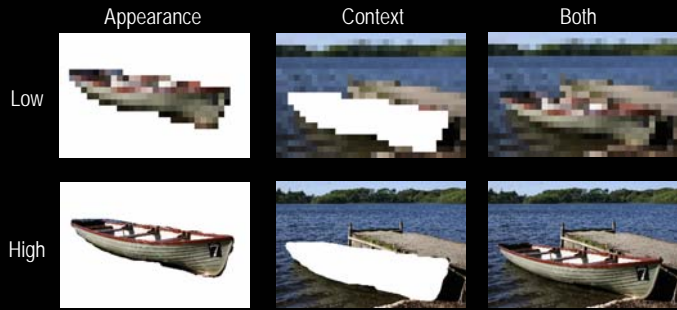


# From Appearance to Context Based Recognition: Dense Labeling in Small Images

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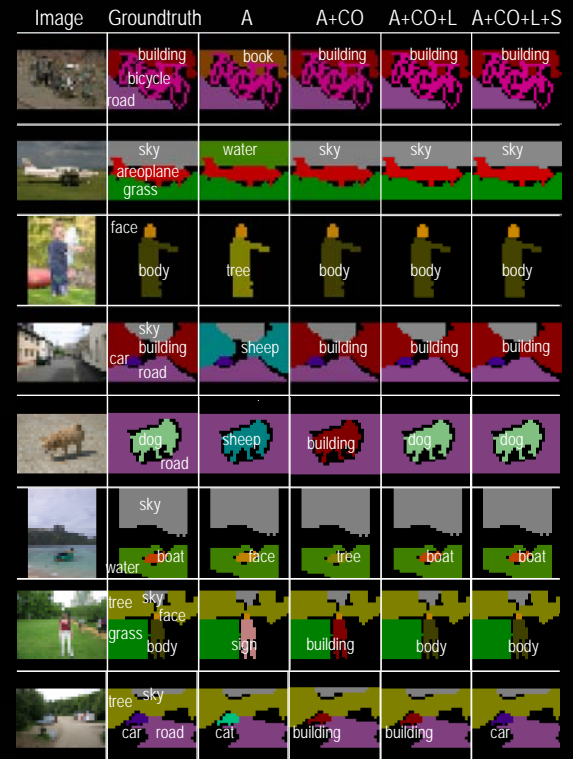
## Motivation



## Scenarios Studied



## Image Labeling Results

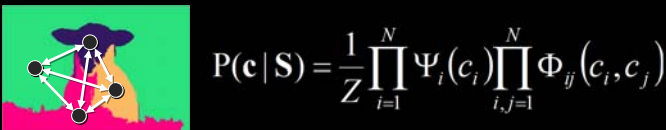


## Approach

Segmentation:



Inference: Belief Propagation on fully connected CRF



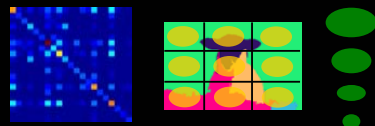
Appearance  $\Psi_i(c_i)$

Texture + Shape [TextronBoost]<sup>3</sup> Color [GMM]

Neural Network<sup>4</sup>

Context  $\Phi_{ij}(c_i, c_j)$

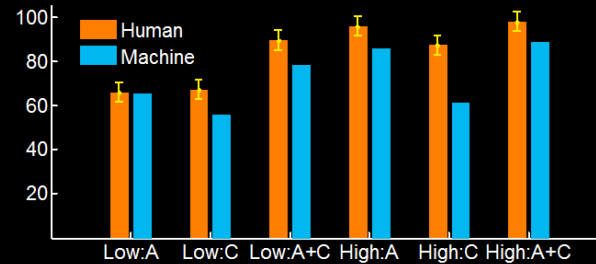
Co-occurrence<sup>5</sup> Location Scale



<sup>3</sup>[Shotton ECCV 2006] <sup>4</sup>[He CVPR 2004]

<sup>5</sup>[Rabinovich ICCV 2007]

## Quantitative Results

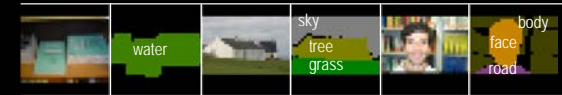


	MSRC (%)	Corel (%)
Existing (high)	75 <sup>6</sup>	81 <sup>7</sup>
Proposed (high)	91	93
Proposed (low)	83	86

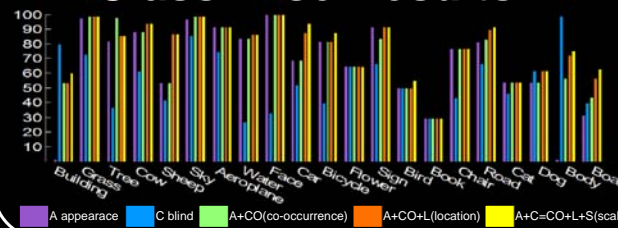
<sup>6</sup>[Yang CVPR 2007] <sup>7</sup>[He ECCV 2006]



## Failure Cases



## Class-wise Results



## Conclusions

- Context is most useful when appearance information is weak.
- Location and scale information are useful sources of context
- Low resolution images provide an appropriate venue for studying context