# **Determining Patch Saliency Using Low-Level Context**

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# Role of Context Traditional Torralba et al., IJCV 03 Holem et al., CVPR 06 Rabinovich et al., ICCV 07 High-level reasoning Role of Context New perspective... Image Saliency map Low-level task ?

# **Computing Saliency Map**

### Co-occurrence based

$$\mathbf{S}_{x_i}^{\text{o}} = \frac{1}{n} \sum_{j=1}^{n} \varphi(x_j \mid x_i) = \frac{1}{n} \sum_{j=1}^{n} \sum_{a=1}^{m} \sum_{b=1}^{m} \underbrace{p(w_a \mid y_i)}_{\text{Association of patch i to word a}} \underbrace{p(w_b \mid y_j)}_{\text{Association of patch j to word b}} \underbrace{p(w_b \mid w_a)}_{\text{given word a}} \underbrace{p(w_b \mid y_j)}_{\text{optical patch j to word b}} \underbrace{p(w_b \mid w_a)}_{\text{given word a}} \underbrace{p(w_b \mid y_j)}_{\text{optical patch j to word b}} \underbrace{p(w_b \mid w_a)}_{\text{given word a}} \underbrace{p(w_b \mid w_a)}_{\text{optical distribution}} \underbrace{p(w_b \mid y_j)}_{\text{potential patch j to word b}} \underbrace{p(w_b \mid w_a)}_{\text{given word a}} \underbrace{p(w_b \mid y_j)}_{\text{optical patch j to word b}} \underbrace{p(w_b \mid w_a)}_{\text{given word a}} \underbrace{p(w_b \mid w_a)}_{\text{patch j to word b}} \underbrace{p(w_b \mid w_a)}_{\text{given word a}} \underbrace{p(w_b \mid w_a)}_{\text{patch j to word b}} \underbrace{p(w_b \mid w_a)}_{\text{given word a}} \underbrace{p(w_b \mid w_a)}_{\text{given word a$$

### Relative location based

$$\mathbf{S}_{x_{i}}^{1} = \frac{1}{n} \sum_{j=1}^{n} \sum_{a=1}^{m} \sum_{b=1}^{m} \sum_{u=1}^{c} \sum_{v=1}^{c} p(l_{u} \mid l_{i}) p(l_{v} \mid l_{j}) p(w_{a} \mid y_{i}) p(w_{b} \mid y_{j}) p(w_{b}, l_{v} \mid w_{a}, l_{u})$$

# **Saliency Measures**



Set-up
Bag-of-features paradigm

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Sample 2

# **Sampling Strategies**

1. Sorting





- 2. Random sampling
- 3. Sequential sampling

$$\mathbf{S}_{x_i}(\overrightarrow{x_1},...,\overrightarrow{x_t}) = \frac{1}{n} \sum_{j=1}^n \max(\varphi(x_j \mid x_i), \varphi(x_j \mid x_1),..., \varphi(x_j \mid x_t))$$

$$\overrightarrow{x_{t+1}} = \arg\max_{x_i} \mathbf{S}_{x_i}(\overrightarrow{x_1},...,\overrightarrow{x_t})$$













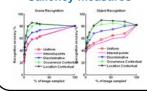
### **Experiments**

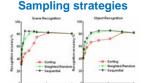






### Saliency measures





### **Discussion**



- Discriminative vs. contextual
- Subjectivity of the notion of saliency
- Unsupervised but dataset dependent

- A patch is salient if it can predict the rest of the image well
- Outperform existing saliency measures on image classification

Build

histogram

**SVM** 

Classify

- Proposed occurrence and location based contextual saliency measures
- Higher accuracies at sparse representations

- Discussed three sampling strategies
- Use of context for a low-level task