

$$\begin{aligned}
(\Delta x)^2(\Delta s)^2 &= \frac{\int x^2 f f^* dx \int s^2 F F^* ds}{\int f f^* dx \int F F^* ds} \\
&= \frac{\int x f . x f^* dx \int f' f'^* dx}{4\pi^2 \left( \int f f^* dx \right)^2} \\
&\cong \frac{\left| \int (x f^* . f' + x f . f'^*) dx \right|^2}{16\pi^2 \left( \int f f^* dx \right)^2} \\
&= \frac{\left| \int x \frac{d}{dx} (f f^*) dx \right|^2}{16\pi^2 \left( \int f f^* dx \right)^2} \\
&= \frac{\left| \int f f^* dx \right|^2}{16\pi^2 \left( \int f f^* dx \right)^2} \\
&= \frac{1}{16\pi^2}.
\end{aligned}$$

# Фильтры Габора

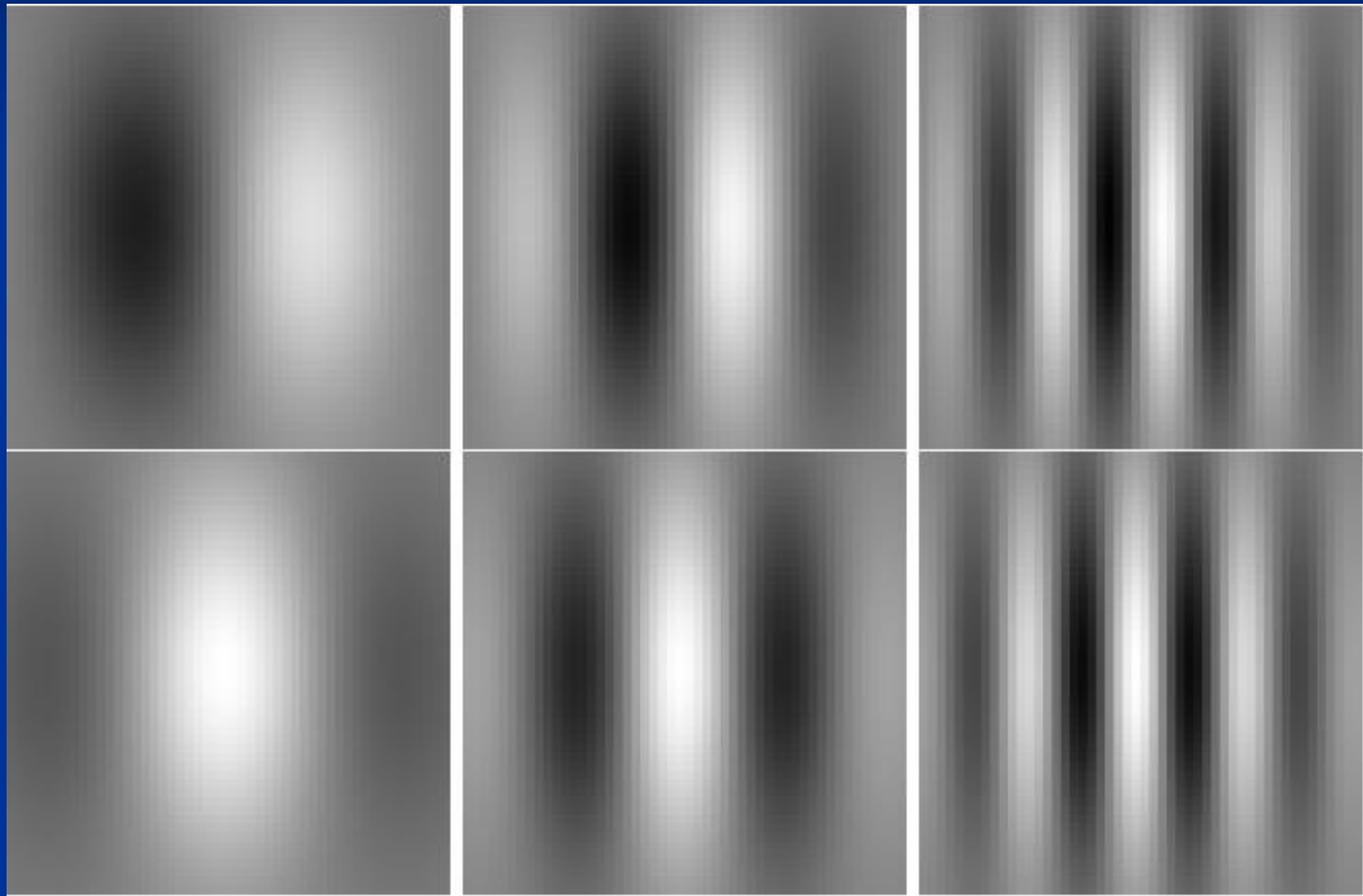
Gabor filters are formed by modulating a complex sinusoid by a Gaussian function:

$$g(x, y) = \overbrace{\frac{1}{2\pi\sigma_x\sigma_y} \exp\left(-\frac{1}{2}\left(\frac{\tilde{x}^2}{\sigma_x^2} + \frac{\tilde{y}^2}{\sigma_y^2}\right)\right)}^{\text{gaussian envelope}} \cdot \overbrace{\exp(2\pi j\omega\tilde{x})}^{\text{complex sinusoidal}}$$

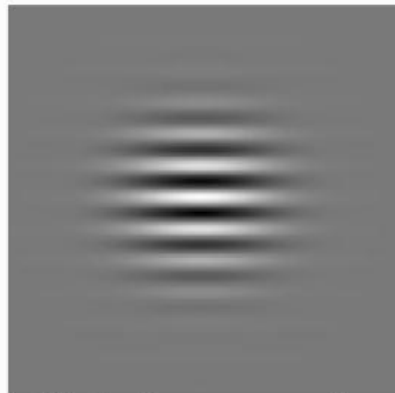
$$\text{with } \begin{cases} \tilde{x} = x \cos(\theta) + y \sin(\theta) \\ \tilde{y} = -x \sin(\theta) + y \cos(\theta) \end{cases}$$

- $\sigma_x$  and  $\sigma_y$  control spatial extent of filter
- $\theta$  is the orientation
- $\omega$  is the radial frequency of the sinusoid

# Фильтры Габо́ра

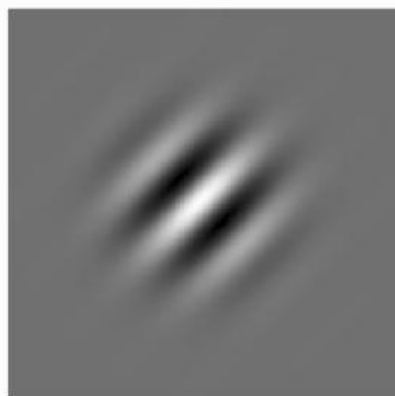
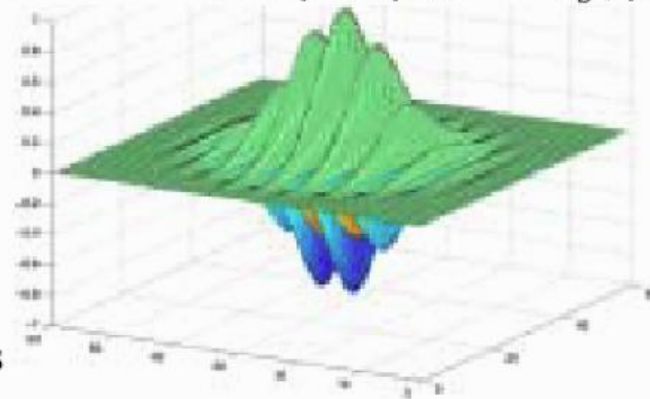


# Фильтры Габора

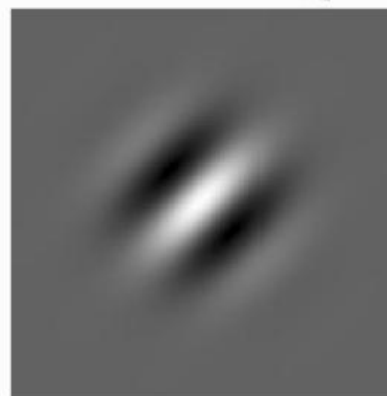


High frequency along axis

$$e^{-\frac{x^2+y^2}{2\sigma^2}} \cos(2\pi(k_x x + k_y y))$$

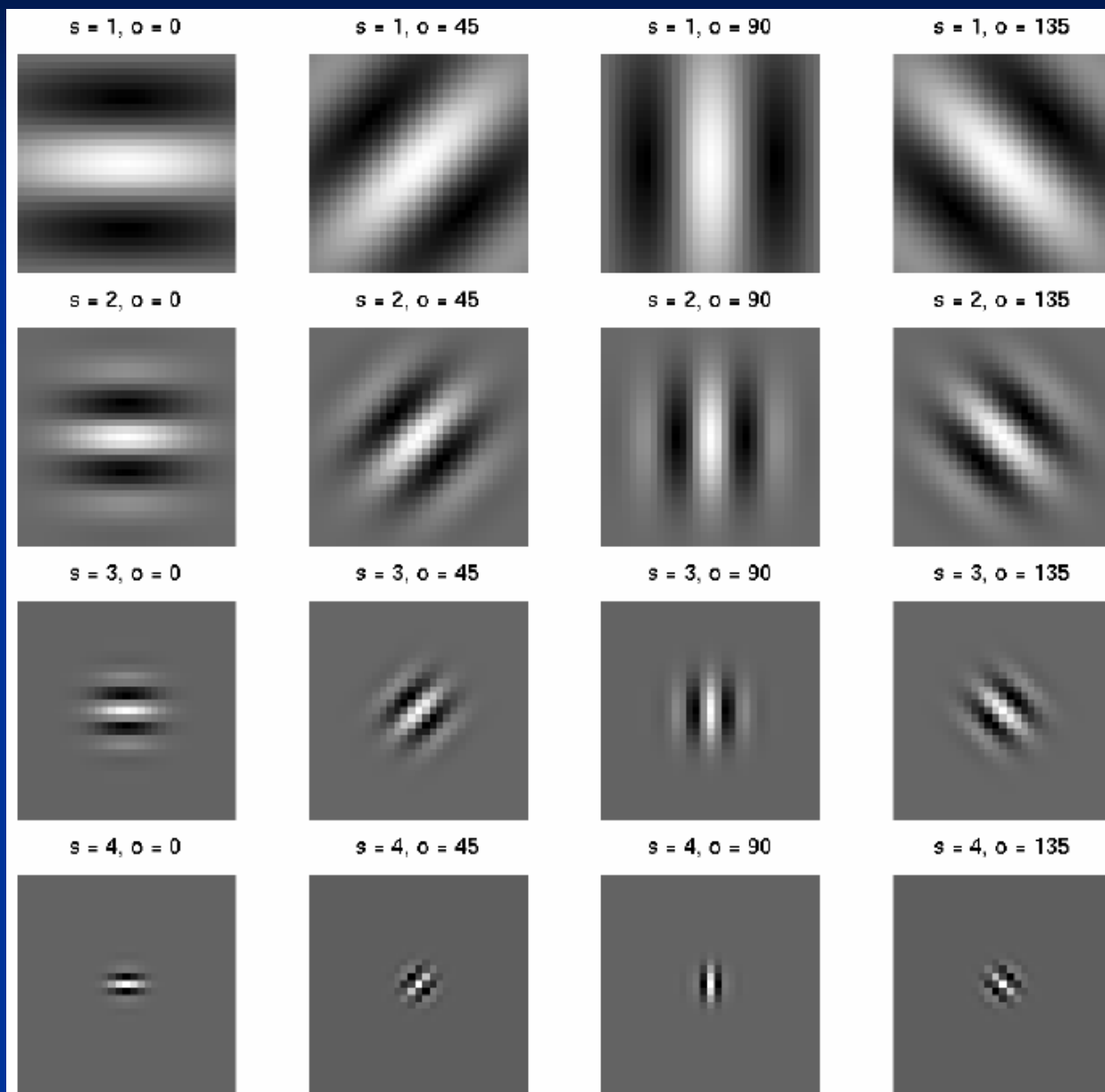


Lower frequency



Even lower frequency

# Фильтры Габора



# Функции Габора

$$g(x, y) = \left( \frac{1}{2\pi\sigma_x\sigma_y} \right) \exp \left[ -\frac{1}{2} \left( \frac{x^2}{\sigma_x^2} + \frac{y^2}{\sigma_y^2} \right) + 2\pi j W x \right],$$

$$G(u, v) = \exp \left\{ -\frac{1}{2} \left[ \frac{(u - W)^2}{\sigma_u^2} + \frac{v^2}{\sigma_v^2} \right] \right\},$$

where  $\sigma_u = 1/2\pi\sigma_x$  and  $\sigma_v = 1/2\pi\sigma_y$ .

# Габоровские вейвлеты

$$g_{mn}(x, y) = a^{-m}g(x', y'), \quad a > 1, \quad m, n = \text{integer}$$

$$x' = a^{-m}(x \cos \theta + y \sin \theta) \quad \text{and}$$

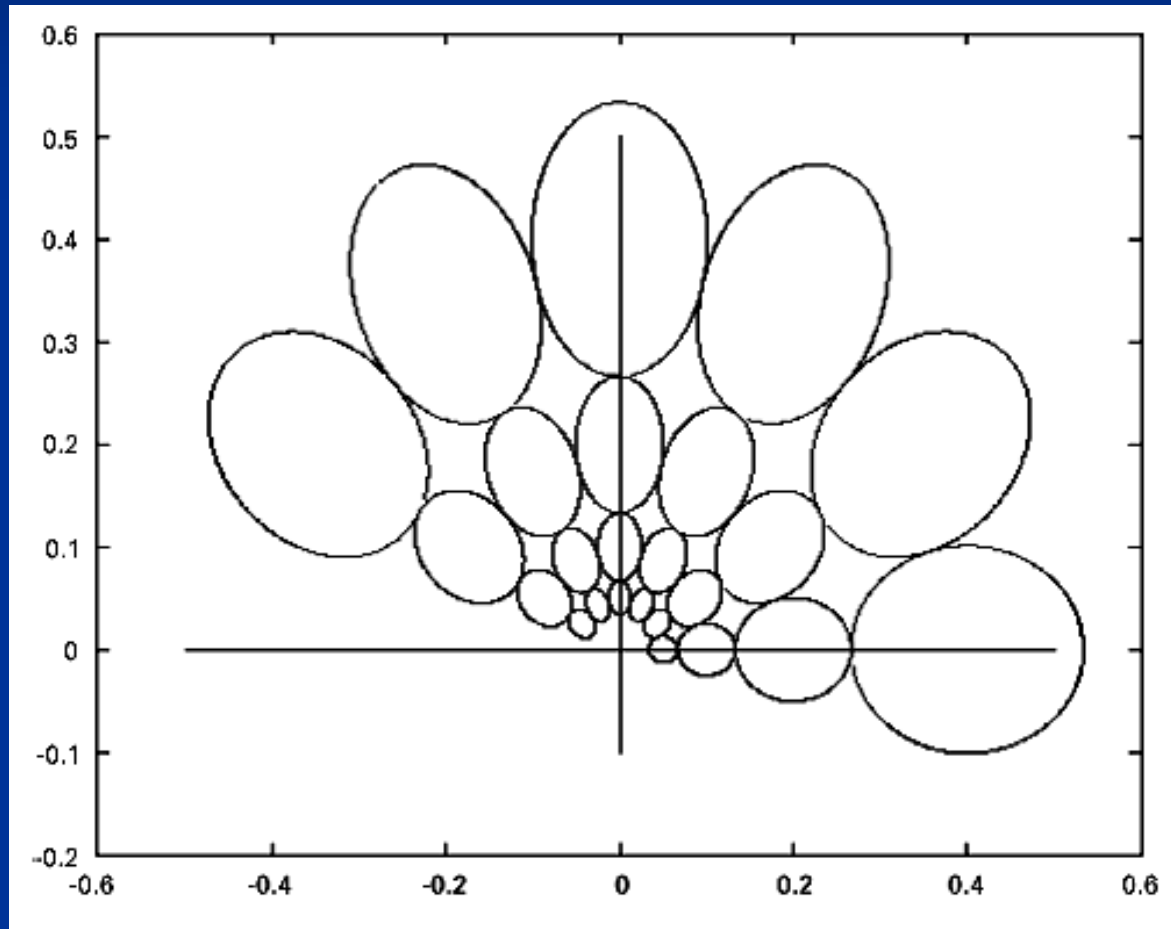
$$y' = a^{-m}(-x \sin \theta + y \cos \theta),$$

$$\theta = n\pi/K$$

$K$  – number of orientations

# Габоровские вейвлеты

$$W_{mn}(x, y) = \int I(x, y) g_{mn}^*(x - x_1, y - y_1) dx_1 dy_1$$



$$U_h = 0.04, U_1 = 0.05, K = 6 \text{ and } S = 4$$

# Габоровские вейвлеты

$$a = (U_{\mathbf{h}}/U_1)^{1/(S-1)}, \quad \sigma_u = \frac{(a-1)U_{\mathbf{h}}}{(a+1)\sqrt{2 \ln 2}},$$

$$\sigma_v = \tan\left(\frac{\pi}{2k}\right) \left[ U_{\mathbf{h}} - 2 \ln 2 \left( \frac{\sigma_u^2}{U_{\mathbf{h}}} \right) \right] \\ \times \left[ 2 \ln 2 - \frac{(2 \ln 2)^2 \sigma_u^2}{U_{\mathbf{h}}^2} \right]^{-1/2}$$

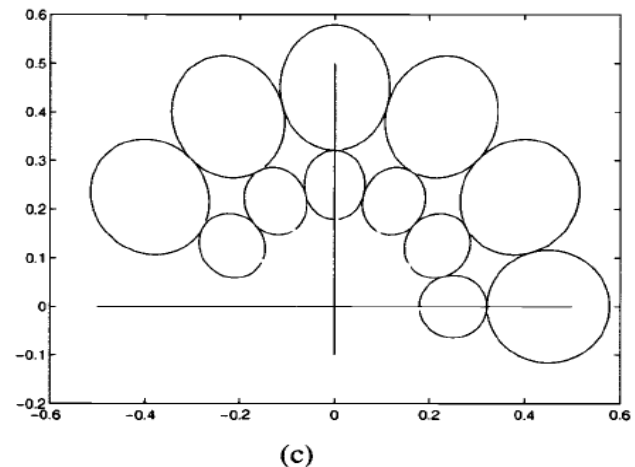
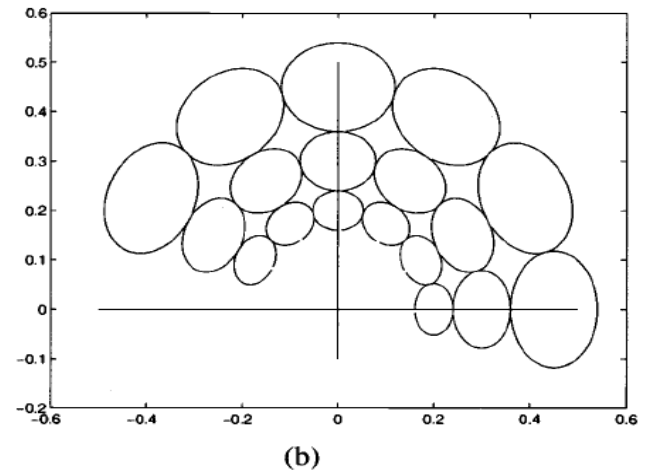
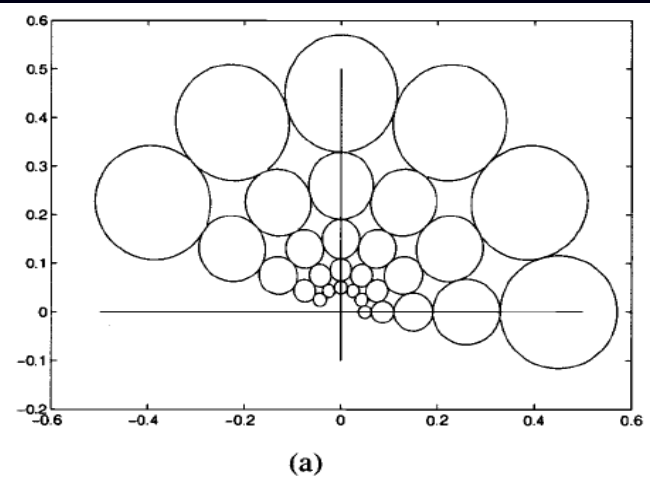
$$W = U_{\mathbf{h}} \text{ and } m = 0, 1, \dots, S-1$$

$K=6$

*a)*  $\sigma = 5, S = 5$

*b)*  $\sigma = 1.25, S = 3$

*c)*  $\sigma = 1, S = 2$



# Текстуры



Bark



Bark



Fabric



Fabric



Fabric



Flowers



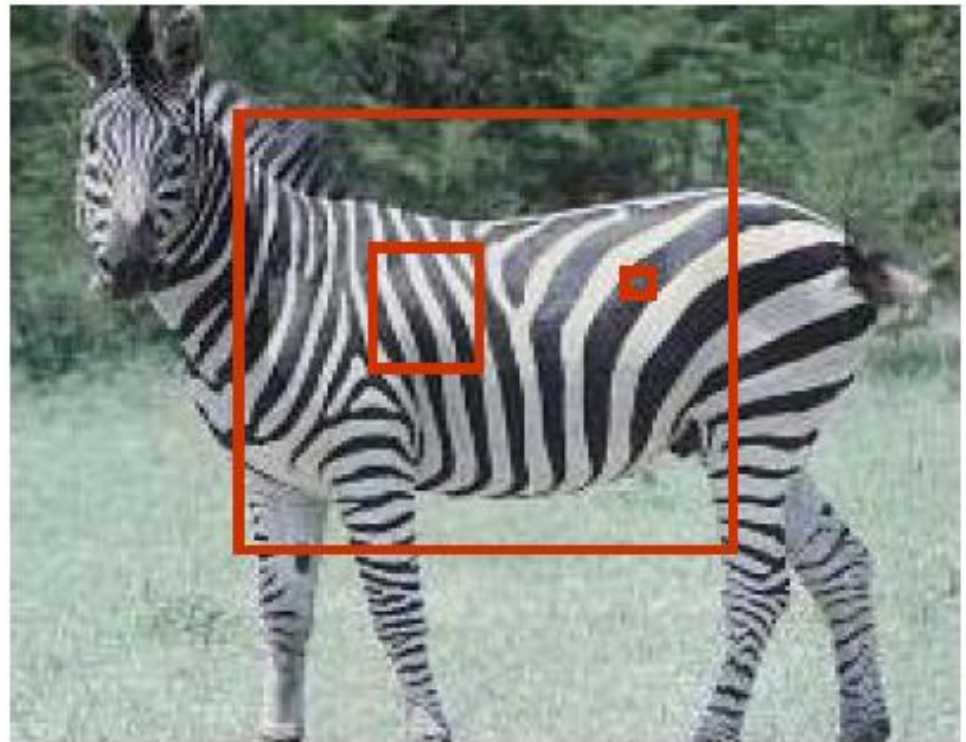
Flowers



Flowers

# Текстуры

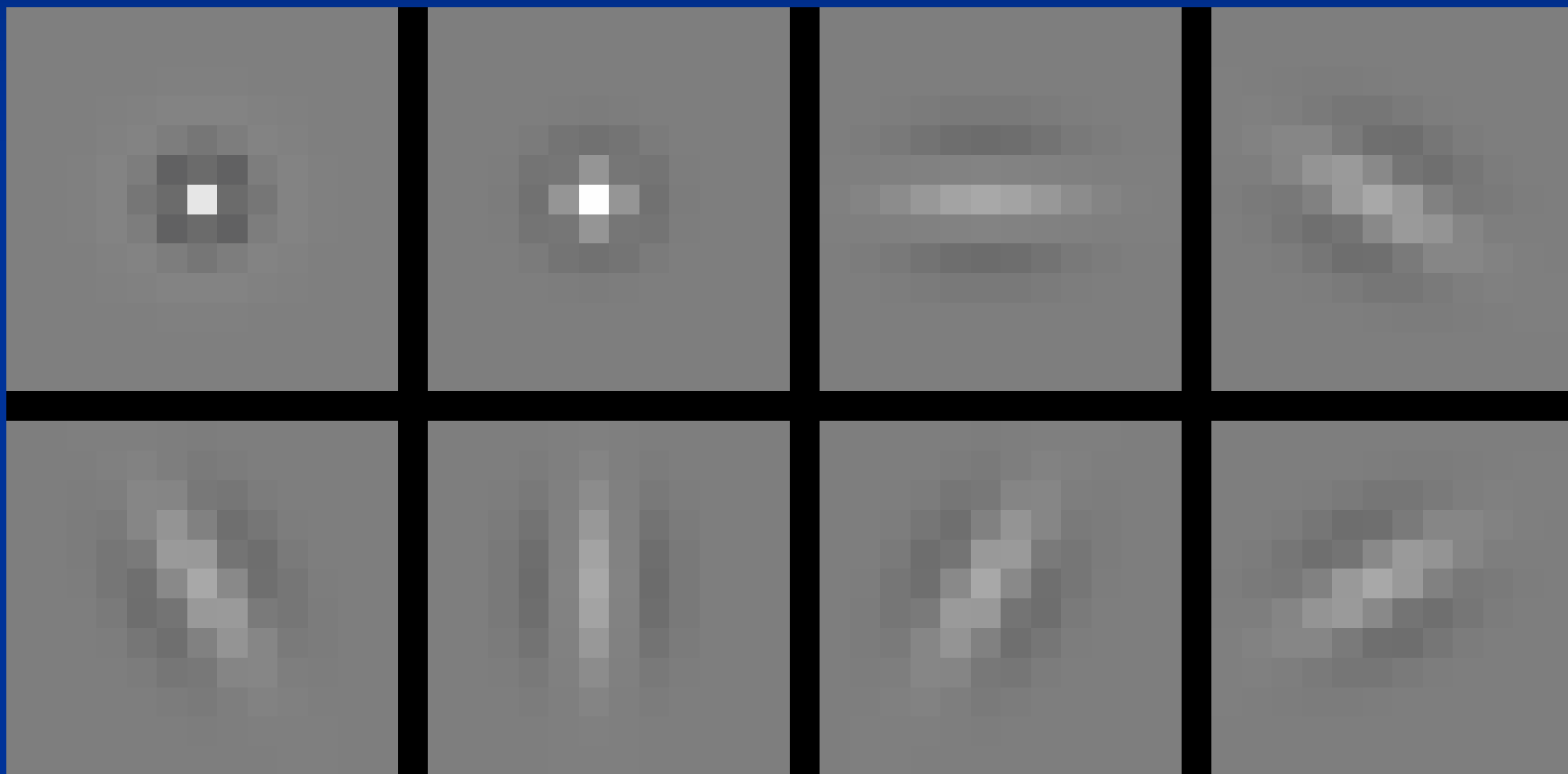
- Whether an effect is a texture or not depends on the scale at which it is viewed.



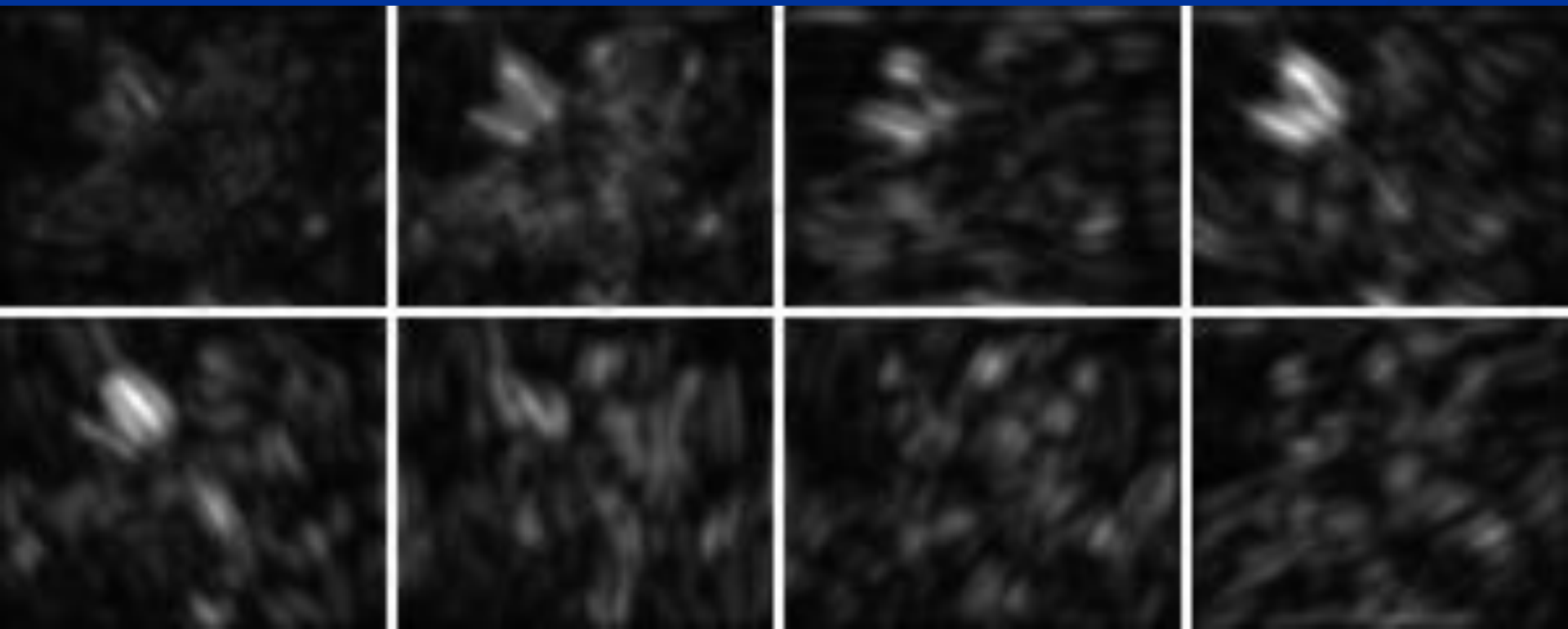
# Текстуры



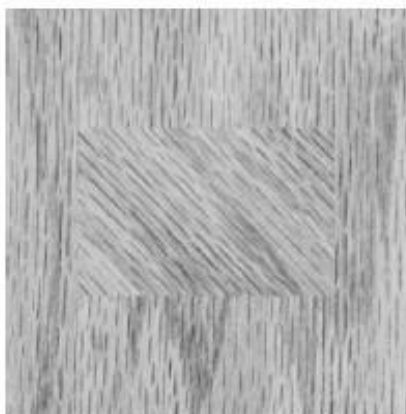
# Банки фильтров



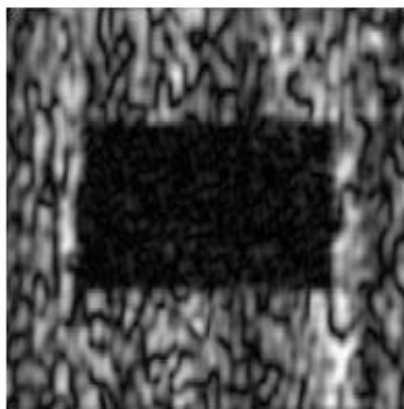
# Банки фильтров



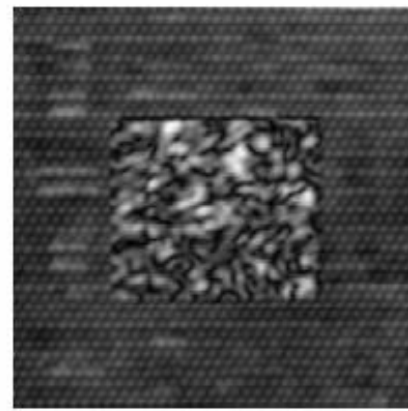
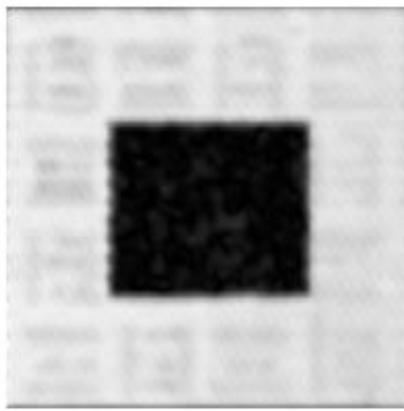
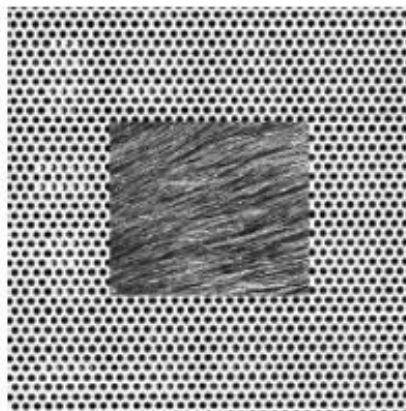
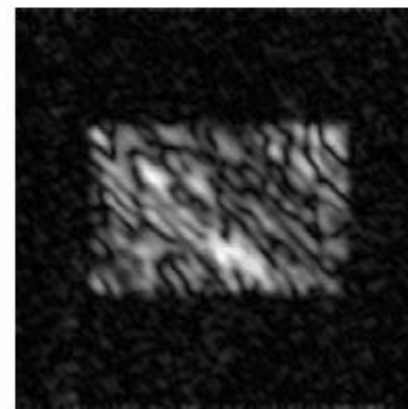
# Фильтры Габора



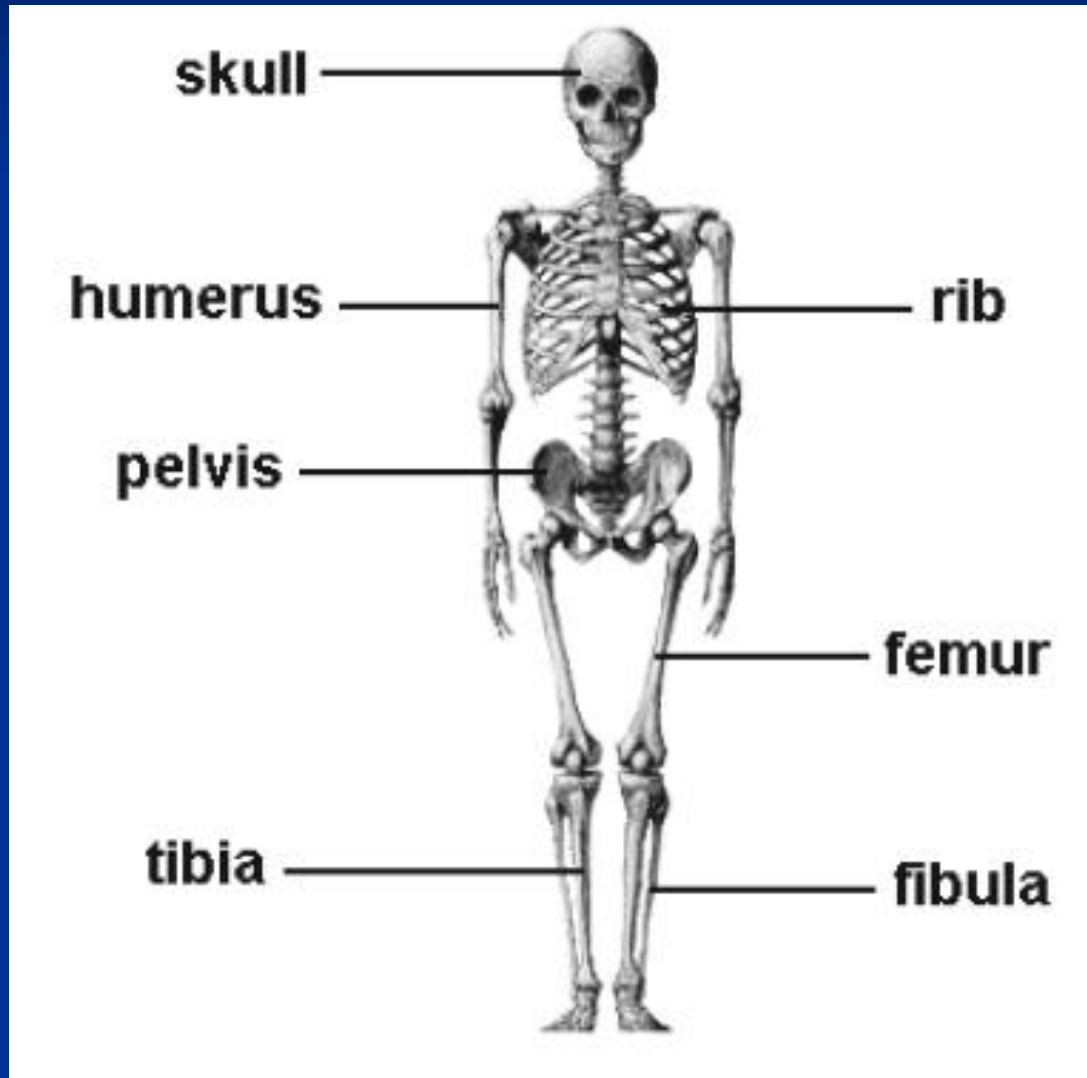
Texture image



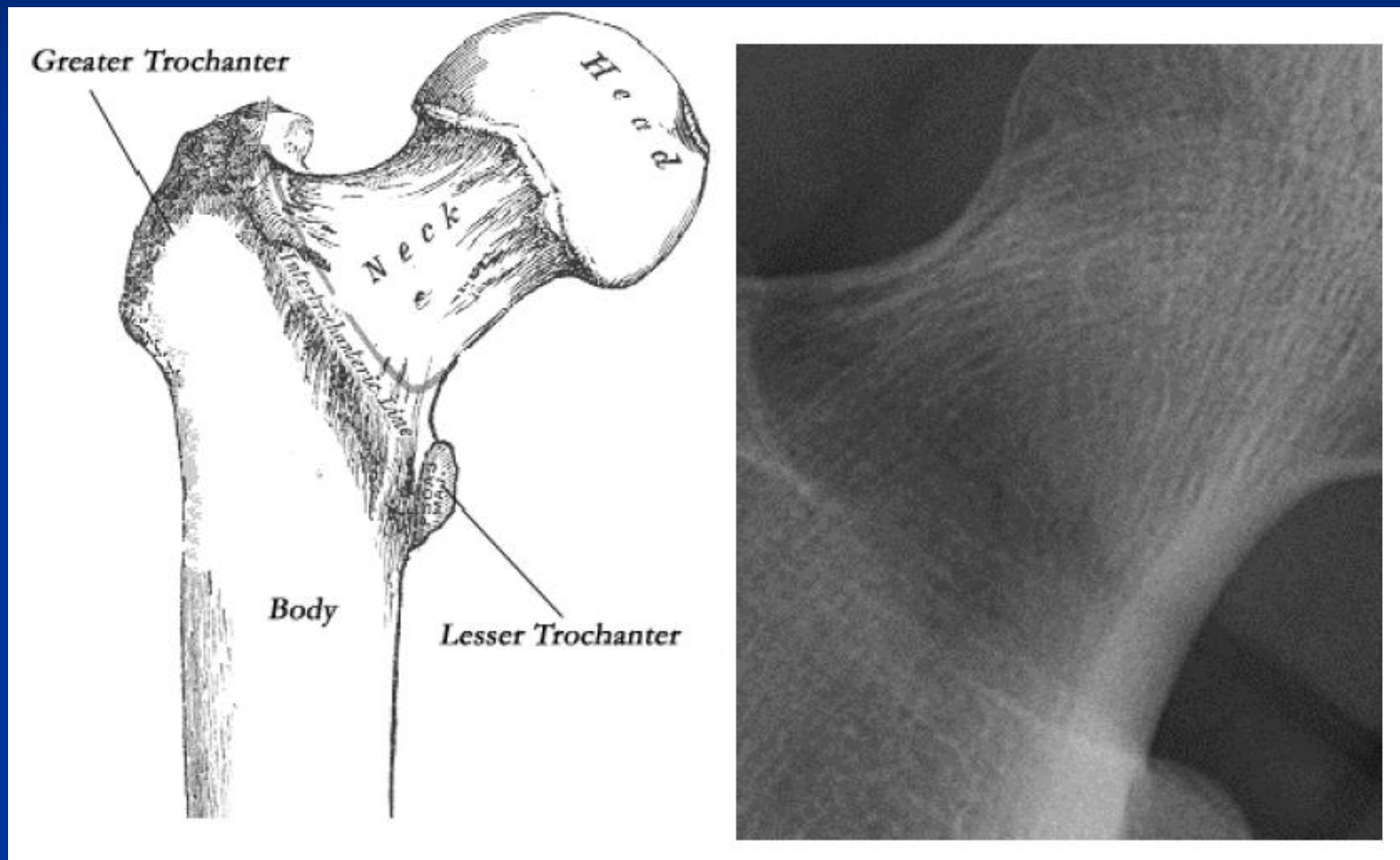
Magnitude of Gabor filter responses



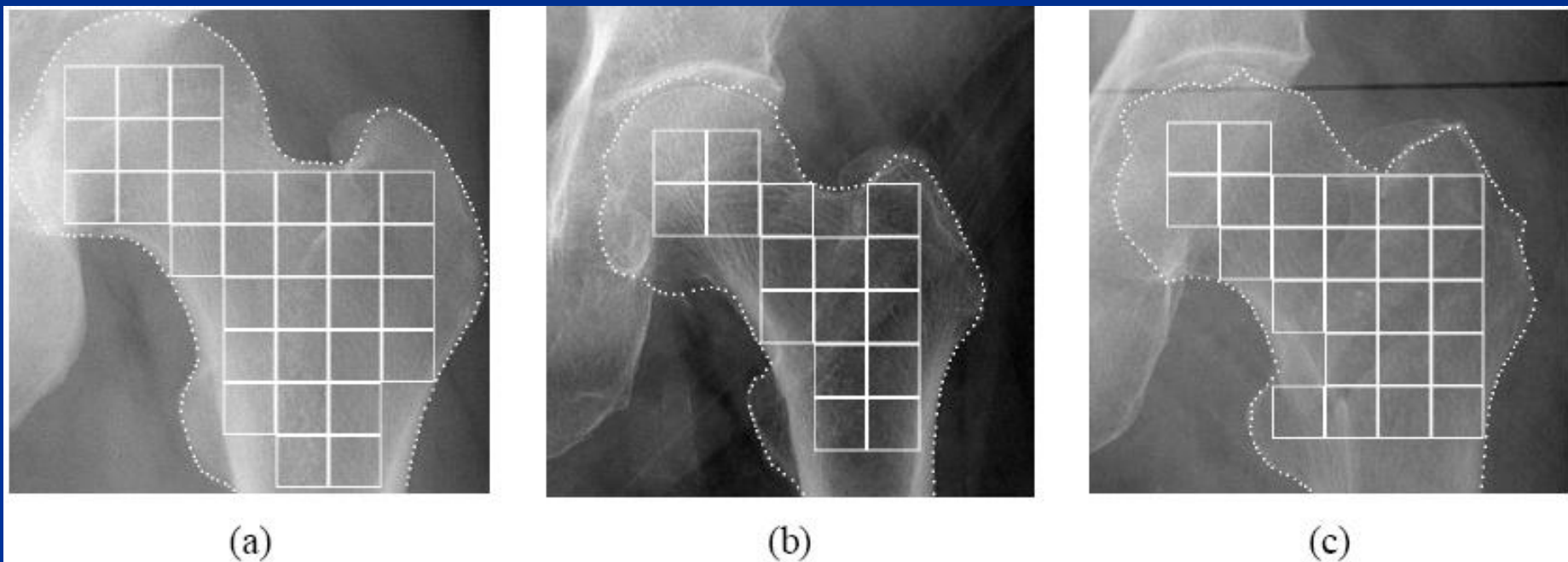
# Анализ бедренной кости (femur)



# Шейка бедра



# Шейка бедра



**Figure 3.3.** A femur is a natural structure that exhibits variations. (a) and (b) above are healthy, while (c) is fractured. Here, (a) is larger than (b). (c) has a relatively shorter neck, due to the fracture. Each grid square is a region sampled for texture orientation feature extraction

$$h(x, y) = g(x', y') \exp(2\pi jfx').$$

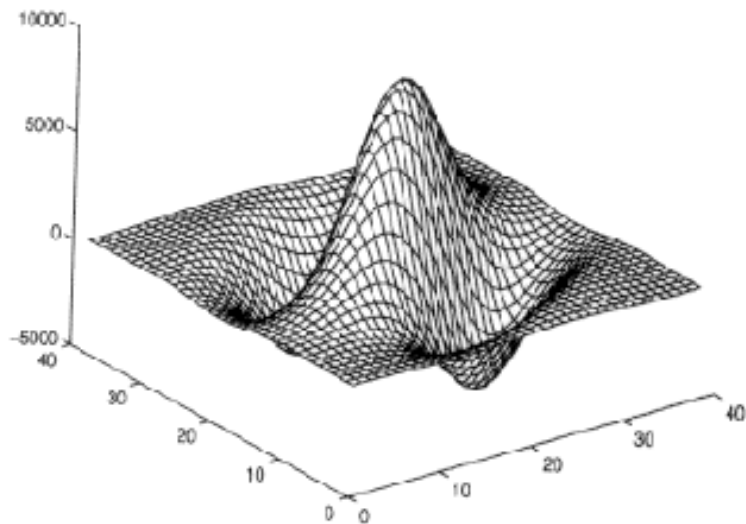
The oriented Gaussian function  $g(x', y')$  is given by:

$$g(x', y') = \frac{1}{2\pi\lambda\sigma^2} \exp\left[-\frac{(x'/\lambda)^2 + y'^2}{2\sigma^2}\right],$$

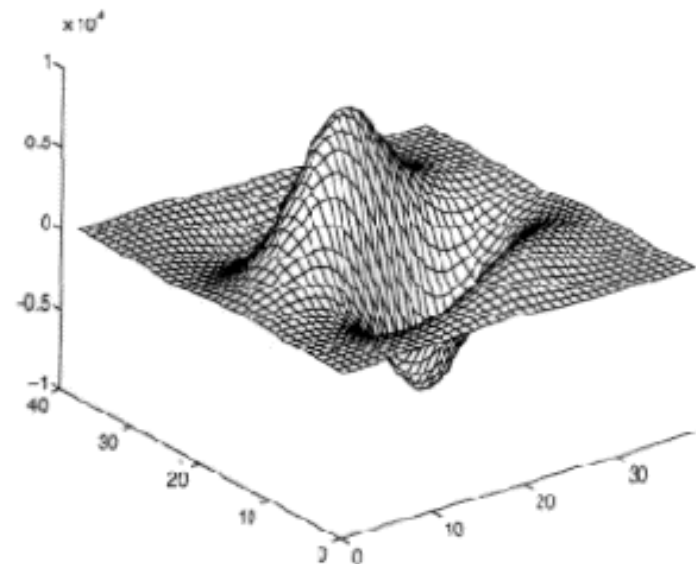
where  $(x', y') = (x \cos \theta + y \sin \theta, -x \sin \theta + y \cos \theta)$  are rotated coordinates

$$h_{c,f\theta}(x, y) = g(x', y') \cos(2\pi fx'),$$

$$h_{s,f\theta}(x, y) = g(x', y') \sin(2\pi fx').$$

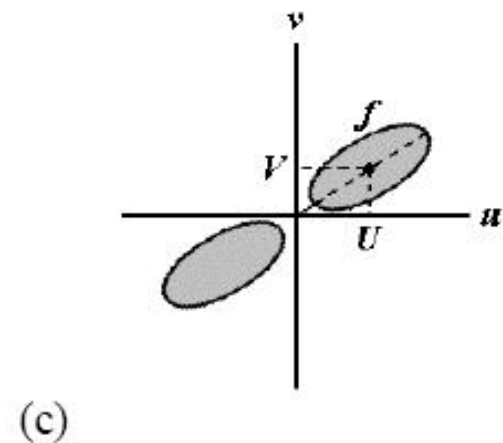
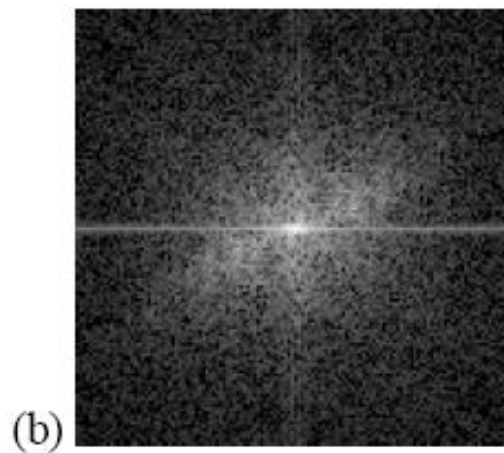
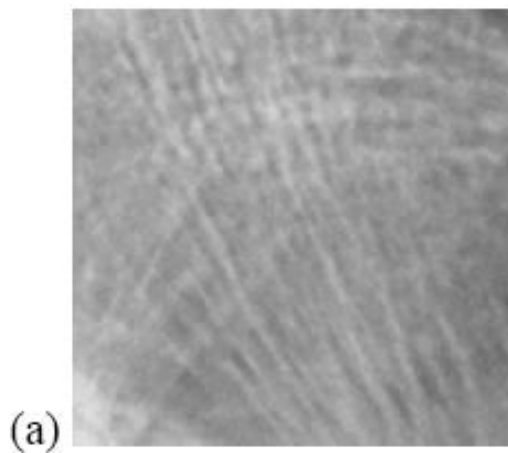


(a)



(b)

# Фурье анализ текстуры кости



$$f_p = \sqrt{\bar{U}^2 + \bar{V}^2}$$

$$f_p \cong 0.13 \text{ cycles per pixel}$$

A Gabor filter bank of 1 frequency channel and 8 orientation channels is used to extract the orientation of the texture patterns in the femur. The centre frequency  $f$  of the Gabor filters is set to 0.13 cycles per pixel, and orientations range from  $0^\circ$  to  $157.5^\circ$ , incrementing in steps of  $22.5^\circ$ .

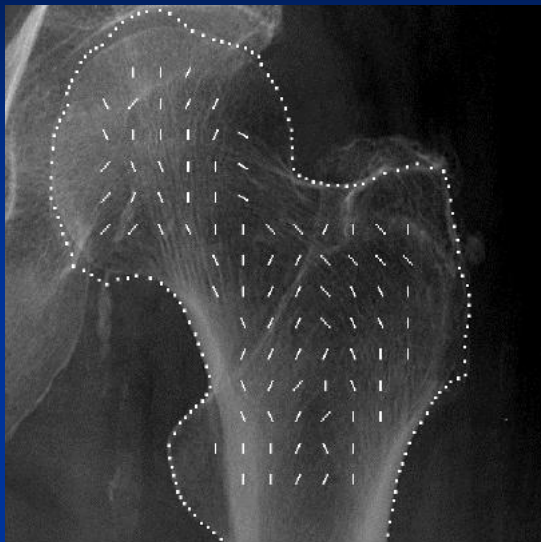
$$e_{c,f\theta}(x, y) = I(x, y) * h_{c,f\theta},$$

$$e_{s,f\theta}(x, y) = I(x, y) * h_{s,f\theta}.$$

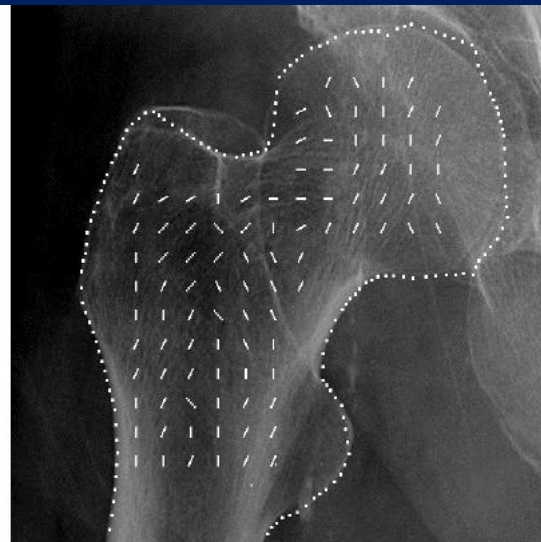
$$E_{f\theta}(x, y) = e_{c,f\theta}^2(x, y) + e_{s,f\theta}^2(x, y)$$

$$\bar{E}_{f\theta} = \frac{1}{S_x S_y} \sum_{x=1}^{S_x} \sum_{y=1}^{S_y} E_{f\theta}(x, y)$$

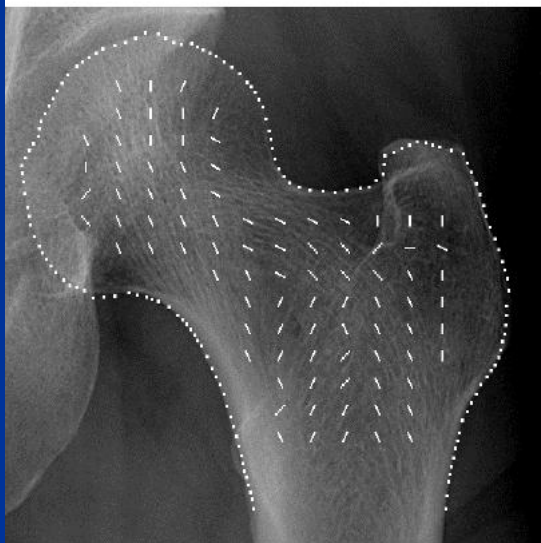
# Целые кости



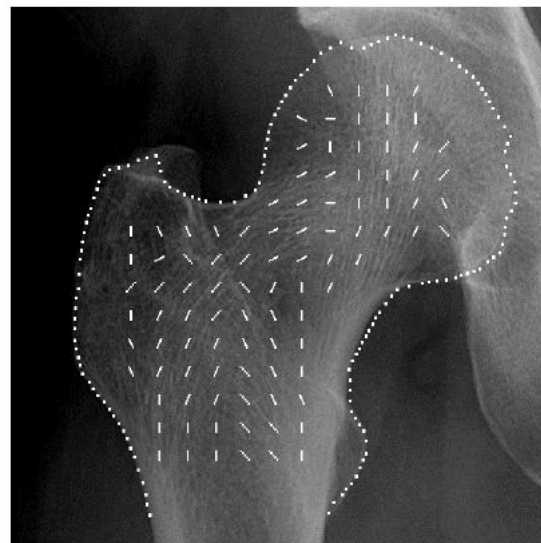
(a)



(b)

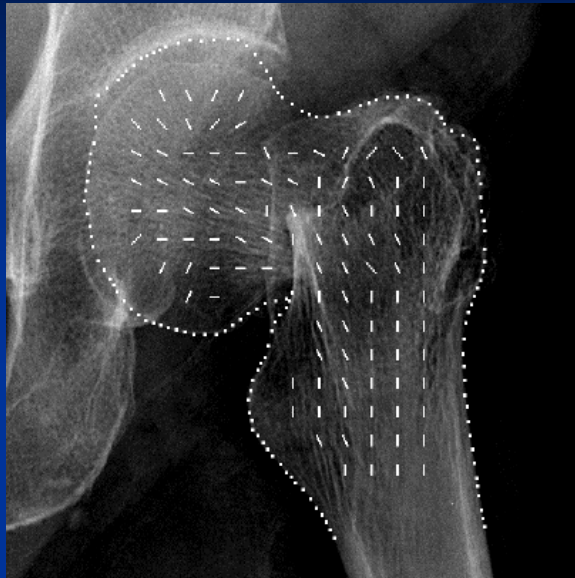


(c)

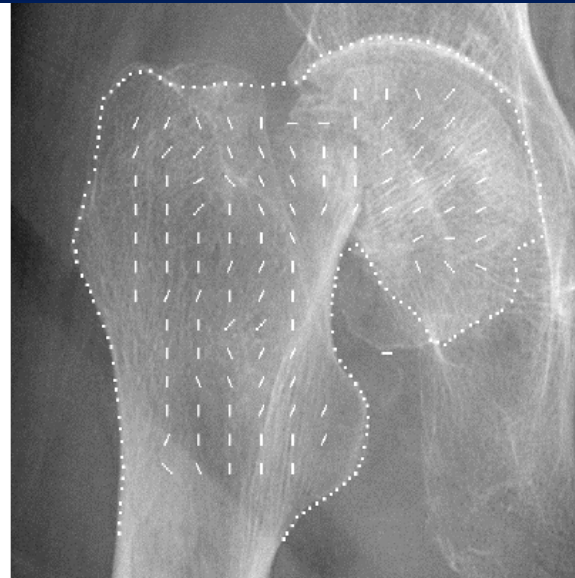


(d)

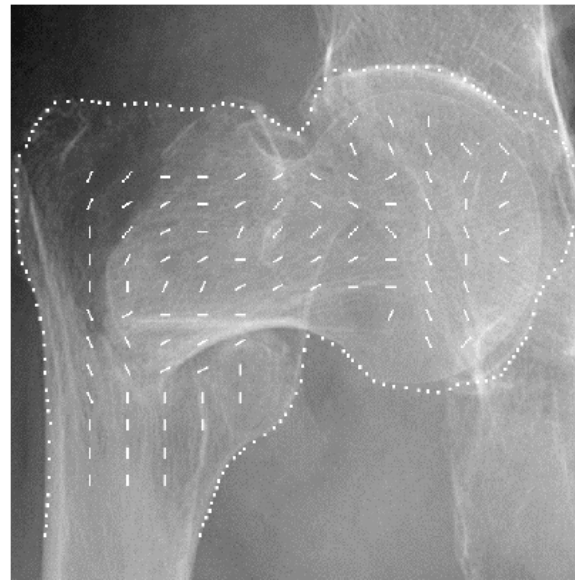
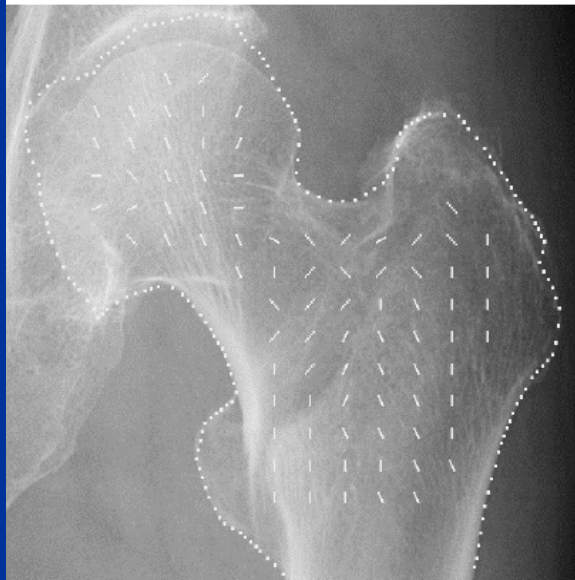
# Кости с переломом



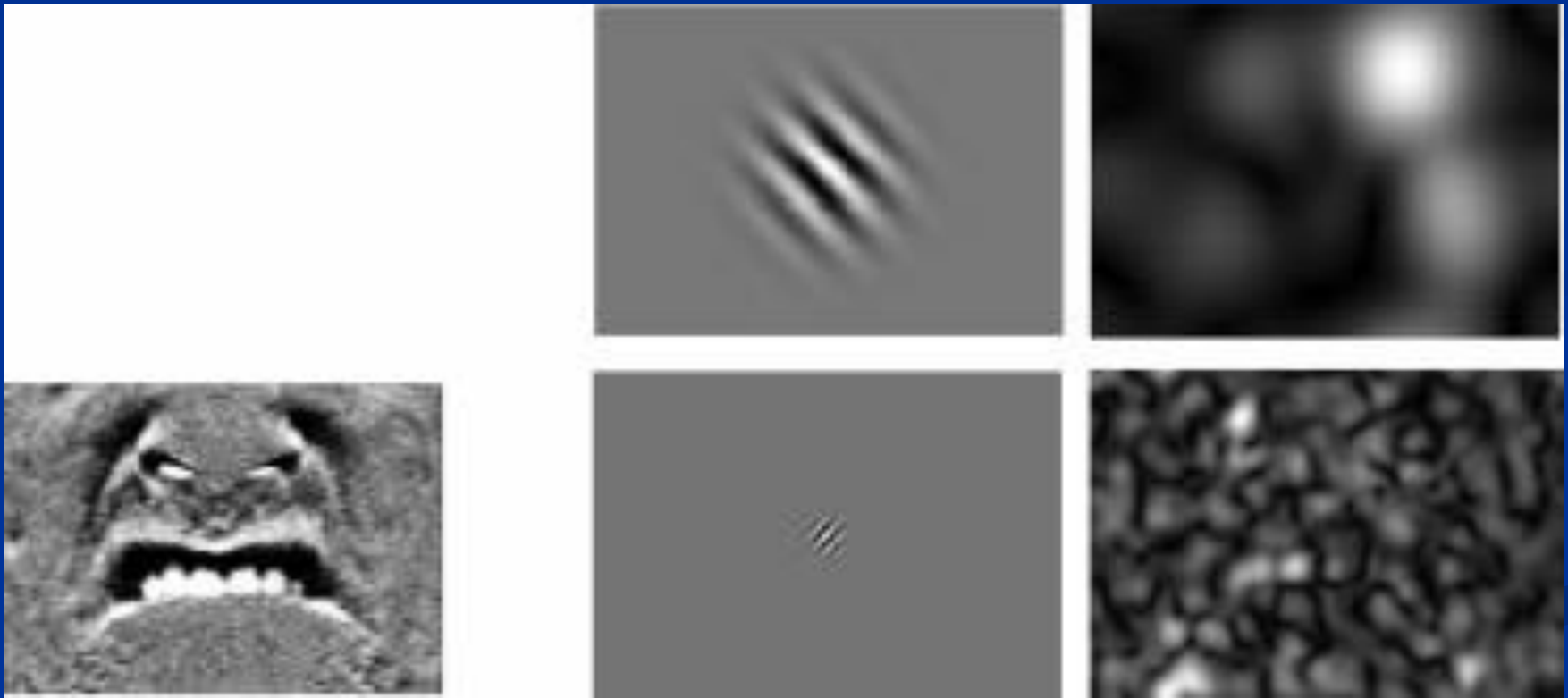
(a)



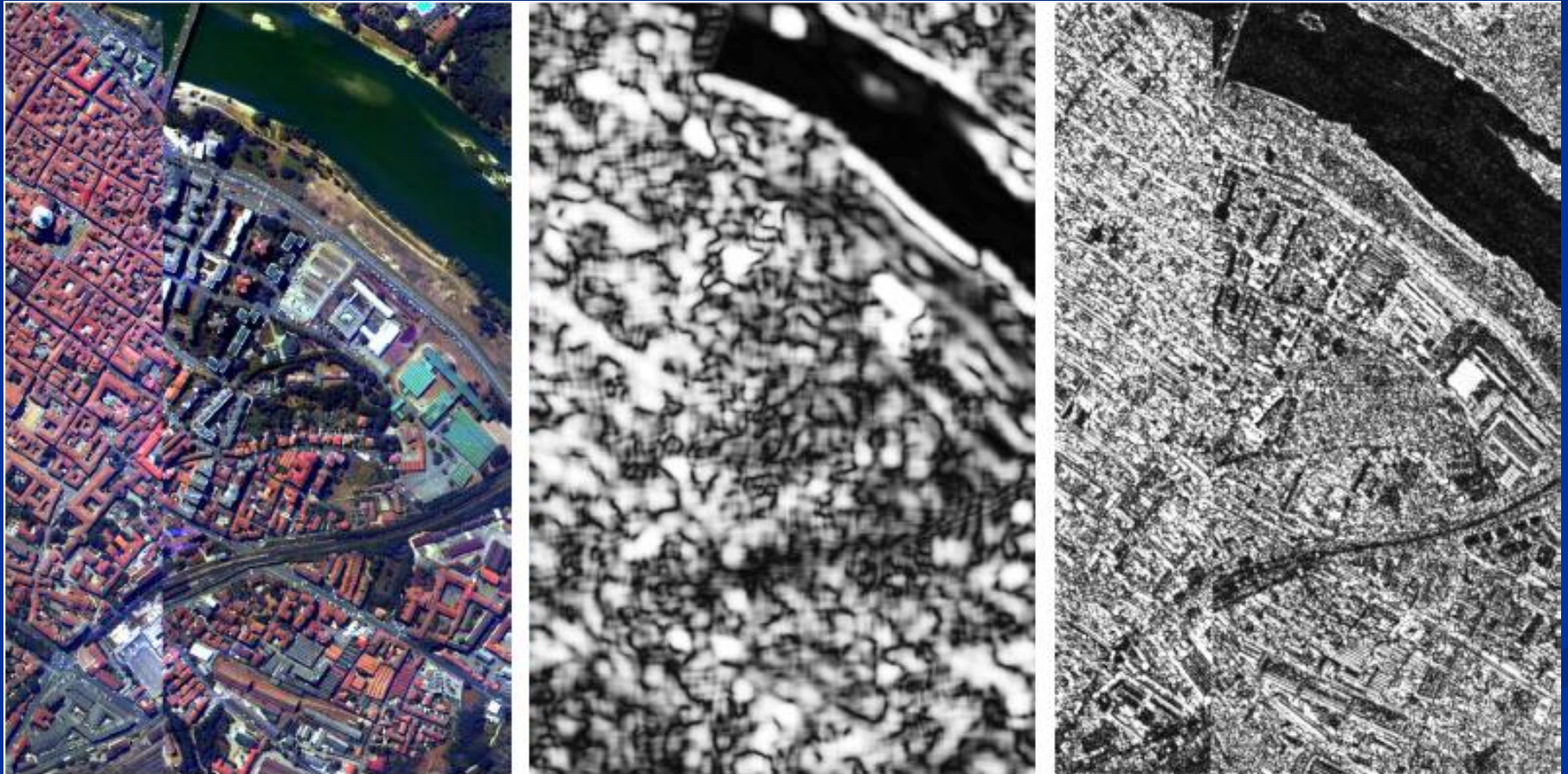
(b)



# Фильтры Габора

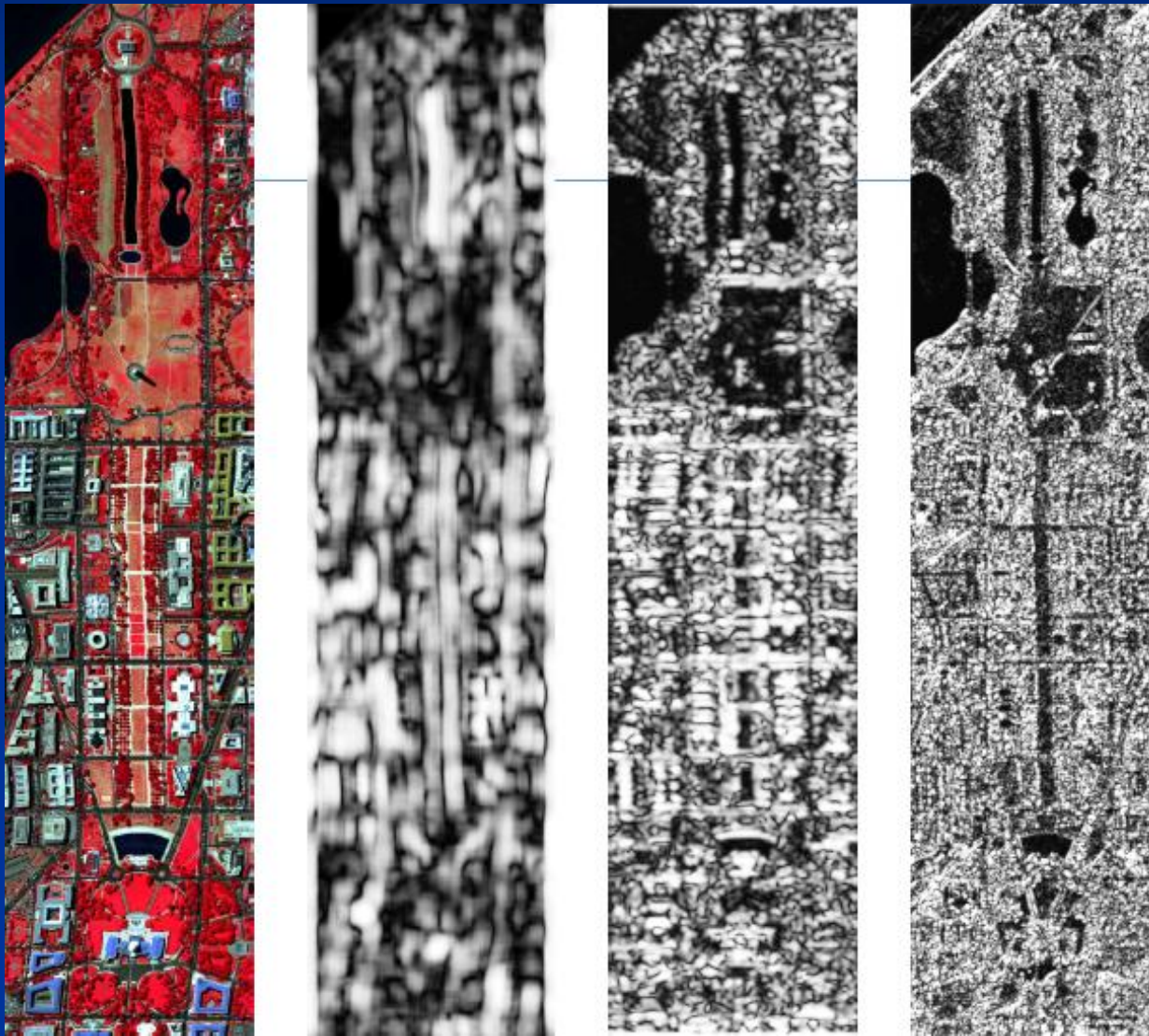


# Фильтры Габора



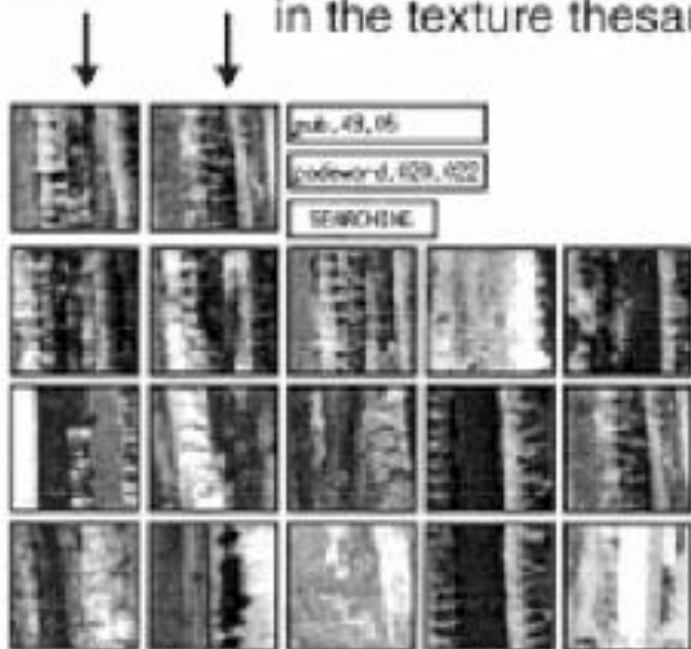
Gabor filter responses for a satellite image.

# Фильтры Габора

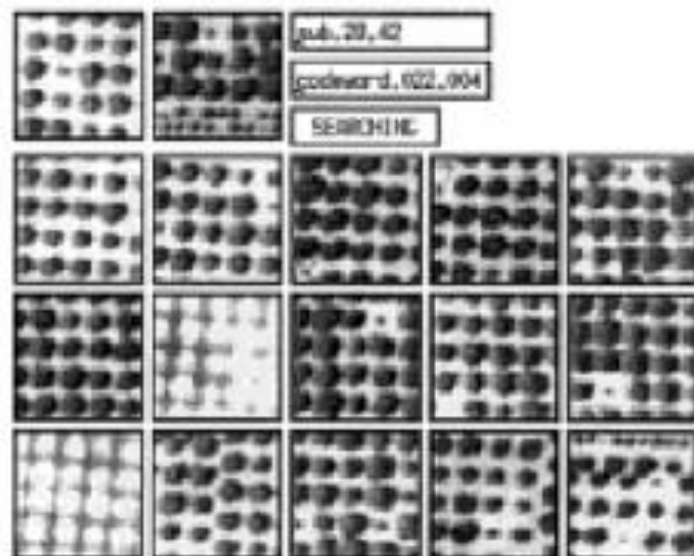


Query pattern

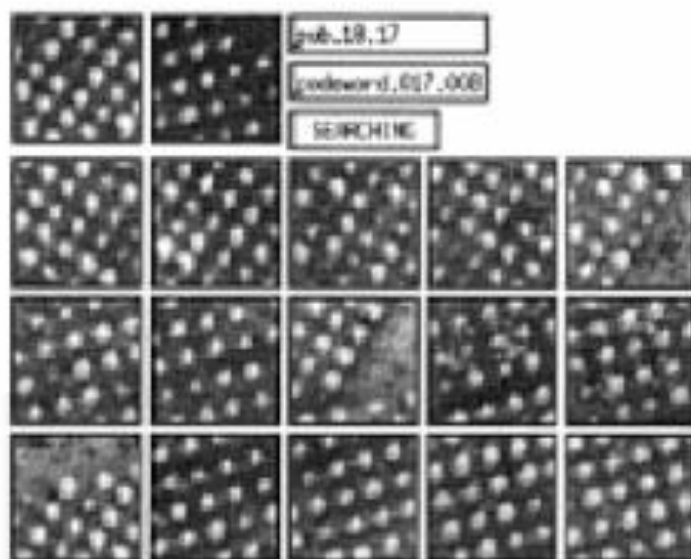
Matched codeword  
in the texture thesaurus



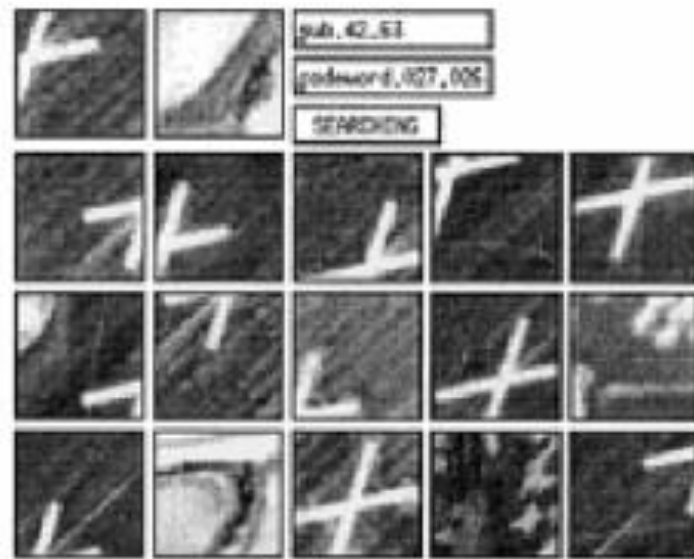
(a)



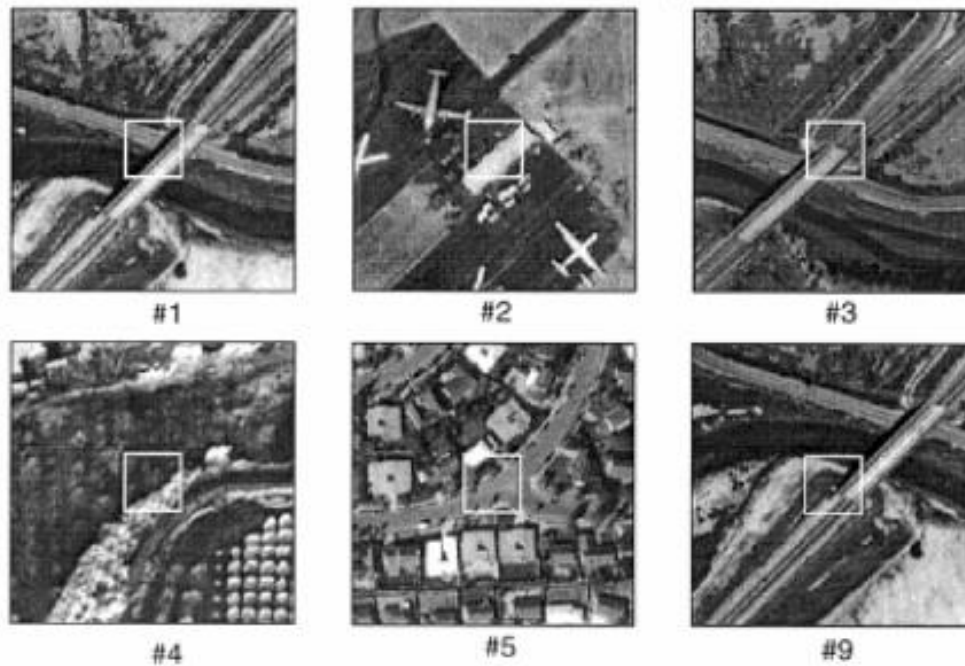
(b)



(c)



(d)



Full resolution of some retrieved tiles

**Теорема.** Если функции  $f$  и  $h$  принадлежат  $L^1(\mathbb{R}) \cap L^2(\mathbb{R})$ , то

$$\int_{-\infty}^{\infty} f(t)h^*(t) dt = \frac{1}{2\pi} \int_{-\infty}^{\infty} \hat{f}(w)\hat{h}^*(w) dw,$$

при  $h = f$  из этого следует

$$\int_{-\infty}^{\infty} |f(t)|^2 dt = \frac{1}{2\pi} \int_{-\infty}^{\infty} |\hat{f}(w)|^2 dw.$$