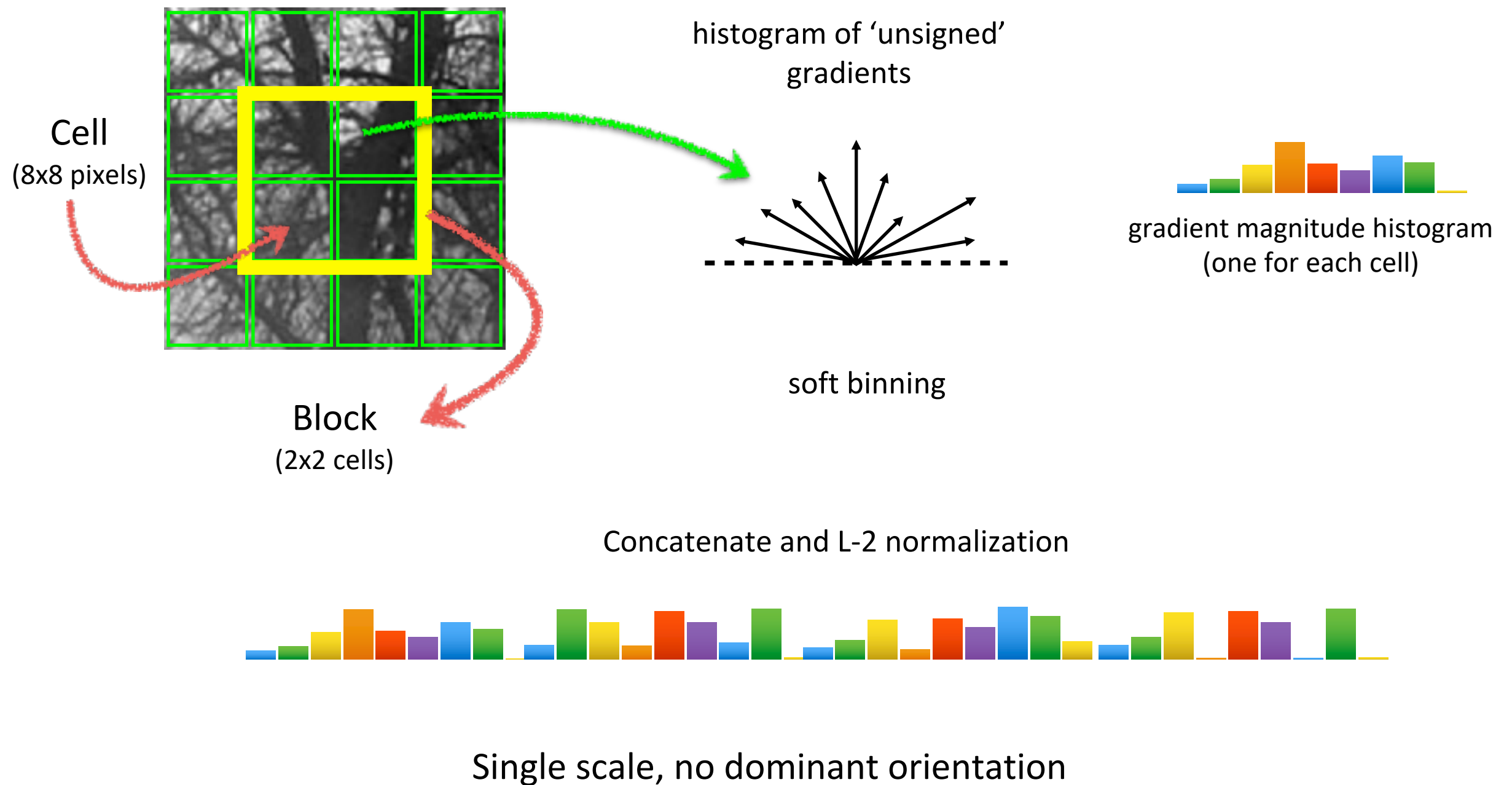


HOG descriptor

HOG

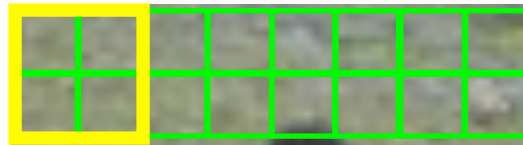


Dalal, Triggs. **Histograms of Oriented Gradients** for Human Detection. CVPR, 2005



Pedestrian detection

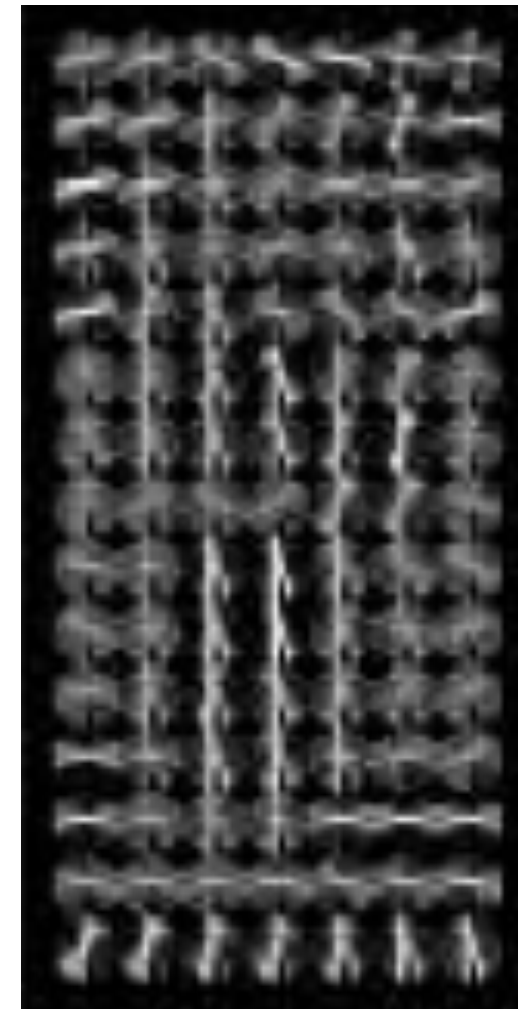
1 cell step size



128 pixels
16 cells
15 blocks



visualization

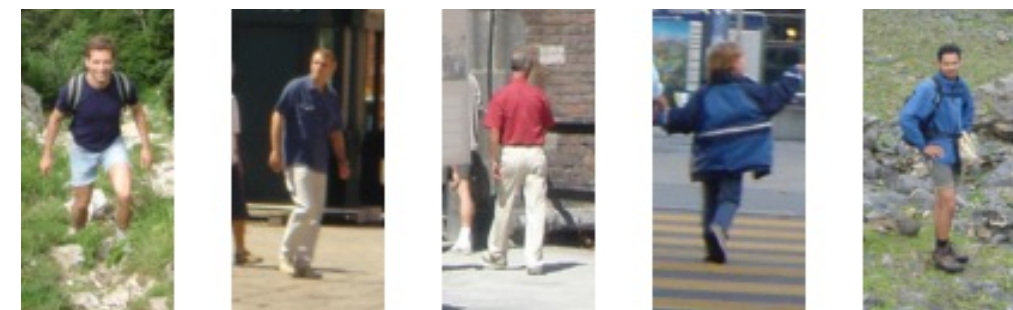


$$15 \times 7 \times 4 \times 9 = 3780$$

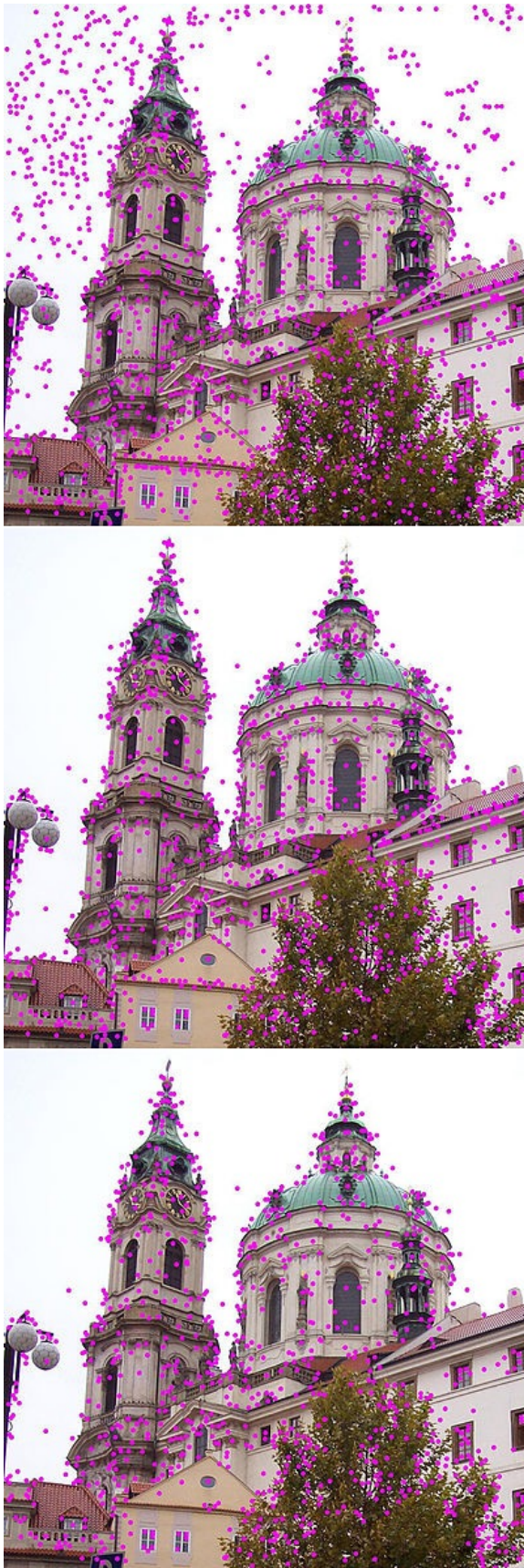
64 pixels
8 cells
7 blocks

Redundant representation due to overlapping blocks

How many times is each inner cell encoded?



SIFT



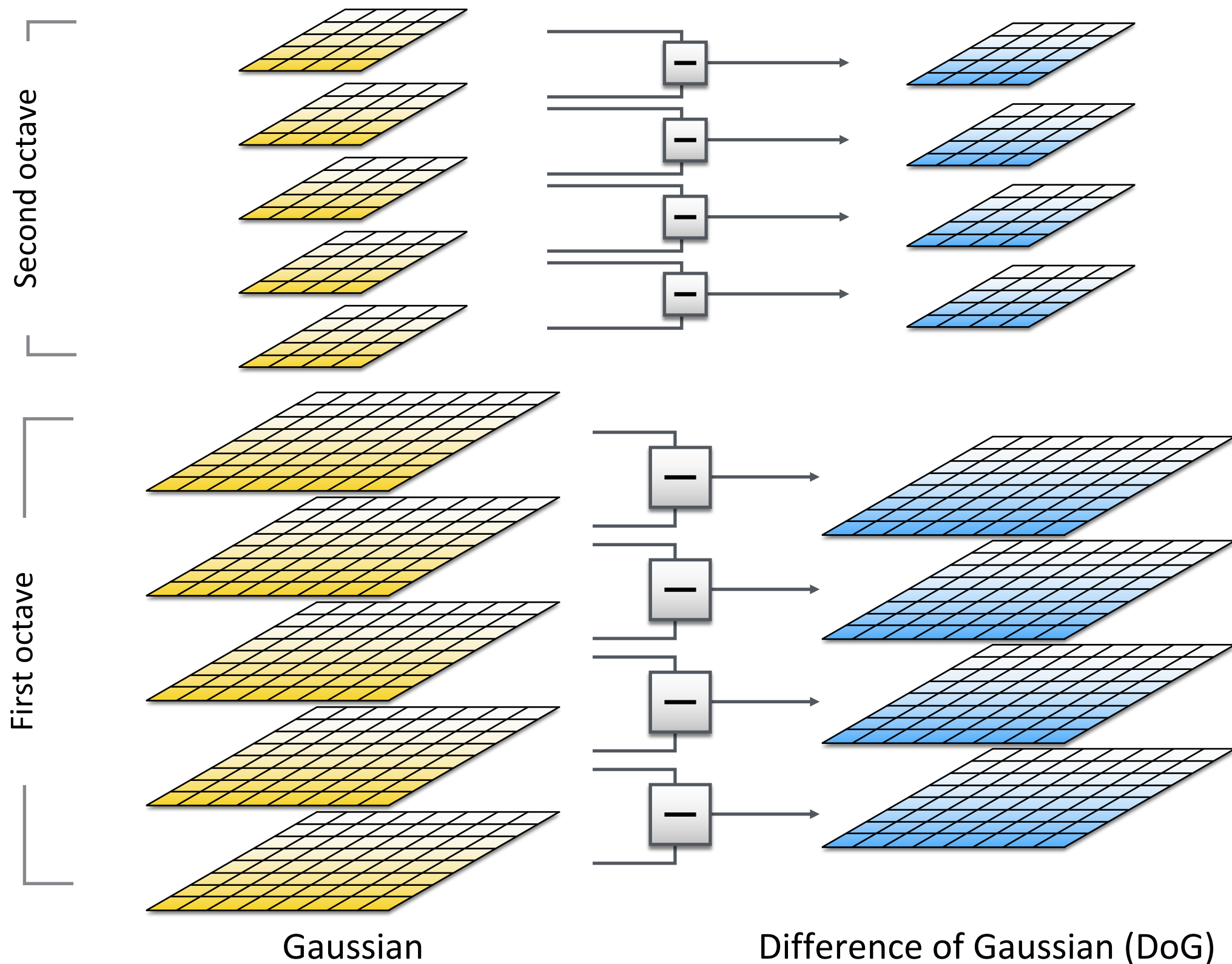
SIFT

(Scale Invariant Feature Transform)

SIFT describes both a **detector** and **descriptor**

1. Multi-scale extrema detection
2. Keypoint localization
3. Orientation assignment
4. Keypoint descriptor

1. Multi-scale extrema detection



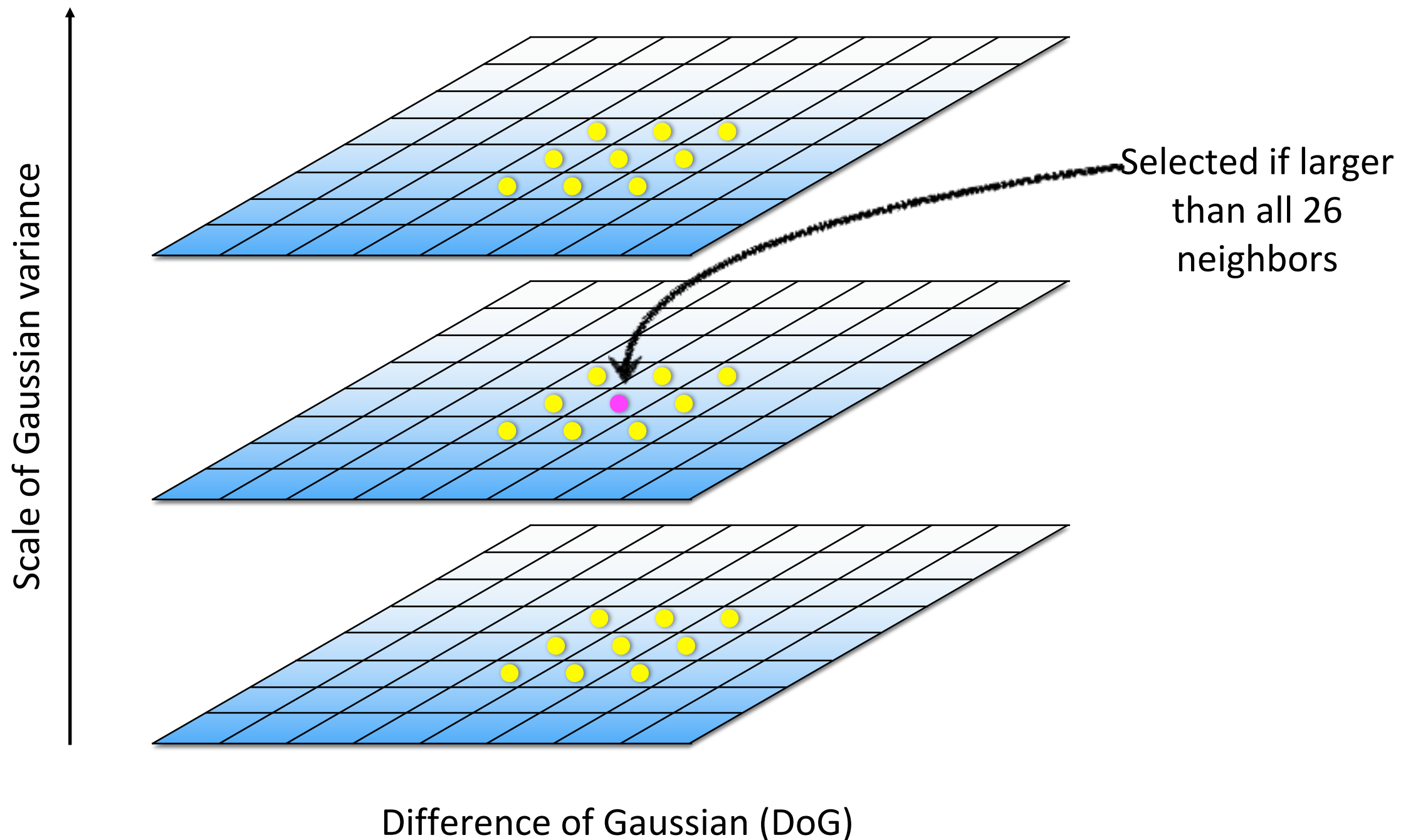


Gaussian



Laplacian

Scale-space extrema



2. Keypoint localization

2nd order Taylor series approximation of DoG scale-space

$$f(\mathbf{x}) = f + \frac{\partial f}{\partial \mathbf{x}}^T \mathbf{x} + \frac{1}{2} \mathbf{x}^T \frac{\partial^2 f}{\partial \mathbf{x}^2} \mathbf{x}$$

$$\mathbf{x} = \{x, y, \sigma\}$$

Take the derivative and solve for extrema

$$\mathbf{x}_m = - \frac{\partial^2 f}{\partial \mathbf{x}^2}^{-1} \frac{\partial f}{\partial \mathbf{x}}$$

Additional tests to retain only strong features

3. Orientation assignment

For a keypoint, **L** is the **Gaussian-smoothed** image with the closest scale,

$$m(x, y) = \sqrt{\underbrace{(L(x+1, y) - L(x-1, y))^2}_{\text{x-derivative}} + \underbrace{(L(x, y+1) - L(x, y-1))^2}_{\text{y-derivative}}}$$

$$\theta(x, y) = \tan^{-1}((L(x, y+1) - L(x, y-1)) / (L(x+1, y) - L(x-1, y)))$$

Detection process returns

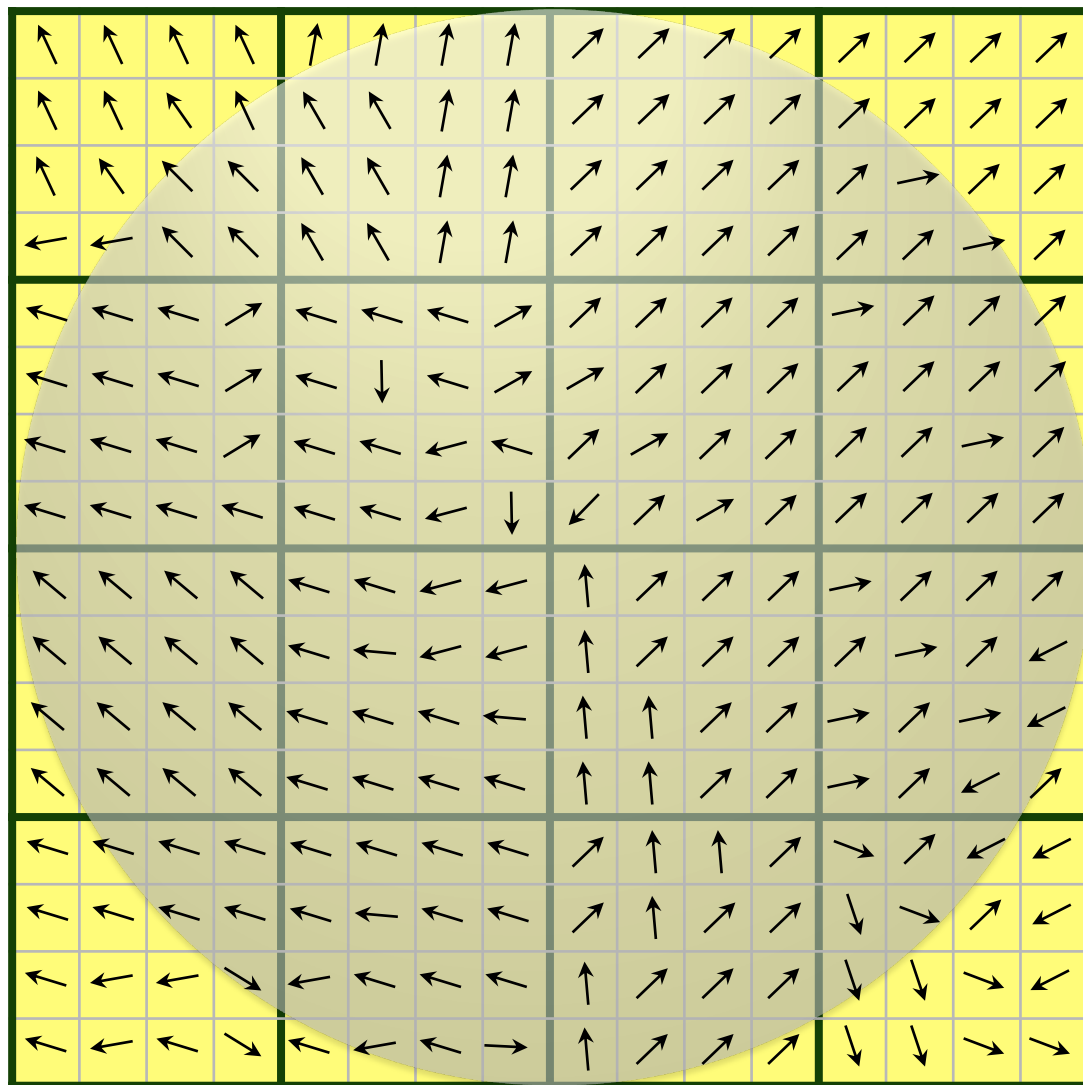
$$\{x, y, \sigma, \theta\}$$

location scale orientation

4. Keypoint descriptor

Image Gradients

(4 x 4 pixel per cell, 4 x 4 cells)

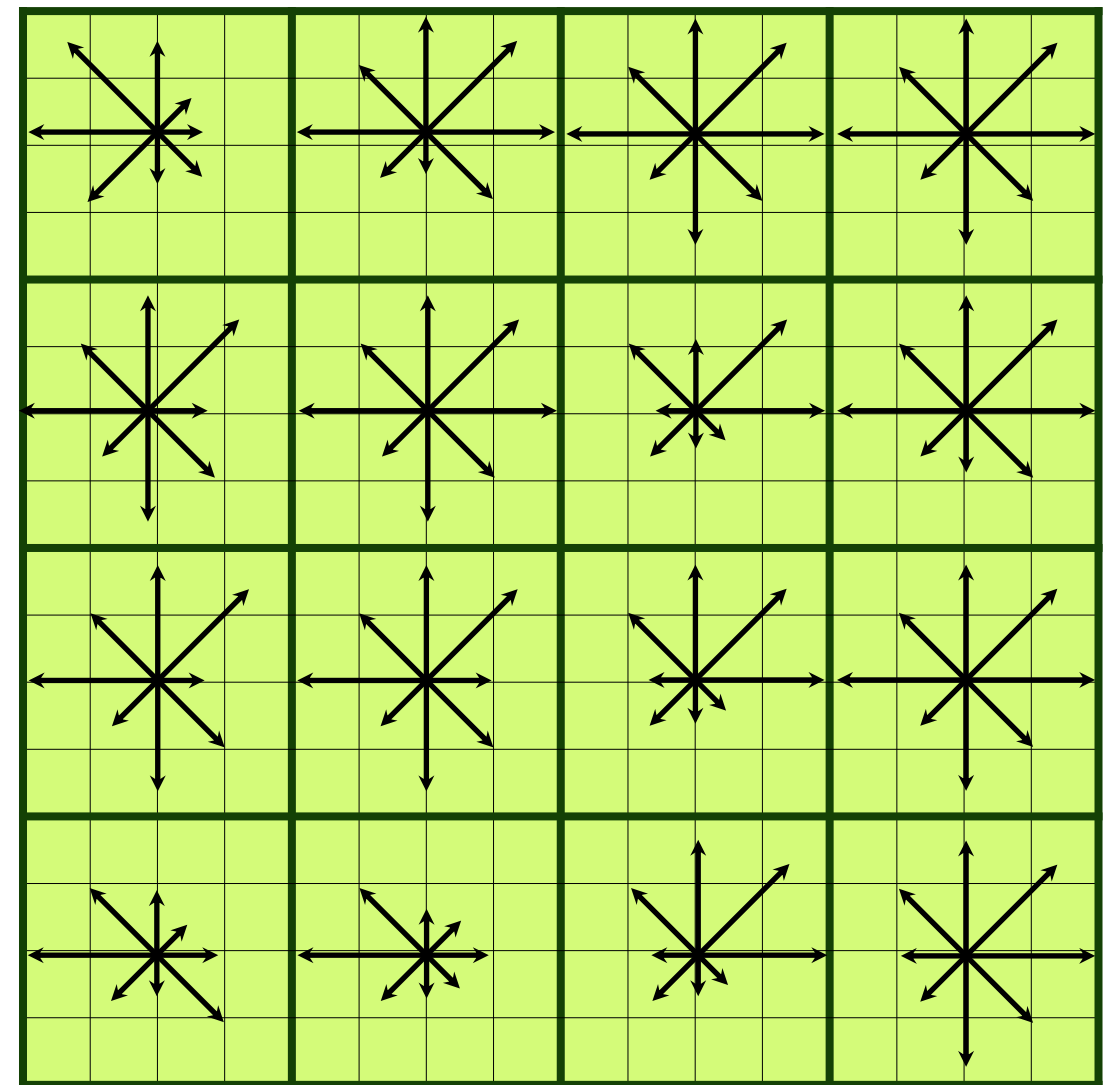


Gaussian weighting

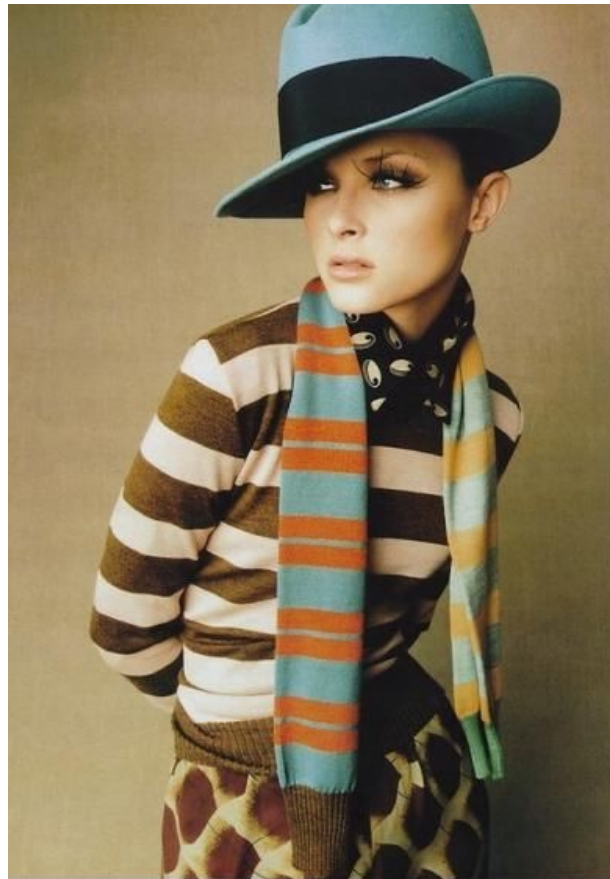
(sigma = half width)

SIFT descriptor

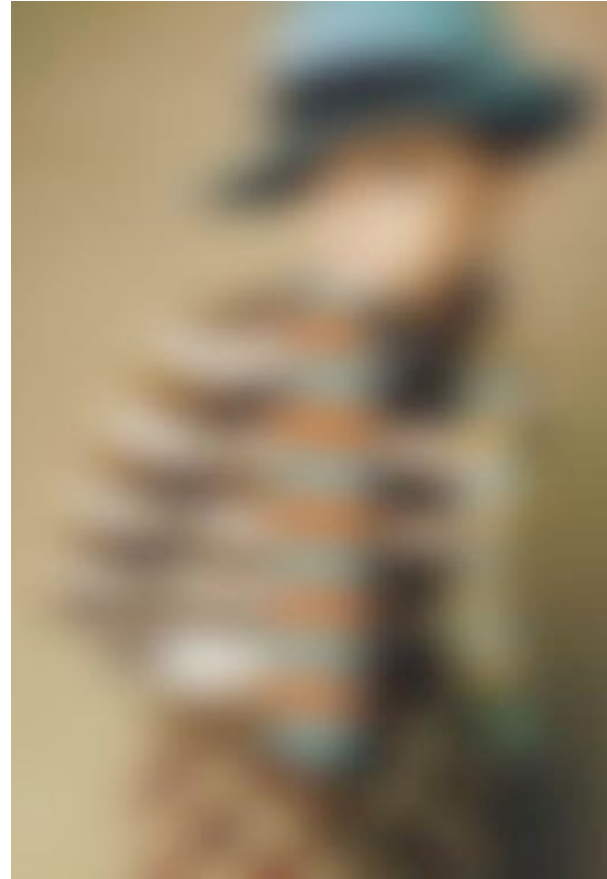
(16 cells x 8 directions = 128 dims)



Discriminative power



Raw pixels



Sampled



Locally orderless



Global histogram

Generalization power

