

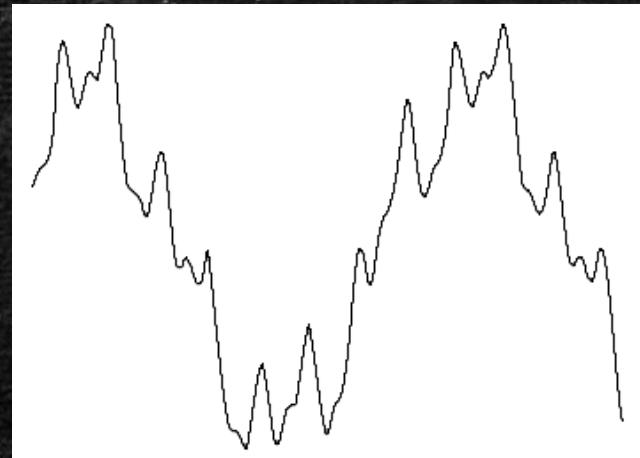
# Prednáška 12

---

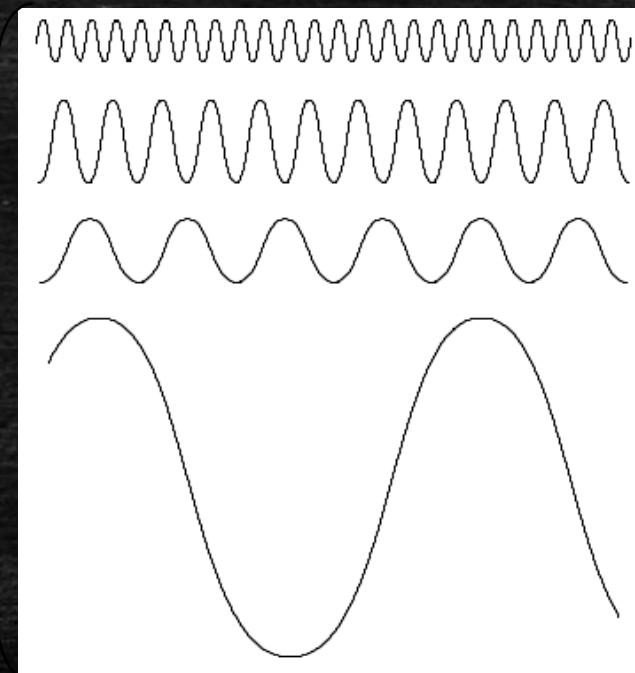
Praktikum z MATLABu  
Elena Šikudová

# Jean Baptiste Joseph Fourier (1768-1830)

Každá periodická funkcia sa dá vyjadriť ako vážená suma sínusov a kosínusov rôznych frekvencií.



=



$$f(t) = \frac{a_0}{2} + \sum_{n=1}^{\infty} a_n \cos \frac{2\pi n t}{T} + \sum_{n=1}^{\infty} b_n \sin \frac{2\pi n t}{T}$$



# MATLAB – periodický signál

```
Fs = 1000; % Sampling frequency
```

```
T = 1/Fs; % Sample time
```

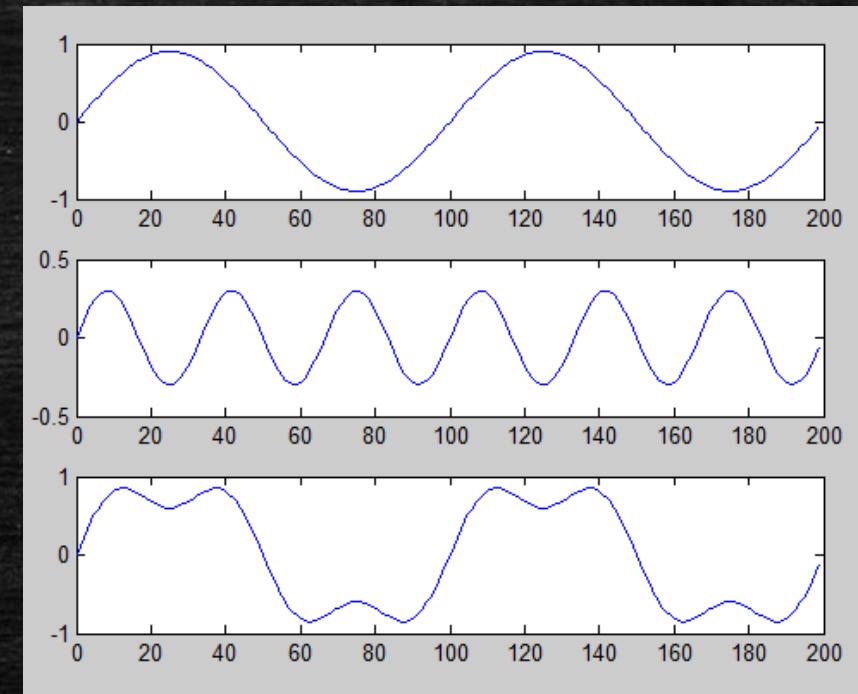
```
L = 1000; % Length of signal
```

```
t = (0:L-1)*T; % Time vector
```

```
y1 = 0.9*sin(2*pi*10*t);
```

```
y2 = 0.3*sin(2*pi*30*t);
```

```
y3 = y1 +y2;
```



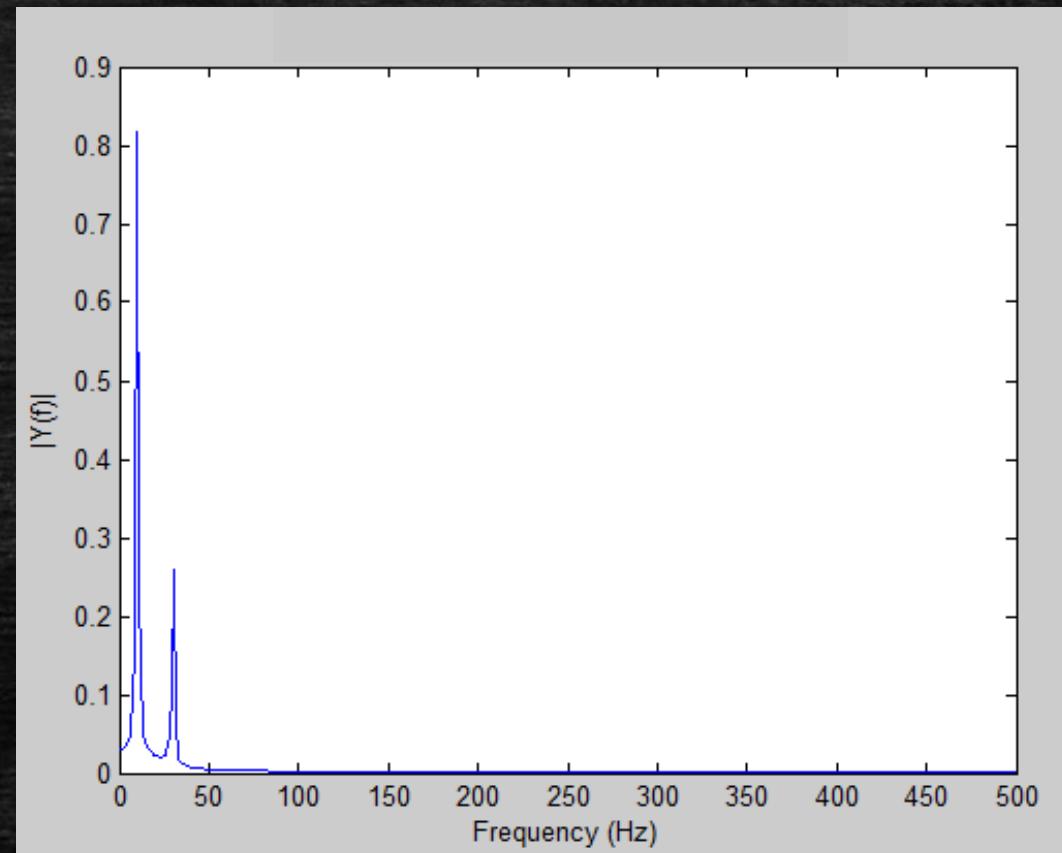
# MATLAB - periodický signál

---

```
NFFT = 2^nextpow2(L); % Next power of 2 from length of L
```

```
Y = fft(y3,NFFT)/L;
```

```
f = Fs/2*linspace(0,1,NFFT/2);
```



# Fourierova Transformácia

---

Funkcie, ktoré nie sú periodické, ale konečné sa dajú vyjadriť ako integrál váhovaných sínusov a kosínusov

$$F(s) = \int_{-\infty}^{\infty} f(x) e^{-i2\pi xs} dx$$

$$f(x) = \int_{-\infty}^{\infty} F(s) e^{i2\pi xs} ds$$

$$F(u, v) = \int_{-\infty}^{\infty} \int_{-\infty}^{\infty} f(x, y) e^{-j2\pi(ux+vy)} dx dy$$

$$f(x, y) = \int_{-\infty}^{\infty} \int_{-\infty}^{\infty} F(u, v) e^{j2\pi(ux+vy)} du dv$$

$$e^{j\theta} = \cos \theta + j \sin \theta$$

## 2D FT a IFT (pre obrazy)

---

DFT

$$F(u, v) = \frac{1}{MN} \sum_{x=0}^{M-1} \sum_{y=0}^{N-1} f(x, y) e^{-j2\pi \left( \frac{ux}{M} + \frac{vy}{N} \right)}$$

$$F(0,0) = ?$$

IDFT

$$f(x, y) = \sum_{u=0}^{M-1} \sum_{v=0}^{N-1} F(u, v) e^{j2\pi \left( \frac{ux}{M} + \frac{vy}{N} \right)}$$

u, v : frekvenčné premenné  
x, y : priestorové premenné

## 2D DFT spektrá

---

Spektrum (magnitúda), fázový uhol a silové spektrum:

$$|F(u,v)| = \left[ R^2(u,v) + I^2(u,v) \right]^{\frac{1}{2}} \quad (\text{spectrum})$$

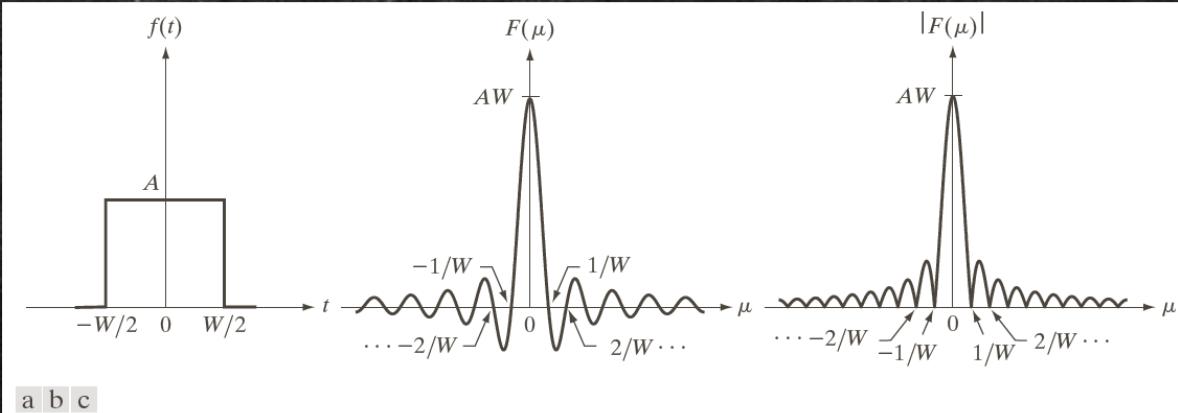
$$\phi(u,v) = \tan^{-1} \left[ \frac{I(u,v)}{R(u,v)} \right] \quad (\text{phase angle})$$

$$P(u,v) = |F(u,v)|^2 = R^2(u,v) + I^2(u,v) \quad (\text{power spectrum})$$

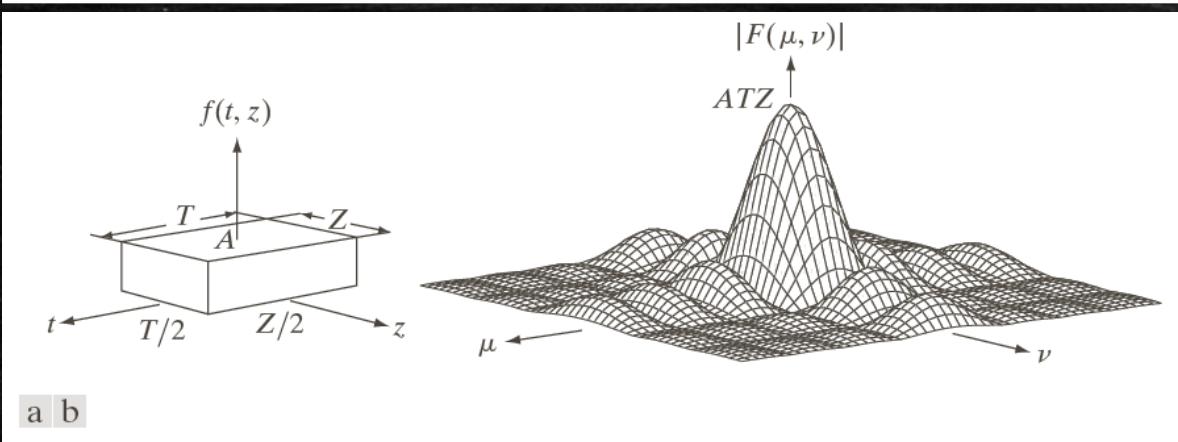
$R(u,v)$ : reálna časť  $F(u,v)$

$I(u,v)$ : imaginárna časť  $F(u,v)$

# Spektrum



**FIGURE 4.4** (a) A simple function; (b) its Fourier transform; and (c) the spectrum. All functions extend to infinity in both directions.



**FIGURE 4.13** (a) A 2-D function, and (b) a section of its spectrum (not to scale). The block is longer along the  $t$ -axis, so the spectrum is more “contracted” along the  $\mu$ -axis. Compare with Fig. 4.4.

# MATLAB fft2, spektrá

---

cameraman.tif

Vypočítajte a zobrazte:

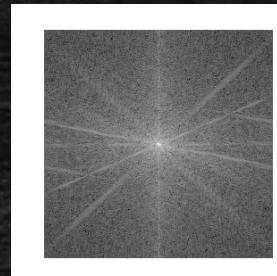
Fft2

Fourier spectrum

Phase angle

Power spectrum

real(), imag(),...

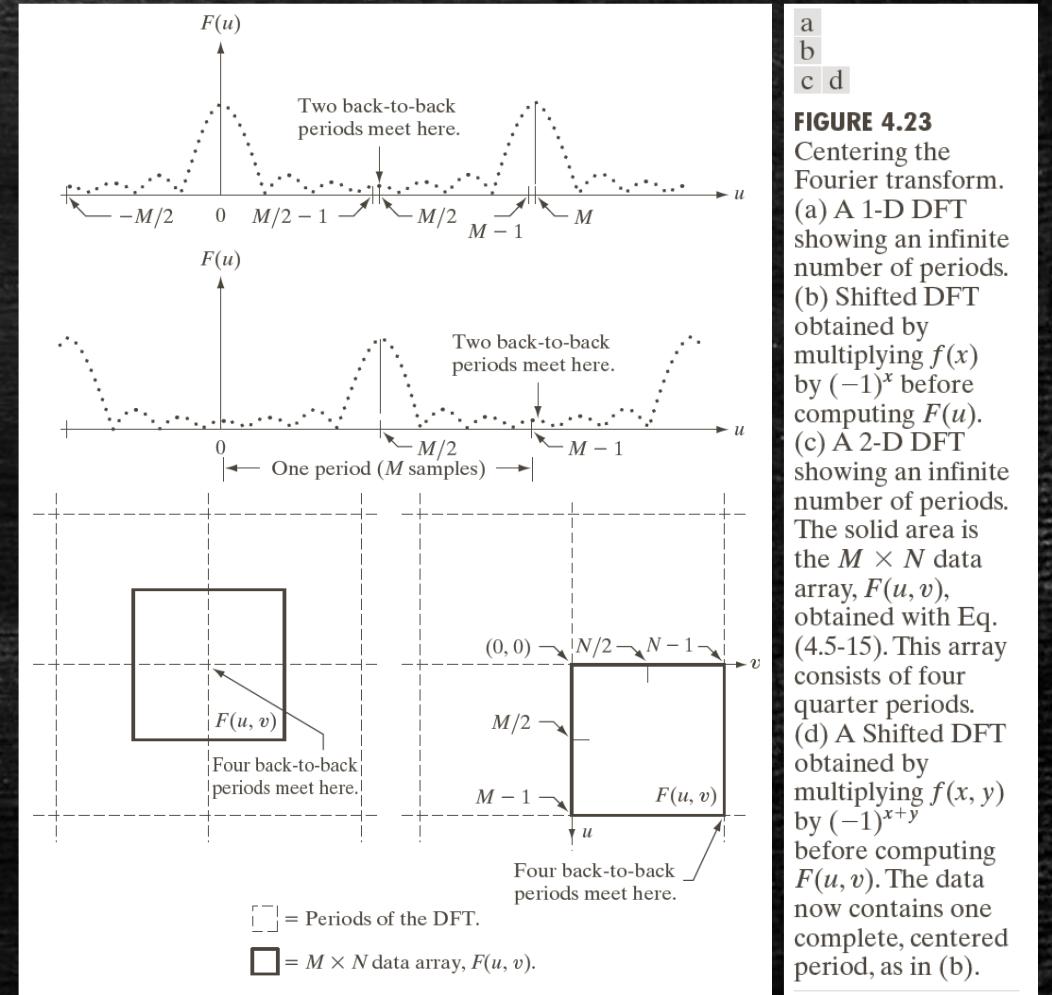


# Centrovanie FT

`A=reshape(1:25,5,[])`

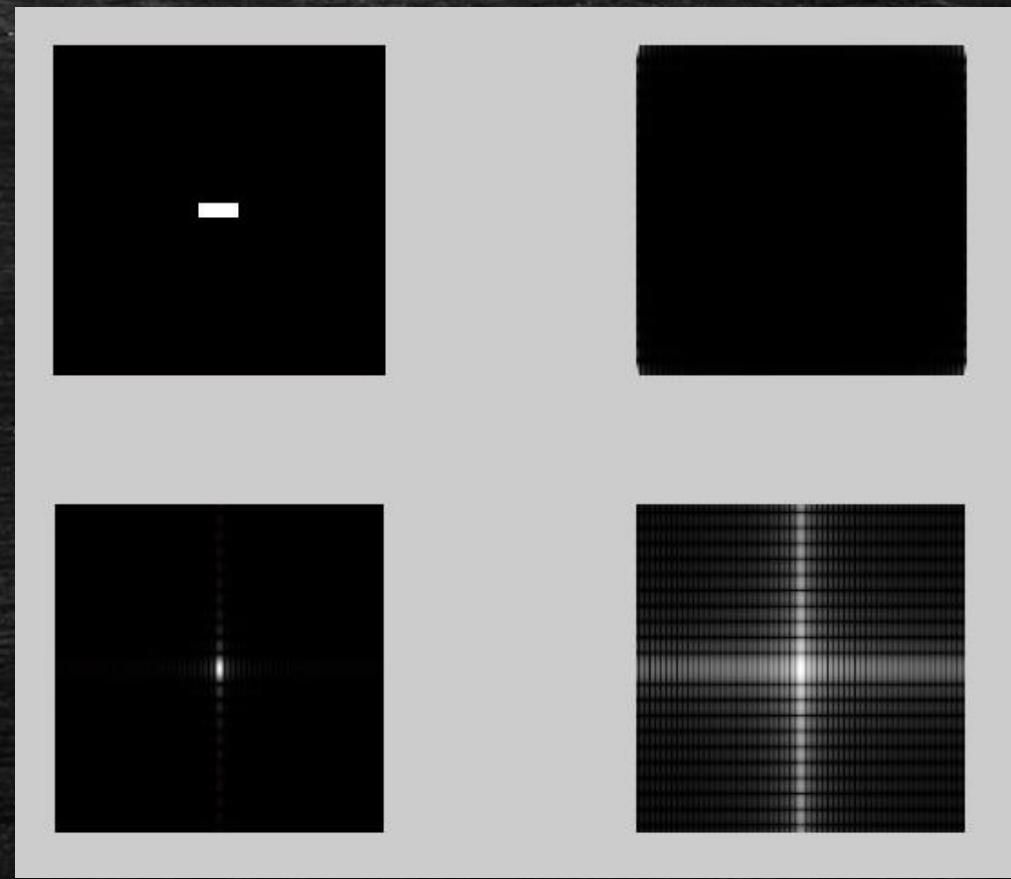
`B=fftshift(A)`

`ifftshift(B)`



# MATLAB fftshift

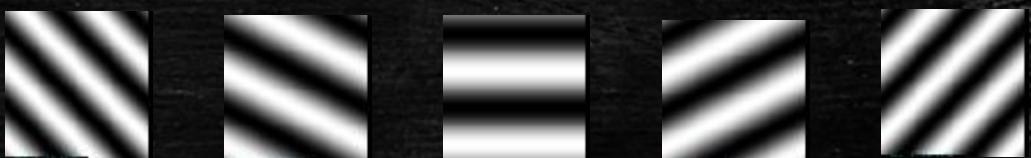
```
f1(245:265,225:285) = 1;  
%%  
F = fft2(f1);  
S = abs(F);  
imshow(S,[]);  
%%  
Fc = fftshift(F);  
S1 = abs(Fc);  
imshow(S1,[]);  
%%  
S2 = log(1+S1);  
imshow(S2,[]);
```



# Centrovanie FT

---

Bázové funkcie



# Bázové funkcie

---

```
wavelength=100;  
orientation=135;  
g = gabor(wavelength,orientation);  
aa=imadjust(real(g.SpatialKernel),[]);  
imshow(aa)
```

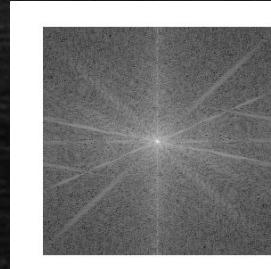
# FFT rekonštrukcia

---

```
a = imread('cameraman.tif');  
figure; imshow(a,[]);
```



```
Fa = fft2(a);  
figure; imshow(log(abs(fftshift(Fa))),[]);
```



```
b = real(ifft2(Fa));  
figure; imshow(b,[]);
```



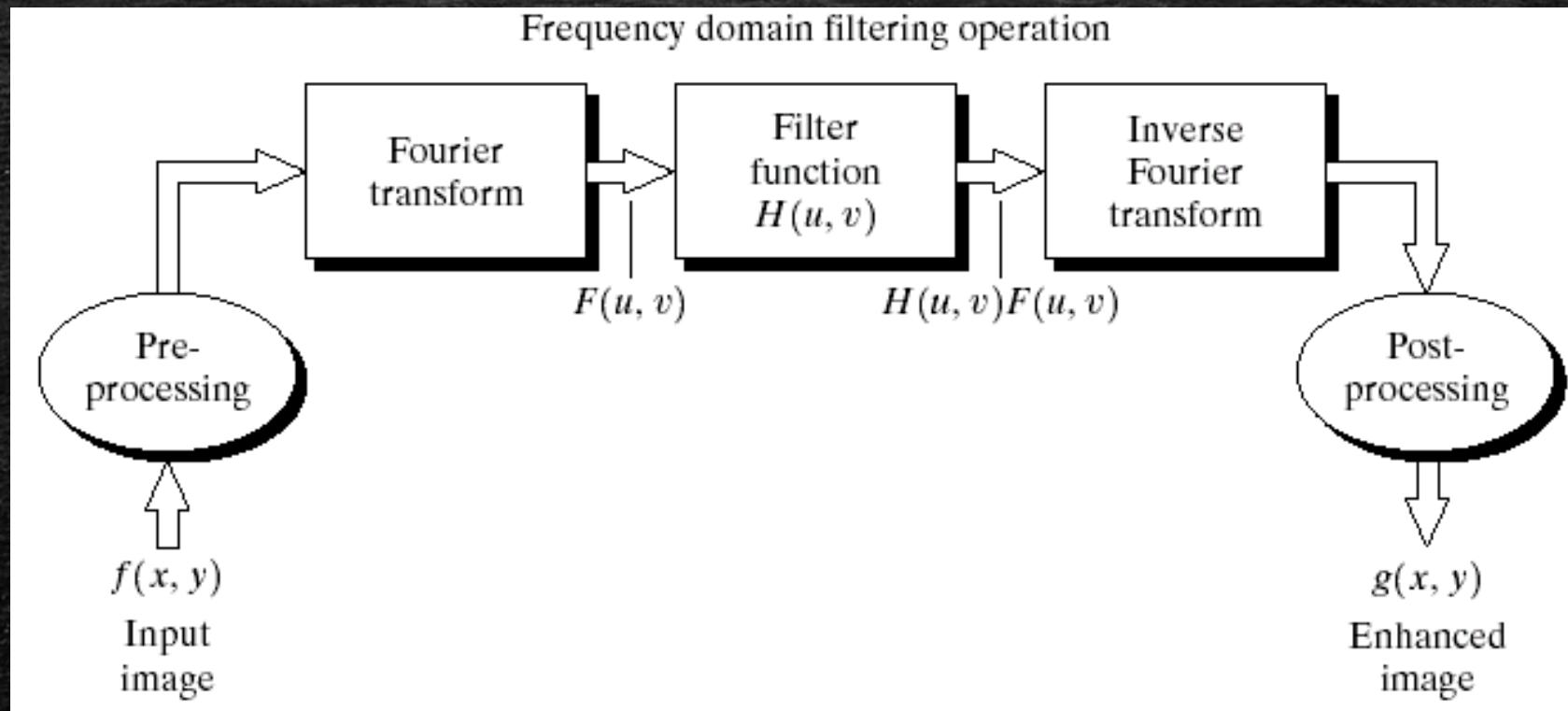
# Konvolučná teoréma

---

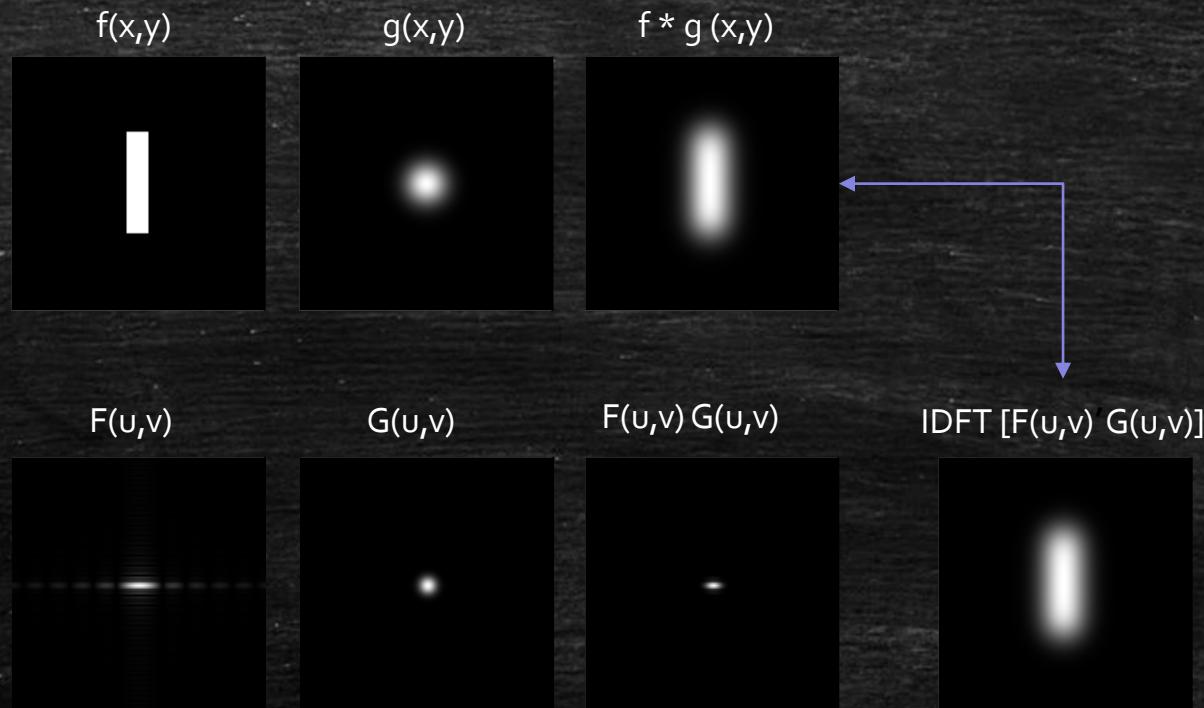
$$f(x, y) * h(x, y) \Leftrightarrow F(u, v)H(u, v)$$

$$f(x, y)h(x, y) \Leftrightarrow F(u, v) * H(u, v)$$

# Filtrácia vo frekvenčnej oblasti



# Filtrácia vo frekvenčnej oblasti



# Frekvenčné filtre

---

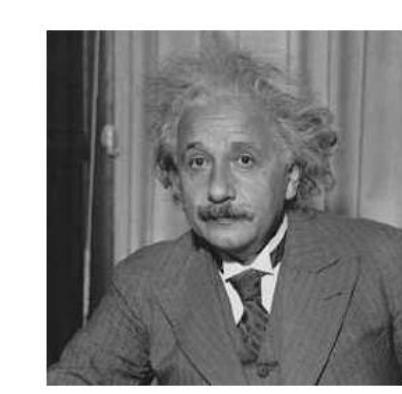
1. Dolnopriepustný filter (rozmazanie)  
Zachová nízke frekvencie

2. Hornopriepustný filter (ostrenie)  
Zachová vysoké frekvencie

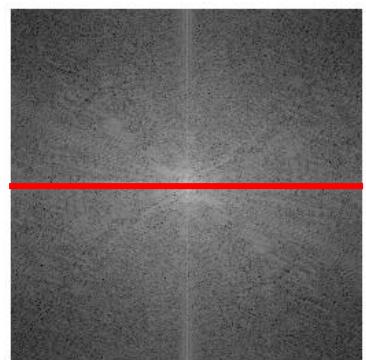
3. Pásmový filter Band-pass  
Zachová určité pásmo frekvencií

4. Pásmový filter Band-stop  
Potlačí určité pásmo frekvencií

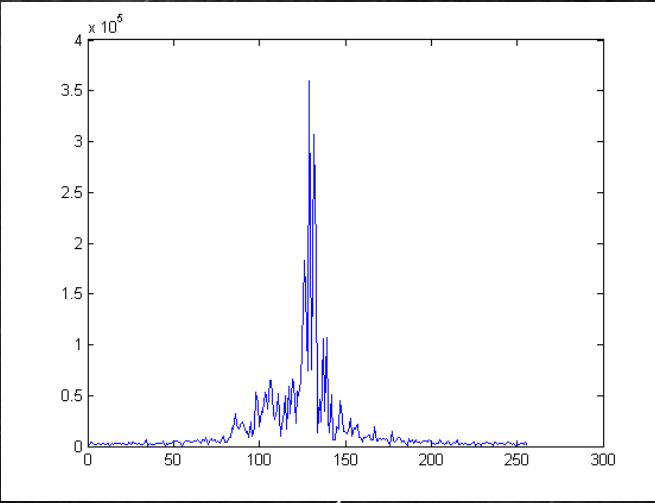
# Dolnopriepustný filter



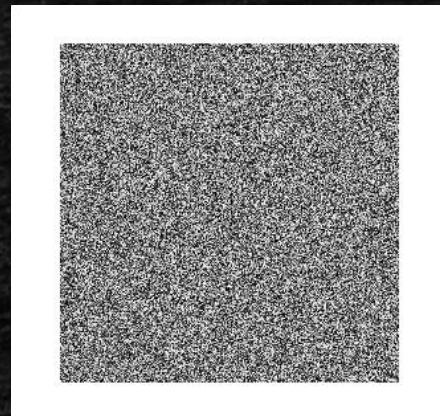
"Einstein"



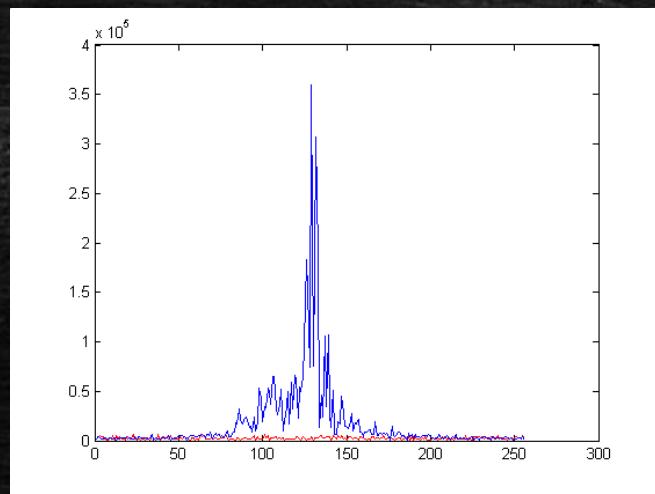
DFT of "Einstein"



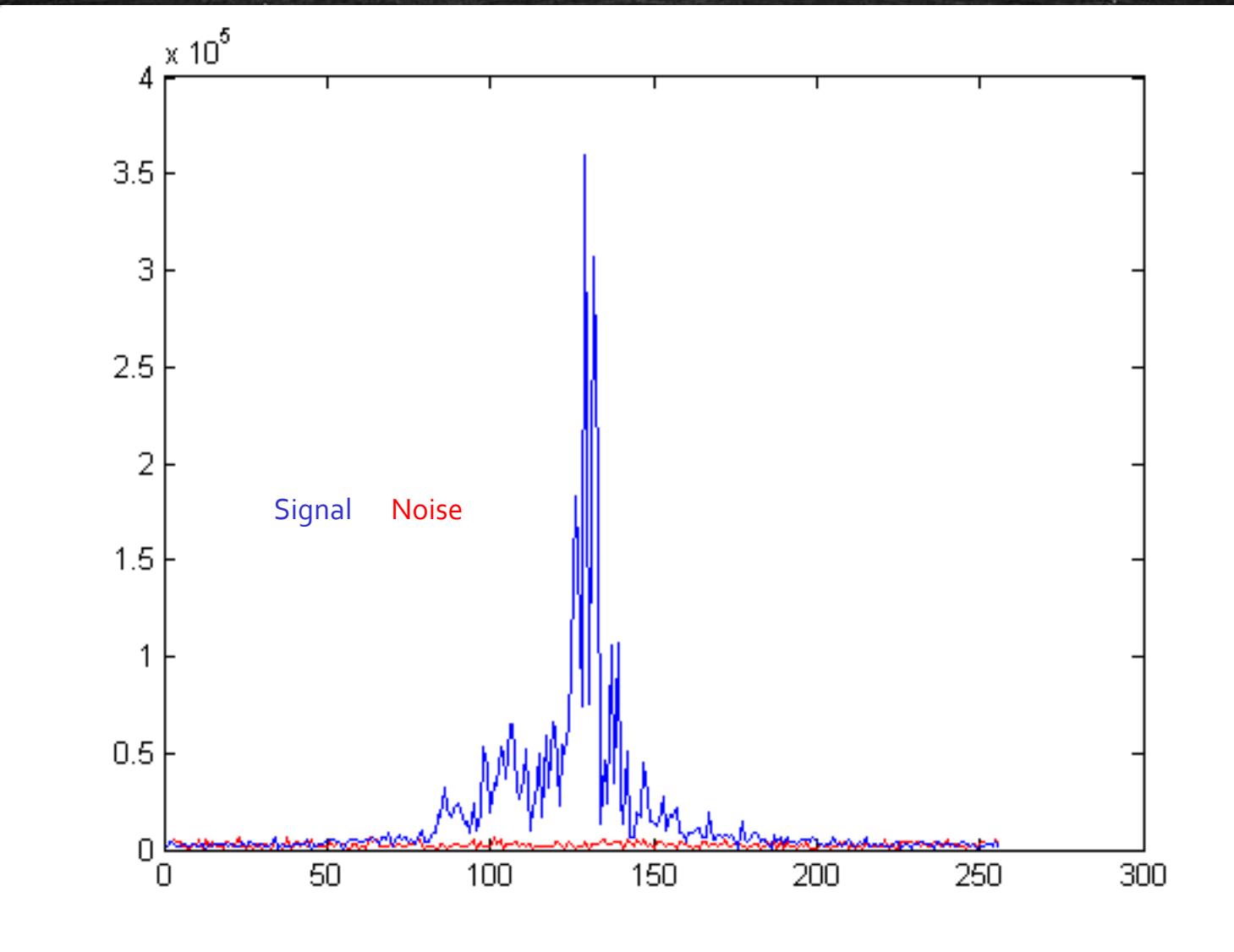
Signal vs Noise



$\text{Noise} = 40 * \text{rand}(256, 256);$

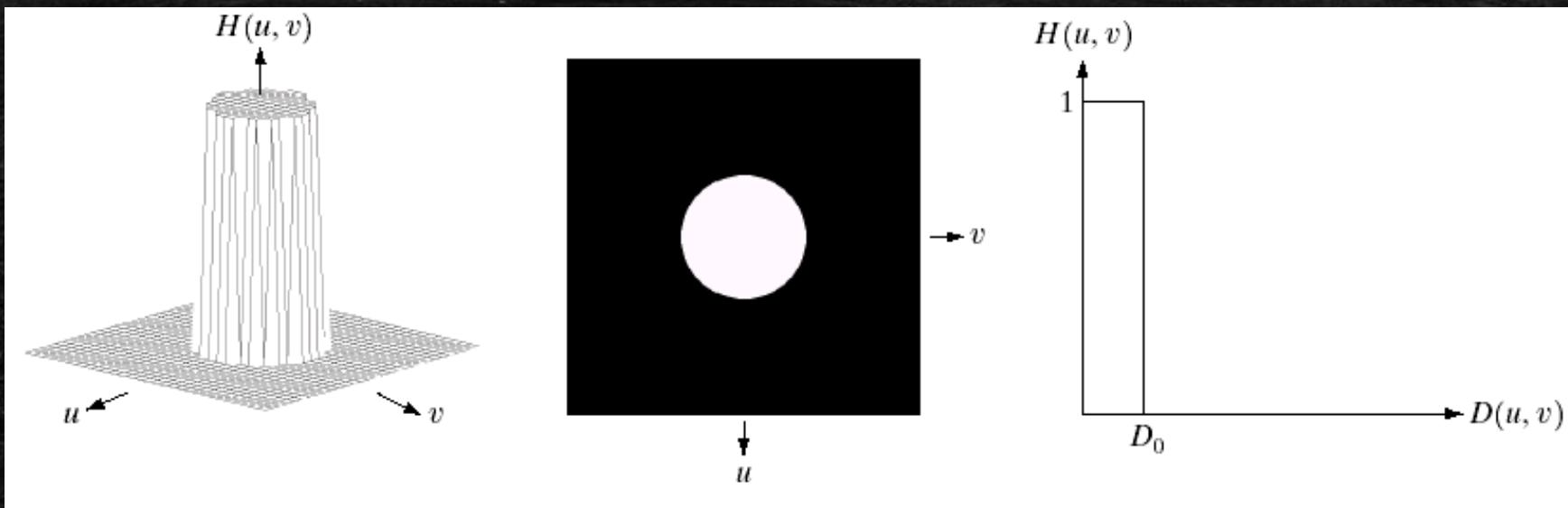


# Dolnopriepustný filter



# Dolnopriepustný filter: Ideal Lowpass Filters (ILPFs)

$$H(u, v) = \begin{cases} 0 & \text{if } D(u, v) \geq D_0 \\ 1 & \text{if } D(u, v) < D_0 \end{cases}$$

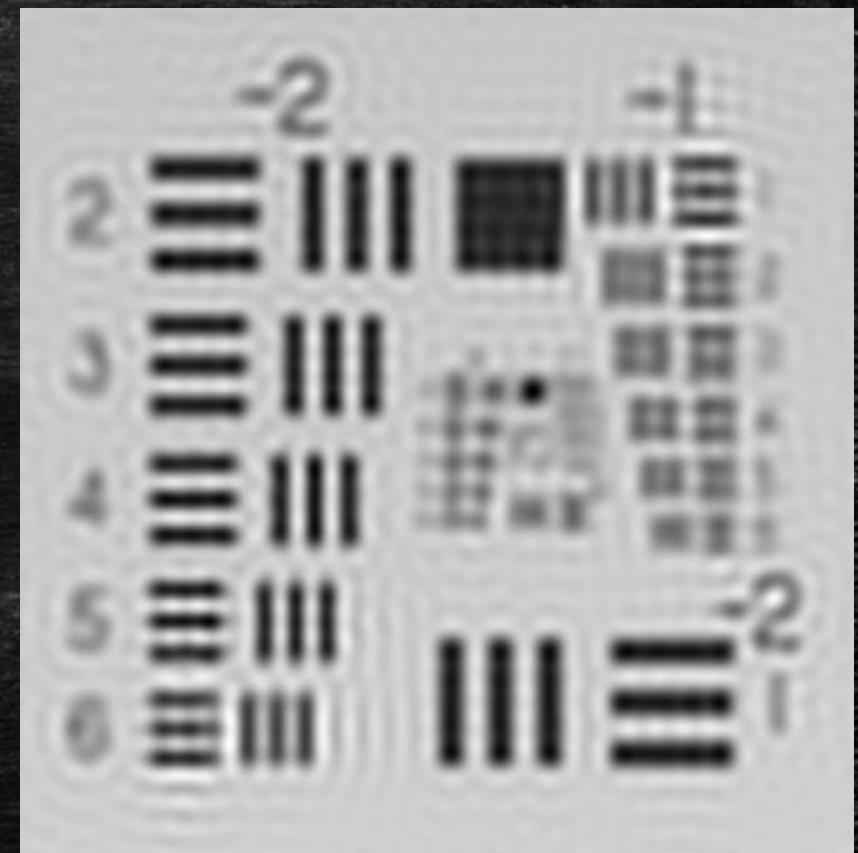


# ILPF problém

---

Ideálny = dajú sa presne vymedziť frekvencie

Problém: rozvlnenie rekonštruovaného obrazu

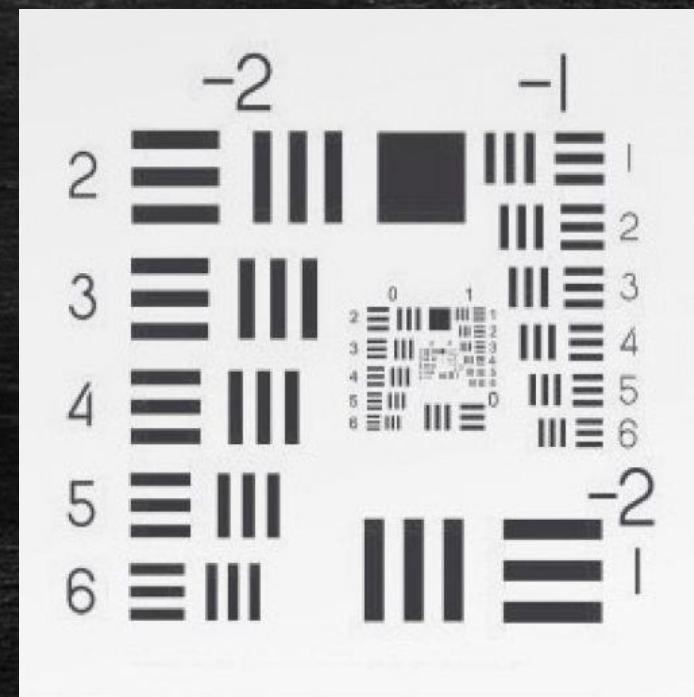


# MATLAB - ILPF

Aplikujte ILPF na timthumb.jpg

Vyskúšajte rôzne  $D_o$

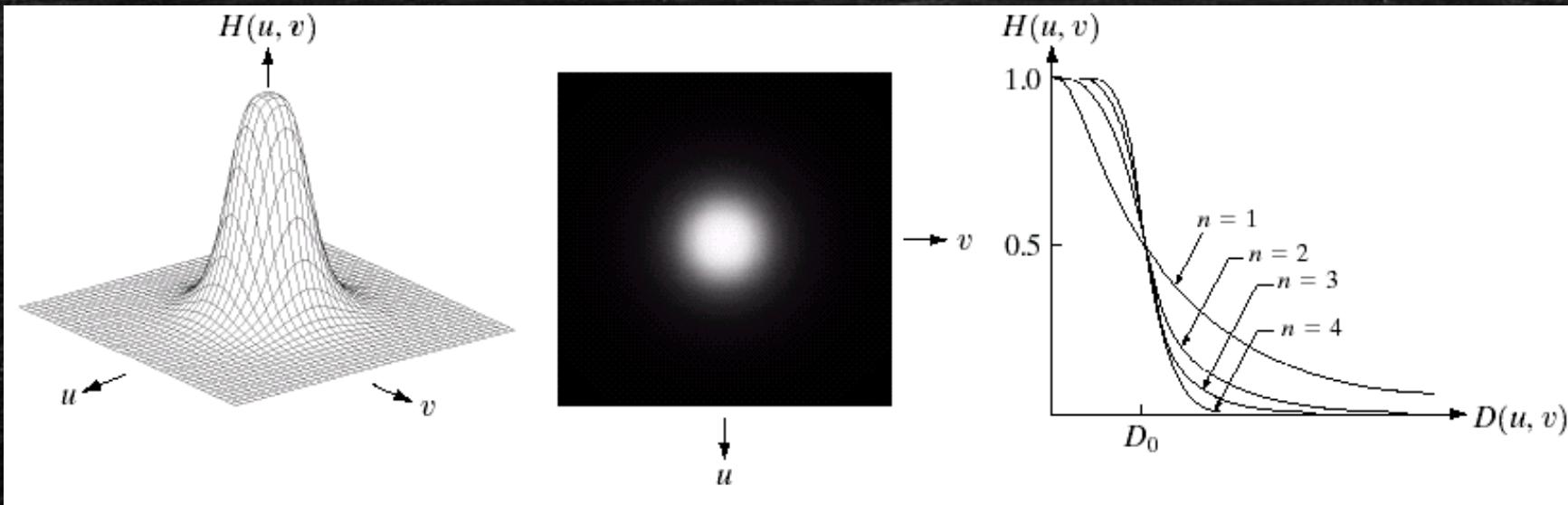
```
H=zeros(512);
radius=32;
h = imbinarize(fspecial('disk',radius),o);
H(256-radius:256+radius,256-radius:256+radius)=h;
figure, imshow(H)
```



# Butterworth Lowpass Filters (BLPFs)

BLPF with order n

$$H(u, v) = \frac{1}{1 + [D(u, v)/D_0]^{2n}}$$



## MATLAB – BLPF

---

Aplikujte BLPF na timthumb.jpg

Vyskúšajte rôzne n, D<sub>o</sub>

```
x=-256:255;
```

```
[X,Y] = meshgrid(x,x);
```

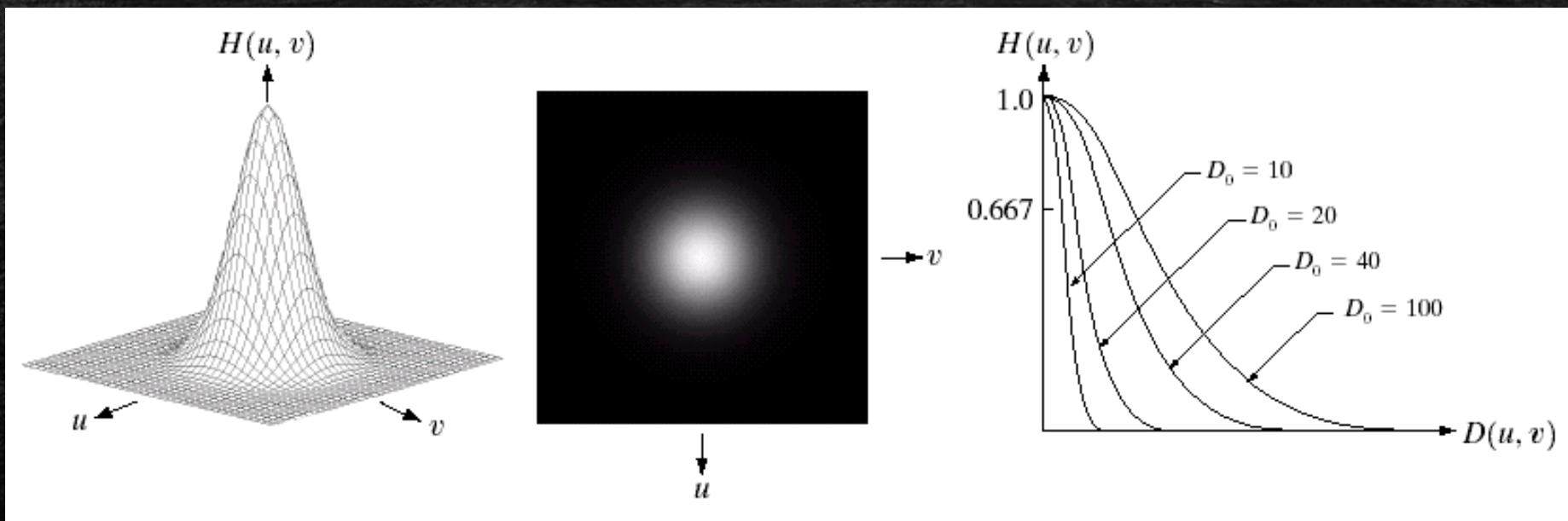
```
D=sqrt(X.^2 + Y.^2);
```

```
H=...
```

# Gaussian Lowpass Filters (GLPFs)

---

$$H(u, v) = e^{-D^2(u, v)/2D_0^2}$$



# MATLAB – GLPF

---

Aplikujte GLPF na timthumb.jpg

Vyskúšajte rôzne  $D_o$

```
H=fspecial('gaussian',hsize,sigma)
```

# High pass filters - sharpening

Ideal highpass filter

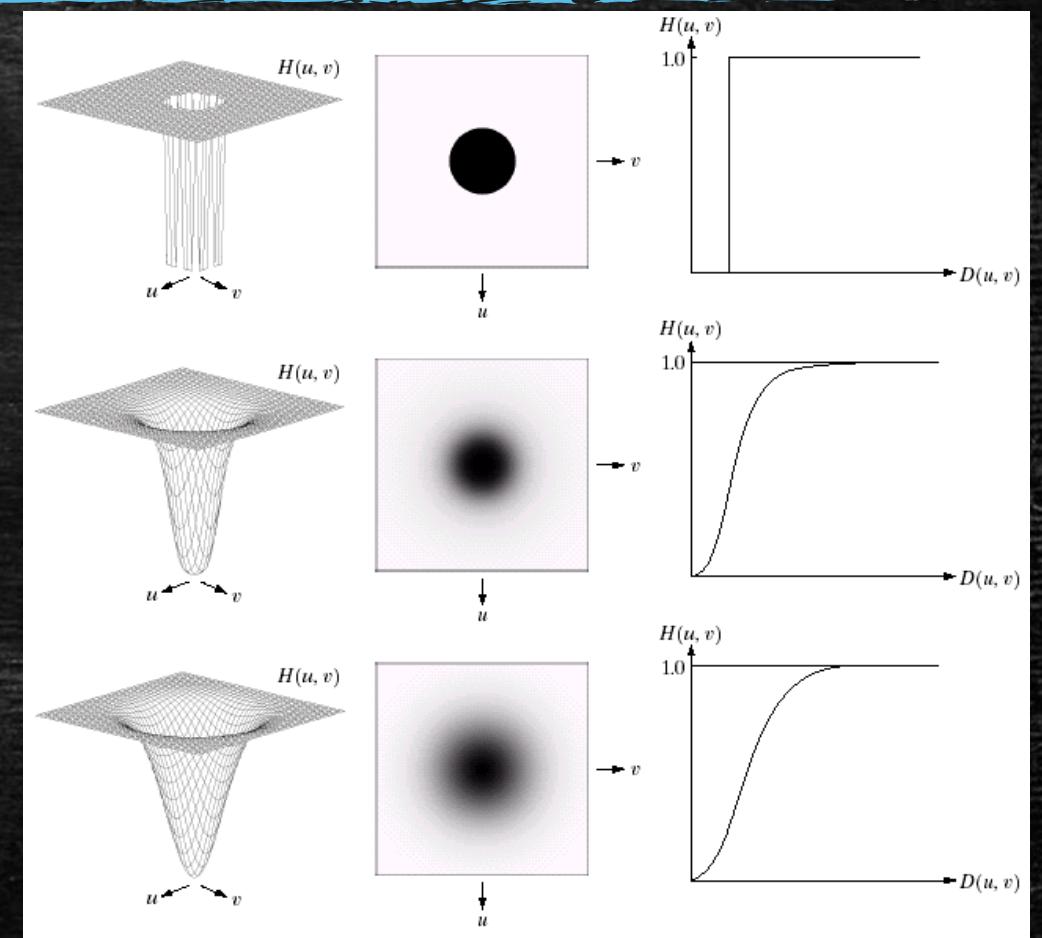
$$H(u, v) = \begin{cases} 0 & \text{if } D(u, v) \leq D_0 \\ 1 & \text{if } D(u, v) > D_0 \end{cases}$$

Butterworth highpass filter

$$H(u, v) = \frac{1}{1 + [D_0 / D(u, v)]^{2n}}$$

Gaussian highpass filter

$$H(u, v) = 1 - e^{-D^2(u, v)/2D_0^2}$$



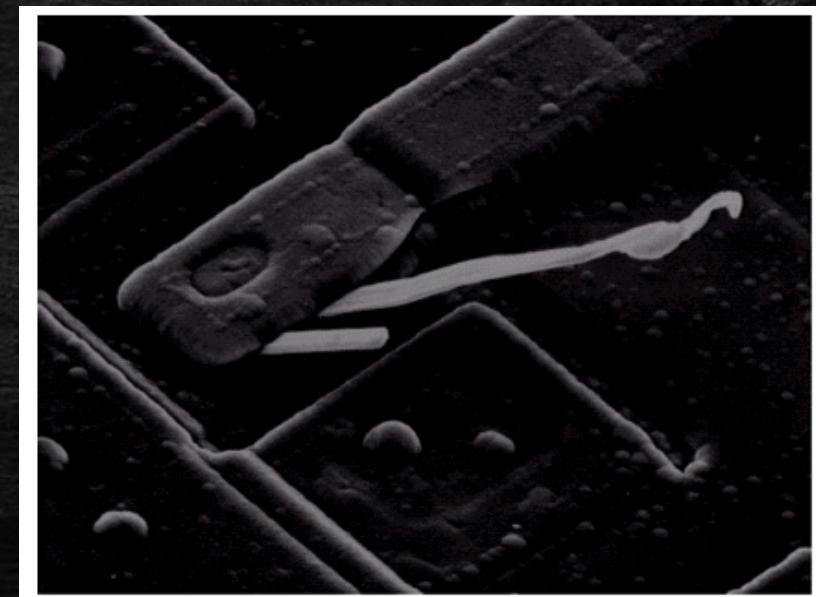
# Notch filter (band stop, narrow band)

---

$$H(u,v) = \begin{cases} 0 & \text{if } (u,v) = (M/2, N/2) \\ 1 & \text{otherwise.} \end{cases}$$

Nastaví  $F(0,0)$  na nulu. Priemerná intenzita obrazu bude 0.

Dá sa použiť na potlačenie konkrétnej frekvencie a jej okolia (ako ideal, B alebo G filter)

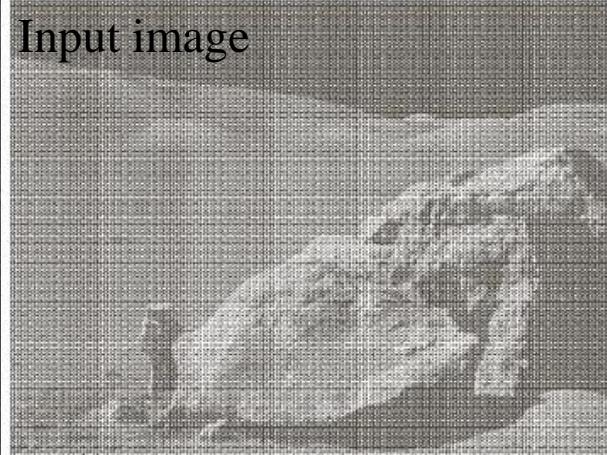


# Band stop, band pass

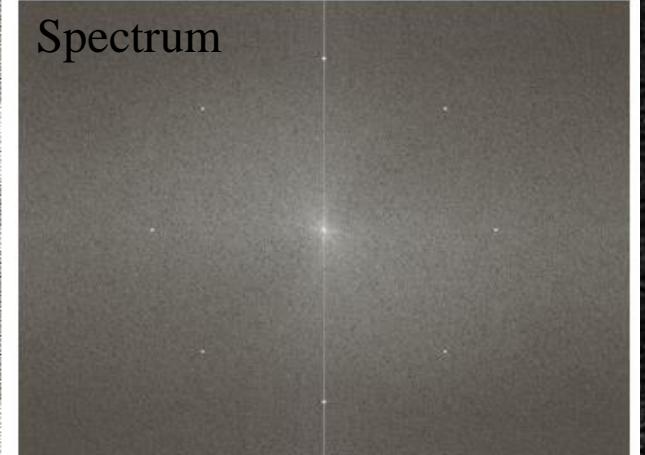
---

$H=1-(D>D_1 \& D \leq D_2);$

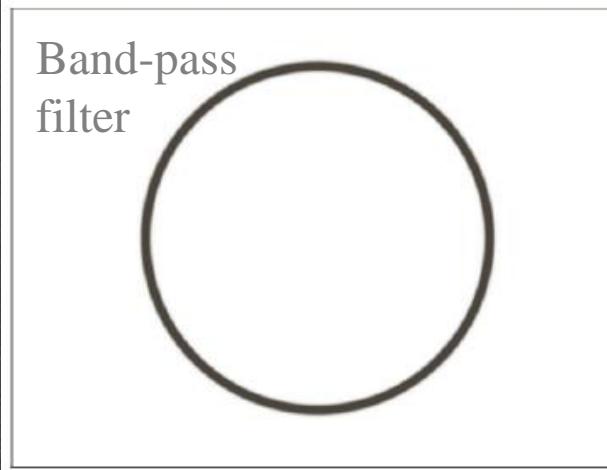
Input image



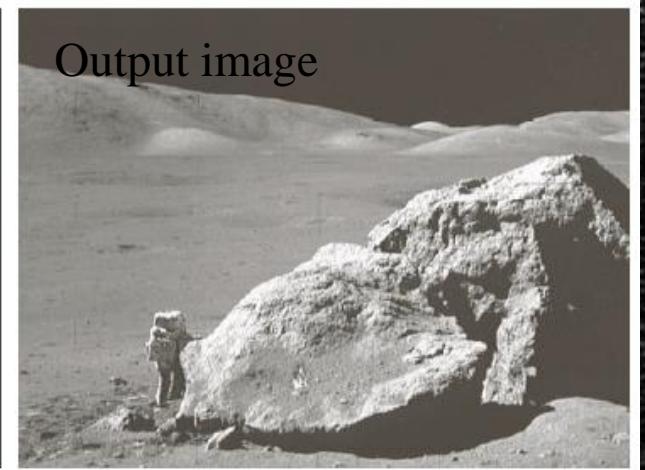
Spectrum



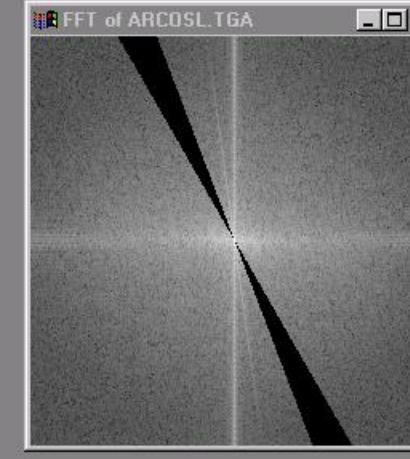
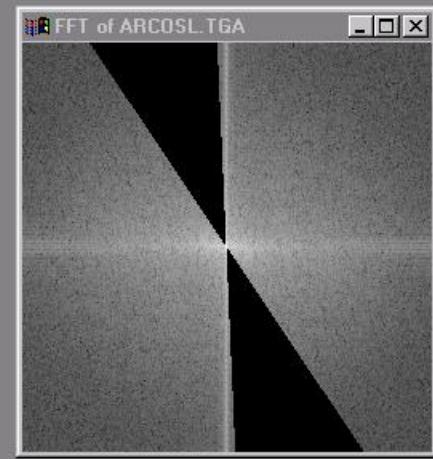
Band-pass  
filter



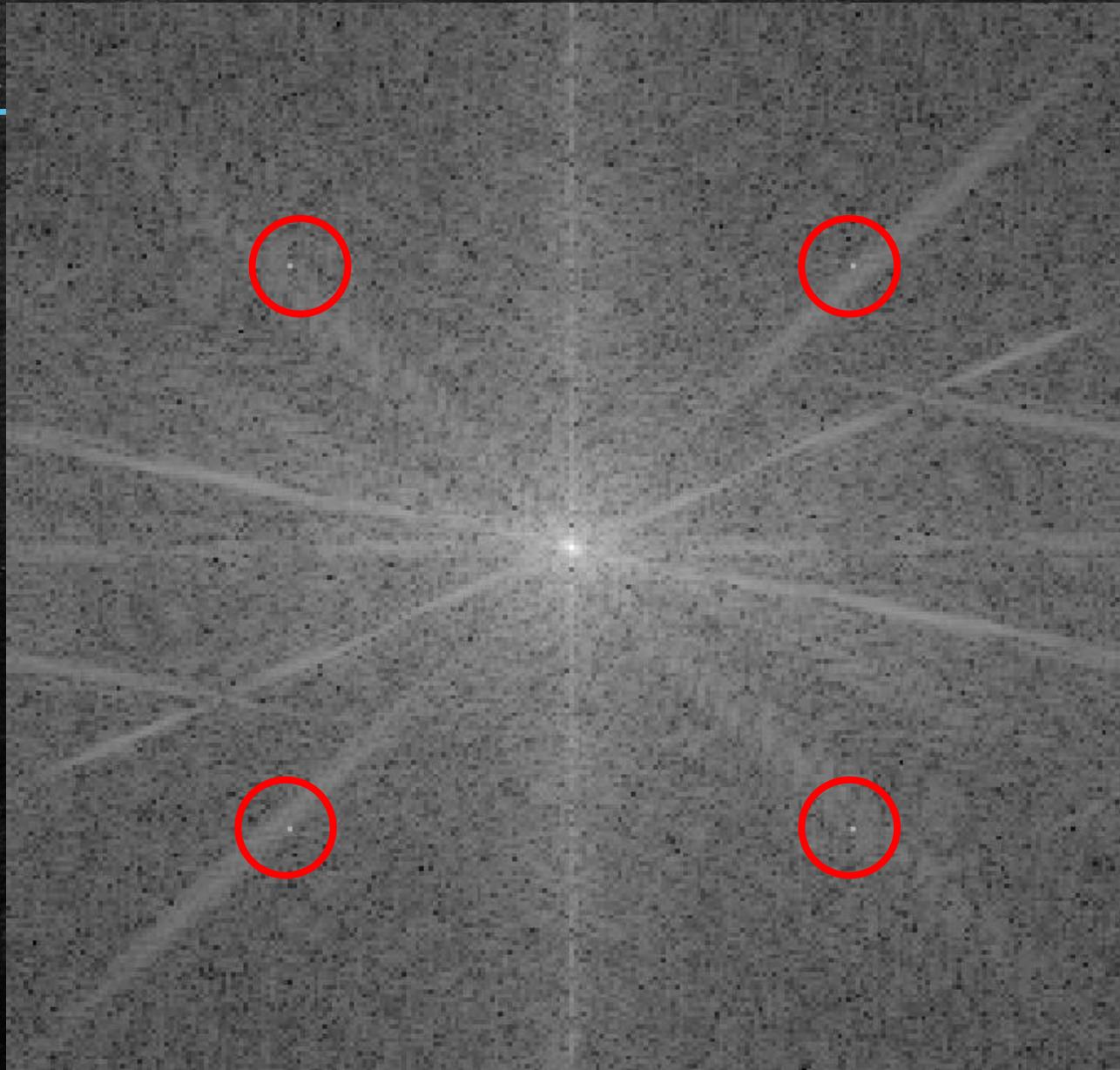
Output image

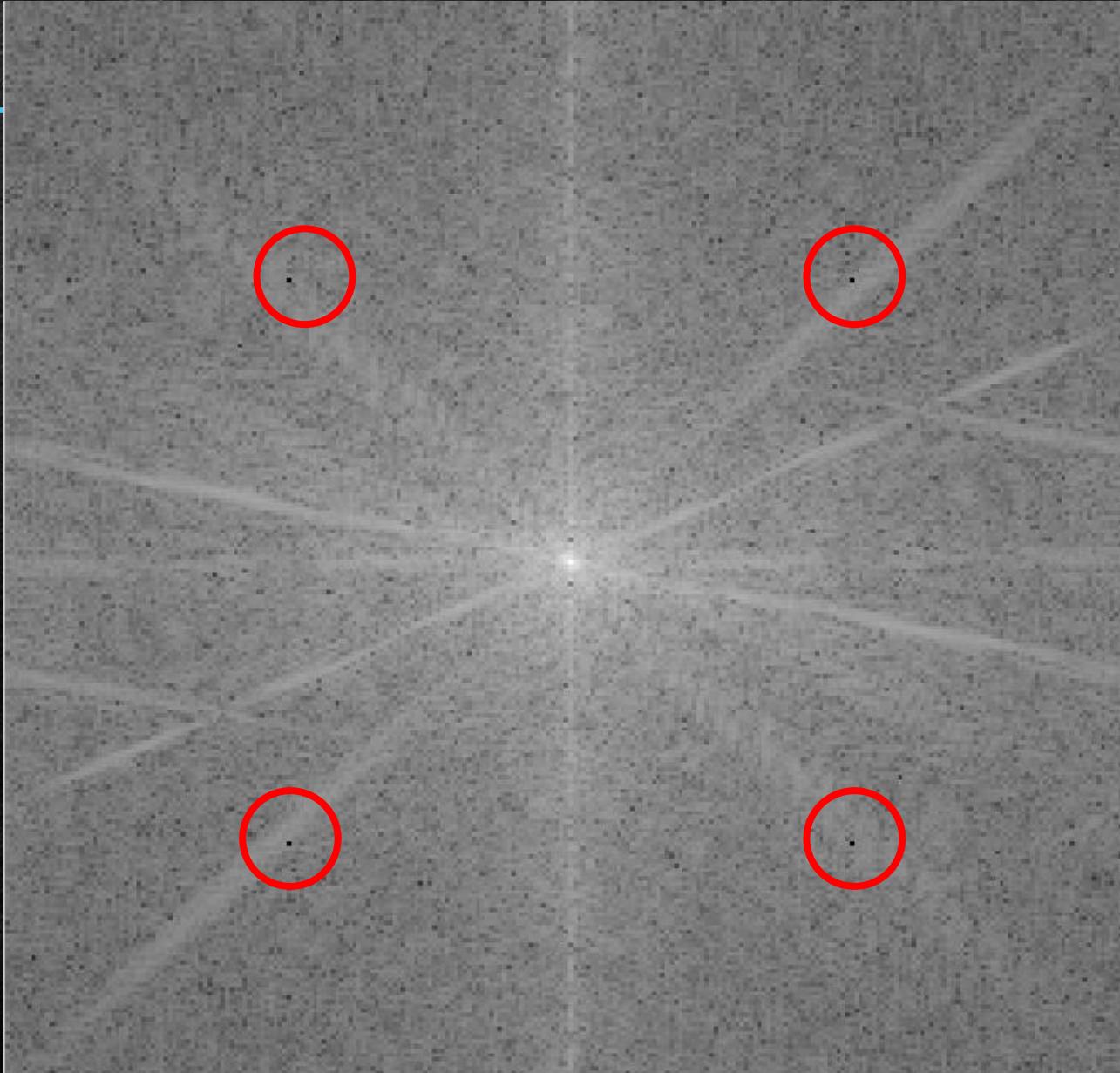


# Other filters











# MATLAB – noise reduction

---

```
y=double(checkerboard(2,64,64)>0.5);
```

```
a=double(imread('cameraman.tif'))+10*y;
```

```
F = fft2(a);
FF=fftshift(F);
```

```
FF(?,?)=0;
```

```
IF=fftshift(FF);
b=ifft2(IF);
figure, imshow(real(b),[])
```