

3.4 Knowledge-Based **Comparison of CNNs**

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Figure 1: Indirect feature space comparison via semantic concepts and sample attributions

Motivation

- Informed model selection for AI safety.
- Selection of the best model (among several) based on their knowledge.

Problem

- Existing methods foremostly utilize performance or error-estimation metrics.
- Different networks have different architectures and may learn different internal representations.

Solution

- Knowledge representation via semantic concepts which correspond to natural language concepts (e.g., head, tyre).
- Abstraction of concepts grows with the depth.



Figure 2: Saliency-based concept similarity estimation



Figure 3: Comparison of mined concepts in layer 7.conv of YOLOv5 and

- Concept vector in the feature space is Concept Activation Vector (CAV) [1].
- Concept can be available *a priori* [1] or mined [2].
- CAVs enable the measurement of *concept* attribution in samples.
- By measuring concept attributions in different networks for the same samples, we compare these networks.
- Knowledge may be compared in *pair of* layers or in whole networks.
- Saliency-based and ranking-based knowledge comparison are proposed.

References:

- [1] Kim, et al., "Interpretability beyond feature attribution: Quantitative testing with concept activation vectors (TCAV)", PMLR, 2018.
- [2] Zhang, Ruihan, et al. "Invertible concept-based explanations for cnn models with non-negative concept activation vectors." AAAI, 2021.



CAV⁺



 $sim(CAV^+, X_3)$

Figure 5: Layer-wise comparison of YOLOv5, RCNN and SSD around a set of concepts related to human body parts

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