

# Object detection with grammar models

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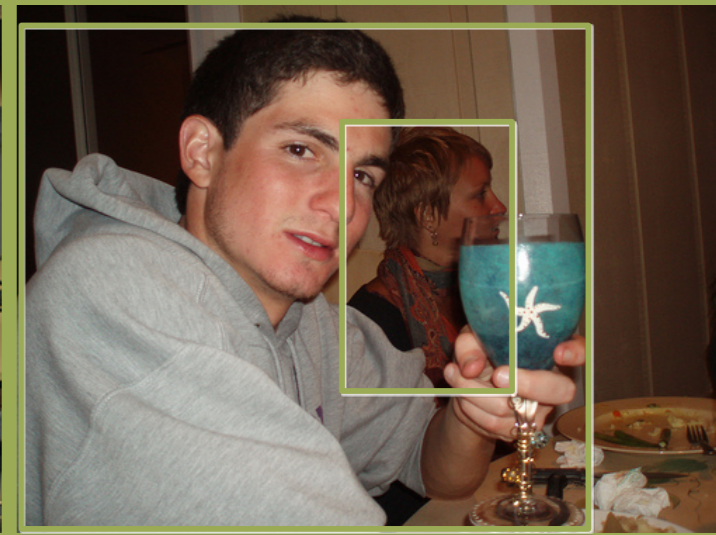
helmet,  
occluded left side



ski cap, no face  
truncated



pirate hat, dresses,  
long hair



truncation, holding glass,  
heavy occlusion

Objects from rich categories have  
diverse *structural* variation



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Neural Information  
Processing Systems  
Foundation

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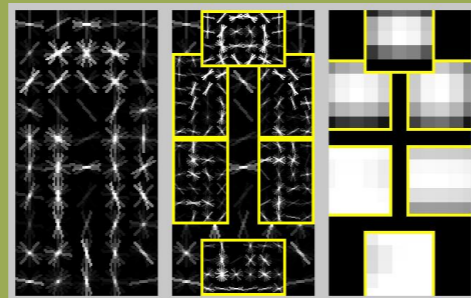
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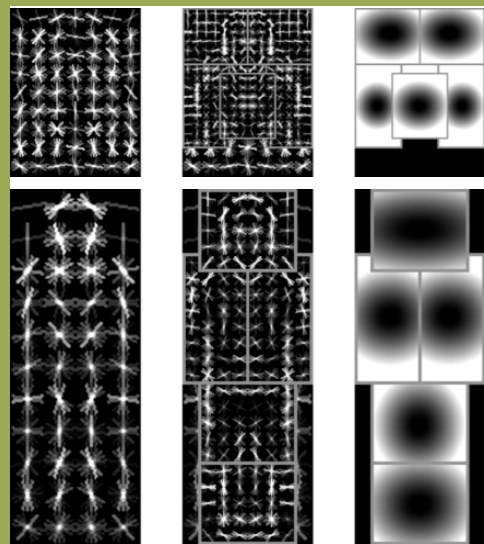
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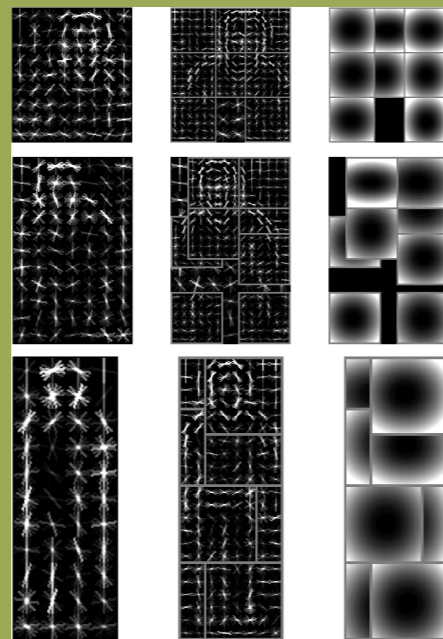
Dalal & Triggs  
CVPR 2005  
AP 0.12



Felzenszwalb, McAllester & Ramanan  
CVPR 2008  
AP 0.27



Felzenszwalb, Girshick,  
McAllester & Ramanan  
PAMI 2010  
AP 0.36



Felzenszwalb, Girshick & McAllester  
voc-release4  
AP 0.42

More mixture components?



There are too many combinations!  
Instead...

... compositional models defined by grammars

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## Localizing people with an object detection grammar

Subtype 1 Subtype 2

Example detections and derived filters

Part 1

Part 2

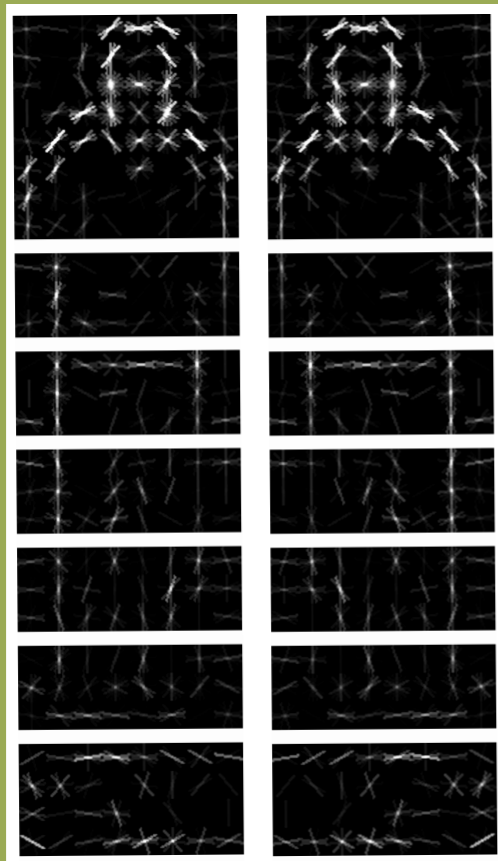
Part 3

Part 4

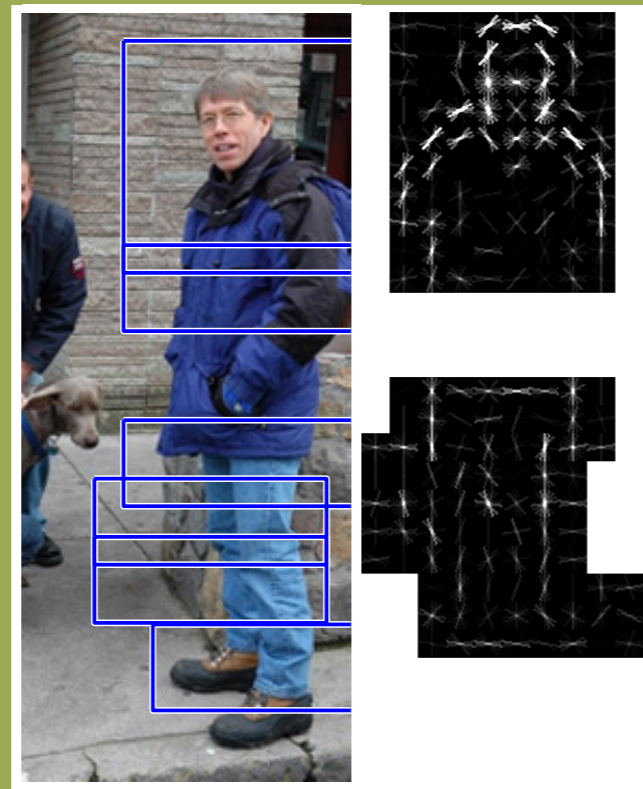
Part 5

Part 6

Occluder



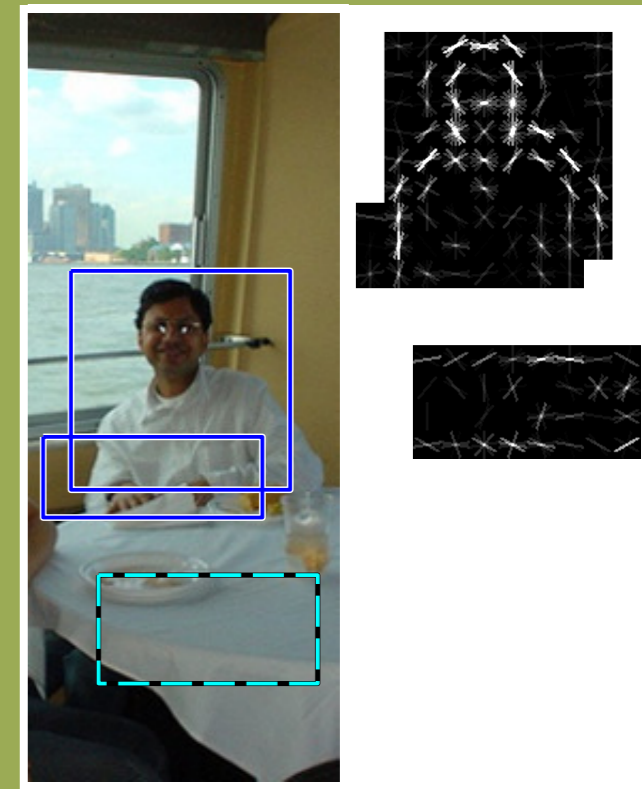
AP 0.47



Parts 1-6 (no occlusion)



Parts 1-4 & occluder



Parts 1-2 & occluder

- ★ Fine-grained occlusion
- ★ Part sharing
- ★ Non-trivial model of the *stuff* that causes occlusion
- ★ Part subtypes
- ★ Subparts at multiple resolutions

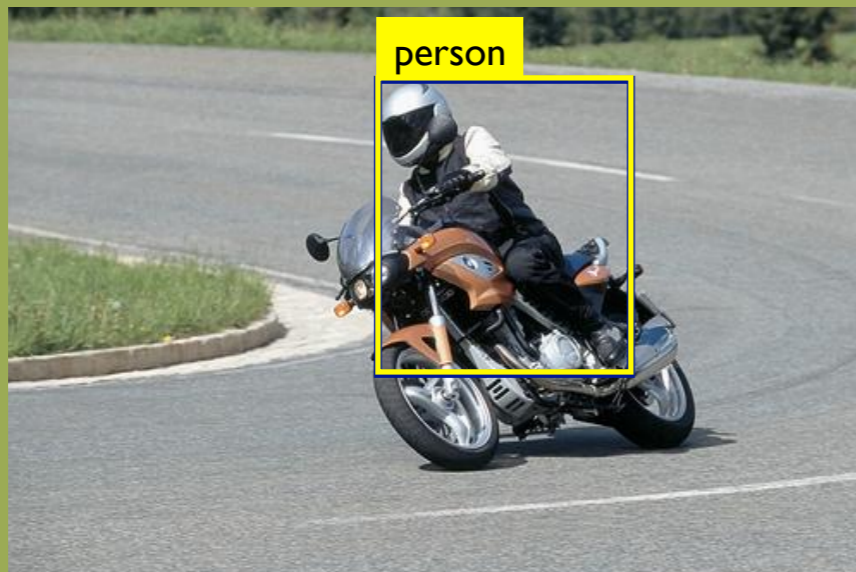
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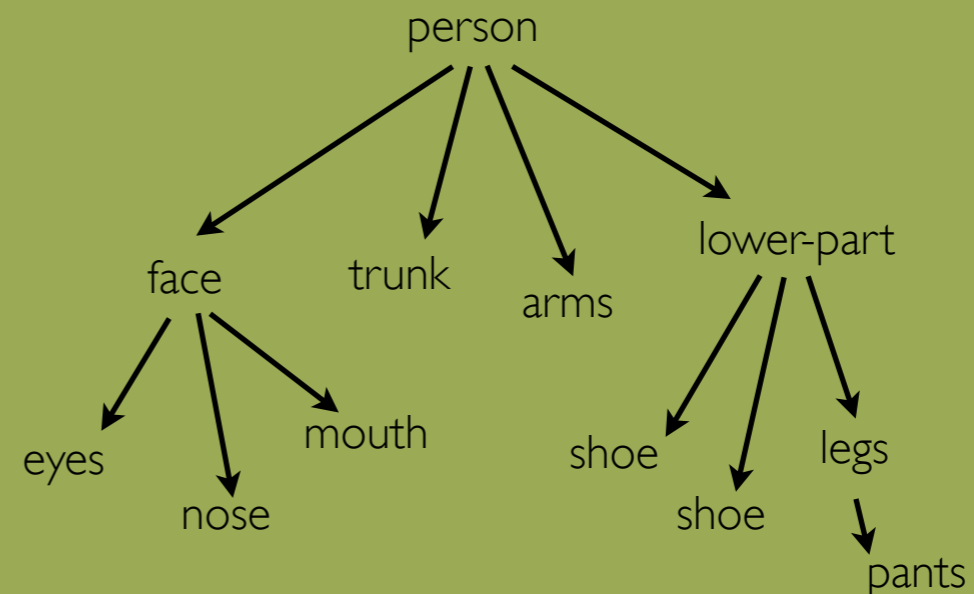
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Discriminative training when the label space  $\neq$  output space



label



output

Weak-label structural SVM  
Generalizes latent structural SVM

Top performance on PASCAL VOC 2010 'person'