

The background of the slide is a dense, 3D-rendered field of numbers. The numbers are in various sizes and orientations, creating a sense of depth and movement. They are primarily in shades of light blue and white, with some darker blue numbers interspersed. The numbers are scattered across the entire frame, with some appearing more prominent than others.

# More Features

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CSCI 450

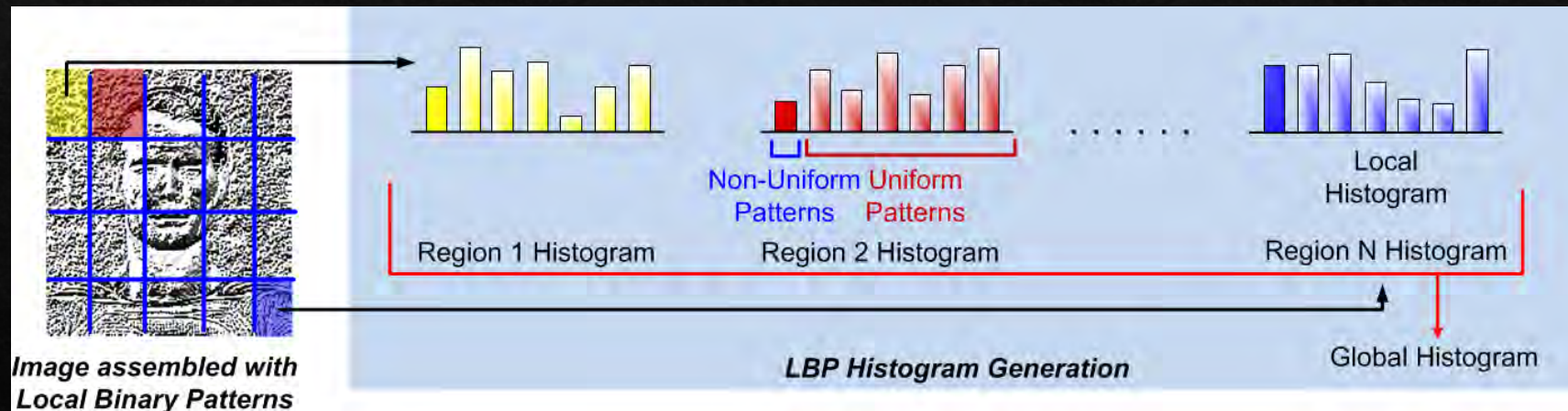
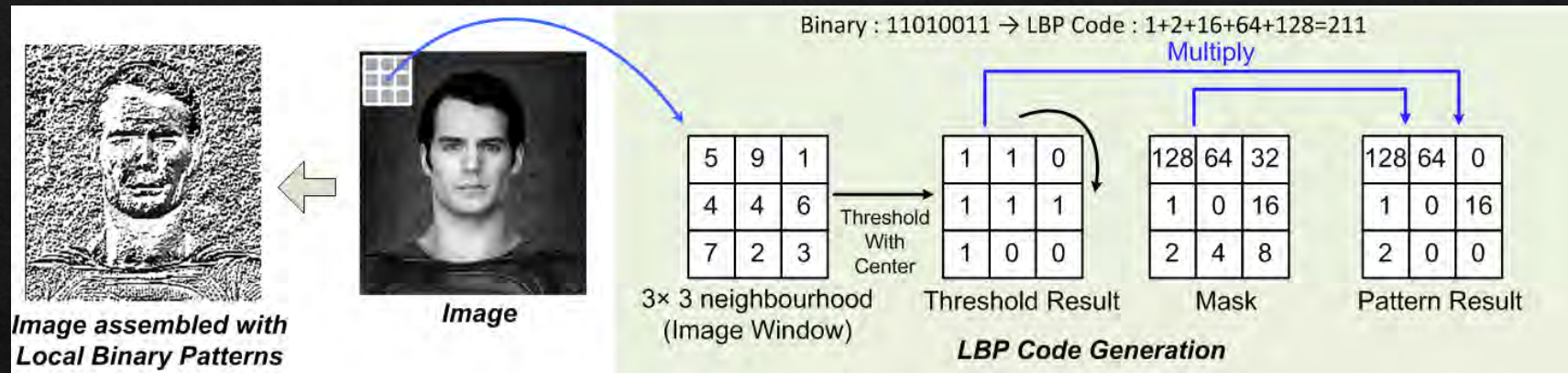
Lake Forest College

# Local Binary Patterns (LBP)

- ◊ Divide the examined window into cells (e.g. 16x16 pixels for each cell).
- ◊ Compare each pixel in a cell (say  $p$ ) to each of its 8 neighbors along a circle.
- ◊ If the neighbor's value  $< p$ , write 0, else write 1, giving an 8-bit binary number.
- ◊ Compute the histogram, over the cell, of the frequency of each number
- ◊ Concatenate (normalized) histograms of all cells. This gives a feature vector for the entire window.
- ◊ <https://ckyrkou.medium.com/object-detection-using-local-binary-patterns-50b165658368>



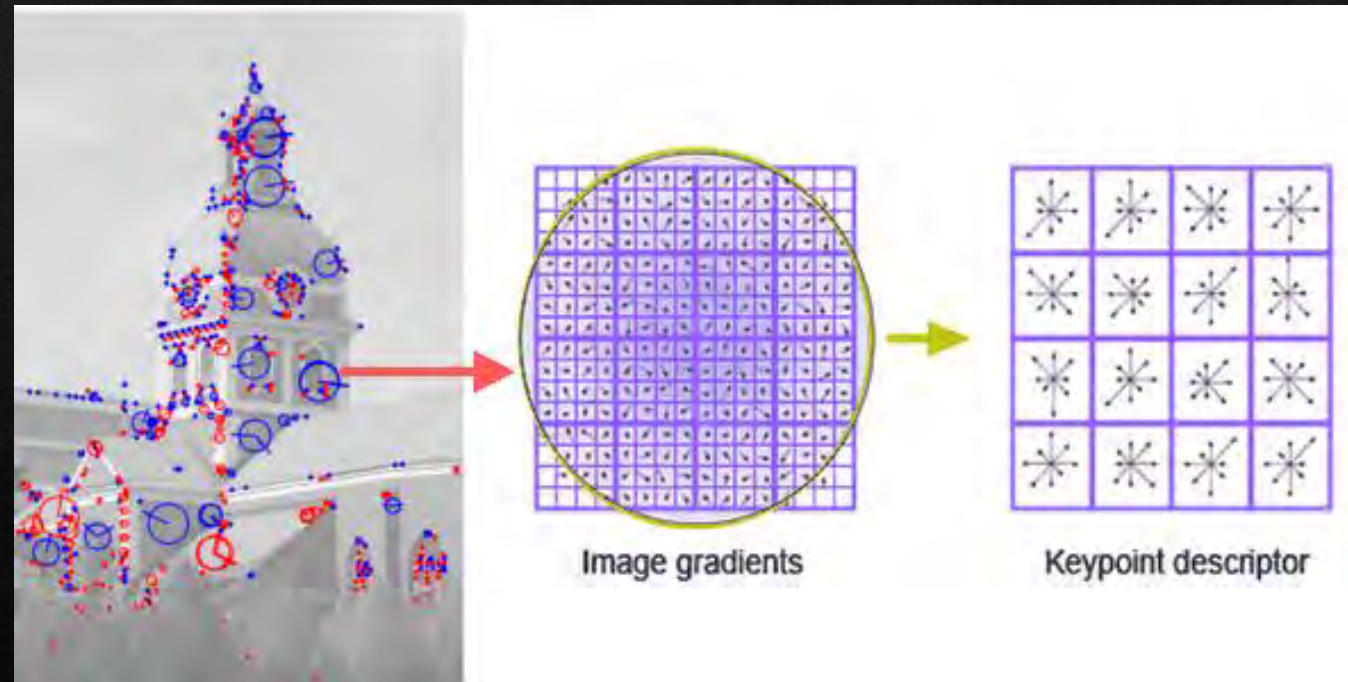
# Local Binary Patterns (LBP)





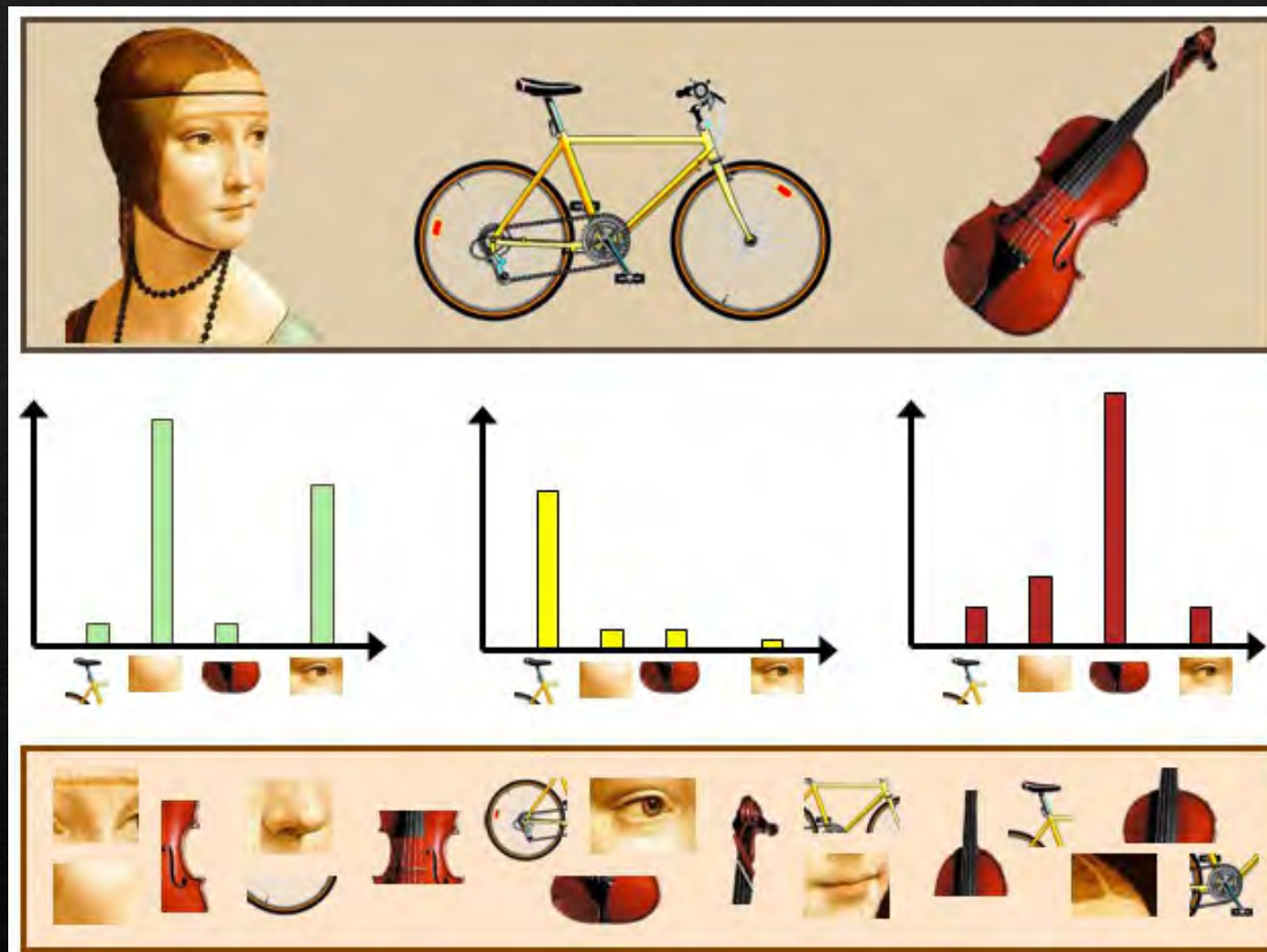
# Scale Invariant Feature Transform (SIFT)

- ◇ SIFT is used for describing local features
- ◇ Uses Difference of Gaussian (DoG) to detect keypoints
- ◇ Uses HOG-like gradient histograms centered at these points
- ◇ <https://www.codeproject.com/Articles/619039/Bag-of-Features-Descriptor-on-SIFT-Features-with-O>



# The Bag of Words Model

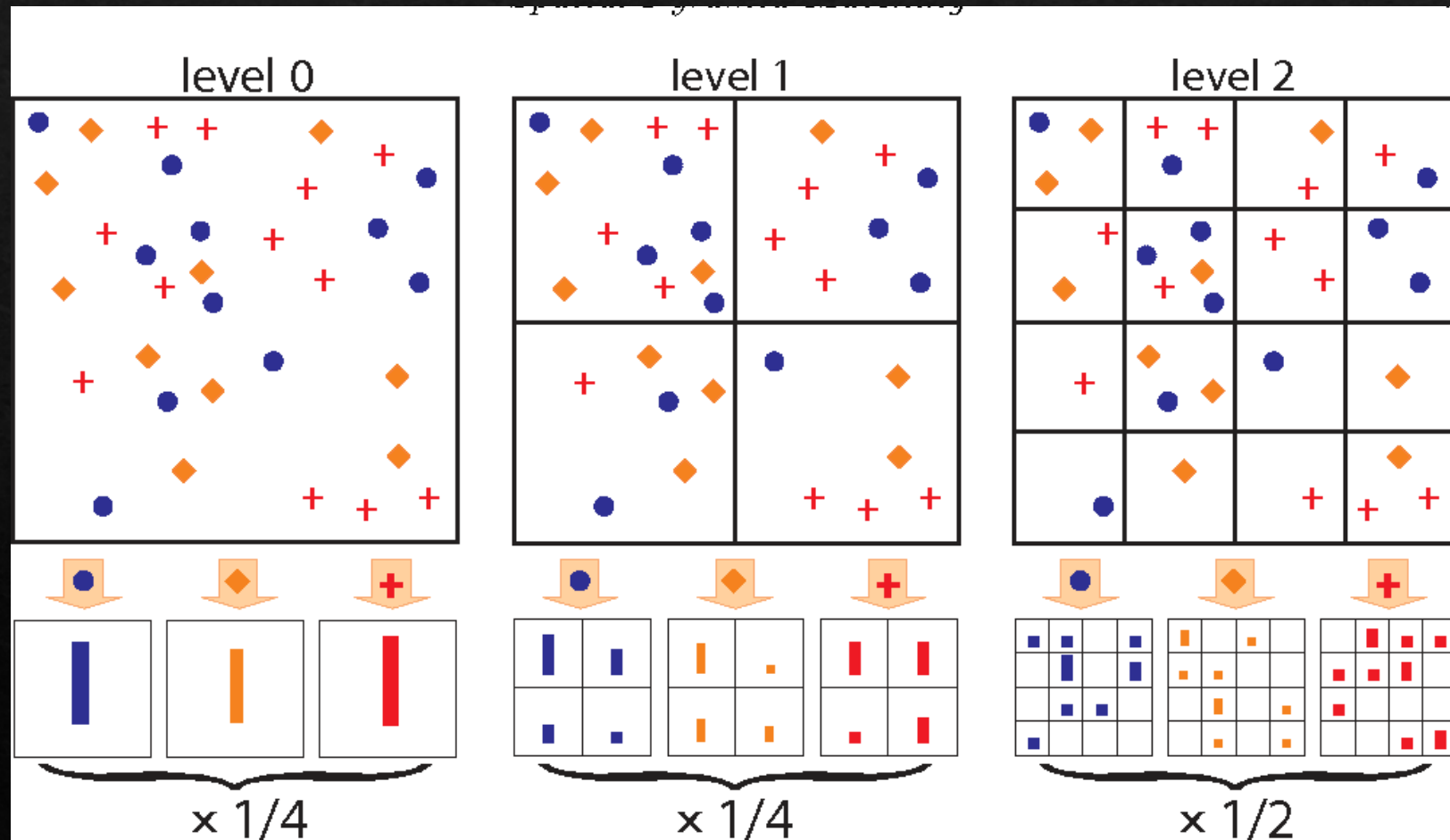
- ◆ Ensures image descriptor lengths are independent of image size or content
- ◆ Steps:
  - ◆ Local feature extraction (dense or sparse)
  - ◆ Clustering (quantization)
  - ◆ Histogram building





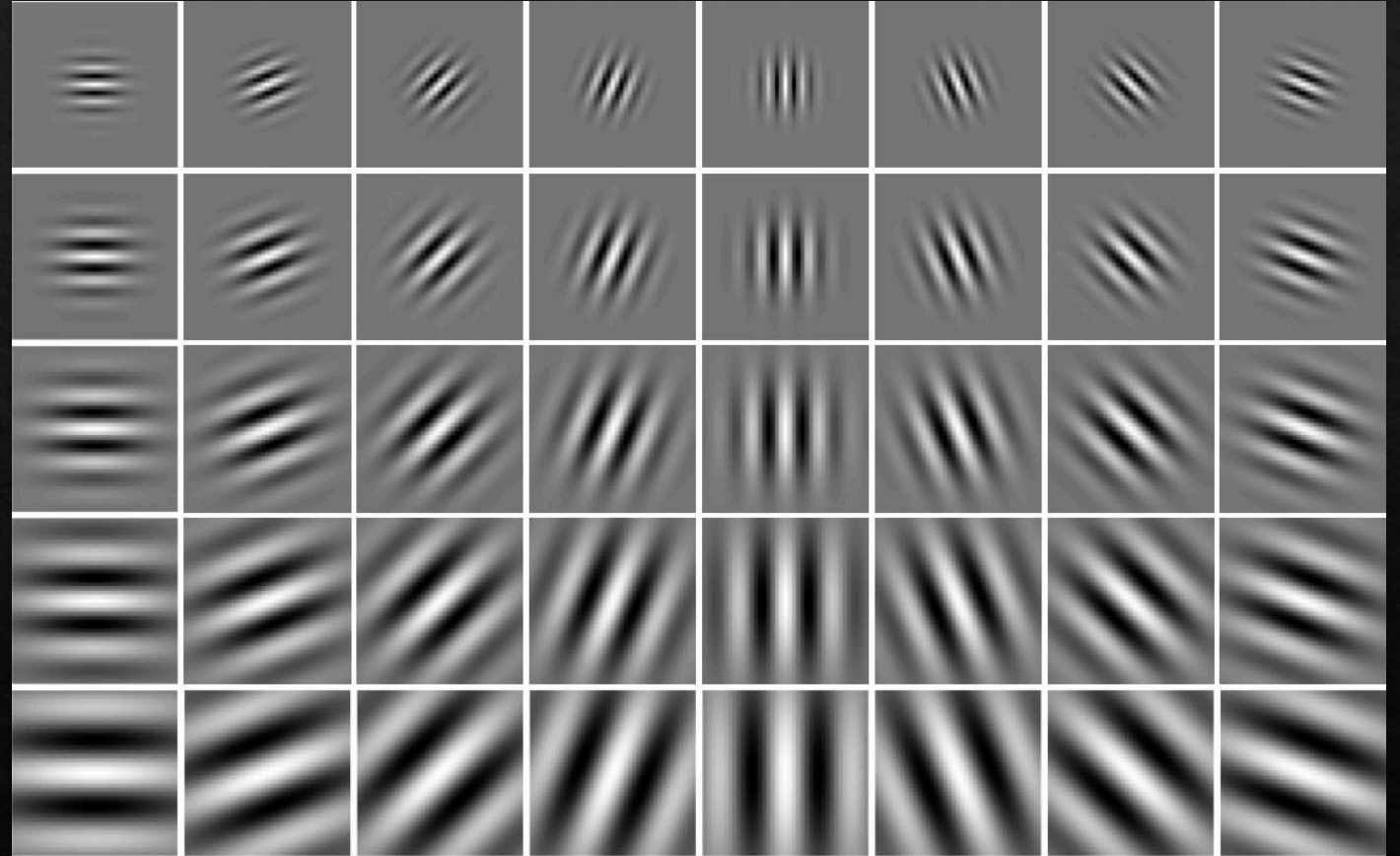
# Spatial Pyramid

- ◇ The BoW model destroys spatial information
- ◇ This technique preserves some of it
- ◇ [http://slazebni.cs.illinois.edu/publications/spatial\\_pyramid\\_pyramid\\_chapter.pdf](http://slazebni.cs.illinois.edu/publications/spatial_pyramid_pyramid_chapter.pdf)



# Gabor Filters

- ◆ A set of filters of several scales and orientations
- ◆ Each 2D Gabor filter is a Gaussian kernel function modulated by a sinusoidal plane wave
- ◆ Similar to simple cells in the visual cortex of mammalian brains
- ◆ A precursor of neural networks



# The GIST Descriptor

- ◆ Gives a rough description (the gist) of the scene
- ◆ Convolve the image with 32 Gabor filters at 4 scales, 8 orientations
- ◆ Divide each feature map into 16 regions (by a 4x4 grid), and average pool.
- ◆ Concatenate the 16 averaged values of all 32 feature maps, resulting in a  $16 \times 32 = 512$  GIST descriptor.
- ◆ Reference:  
[Modeling the shape of the scene: a holistic representation of the spatial envelope](#)

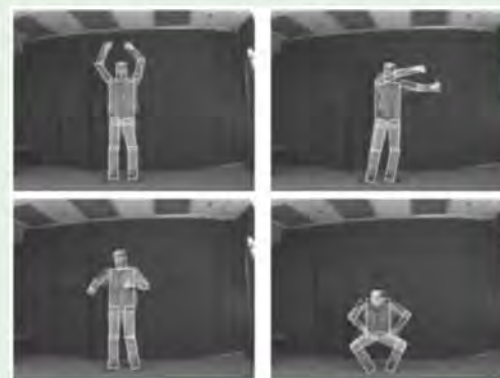
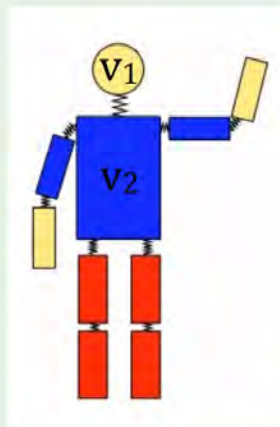


# Deformable Part Models (DPM)

- ◆ Complex descriptors for non-rigid bodies
- ◆ Treats objects as a combination of parts
- ◆ One of the most popular object recognition methods before CNNs
- ◆ <https://www.cs.ucf.edu/~bagci/teaching/computervision16/Lec21.pdf>

Part configuration score function

$$\text{score}(p_1, \dots, p_n) = \underbrace{\sum_{i=1}^n m_i(p_i)}_{\text{Part match scores}} - \underbrace{\sum_{(i,j) \in E} d_{ij}(p_i, p_j)}_{\text{spring costs}}$$



Highest scoring configurations

