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Code Available

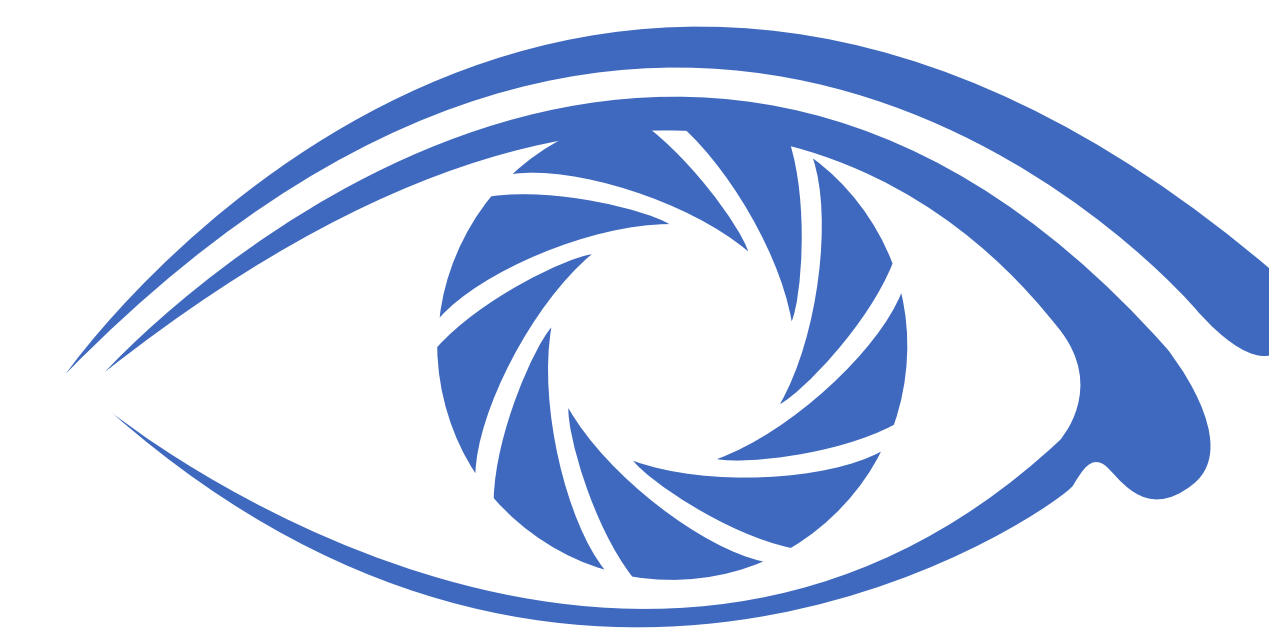
# Birds of a Feather Flock Together

## Local Learning of Mid-level Representations for Fine-grained Recognition

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Friedrich Schiller University Jena

Computer Vision Group

### Motivation

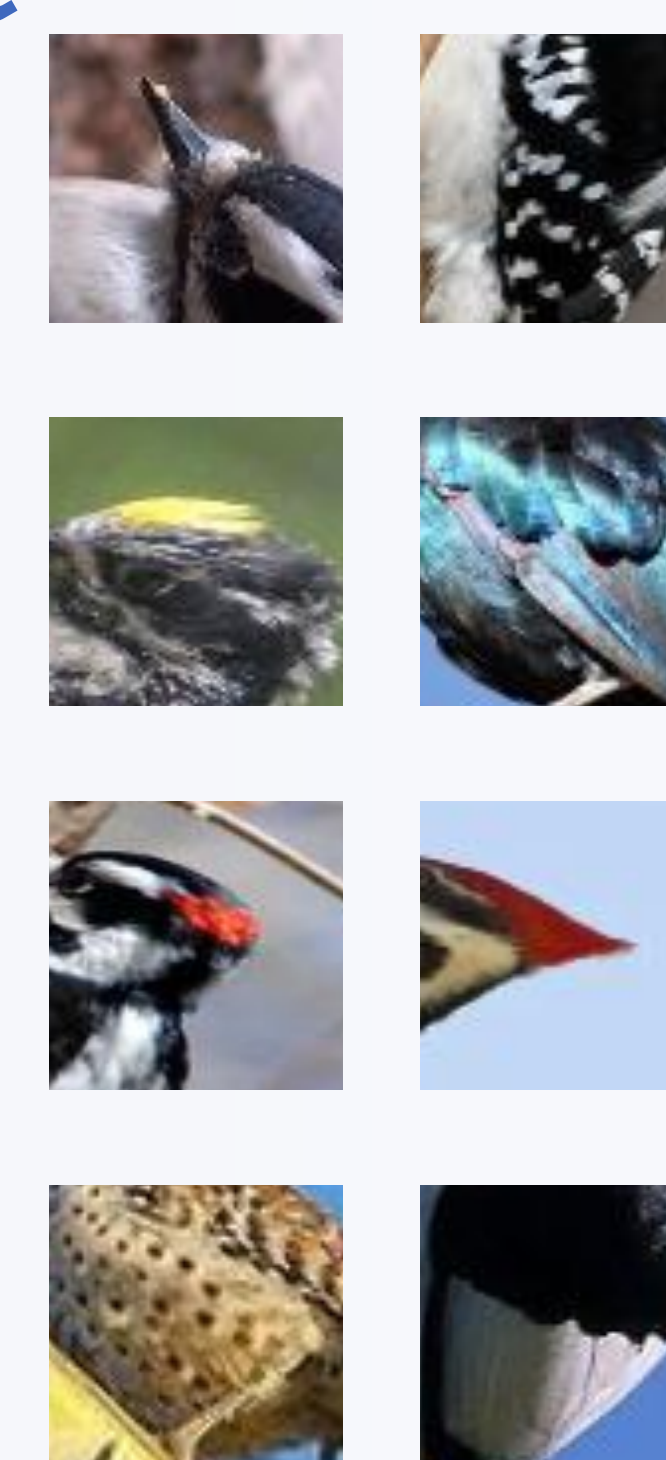
Do we need to know how to differentiate between 20 eagle species, when we currently spot a singing bird?



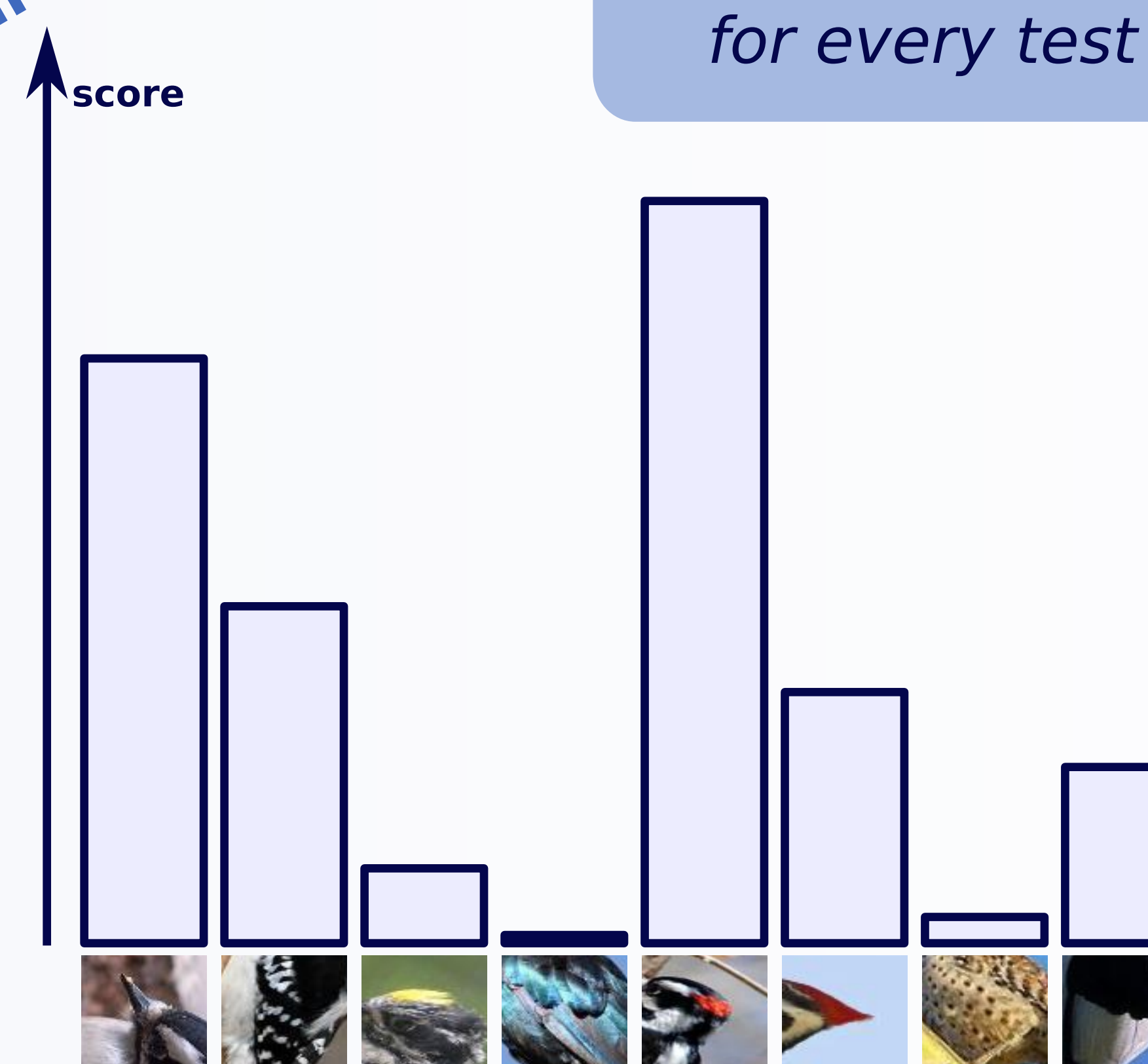
Nearest Neighbor Matching



Discovery of Discriminative Features



Encoding + Local Learning



### Approach

We propose to learn image representations **and** classification models for every test sample on the fly.

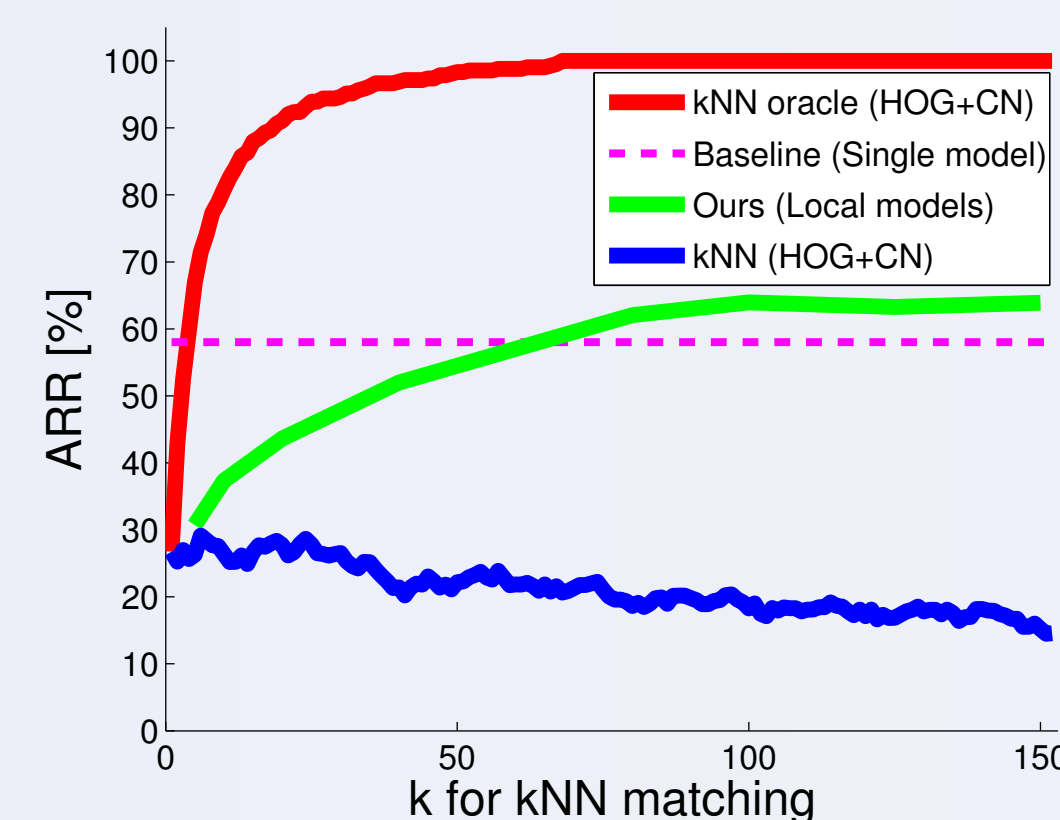
"When solving a given problem, try to avoid solving a more general problem."

V. Vapnik

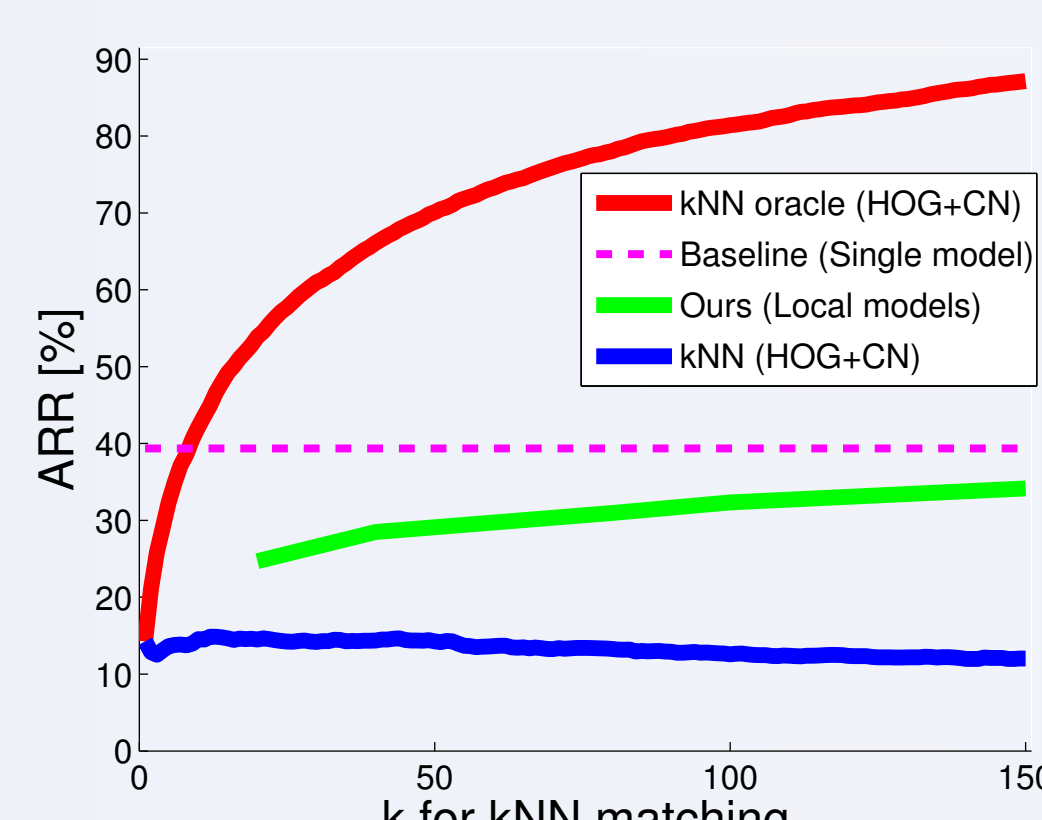
### Method

1. Find  $k$  nearest neighbors based on HOG and Color Names  
...find roughly similar birds.
2. Learn representations for those images only  
...learn subtle details.
3. Learn models with  $k$  nearest neighbors only  
...discriminate subtle details.
4. Encrypt and classify test image  
...compare subtle details with similar birds.

### Matching performance



CUB-2011-14



CUB-2011-200

Local Learning  
ECCV WS'14

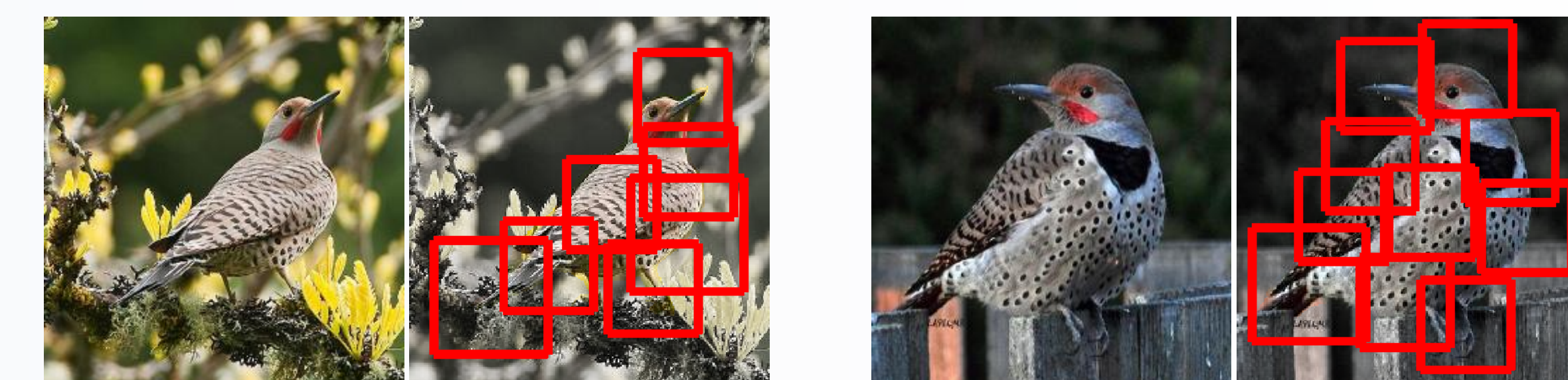
Patch Discovery  
GCPR'14

### Classification performance

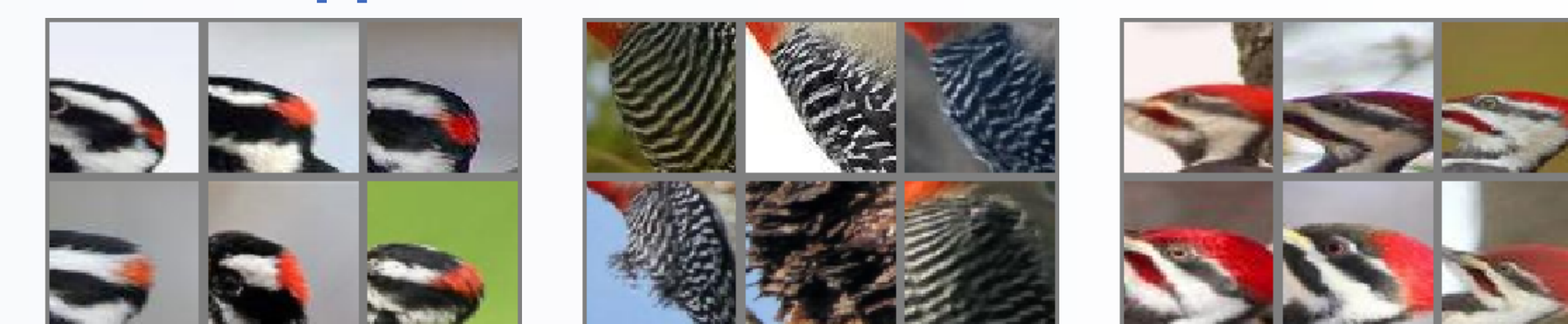
Approach	CUB-2011-14	CUB-2011-200
Dataset (Wah, TechReport 2011)	-	10.25%
Single representation	58.01%	39.35%
Local representation (K = 150)	63.89%	34.16%
Style-awareness (Lee, ICCV 2013)	-	38.31%
POOF (Berg, CVPR 2013)	70.10%	56.78%
Part-Transfer (Goering, CVPR 2014)	73.39%	57.99%
Local representation (K = 150) + (Goering, CVPR 2014)	<b>76.64%</b>	<b>58.55%</b>

Wah et al., "The caltech-ucsd birds-200-2011 dataset" (Caltech 2011)  
Lee et al., "Style-aware mid-level representation for discovering visual connections in space and time" (ICCV 2013)  
Berg and Bellamuri, "Poof: Part-based one-to-one features for fine-grained categorization, face verification, and attribute estimation" (CVPR 2013)  
Goering et al., "Nonparametric part transfer for fine-grained recognition" (CVPR 2014)  
Freytag et al., "Exemplar-specific patch features for fine-grained recognition" (GCPR 2014)

### Seeding



### Bootstrapped Detectors



### Detection Responses

