

IMAGE PROCESSING

CS 3630 Introduction to Robotics and Perception
Frank Dellaert

FILTERING

- Noise removal
- Edge detection
- Texture description
- Multi-scale algorithms
- Feature detection
- Matched filters

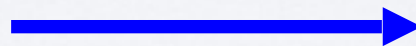


WHAT IS IMAGE FILTERING?

Modify the pixels in an image based on some function of a local neighborhood of the pixels

10	5	3
4	5	1
1	1	7

Some function



	7	

LINEAR FILTERING

- Linear case is simplest and most useful
 - Replace each pixel with a linear combination of its neighbors.
- Prescription for linear combination is called the **convolution kernel**.

10	5	3
4	5	1
1	1	7

*

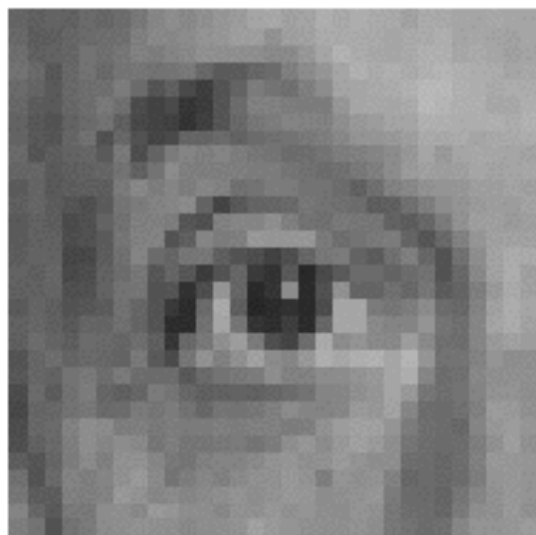
0	0	0
0	0.5	0
0	1.0	0.5

=

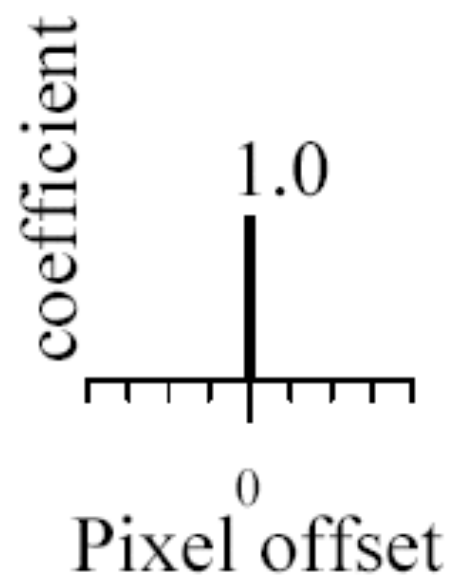
	7	

kernel

FILTERING EXAMPLES

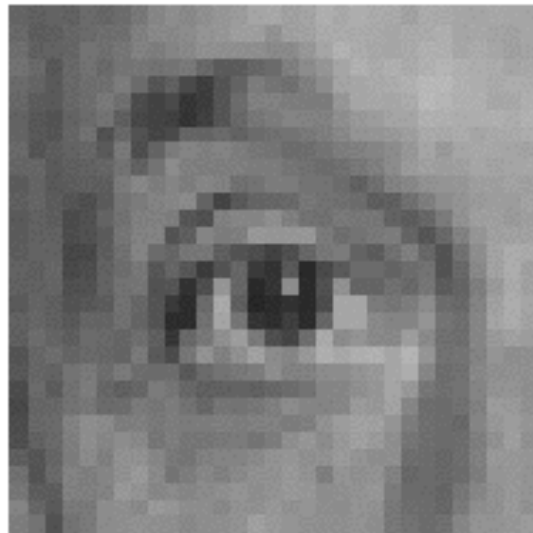


original

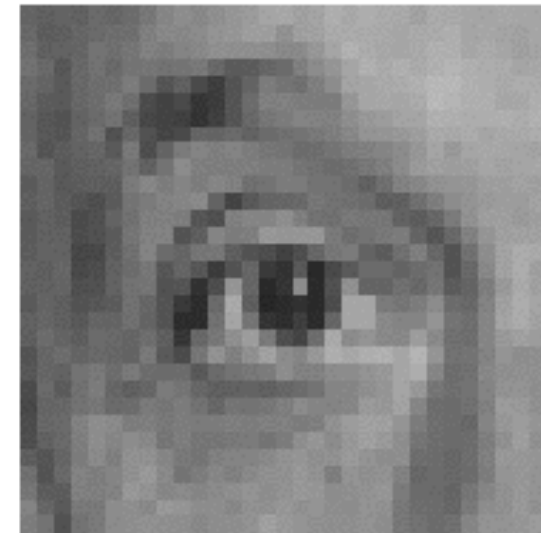
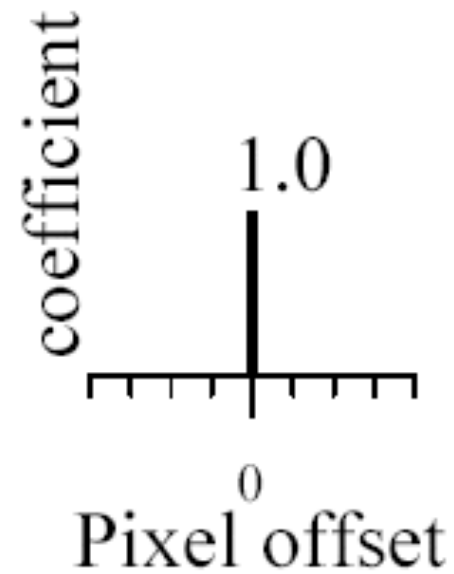


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FILTERING EXAMPLES: IDENTITY

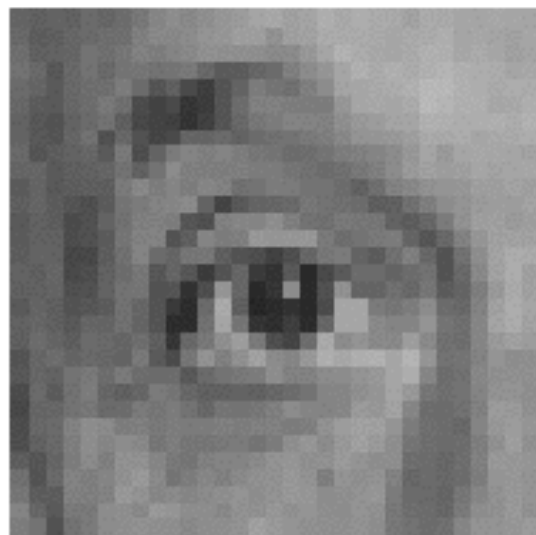


original

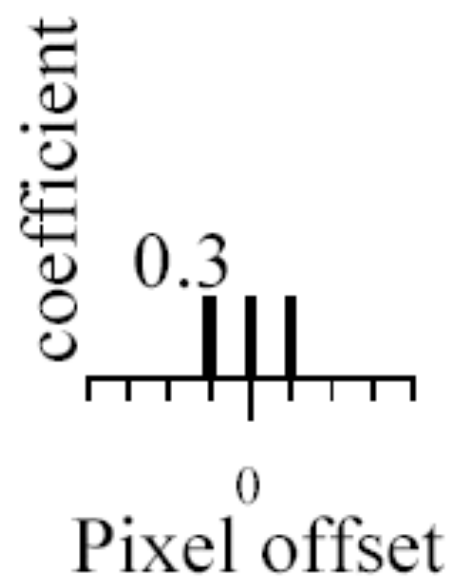


Filtered
(no change)

FILTERING EXAMPLES

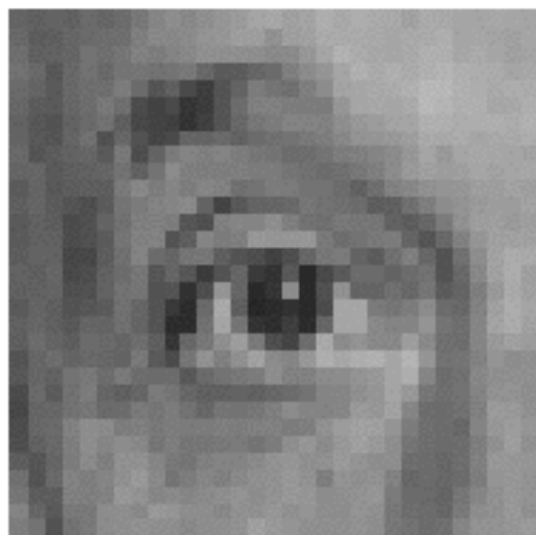


original

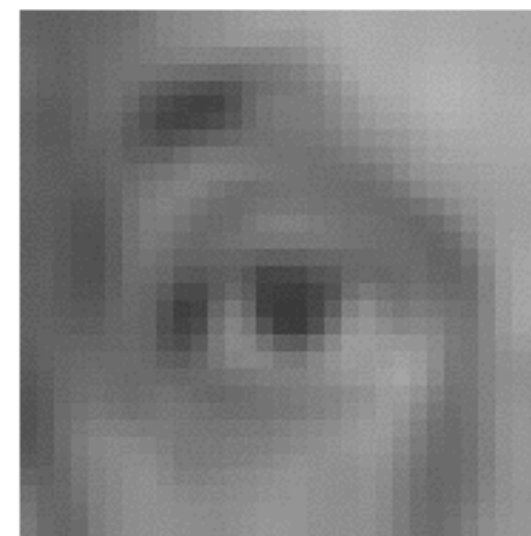
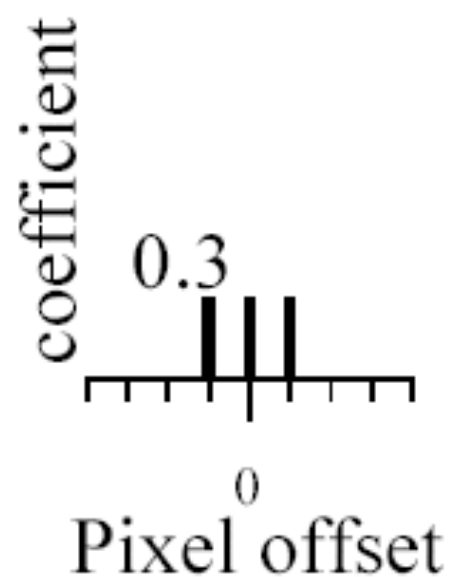


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FILTERING EXAMPLES: BLUR

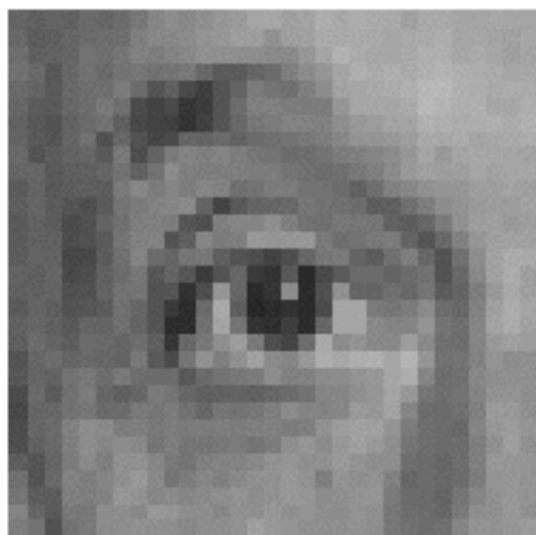


original

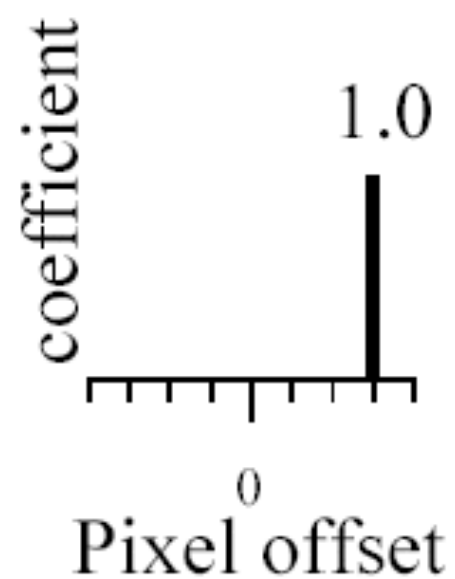


Blurred (filter applied in both dimensions).

FILTERING EXAMPLES

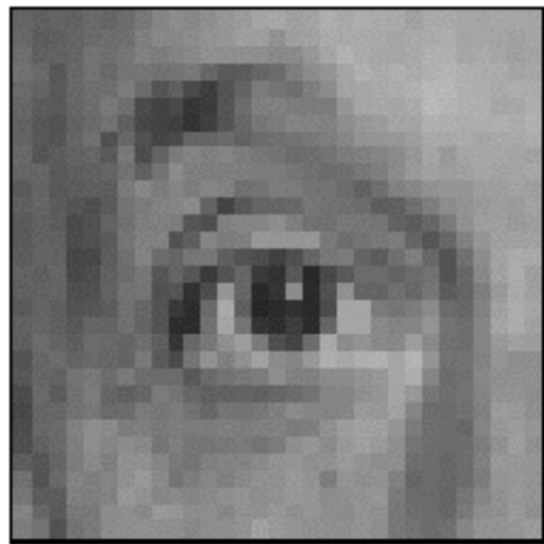


original

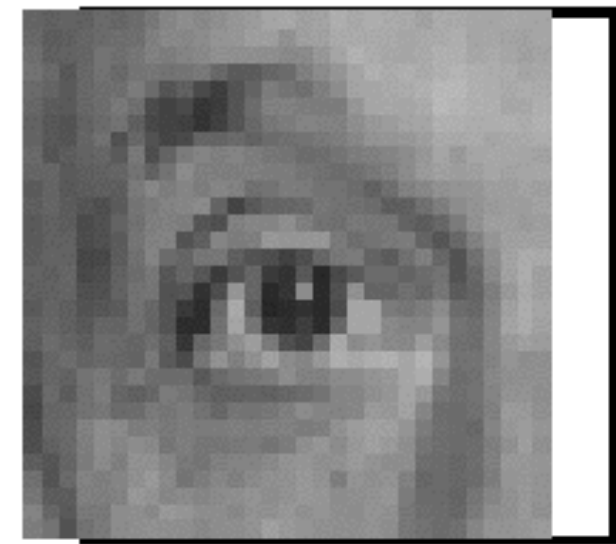
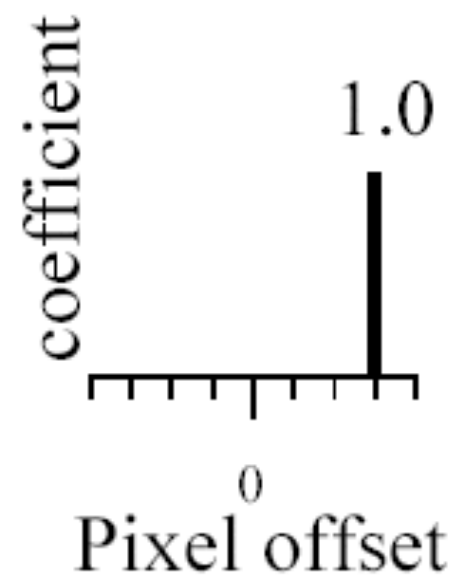


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FILTERING EXAMPLES: SHIFT



original



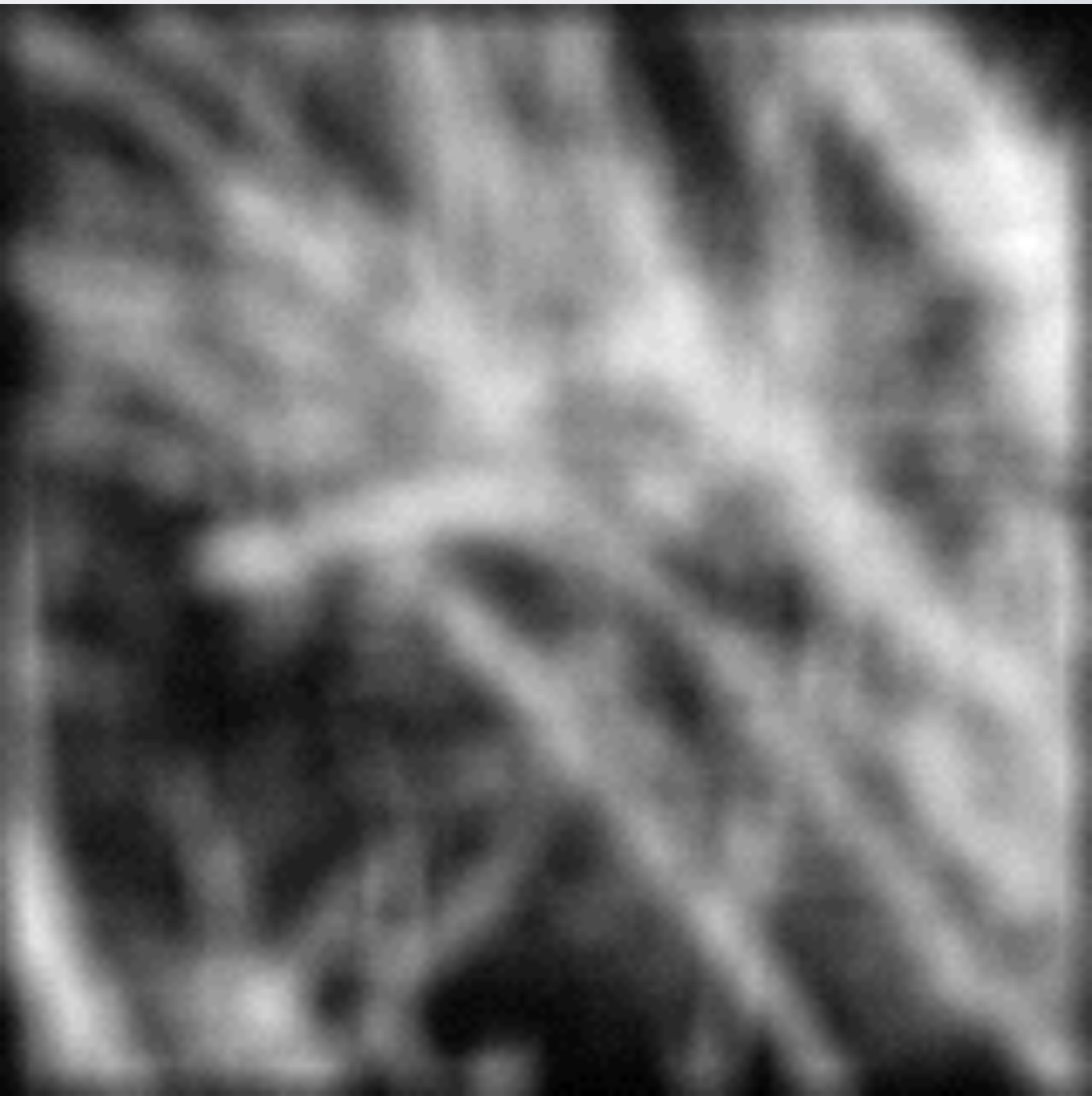
shifted

CONVOLUTION

$$R_{ij} = \sum_{u,v} H_{i-u,j-v} F_{uv}$$

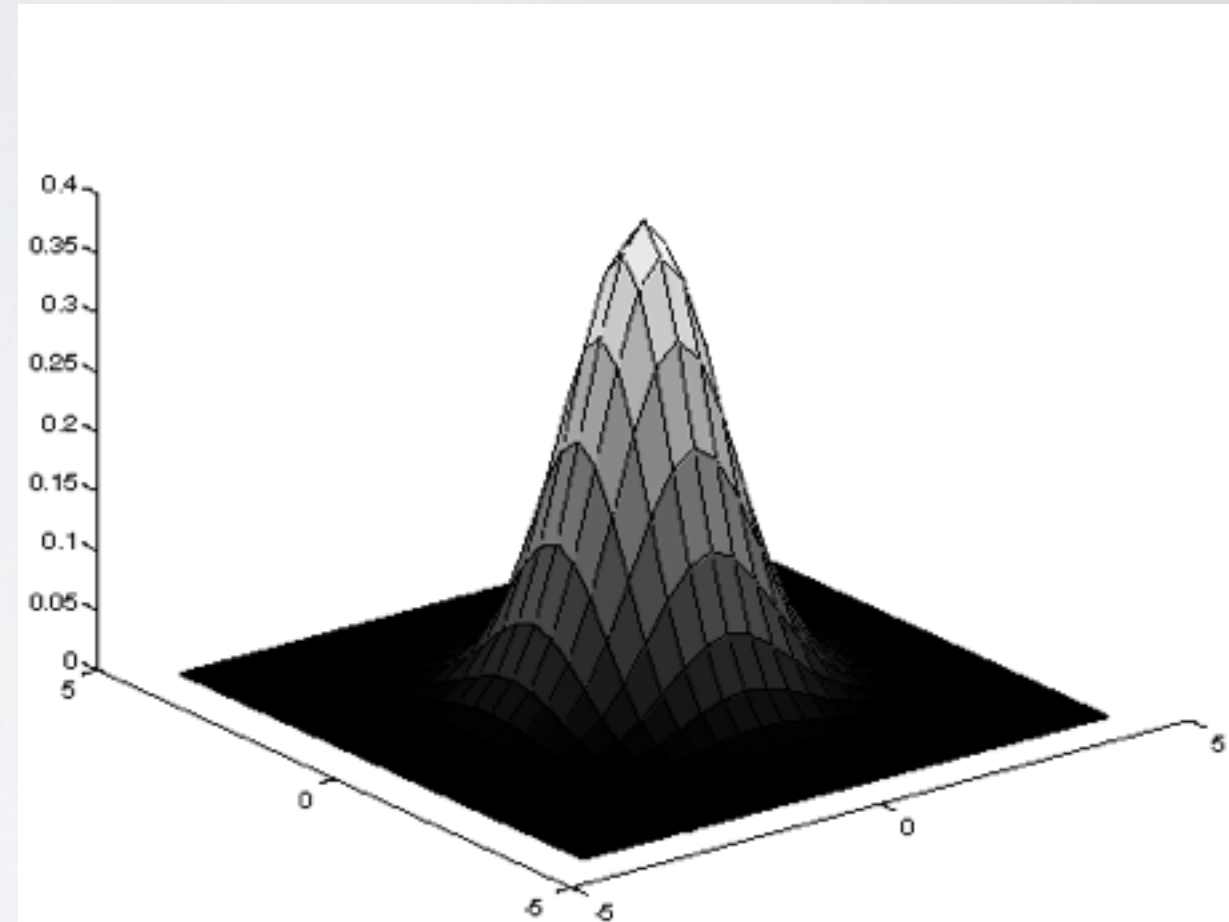
- Represent these weights as an image, H
- H is usually called the **kernel**
- Operation is called **convolution**

EXAMPLE: SMOOTHING BY AVERAGING



SMOOTHING WITH A GAUSSIAN

- Averaging does not model defocussed lens well
- impulse response should be fuzzy blob



AN ISOTROPIC GAUSSIAN

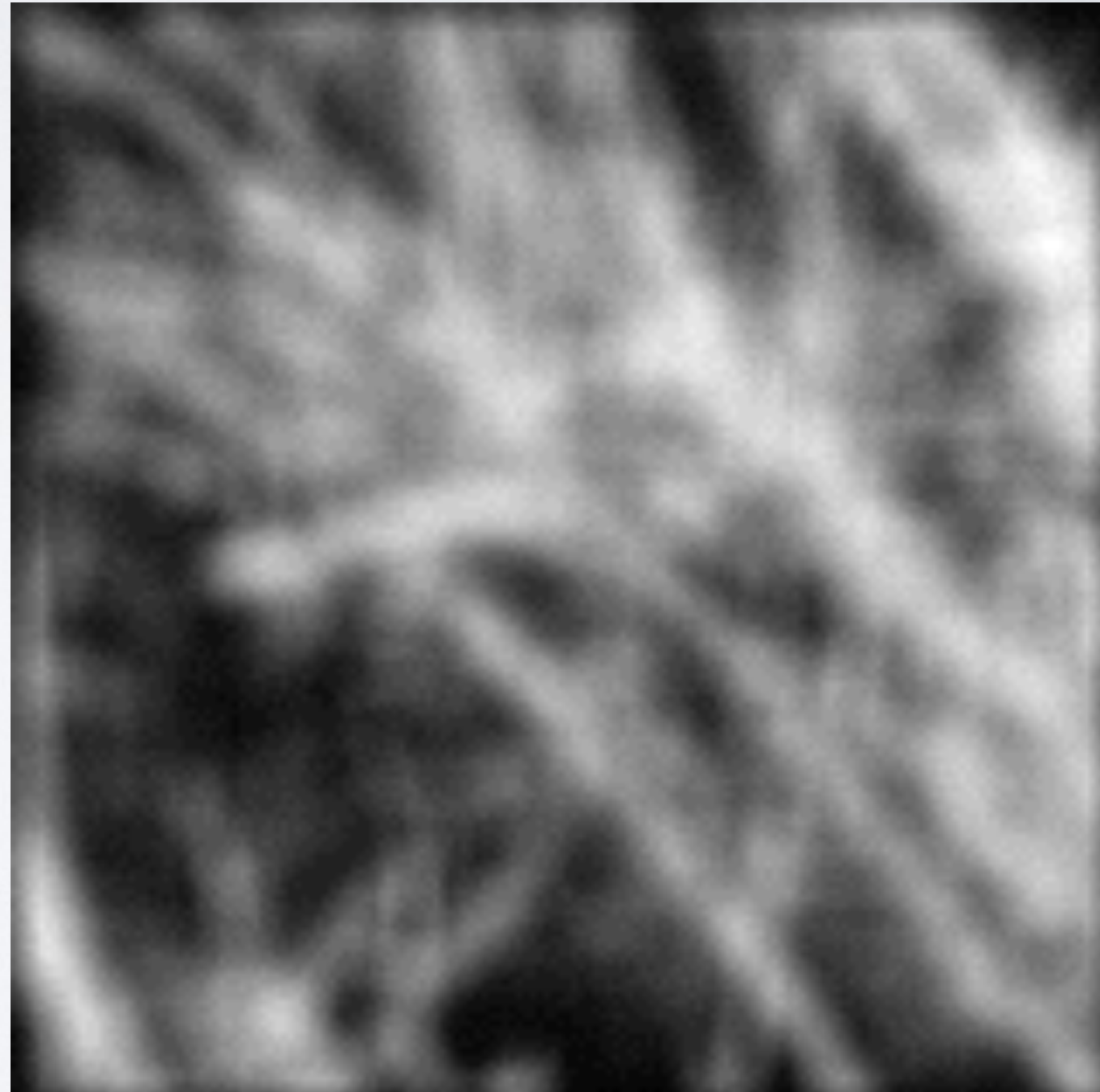


- The picture shows a smoothing kernel proportional to

$$\exp\left(-\left(\frac{x^2 + y^2}{2\sigma^2}\right)\right)$$

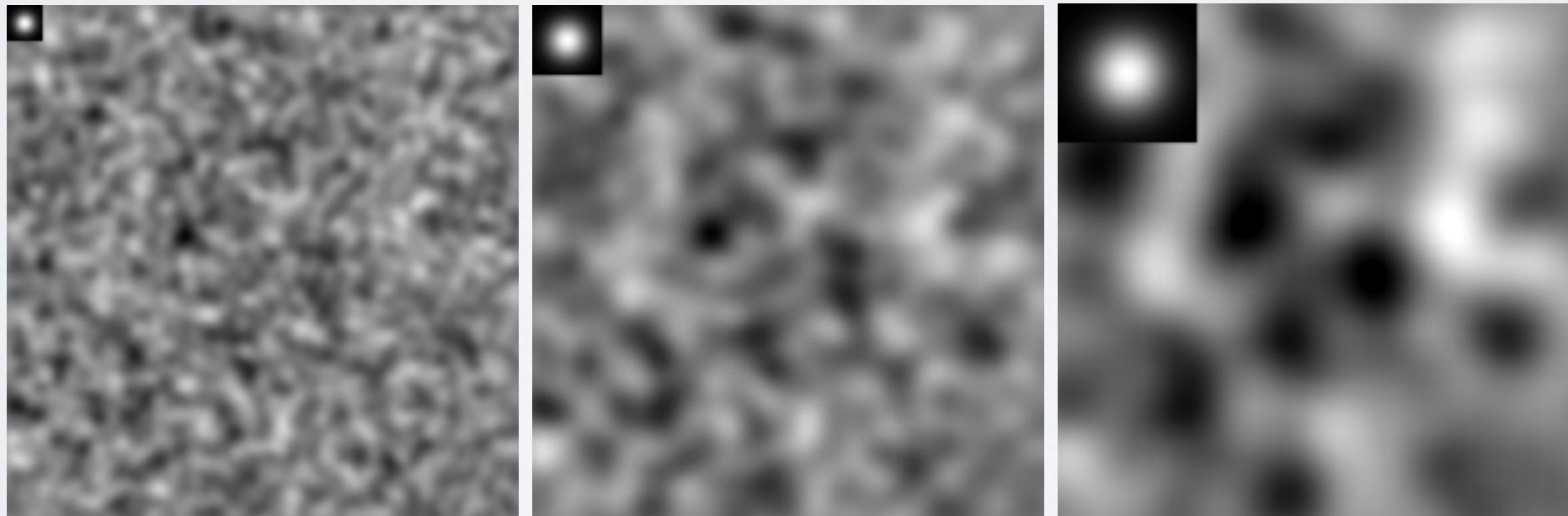
- reasonable model of a circularly symmetric blob

SMOOTHING WITH A GAUSSIAN

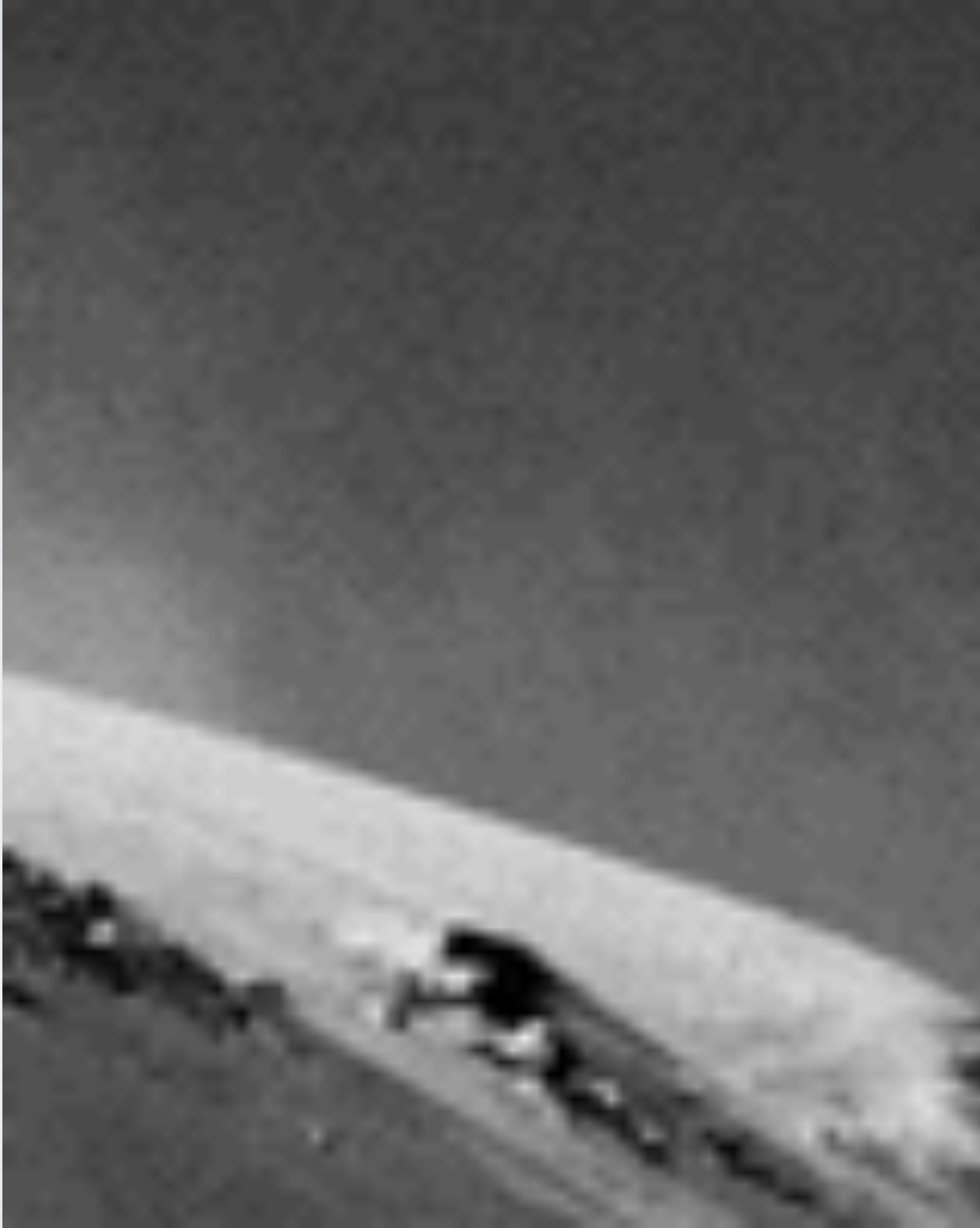


FILTER RESPONSES ARE CORRELATED

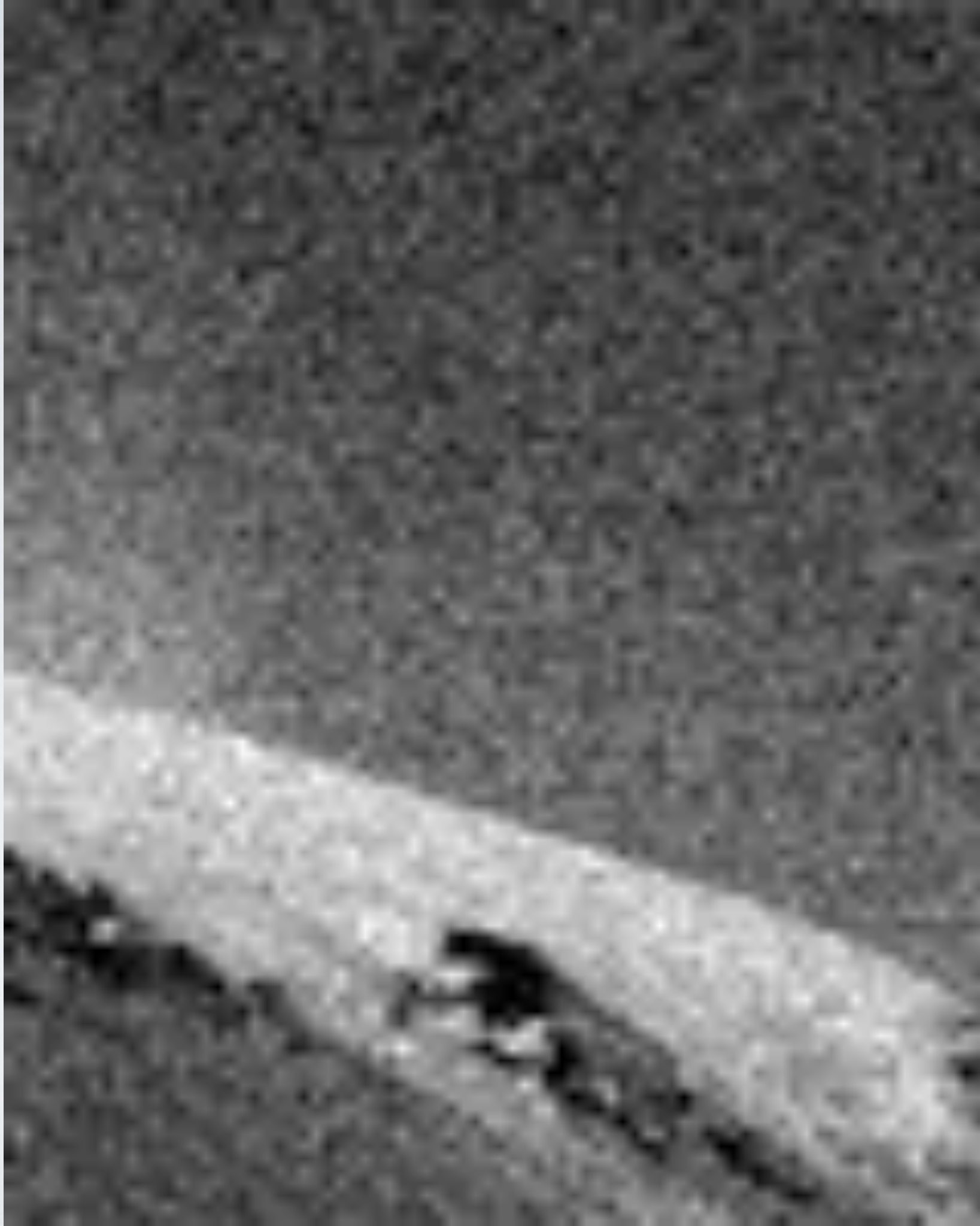
- Correlated over scales similar to scale of filter
- Filtered noise is sometimes useful
 - looks like some natural textures, can be used to simulate fire, etc.



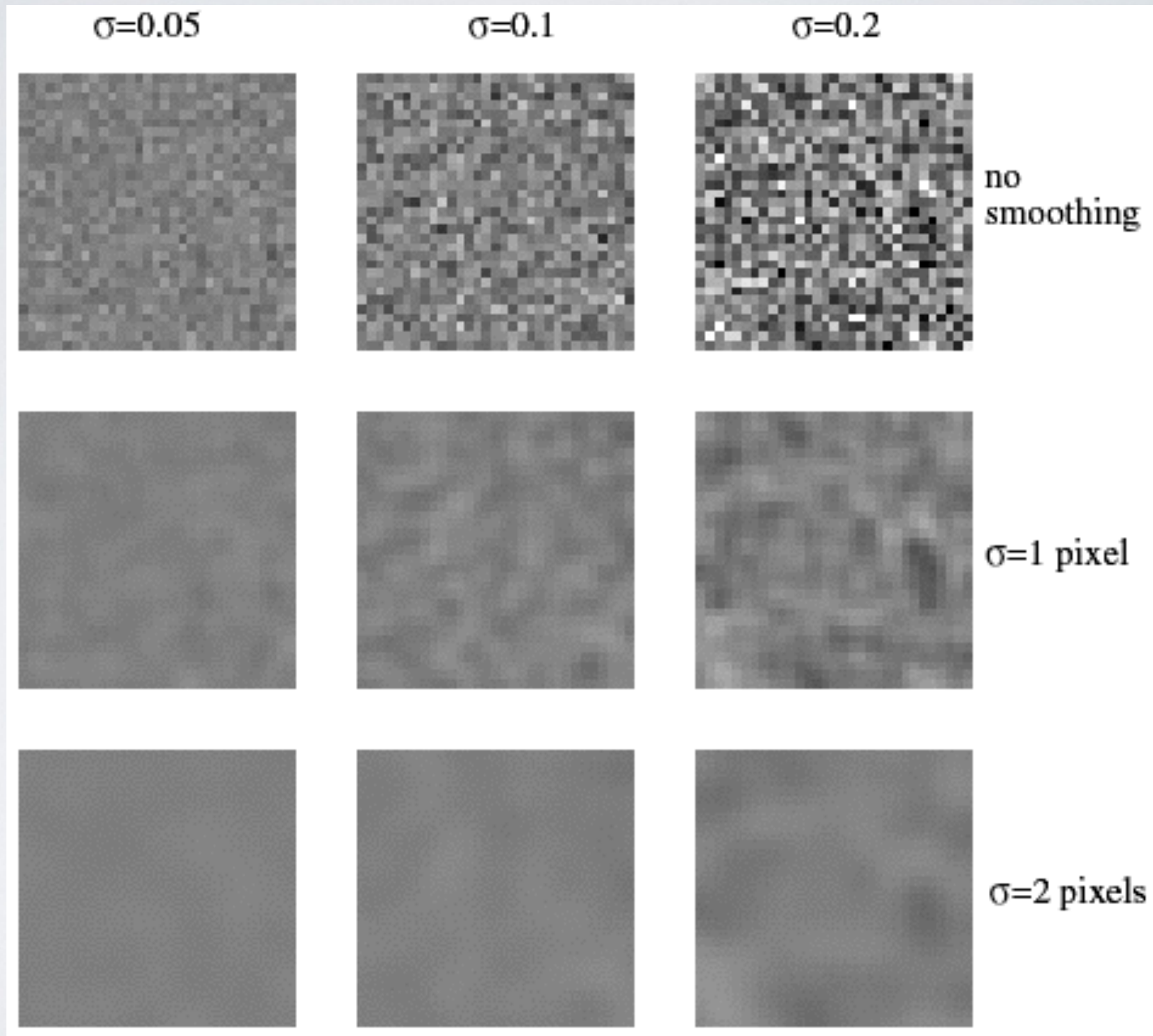
$\sigma=1$



$\sigma=16$

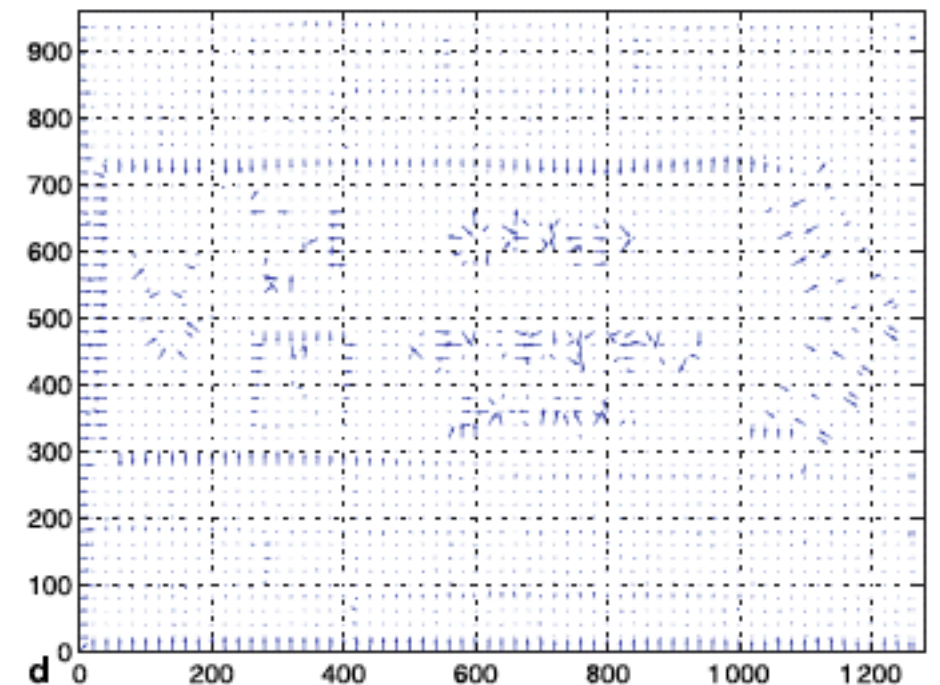
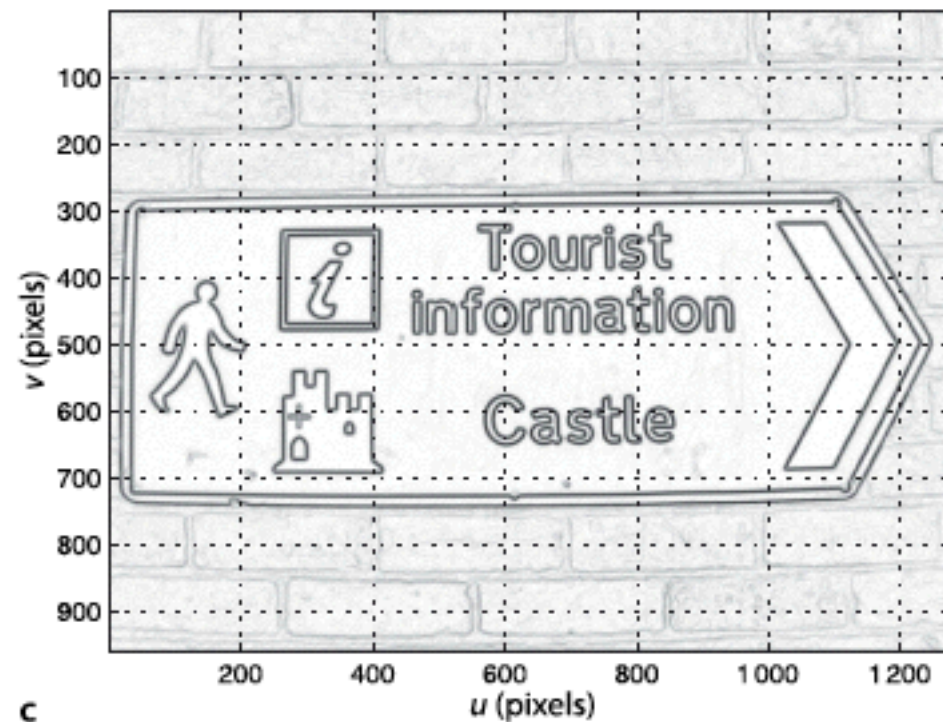
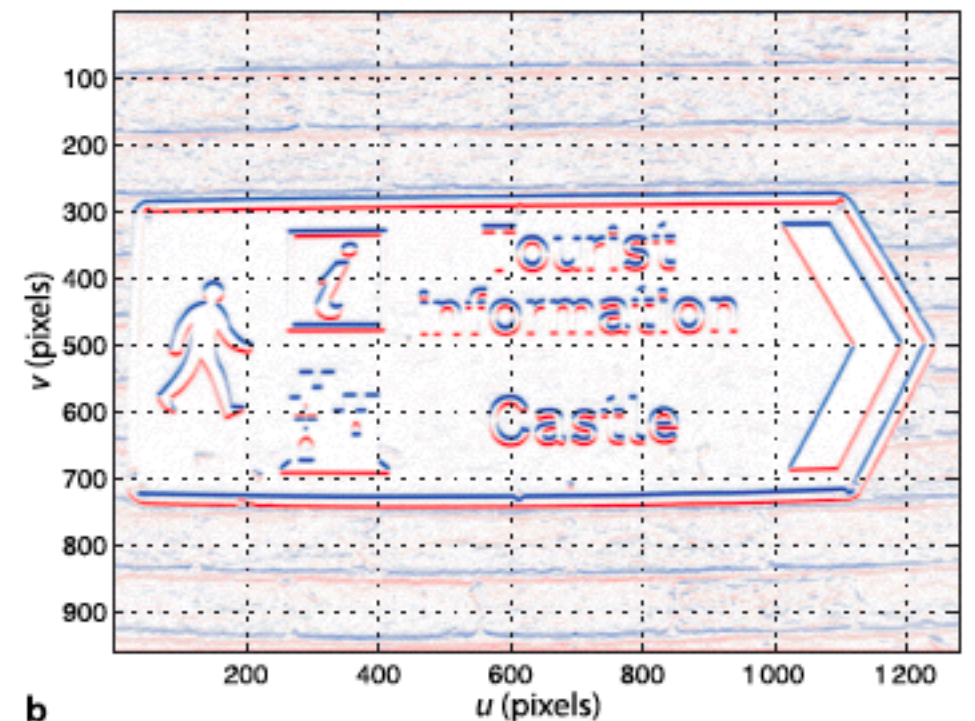
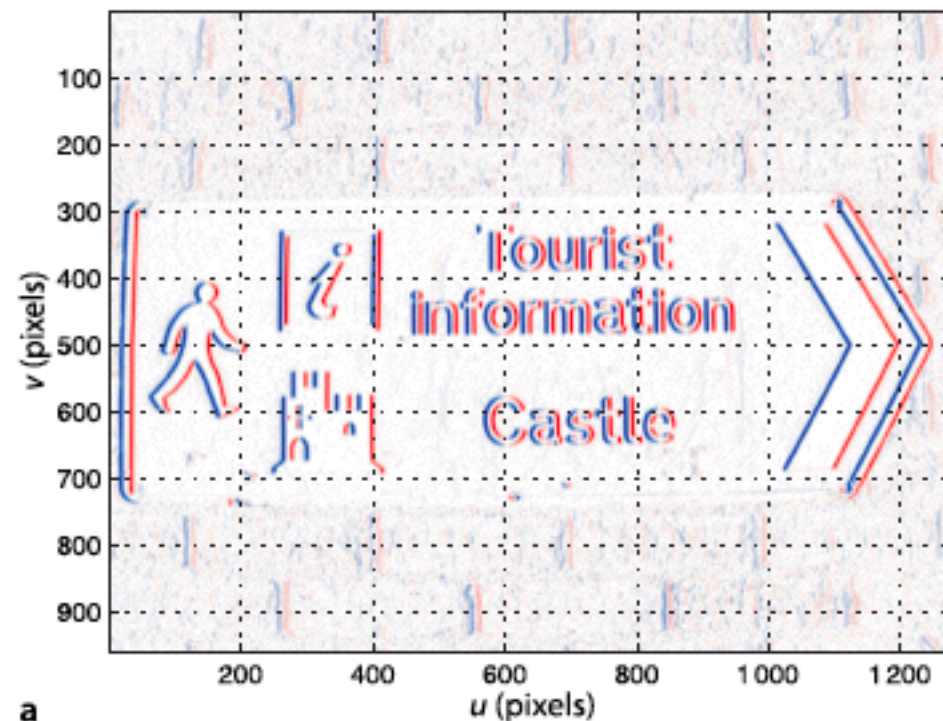


The effects of smoothing



EDGE DETECTION

```
>> Du = ksobel  
Du =  
    -1     0     1  
    -2     0     2  
    -1     0     1
```

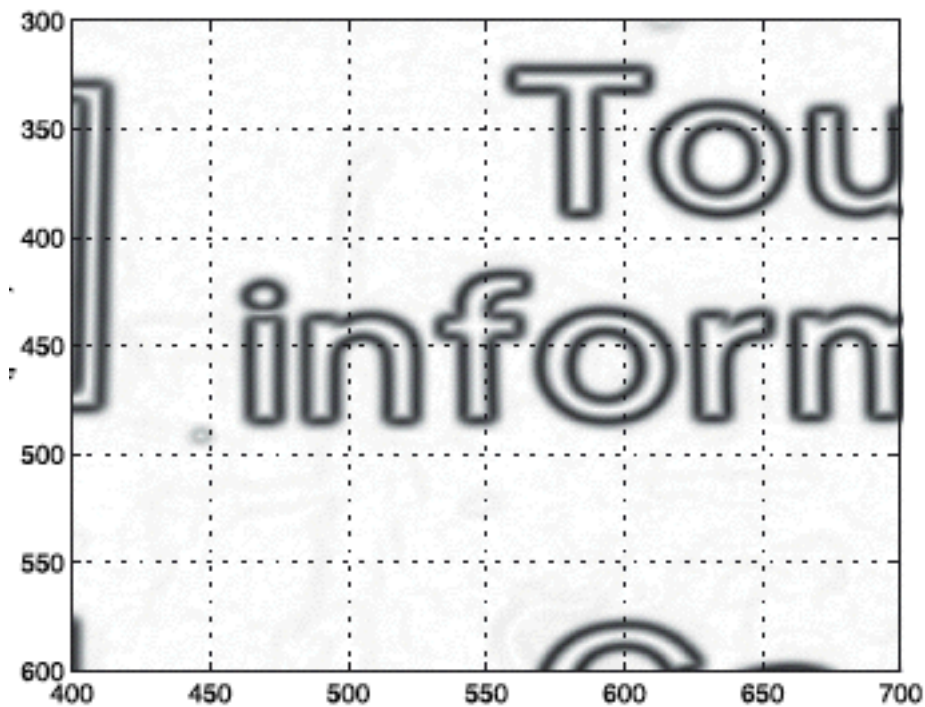


Magnitude
& direction

- Sobel Kernel (Corke Chapter 12)

|DOG| VS. CANNY

- Derivative of Gaussian operator, then take magnitude



$$\nabla I = \mathbf{D} \otimes (\mathbf{G}(\sigma) \otimes I) = \underbrace{(\mathbf{D} \otimes \mathbf{G}(\sigma))}_{\text{DoG}} \otimes I$$

$$G_u(u, v) = -\frac{u}{2\pi\sigma^2} e^{-\frac{u^2+v^2}{2\sigma^2}}$$

```
>> Iu = iconv( castle, -kdgauss(2) );  
>> Iv = iconv( castle, -kdgauss(2)' );  
>> m = sqrt( Iu.^2 + Iv.^2 );
```

- Canny: smart post-processing of edge magnitude

