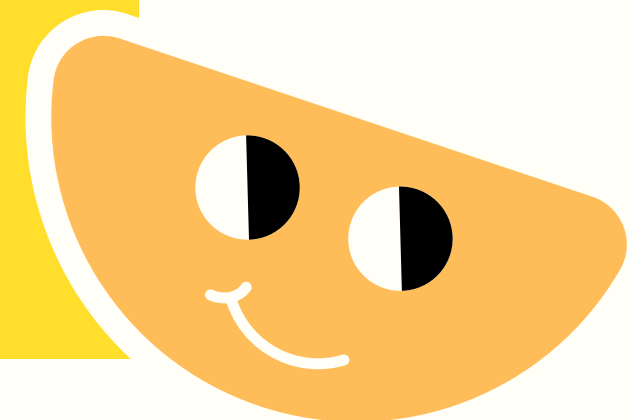


Transfer Learning in Natural Language Processing / NAACL 2019 Tutorial,
<https://vimeo.com/359399507>



The State of Transfer Learning in NLP,
Sebastian Ruder, 2019,
<https://ruder.io/state-of-transfer-learning-in-nlp/>

Transfer Learning - Machine Learning's Next Frontier,
Sebastian Ruder, 2017
<https://ruder.io/transfer-learning/>



Discussion points

- Drawbacks of pretrained language models
- How to choose pre-training models?
- Meta-learning
- Bias in pre-trained models

