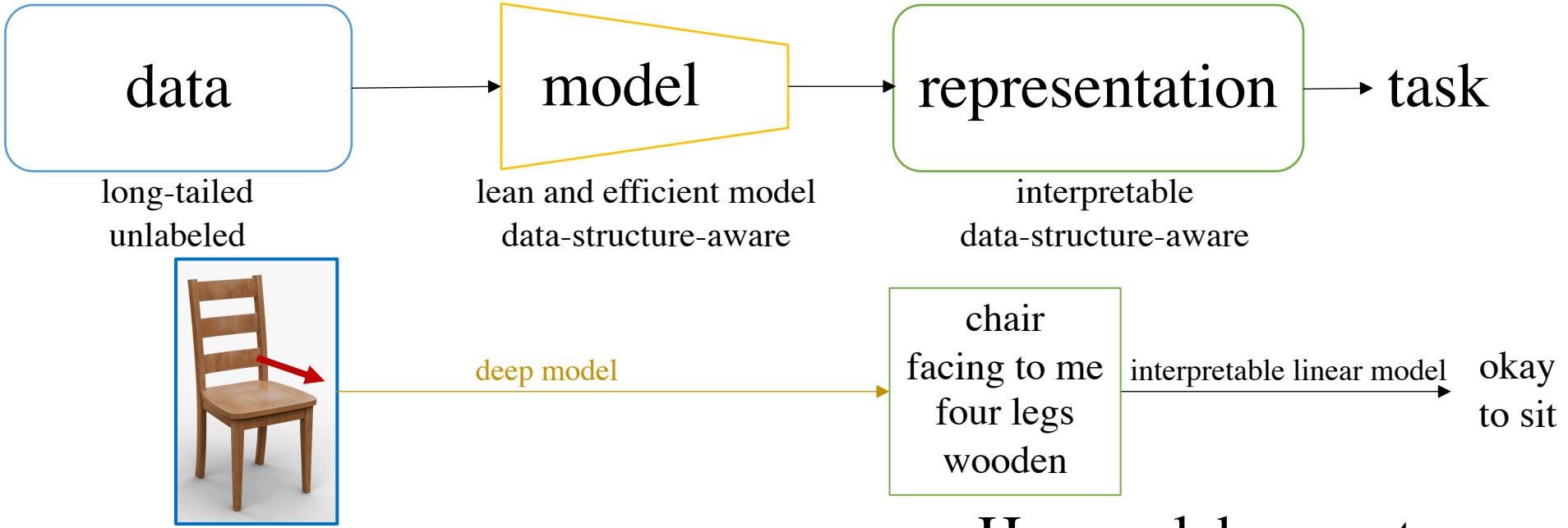


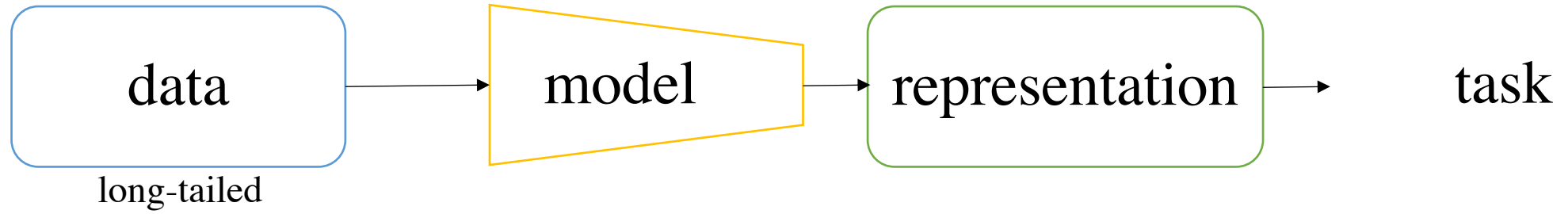
Machine Learning Pipeline



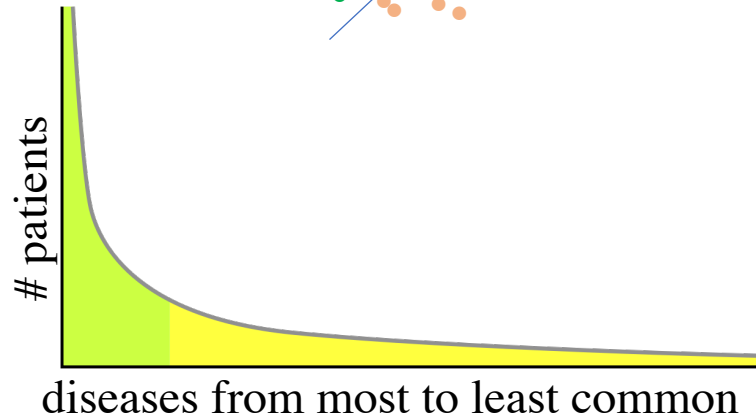
Goals: High accuracy with low cost { Human labor cost
Computation cost

Interpretability

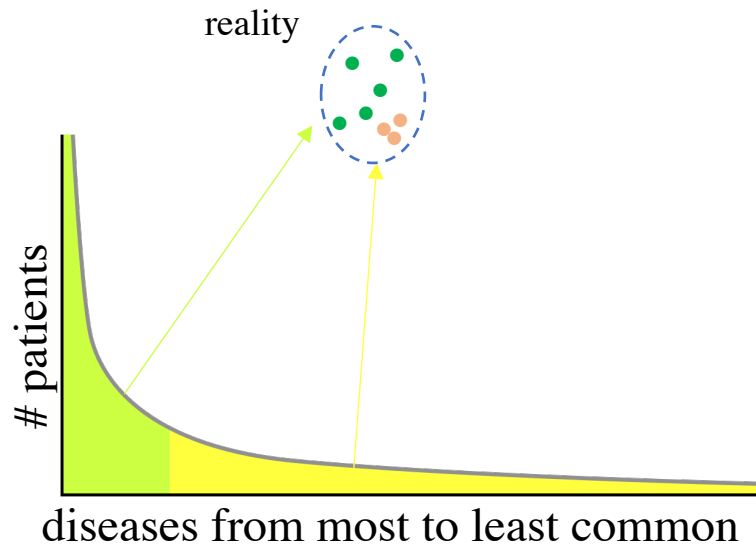
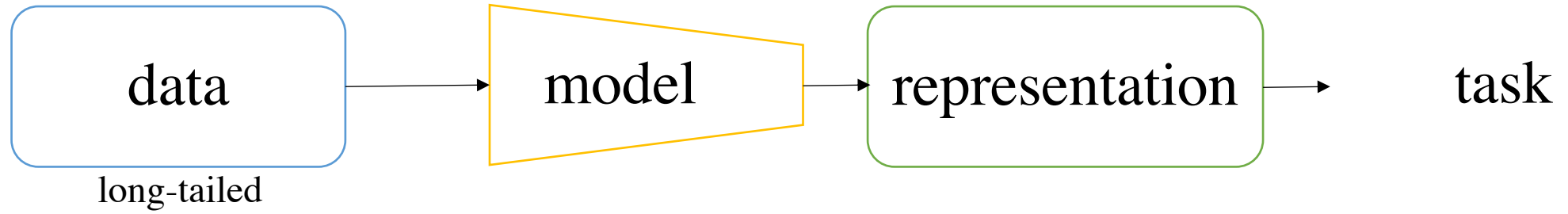
Data-Driven Structure-Aware Learning



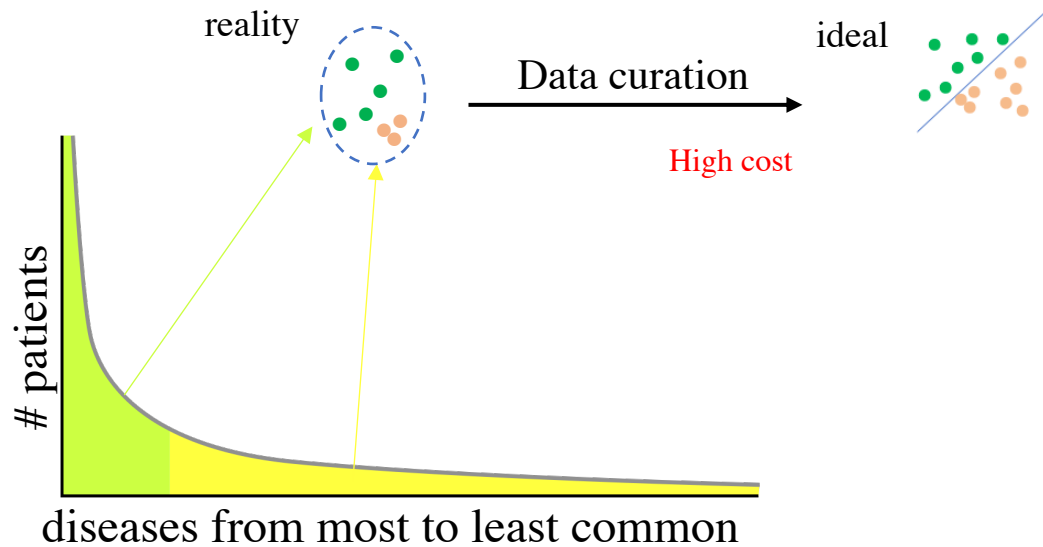
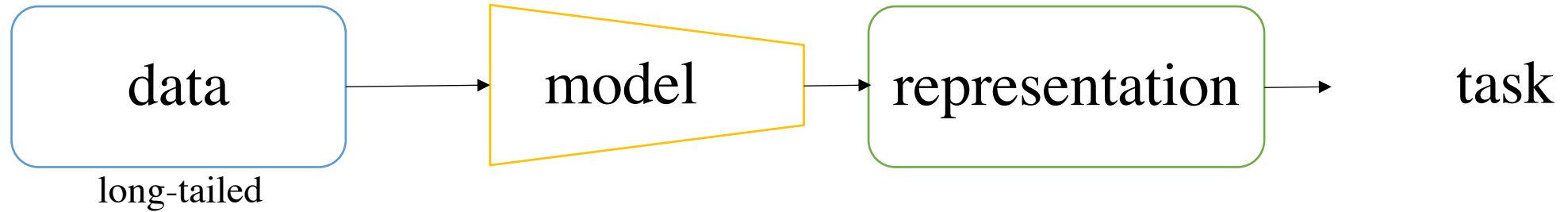
ideal



Data-Driven Structure-Aware Learning

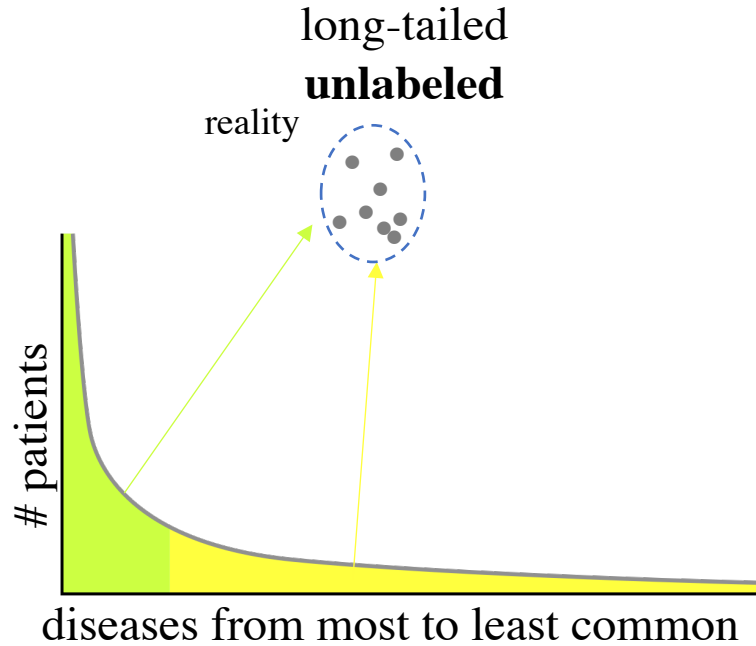
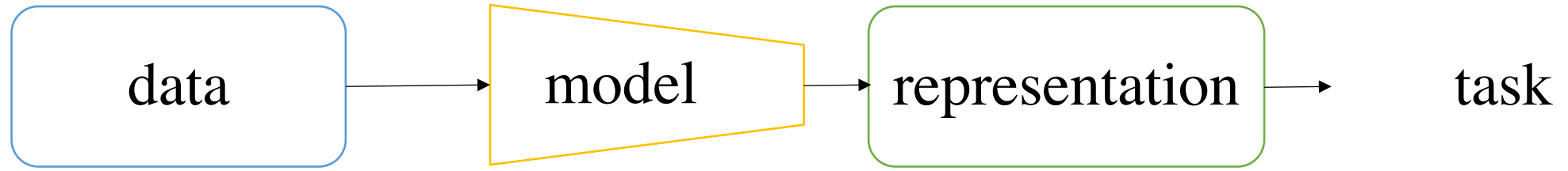


Structure-Aware Learning for Real-World Applications



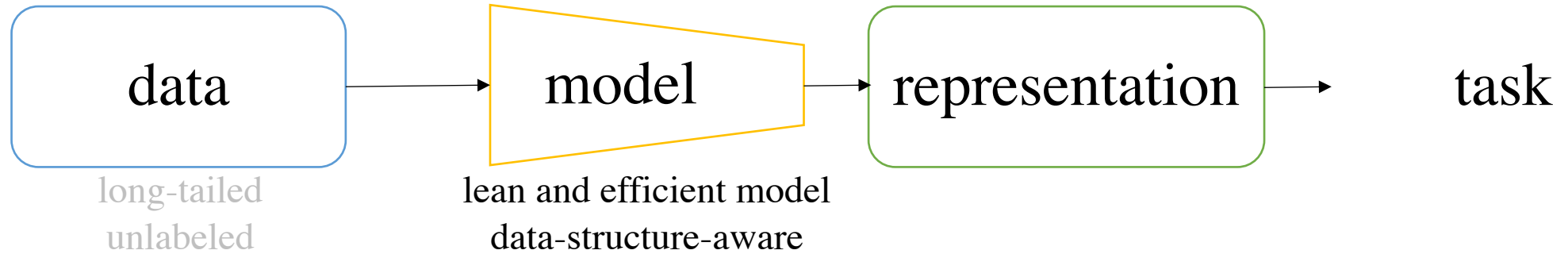
Better model for imbalanced data?

Data-Driven Structure-Aware Learning

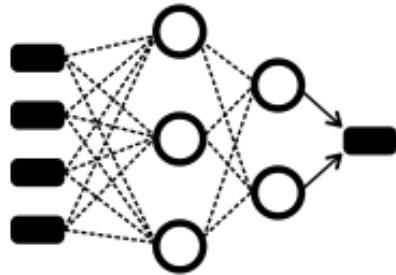


- Labeling large-scale data takes long
- Labels could be ambiguous
- Labels reflect human bias

Data-Driven Structure-Aware Learning



Structures in data



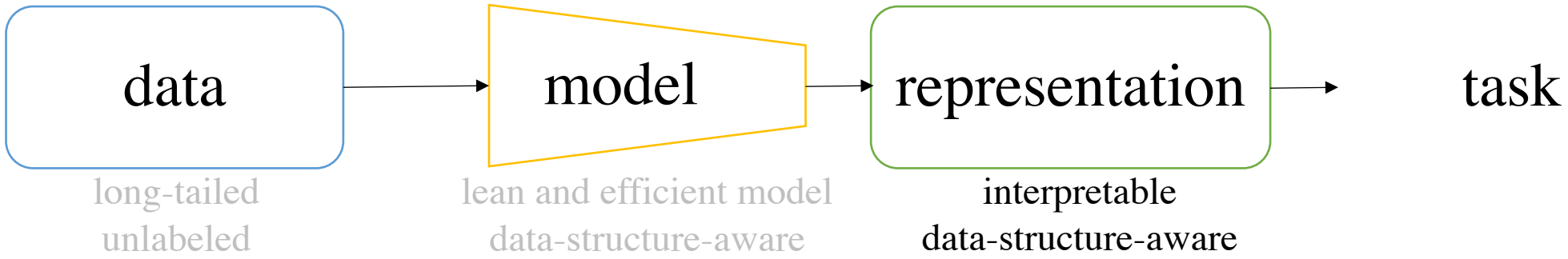
Structures in model

Constrained neural optimization:

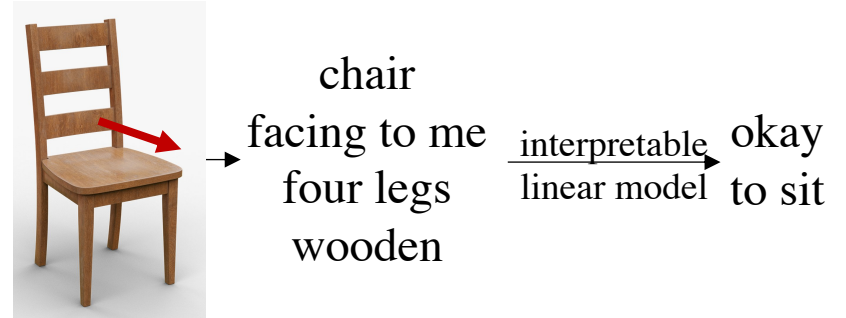
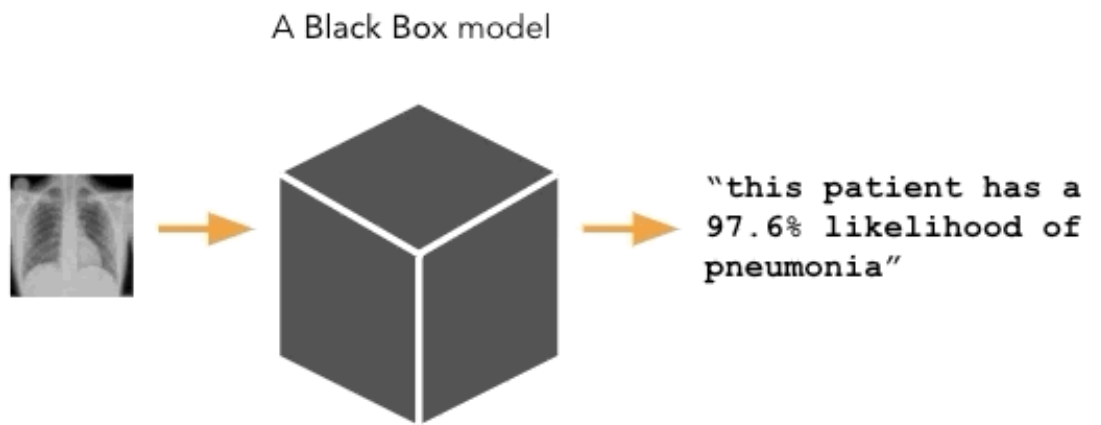
- Higher performance for small data
- Faster training and inference time

- Prior information on structures requires less training data
- Small models → faster, lower computation cost and latency

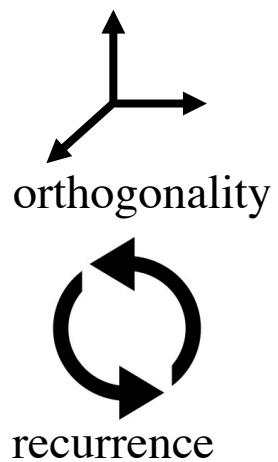
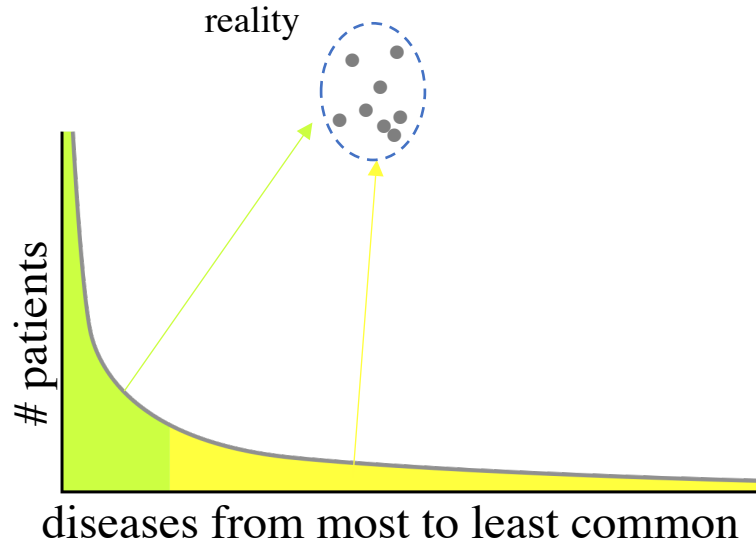
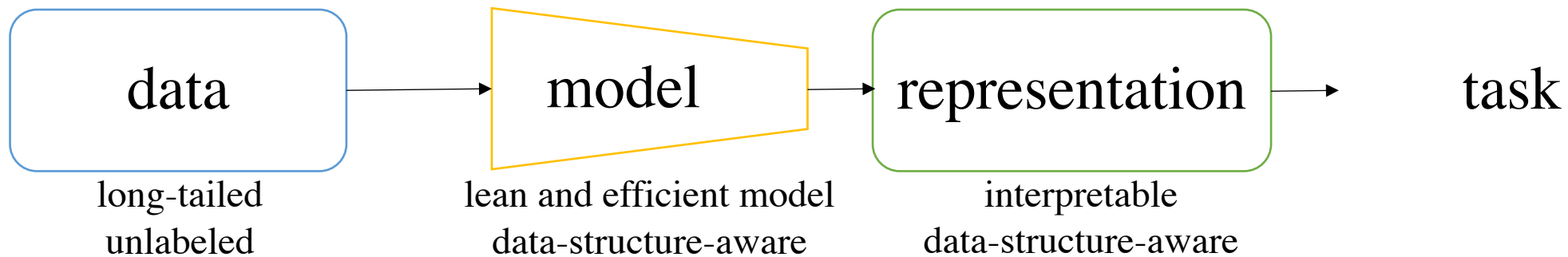
Data-Driven Structure-Aware Learning



Deep models are hard to interpret



Summary



low latency -> deployment

