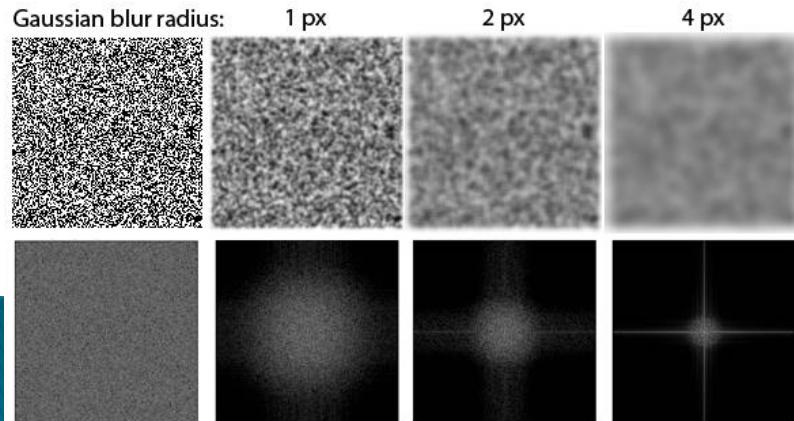


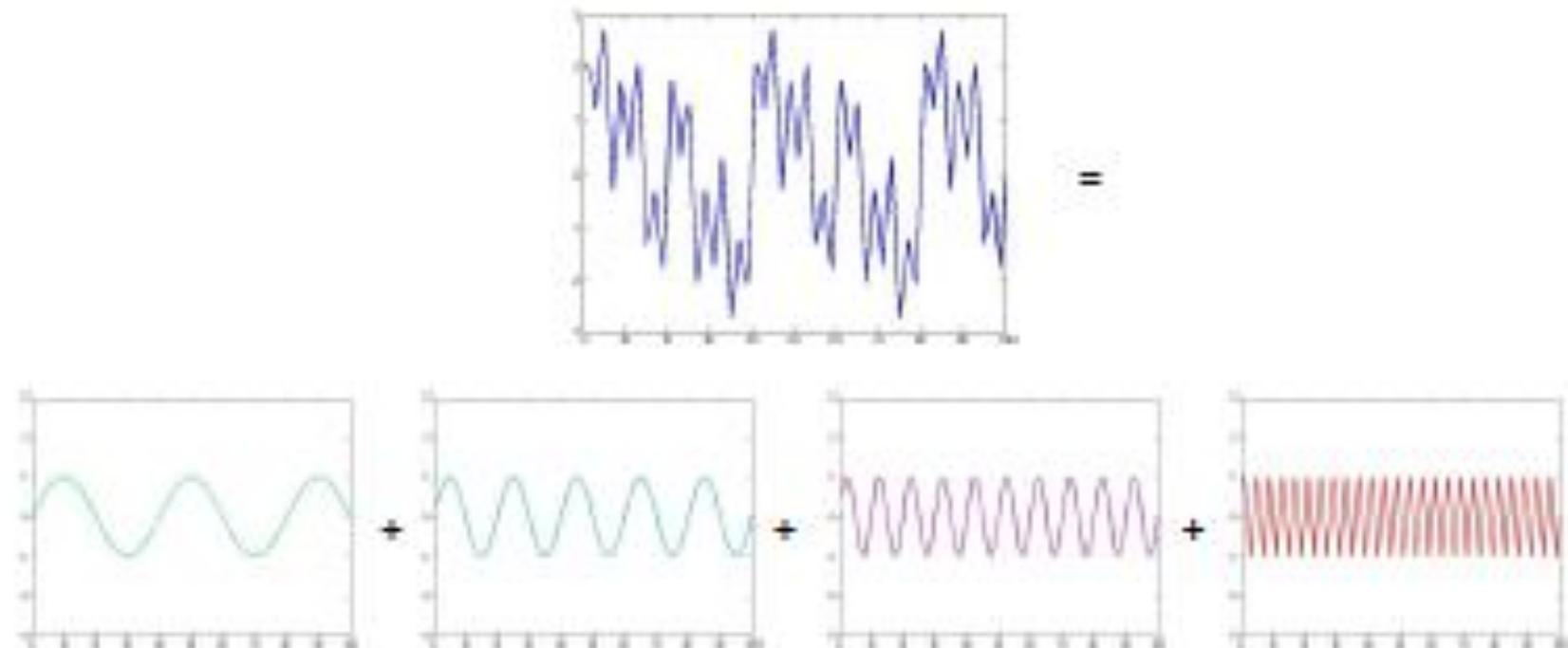
# Processamento de Imagem na Frequência

## A transformada de Fourier



# A série de Fourier 1D

- ▶ Os sinais periódicos podem construir-se com base na soma de senos e cosenos com diferentes coeficientes



# A transformada de Fourier 2D

- ▶ A transformada de Fourier decompõe uma imagem num conjunto de senos e cosenos de diferentes frequências
- ▶ Seja  $f(x,y)$  com  $x = 0,1,\dots,M-1$  e  $y = 0,1,\dots,N-1$  uma imagem de  $M \times N$
- ▶ A transformada directa de Fourier é dada por:

$$F(u,v) = \sum_{x=0}^{M-1} \sum_{y=0}^{N-1} f(x,y) e^{-i2\pi \left( \frac{ux}{M} + \frac{vy}{N} \right)}$$

com  $u = 0,1,\dots,M-1$  e  $v = 0,1,\dots,N-1$

$$e^{-iwt} = \cos(wt) + i \sin(wt)$$

- ▶ A transformada inversa de Fourier é dada por:

$$f(x,y) = \frac{1}{MN} \sum_{u=0}^{M-1} \sum_{v=0}^{N-1} F(u,v) e^{i2\pi \left( \frac{ux}{M} + \frac{vy}{N} \right)}$$

com  $x = 0,1,\dots,M-1$  e  $y = 0,1,\dots,N-1$

# A transformada de Fourier

- ▶ A transformada de Fourier de uma função real é uma função complexa
  - **difícil de visualizar** – pelo que se representa normalmente como amplitude e fase.
- ▶ Uma curiosidade importante é que quase todas as imagens “naturais” têm:
  - uma amplitude muito idêntica.
  - uma fase que difere significativamente.
- ▶ O que acontecerá se se fizer a reconstrução de uma imagem com a amplitude de uma imagem e a fase de outra?

# Componentes da Transformada de Fourier

- ▶ O valor de amplitude da transformada de Fourier (o espectro da imagem) é dado por:

$$|F(u, v)| = \sqrt{R^2(u, v) + I^2(u, v)}$$

- ▶ O valor da fase por:

$$\phi(u, v) = \tan^{-1} \left( \frac{I(u, v)}{R(u, v)} \right)$$

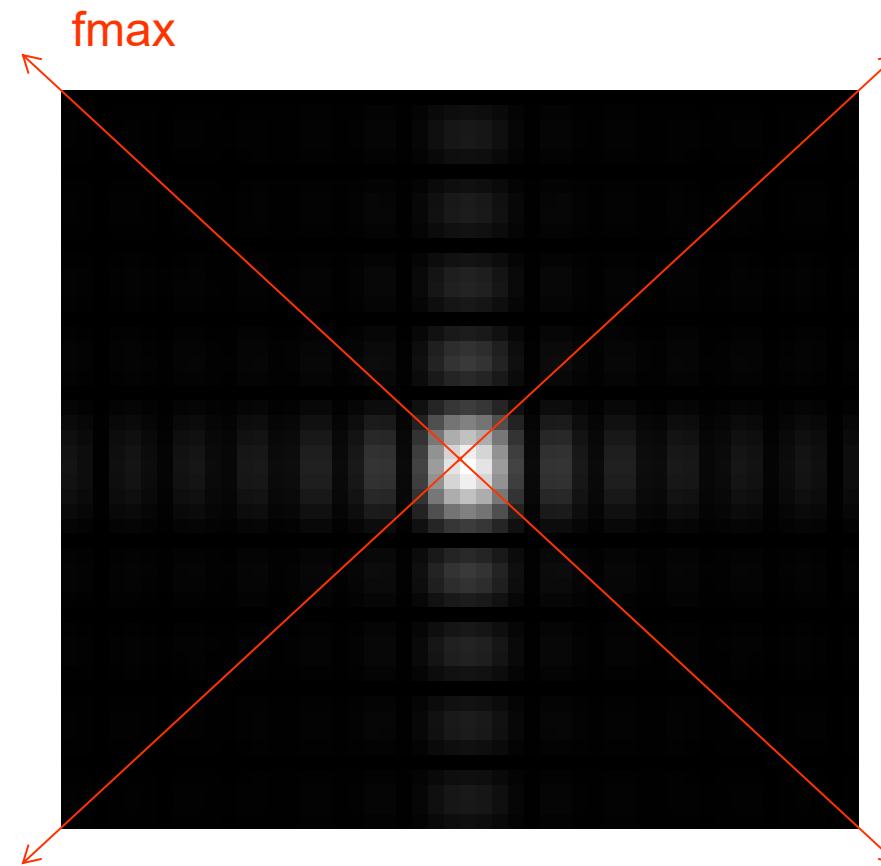
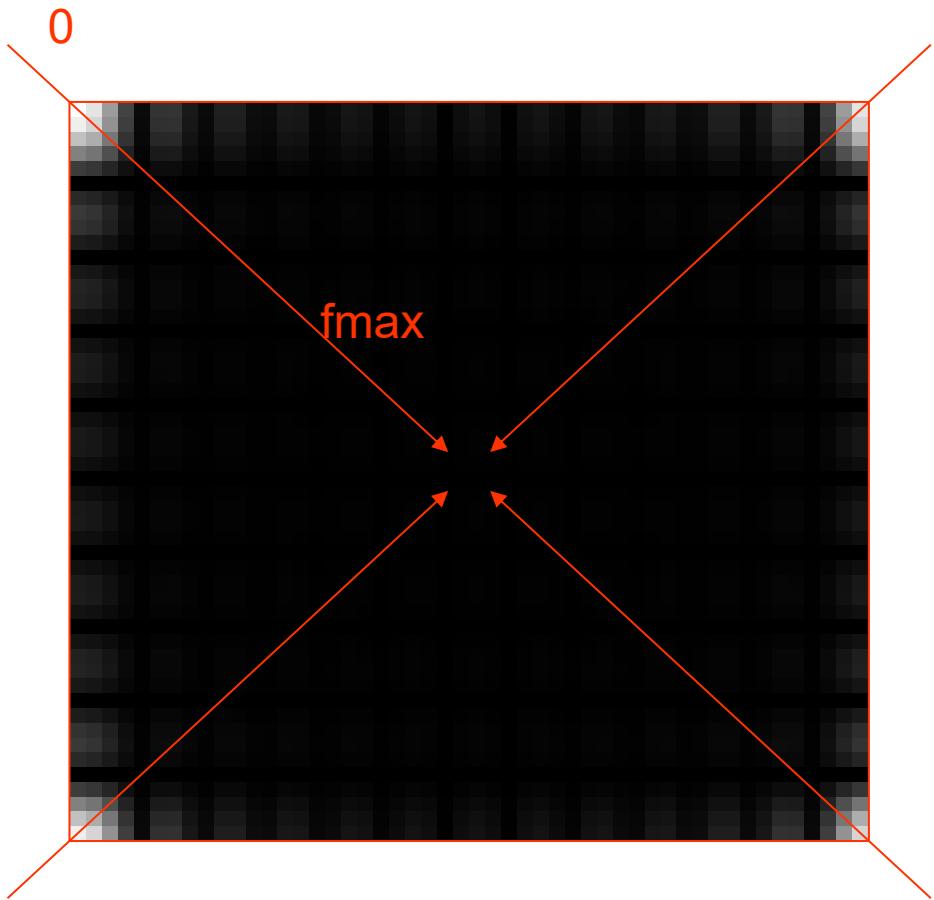
- ▶ Podemos então dizer:

$$F(u, v) = |F(u, v)| e^{i\phi(u, v)}$$

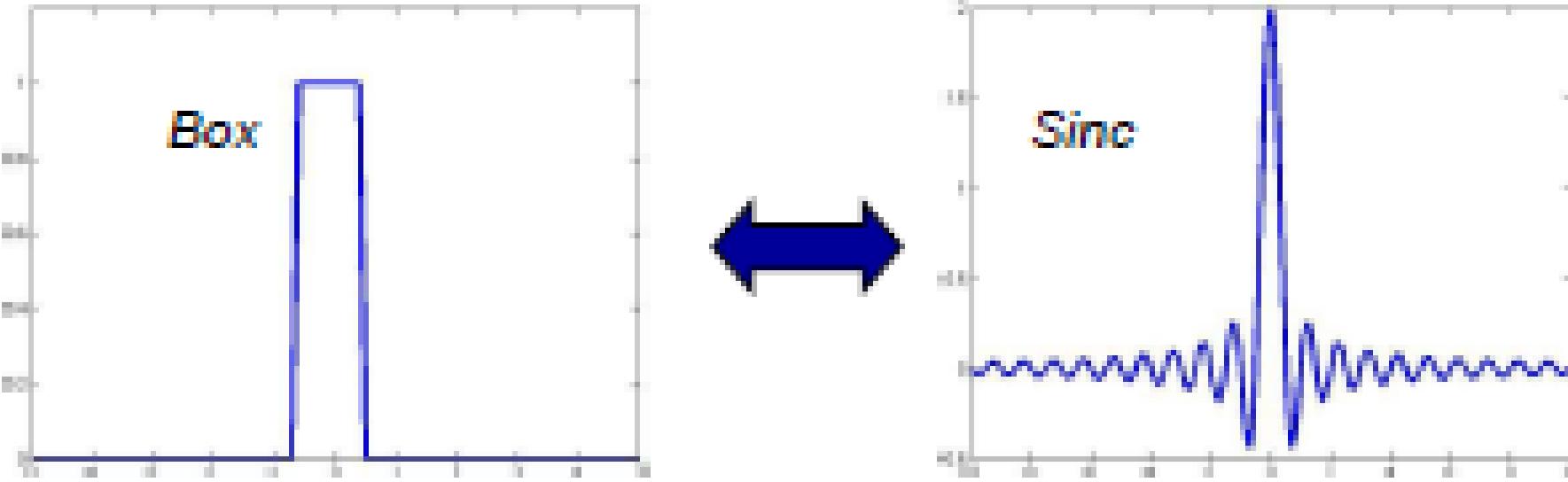
- ▶ O espectro de potência é definido como o quadrado da amplitude:

$$P(u, v) = |F(u, v)|^2 = R^2(u, v) + I^2(u, v)$$

# FFT Resultado

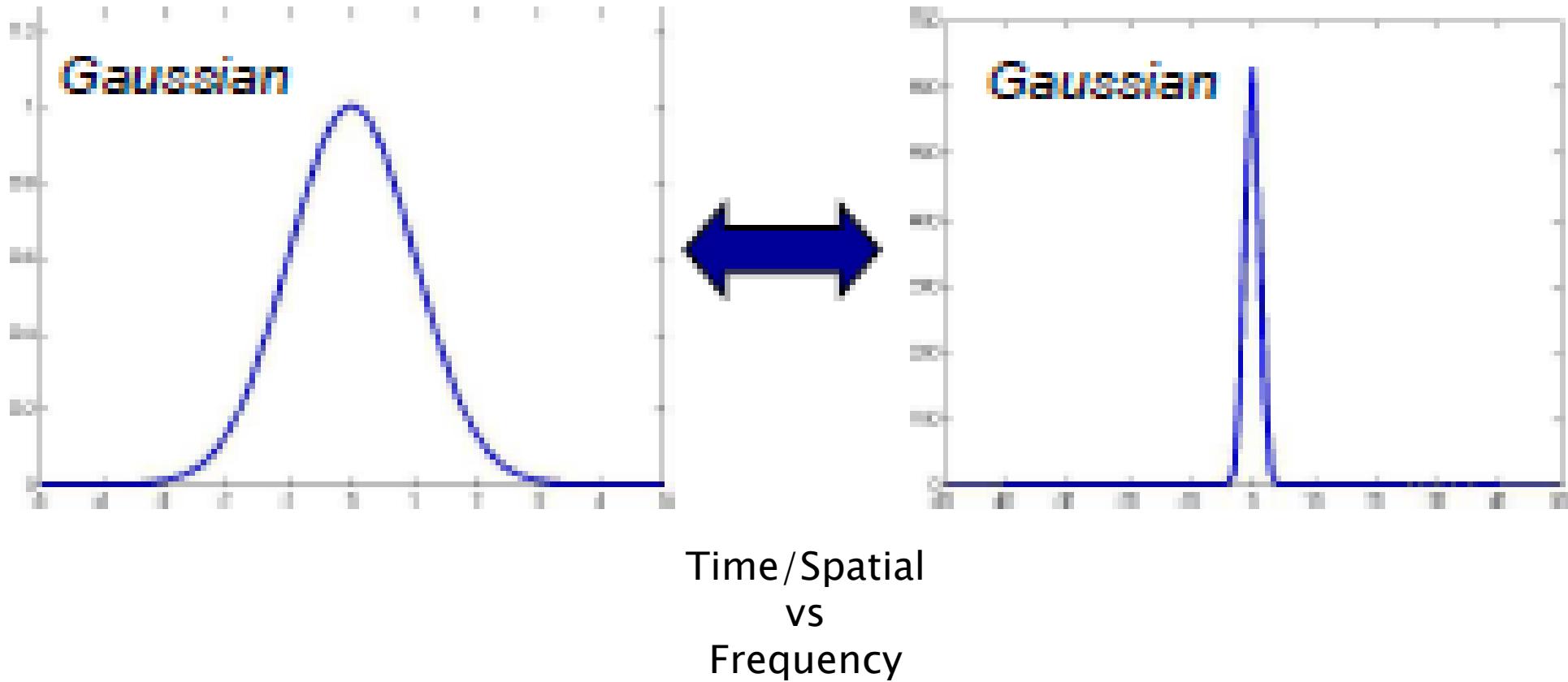


# Algumas transformadas básicas



Time/Spatial  
vs  
Frequency

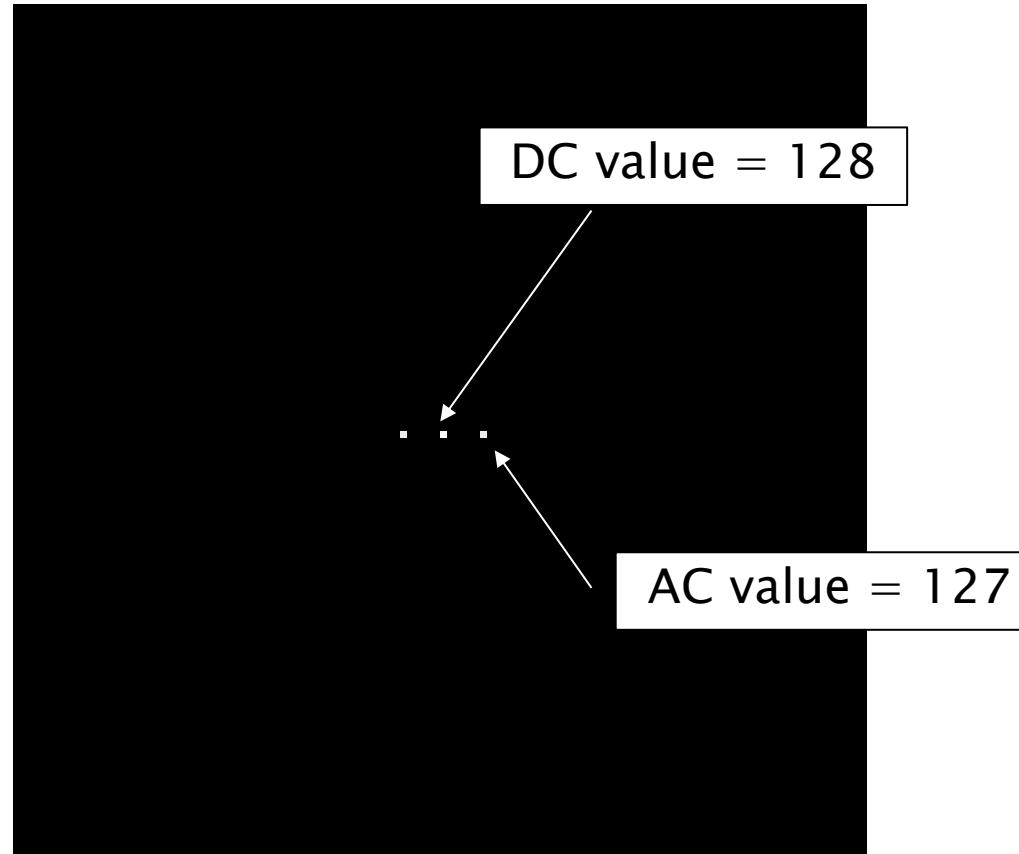
# Algumas transformadas básicas



# FFT – Exemplo

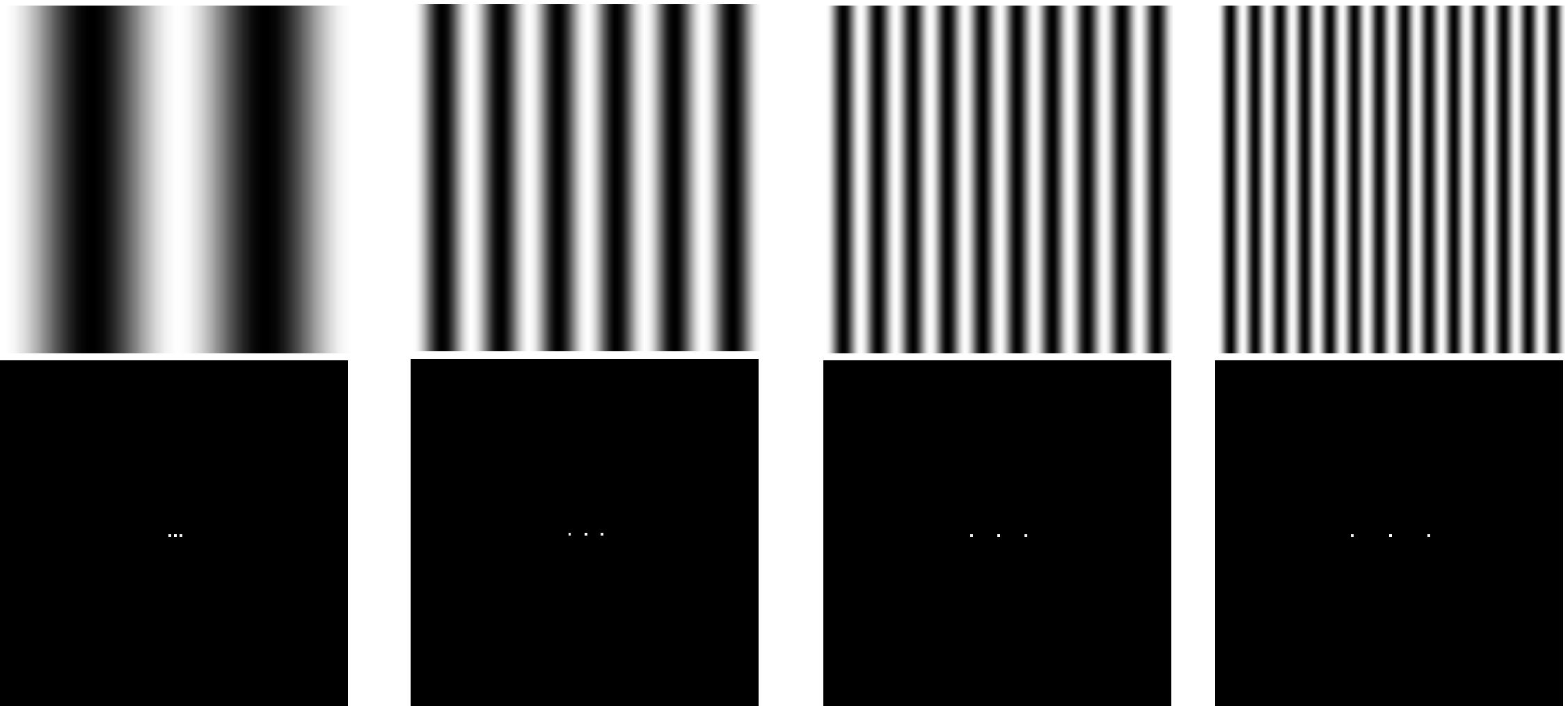


Espaço  
 $\text{img}=\text{Sin}(\text{wt}) * 127 + 128$

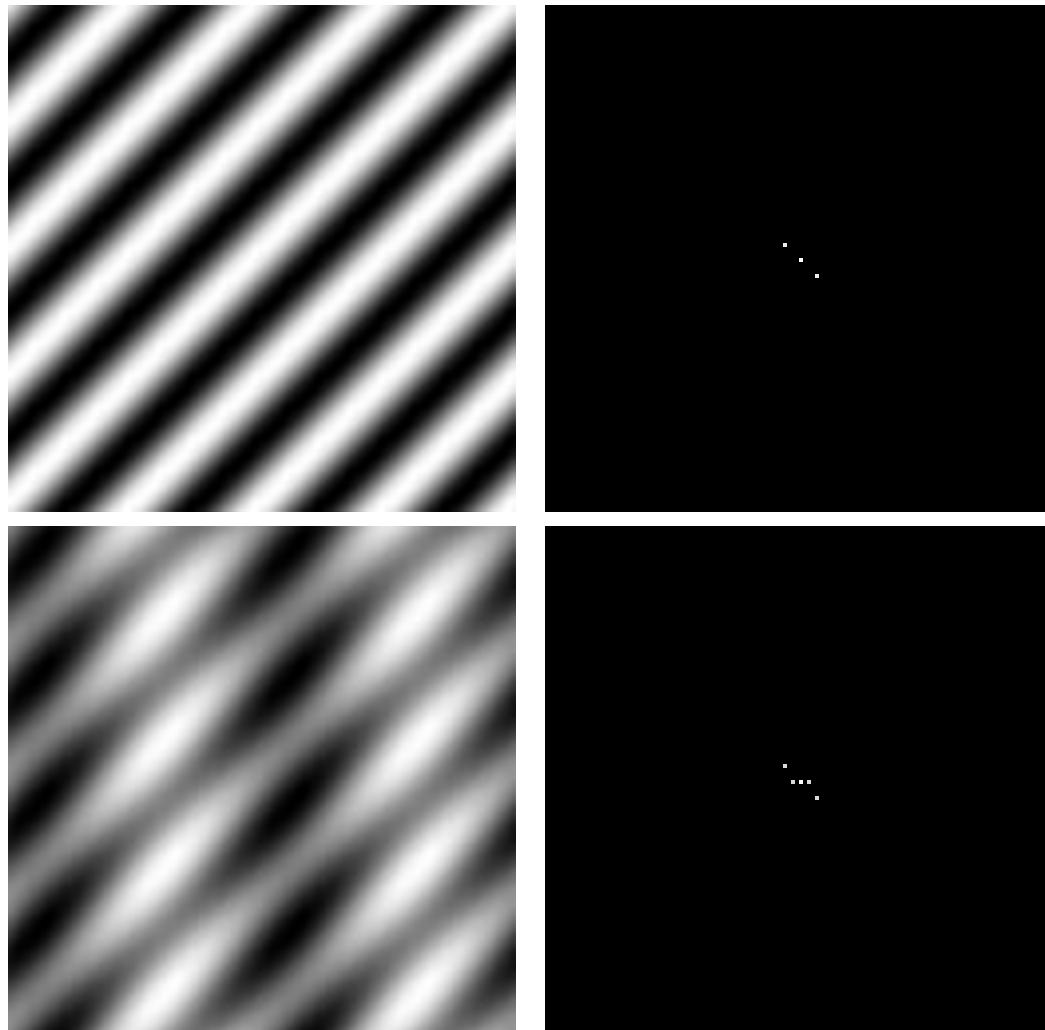


Frequência (magnitude)

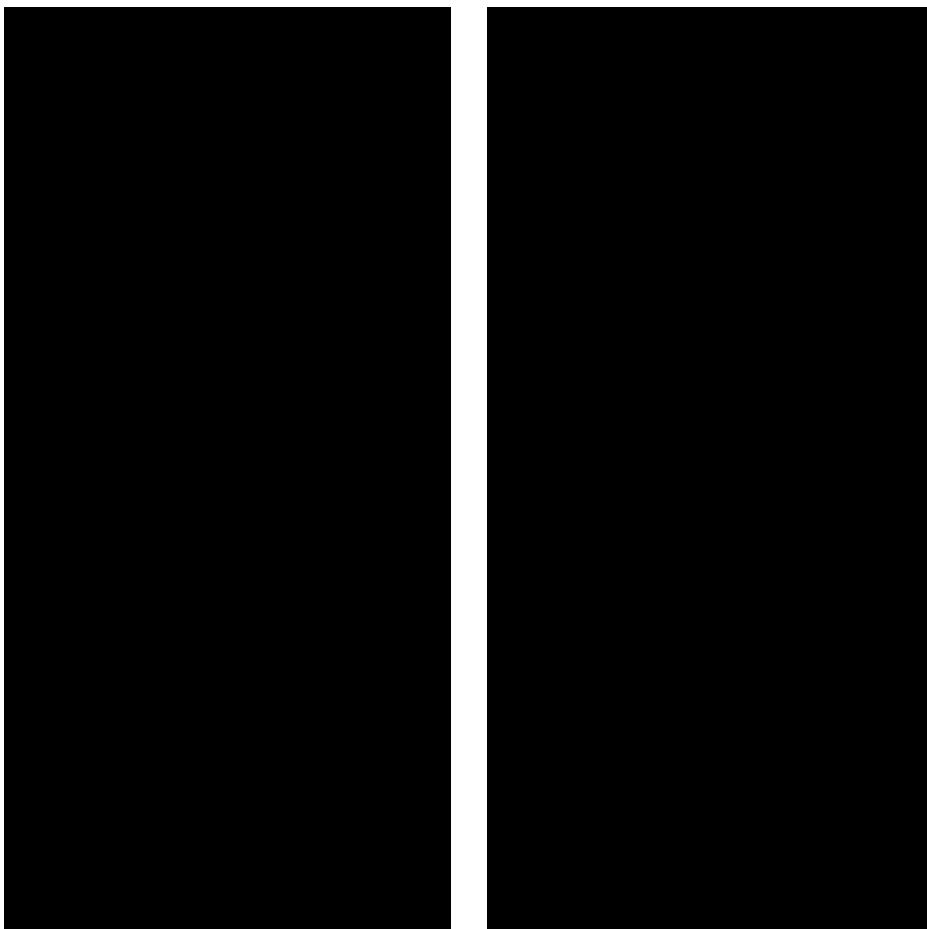
# FFT – Exemplos



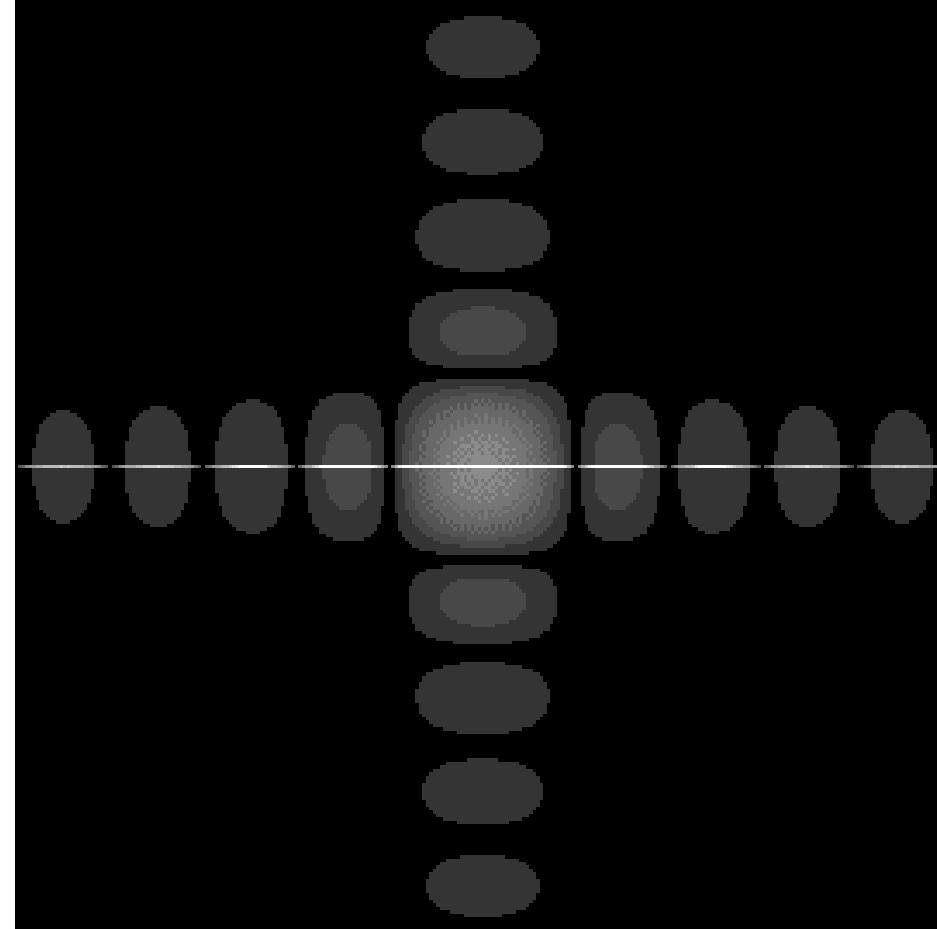
# FFT – Exemplos



# FFT – Exemplo



Espaço  
BOX



Frequência (Magnitude)  
Sync

# FFT – Exemplo

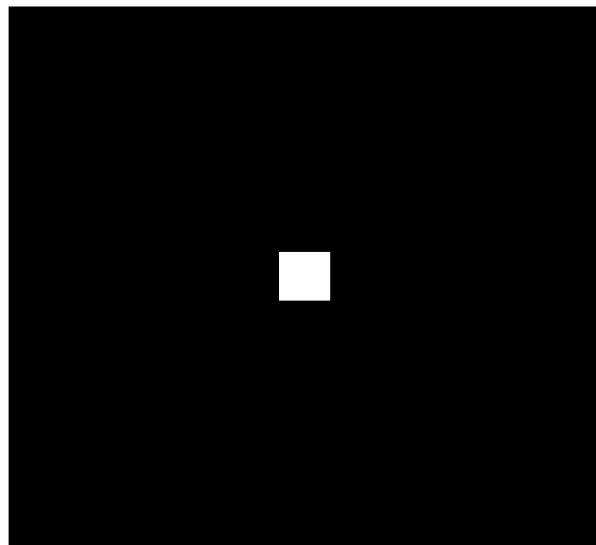
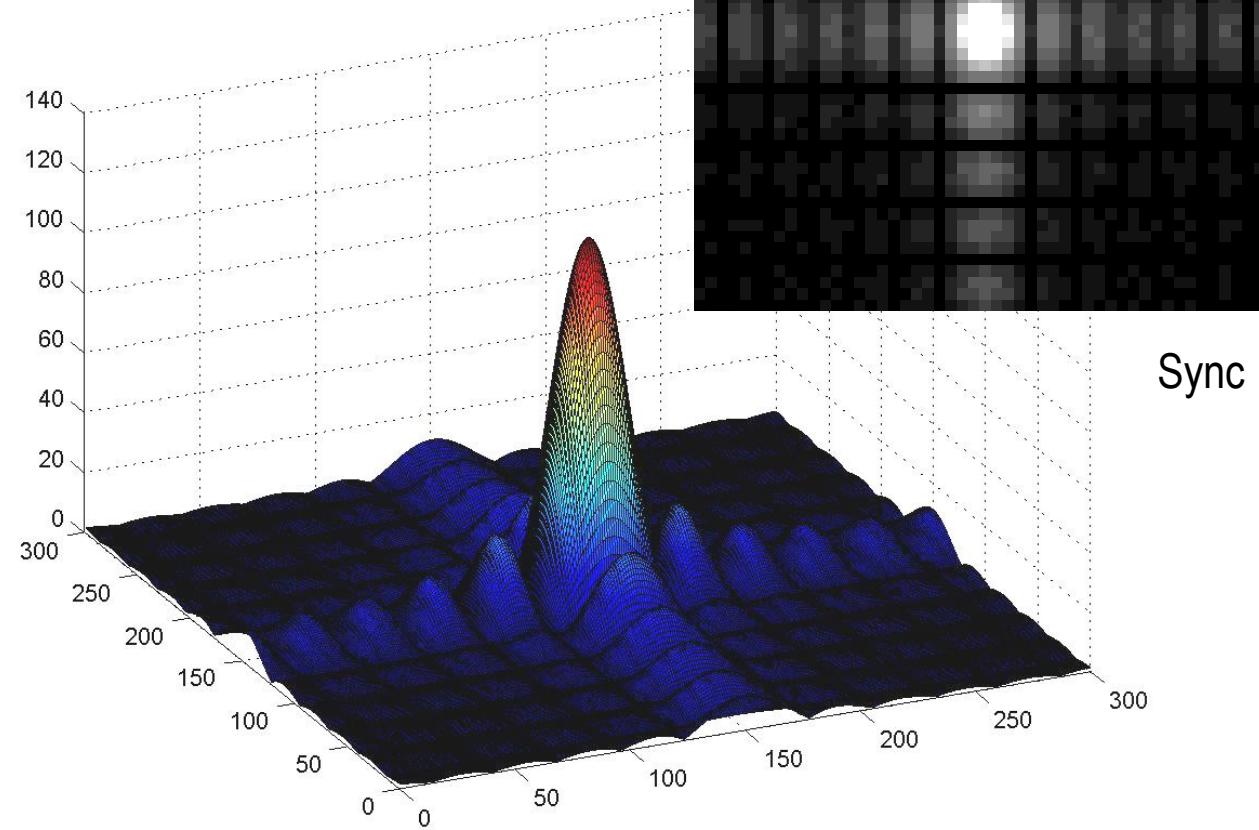
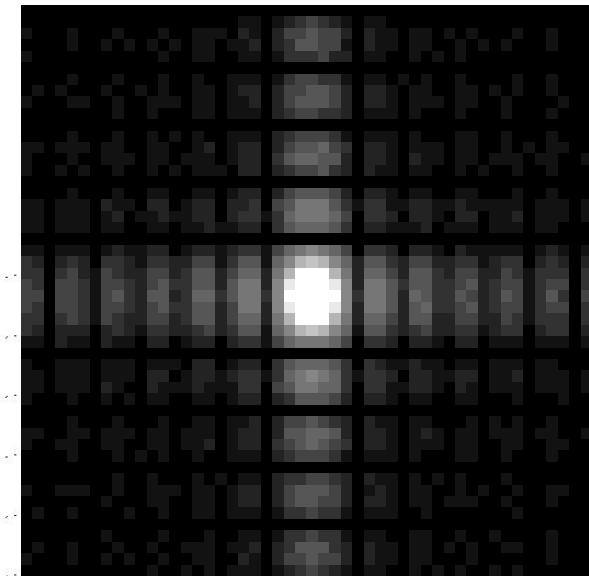


Imagen original  
Box



Amplitude da FFT resultante



Sync

# Transformadas de Fourier

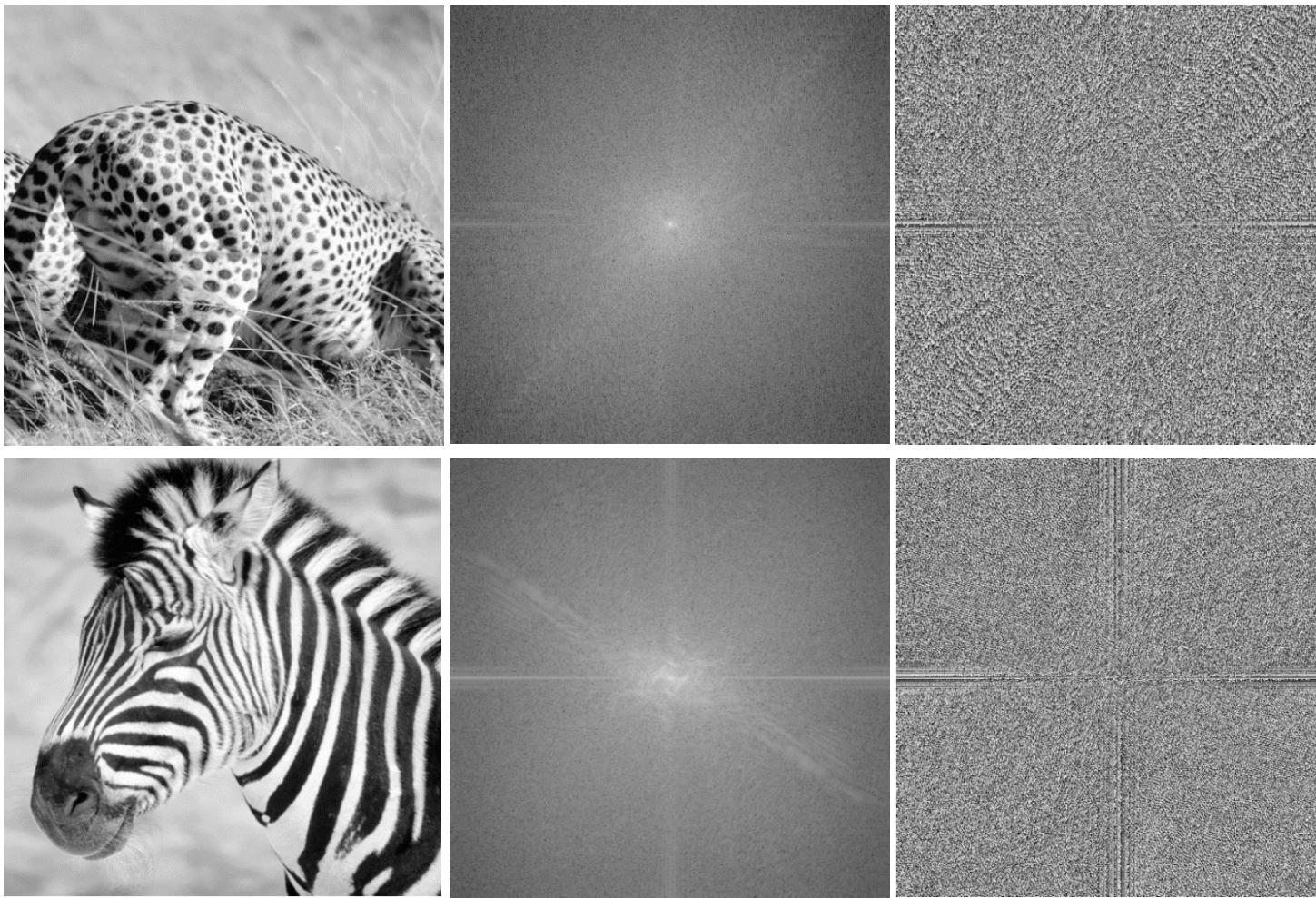
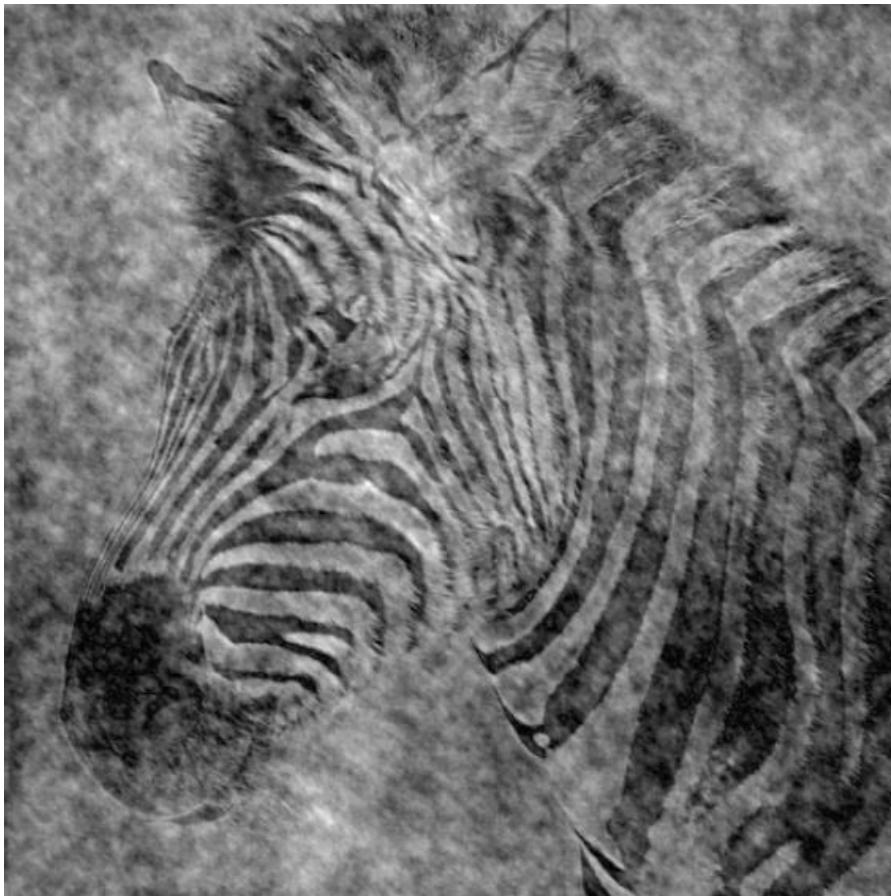


Imagen original

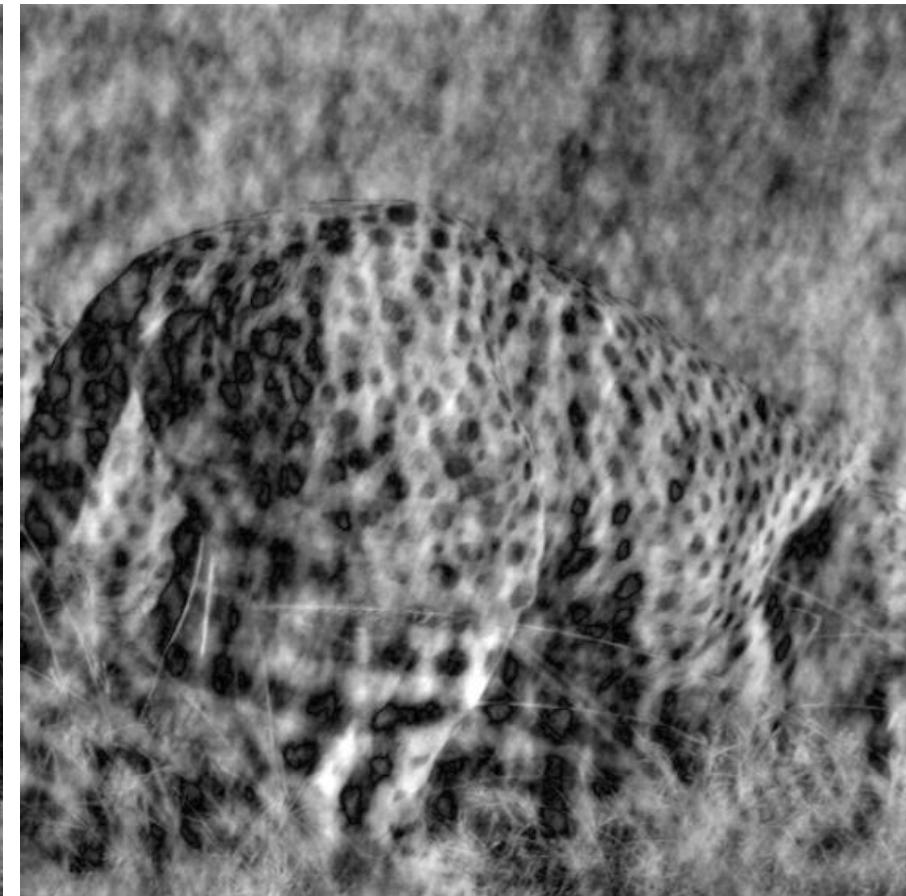
Amplitude

Fase

# Comparação de importância amplitude/fase



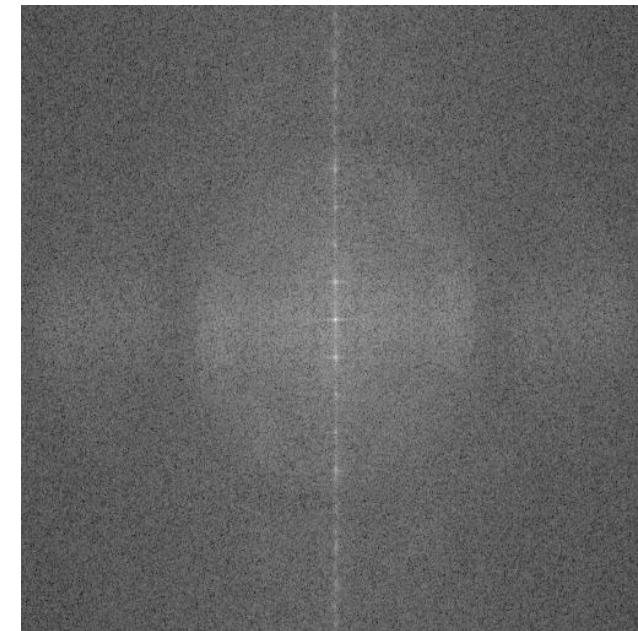
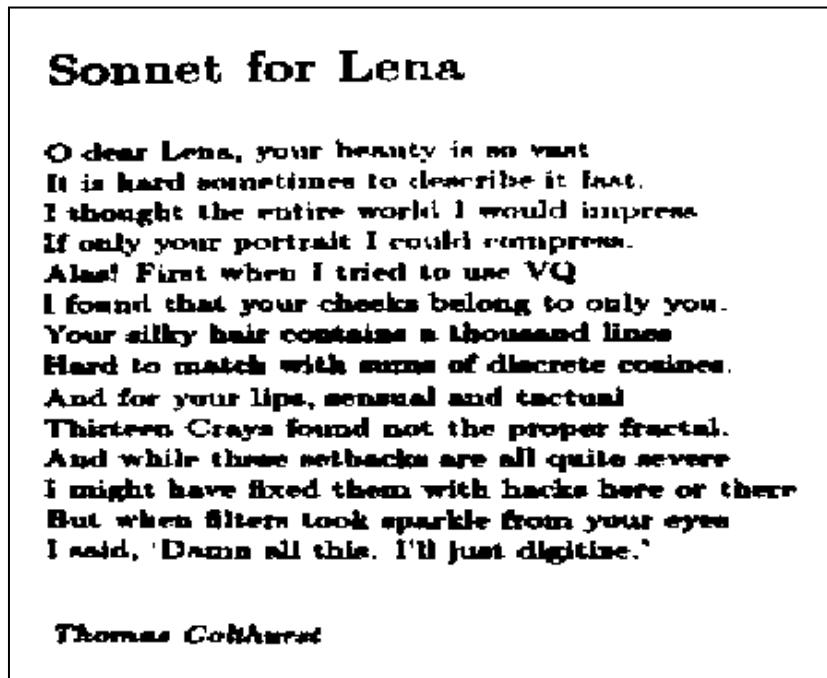
Amplitude da chita com a fase da zebra



Amplitude da zebra com a fase da chita

# Exemplo de aplicação da FFT em imagem

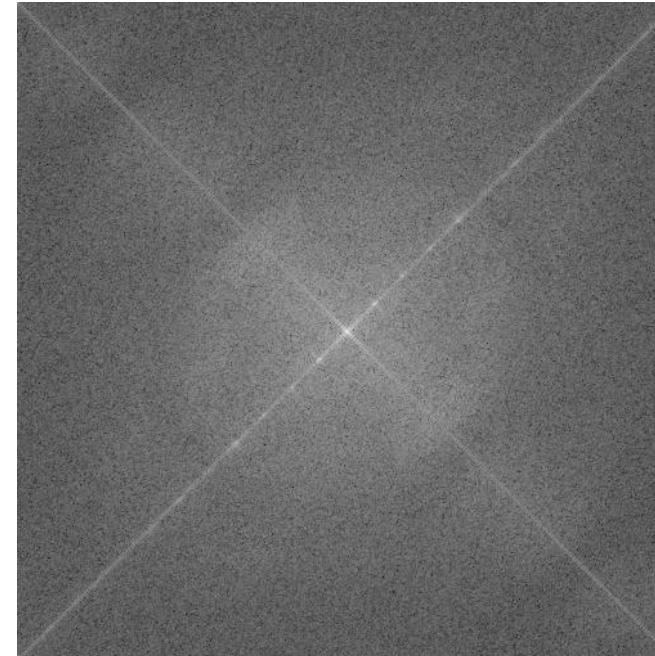
- ▶ Determinação da orientação do texto na imagem:



Amplitude

# Exemplo de aplicação da FFT em imagem

- Partindo agora de uma imagem semelhante, mas rodada:



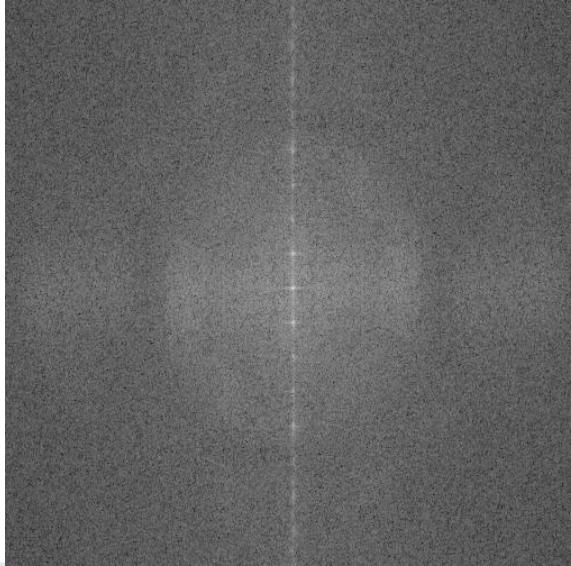
Os pontos de maior amplitude permitem determinar a orientação principal do texto

# Comparação

## Sonnet for Lena

O dear Lena, your beauty is so vast  
It is hard sometimes to describe it fast.  
I thought the entire world I would impress  
If only your portrait I could compress.  
Alas! First when I tried to use VQ  
I found that your cheeks belong to only you.  
Your silky hair contains a thousand lines  
Hard to match with sums of discrete cosines.  
And for your lips, sensual and tactful  
Thirteen Crays found not the proper fractal.  
And while these setbacks are all quite severe  
I might have fixed them with hacks here or there.  
But when filters took sparkle from your eyes  
I said, 'Damn all this. I'll just digitize.'

Thomas Cottrell

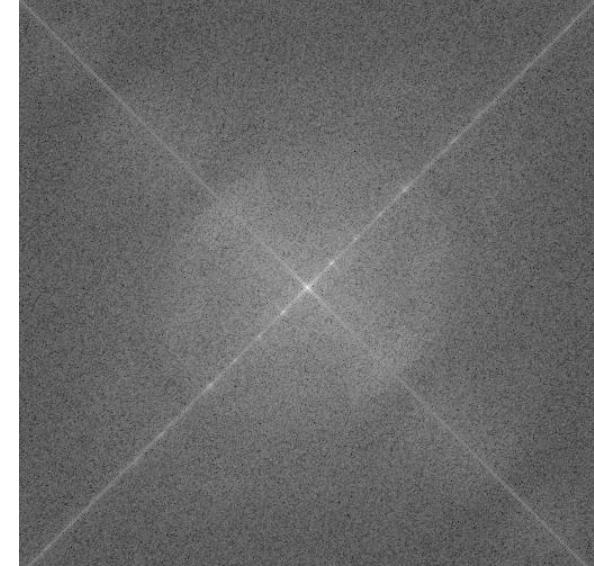


## Sonnet for Lena

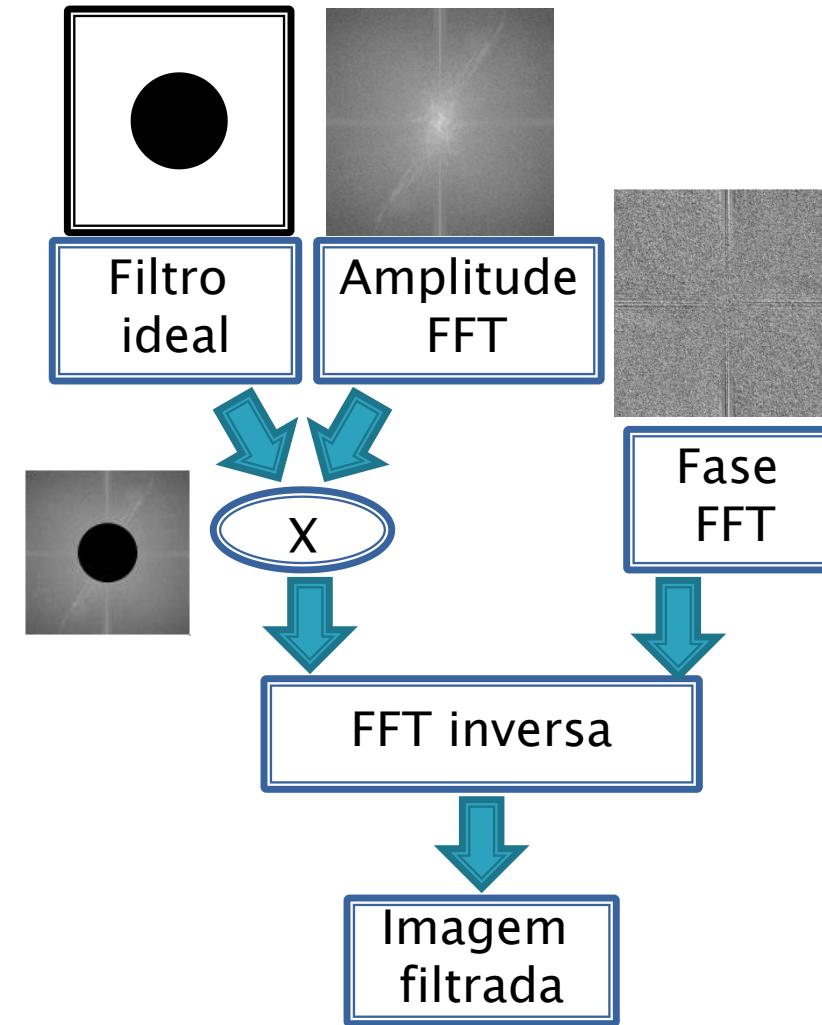
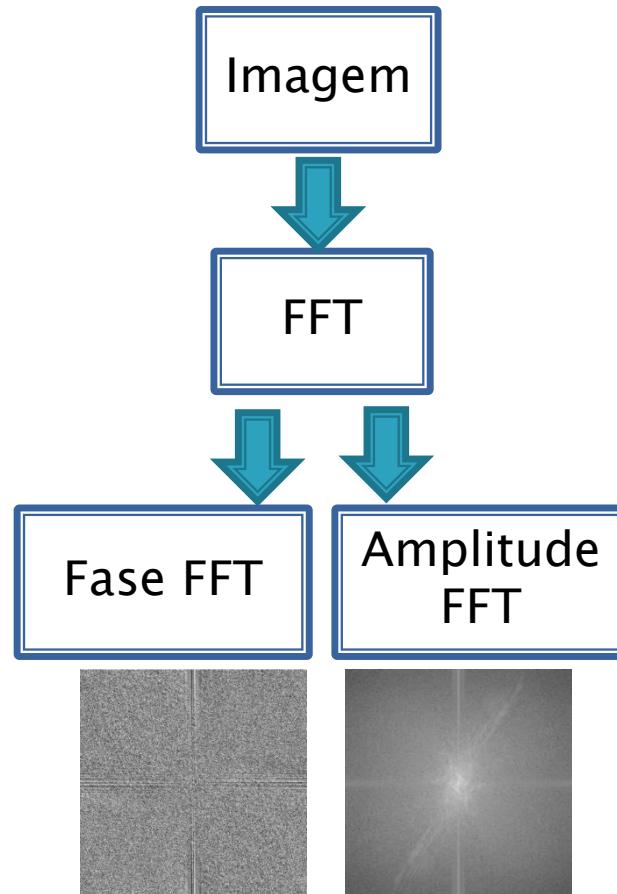
sonnet for Lena

O dear Lena, your beauty in no words,  
I could never hope to describe it, but  
It's hard sometimes to believe it's there,  
I thought you were like a diamond and glass.  
At last I find you're made of delicate porcelain,  
I know it's silly to think so much of you, my friend,  
And for your eyes to sparkle like this, I'll just die,  
And for your hair to have such a golden sheen,  
I'd give up the world for you, my love.  
But when I saw you all alone,  
I thought you were like a diamond and glass.  
Thomas Collyer

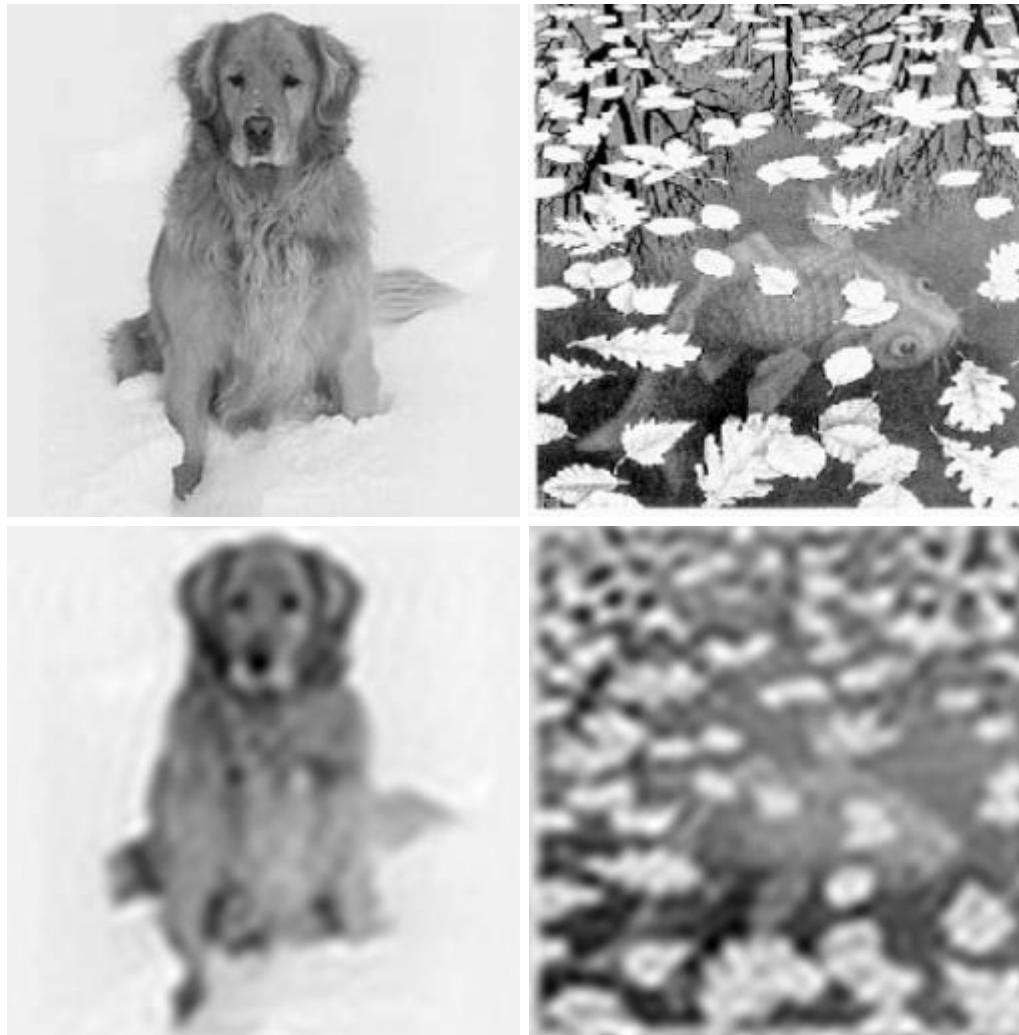
Thomas Collier



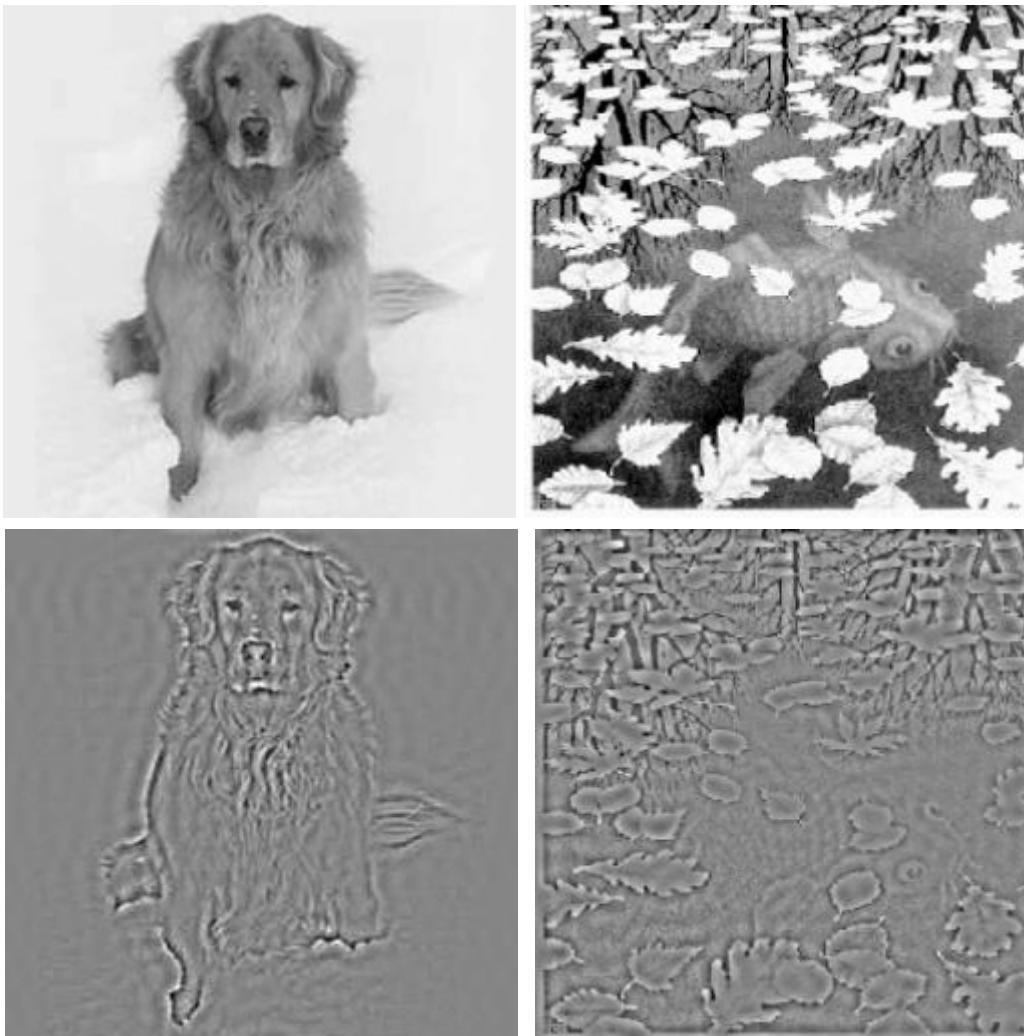
# Filtragem na frequência



# Filtragem passa-baixos



# Filtragem passa-altos



O efeito de ringing  
deve-se ao filtro ser  
ideal:  
A FFT de uma função  
degrau é um Sinc

# Filtragem na frequência – Passa Baixo

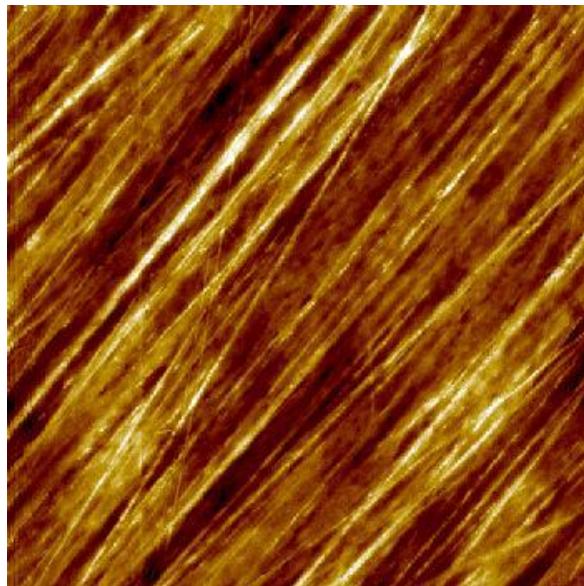
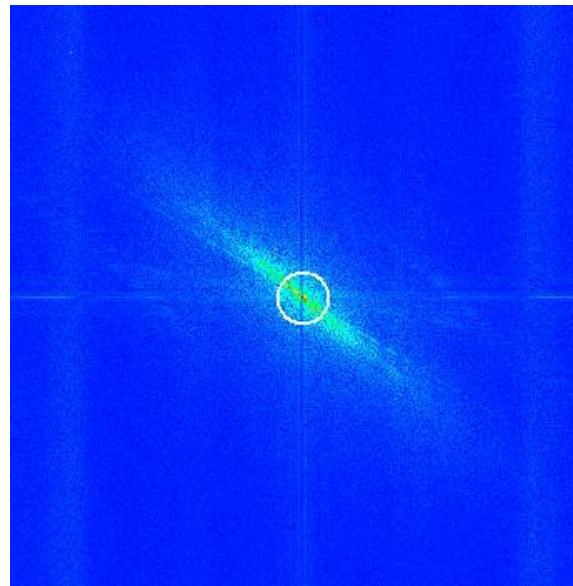


Imagen original



FFT com frequência de corte  
assinalada

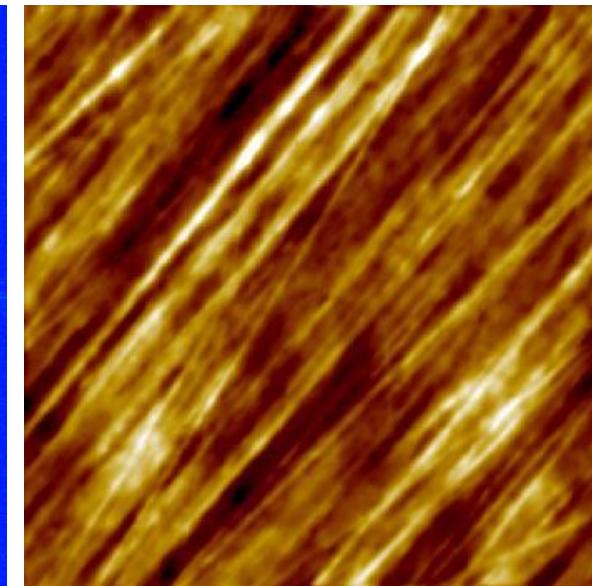
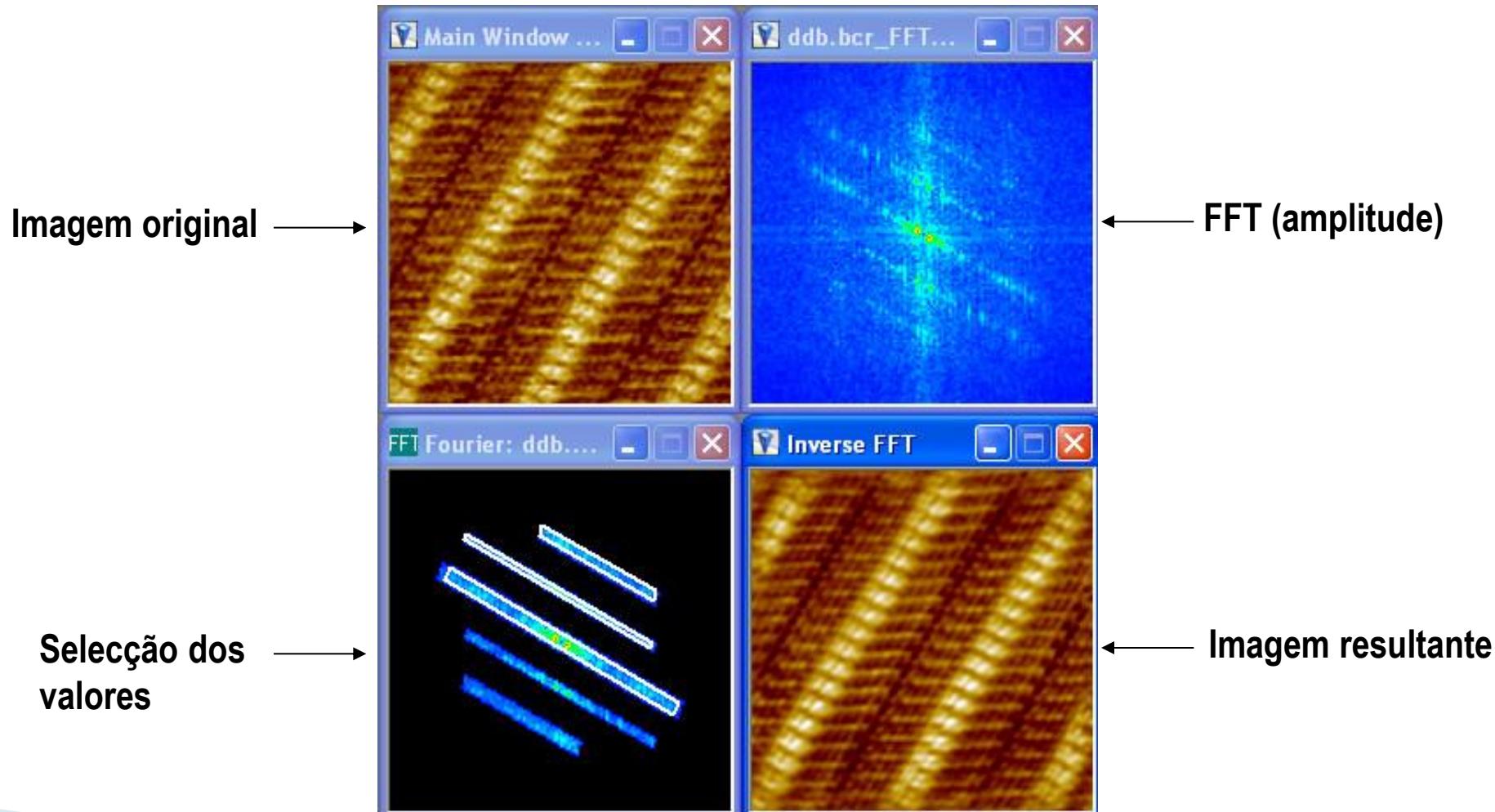
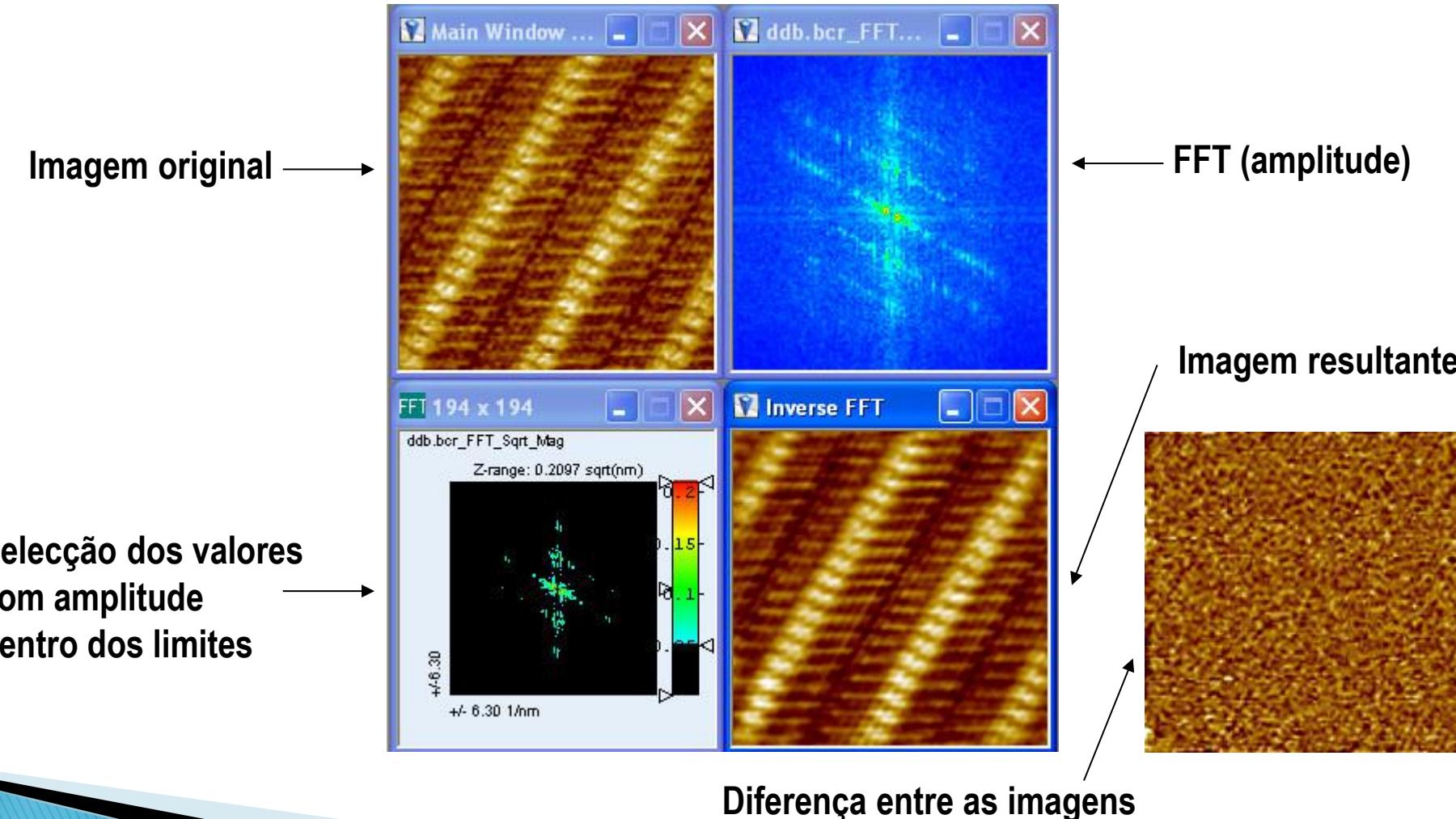


Imagen resultante

# FFT para filtragem selectiva (1)



# FFT para filtragem selectiva (2)



# FFT para filtragem selectiva (3)

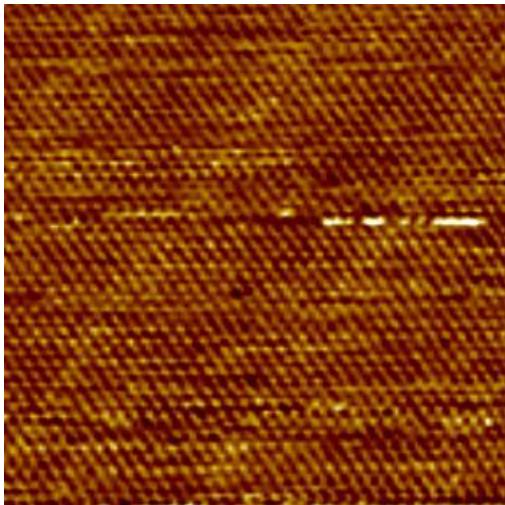
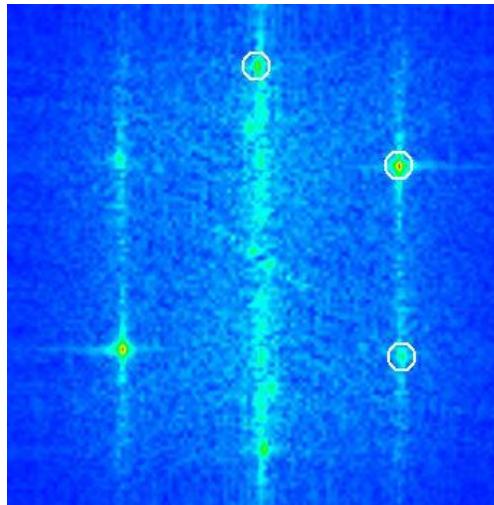
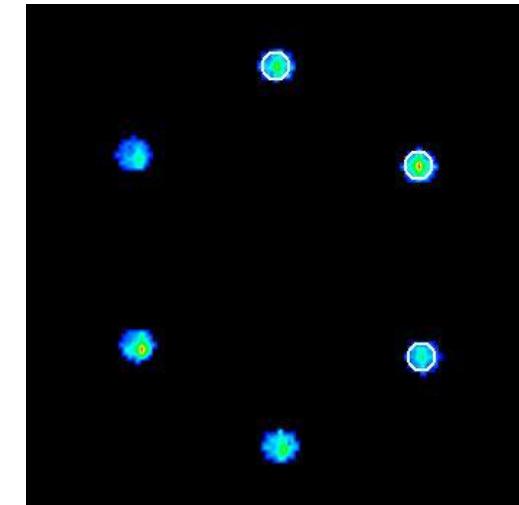


Imagen original



FFT



FFT seleccionada

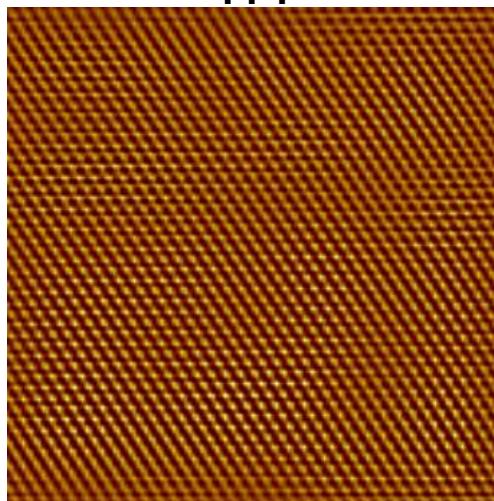


Imagen resultante

# FFT para focagem



# FFT - Aplicações

- ▶ Análise de frequênciā da imagem (ex: focagem)
- ▶ Filtragem passa baixo, passa alto, selectiva
- ▶ Acelerar a operação de convulsão entre duas imagens
  - A convulsão corresponde a avaliar cada pixel  $N_2 \times N_2$  vezes
  - Convulsão corresponde à multiplicação na frequência:
$$I1(X, Y) \cdot I2(X, Y) \rightarrow I1(u, v) \times I2(u, v)$$

- ▶ Compressão de imagem
- ▶ Reconstrução de imagem

