

PATCH-BASED IMAGE CLASSIFICATION AND RETRIEVAL

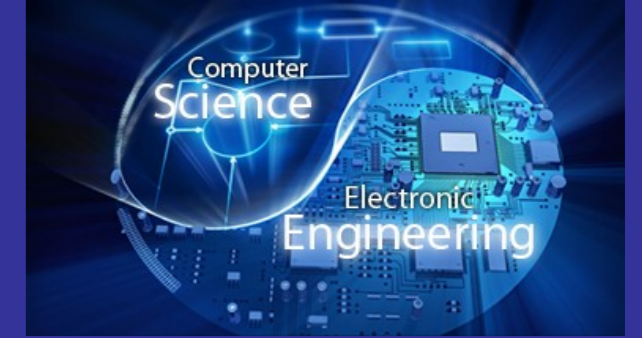
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1. Content-based Image Analysis

In a word of automated multimedia content, the challenge is to provide means of extract image semantics

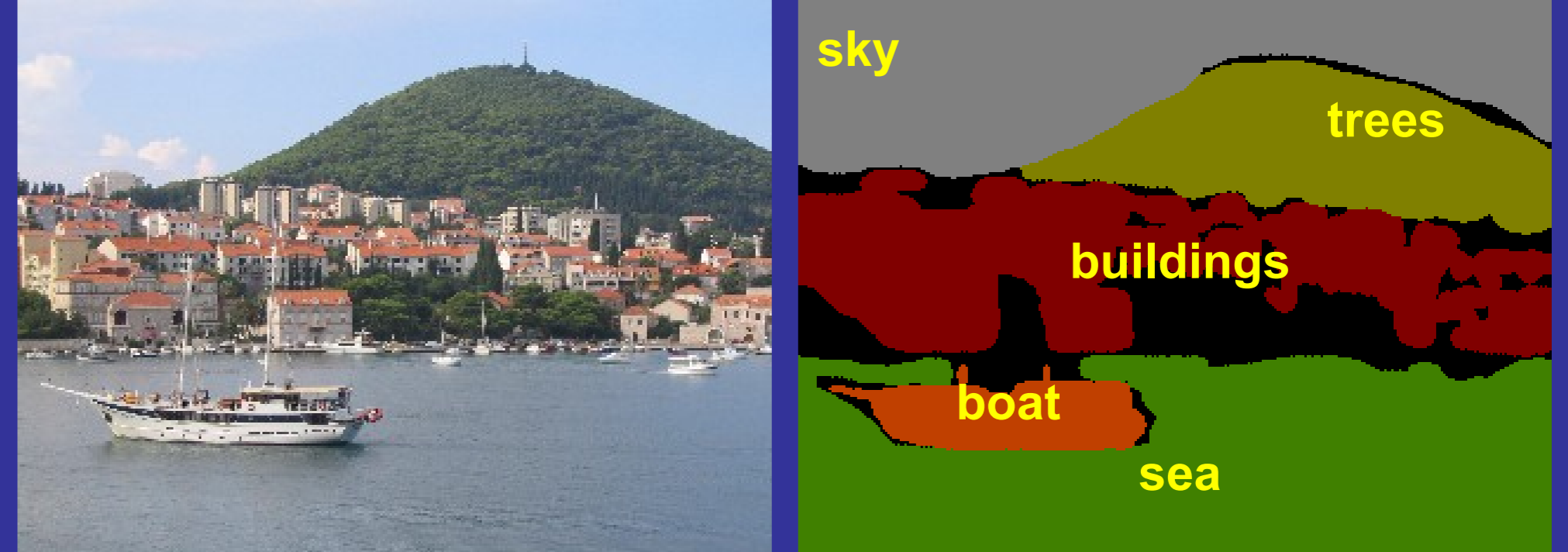
Applications: image retrieval, Human-Computer Interaction,

e.g.: sailboat at sunset



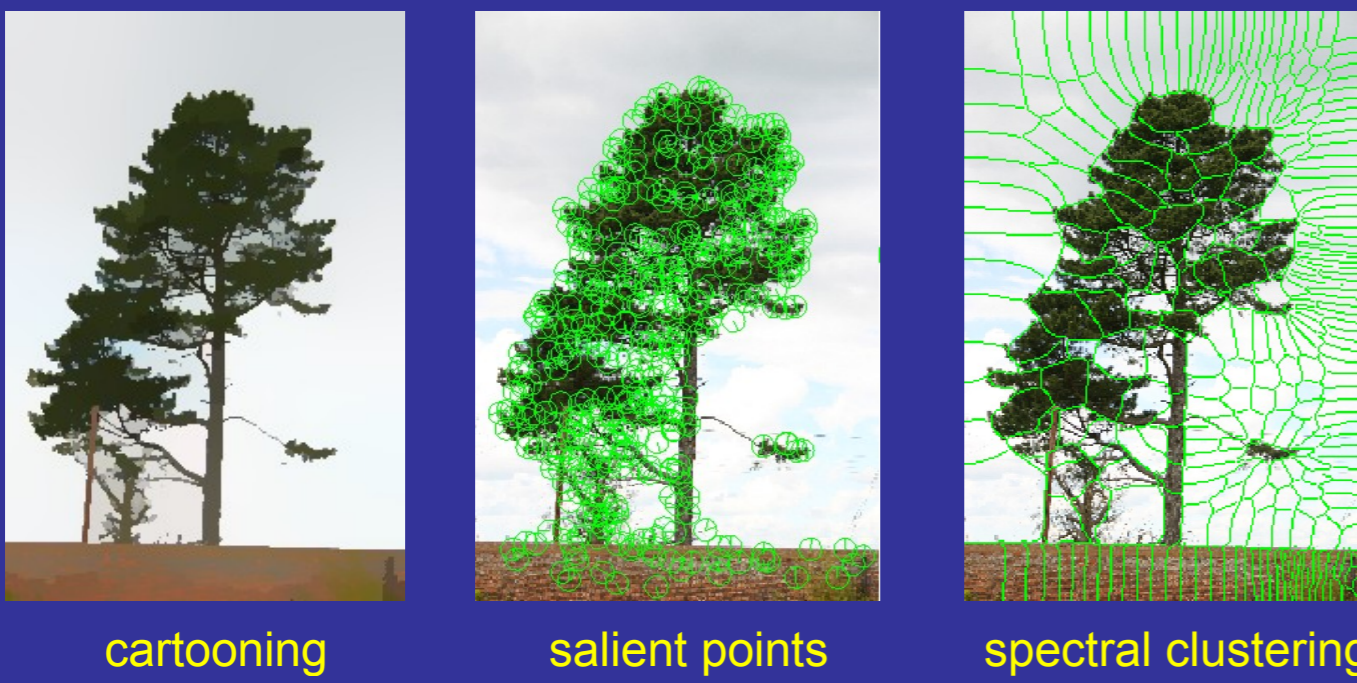
2. Problem: Understanding Image Content

My aim is to devise a system to automatically interpret different parts of an image and put them in context



3. Solution: Patch-based Image Analysis

The strategy is to extract parts from images, and associate categories to them, according to (1) appearance, and (2) context.



Context is considered linking parts in a graph and using a discriminative probabilistic model to infer parts categories

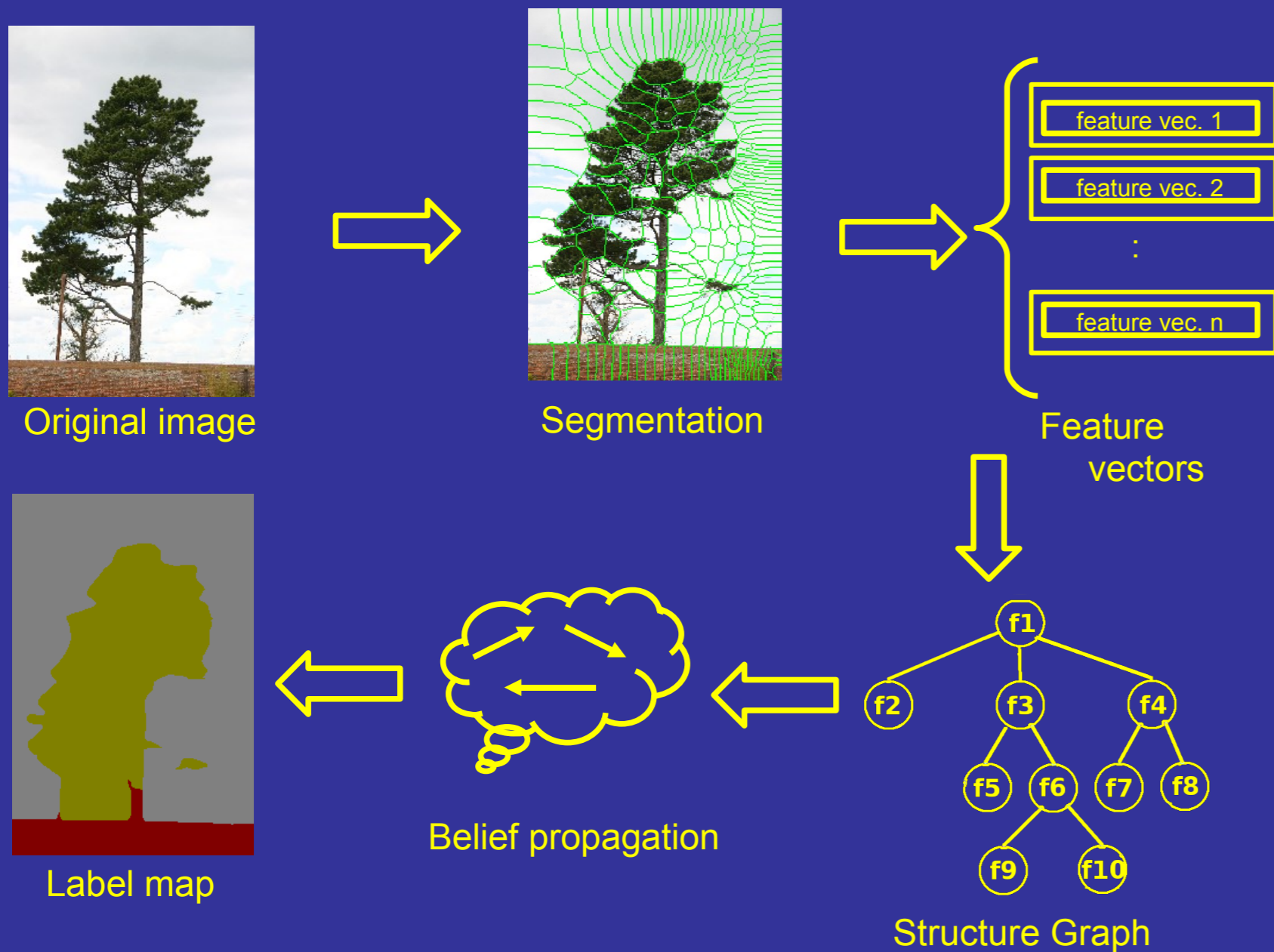
Conditional Random Fields: $p(y|X; \theta) = \frac{\exp \Psi(y, X, \theta)}{Z(X, \theta)}$

$$\Psi(y, X, \theta) = \underbrace{\sum_{v \in V} \sum_{k \in K_1} \theta_k \phi_k^1(y_v, X)}_{\text{appearance}} + \underbrace{\sum_{(i,j) \in E} \sum_{k \in K_2} \theta_k \phi_k^2(y_i, y_j, X)}_{\text{relationships}}$$

CRF is an unconditional graphical model, in which inference can be performed via Belief Propagation

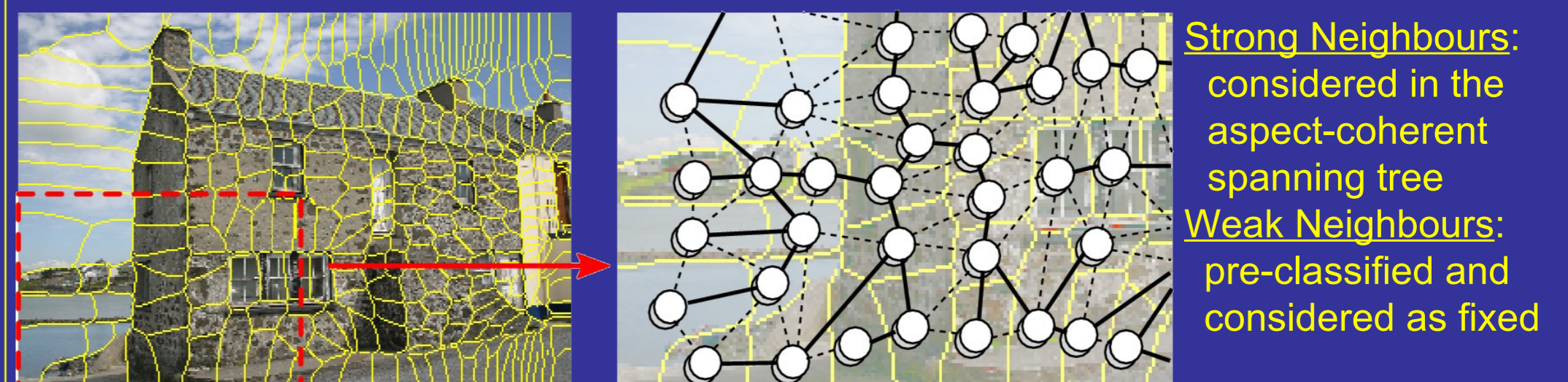
4. Contributions

4.1 System Model



4.4 Weak Neighbours for Dense Local Area Coverage

The patches left unconnected in the tree are pre-classified as considered in inference.



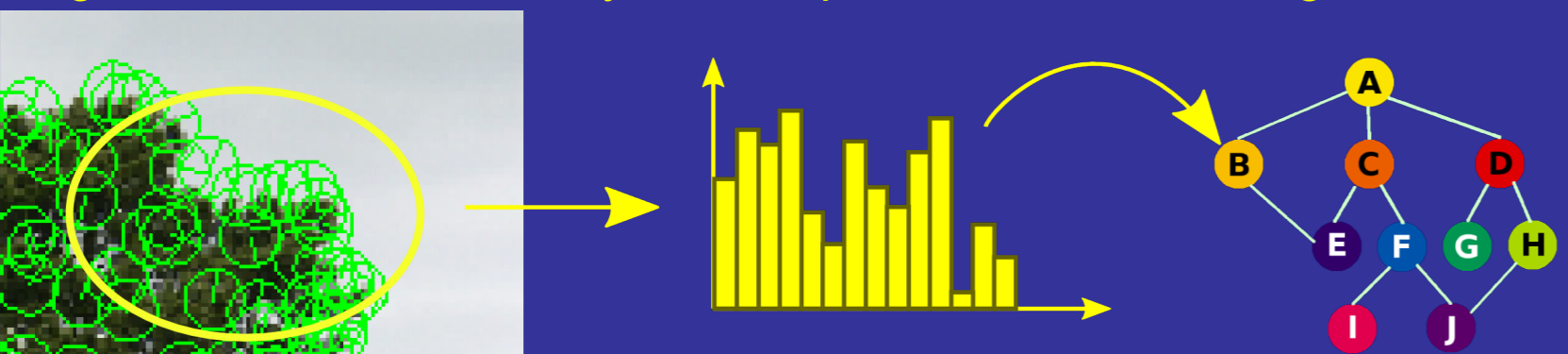
4.2 Aspect-coherence for Tree Structure

The structure connecting parts has to be a tree to perform exact inference exactly. I connect parts that have similar aspect, thus highly correlated.



4.3 Salient Points for Context Awareness

I extract salient points, associate them with "visual words" and I consider bags of words in the vicinity of each patch obtained via segmentation.



5. System Performance

System	building	grass	tree	sky	cow	plane	face	car	cycle	avg
no conn.	57.0%	93.1%	67.8%	53.0%	94.2%	37.2%	60.2%	51.5%	60.3%	73.4%
CRF _{AC}	63.0%	94.2%	68.9%	84.4%	93.7%	75.8%	92.9%	76.4%	86.5%	82.9%
CRF _{WN}	72.0%	94.8%	71.6%	77.3%	95.3%	80.3%	92.1%	82.3%	89.9%	85.2%
CRF _{WWH}	76.7%	94.6%	71.4%	86.3%	95.0%	73.1%	99.3%	73.2%	93.7%	86.2%
Lit.	73.6%	91.1%	82.1%	73.6%	95.7%	78.3%	89.5%	84.5%	81.4%	84.9%

no conn.: no connections considered

CRF_{AC}: Aspect-Coherence tree

CRF_{WN}: Weak Neighbours for dense local coverage

CRF_{WWH}: Salient Points for Context Awareness

LIT: J. Verbeek and B. Triggs, "Scene segmentation learned from partially labeled images," in *NIPS*, 2007

6. Results examples

