

# Weakly Supervised Semantic Segmentation

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# Problem Statement

- Segmenting an image using scribbles as partial labellings
- Challenging because of: ill-defined boundaries, articulations, noise etc.,

# Motivation

- Obtaining dense segmentation results manually is both costly and time-consuming.
- Unsupervised approaches do not yield good results in general
- With scribble annotations, it is possible to achieve high accurate results

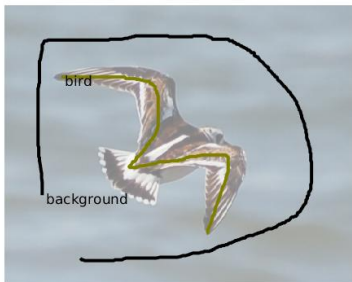


Figure: Scribble Annotated

- Dilation Network (Yu et al., 2016)
- ScribbleSup (Lin et al., 2016)
- SegNet (Kendall et al., 2015)
- FCNs (Long et al., 2015)

# Our Proposed Strategy

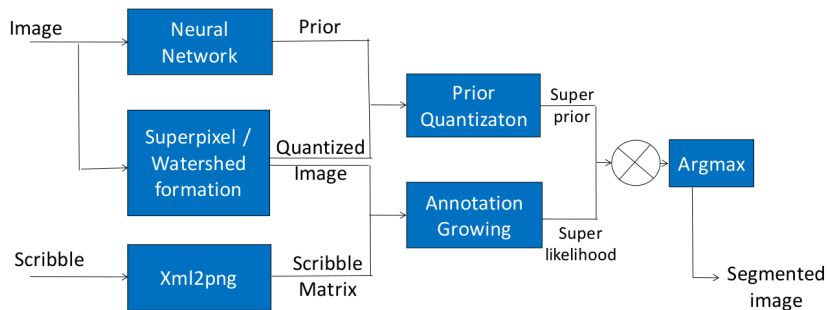


Figure: Architecture of our System

# Visualization

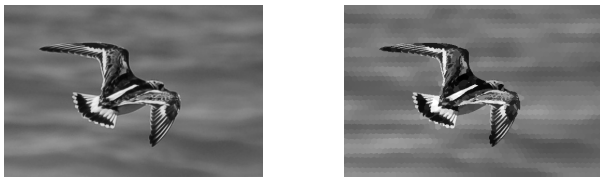


Figure: Superpixel Visualization



Figure: Visualization of Likelihood using RGB histogram



Figure: Visualization of Likelihood based on distance from scribble



Figure: Visualization of Max. Likelihood Estimation

- This result is obtained by max-likelihood estimation of how each superpixel is close to scribble in terms of rgb histogram and distance from scribble.



- **DATASET: Pascal VOC-2012**

- 20 classes segmentation
- scribble annotation available

- "Dilation" Network built with Caffe.

Training: Pascal-VOC-2012 training data.

- Testing: 100 images from Pascal-VOC-2012 cross-validation set

- **Evaluation Metric**

$$\text{True positive rate} = \frac{\text{True positives(excl background)}}{\text{All positives(excl background)}}$$

## RESULTS

Mean Accuracy prior(Baseline) = 85.13

Mean Accuracy posterior(Ours) = 86.43

# Visual Comparison



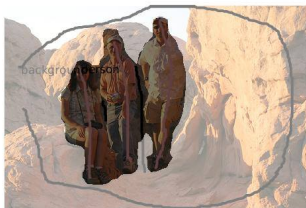
prior



posterior

Figure: Baseline(left) vs Ours(right)

# Visual Comparison



prior



posterior

Figure: Baseline(left) vs Ours(right)

# Conclusion

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- The improvement is significant for odd Neural Network outputs
- We can improve evaluation metric to focus on these odd outputs
- Also, we can improve label propagation methods from the scribbles.



**Thank You!!**