

## Aula 13 – Transformada de Fourier

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### Roteiro



- Transformada de Fourier
- O par de transformadas de Fourier
- Analisando a equação da Transforma de Fourier
- A Transformada Discreta de Fourier
- Calculo da DFT

#### Transformada de Fourier



• A transformada de Fourier de uma função continua f(t) é definida como:

$$\Im\{f(t)\} = \int_{-\infty}^{\infty} f(t)e^{-j2\pi\mu t}dt$$

• Como  $\Im\{f(t)\}$  é uma função de apenas  $\mu$ , pois t é eliminada pela integração, a transformada de Fourier de f(t) pode ser expressa como:

$$F(\mu) = \int_{-\infty}^{\infty} f(t)e^{-j2\pi\mu t}dt$$

• Dada F( $\mu$ ), podemos obter novamente f(t) utilizando a transformada inversa de Fourier, f(t) =  $\mathfrak{I}^{-1}{F(\mu)}$ , expressa como:

$$f(t) = \int_{-\infty}^{\infty} F(\mu) e^{j2\pi\mu t} d\mu$$

## O par de transformadas de Fourier

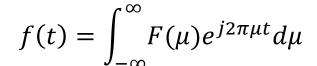


$$F(\mu) = \int_{-\infty}^{\infty} f(t)e^{-j2\pi\mu t}dt$$

Função no domínio do **tempo** 

Função no domínio da **frequência** 





# Analisando a equação da Transforma de Fourier



• Utilizando a fórmula de Euler podemos reescrever...

$$F(\mu) = \int_{-\infty}^{\infty} f(t)e^{-j2\pi\mu t}dt$$

como:

$$F(\mu) = \int_{-\infty}^{\infty} f(t) \cos(2\pi\mu t) - j \operatorname{sen}(2\pi\mu t) dt$$

- F(μ) é a própria função f(t) multiplicada por termos senoidais com frequências definidas pelos valores de μ.
  - A variável t (tempo) é eliminada pela integração.
  - Na verdade t pode representar qualquer variável continua: tempo, espaço, etc.
    - As unidades da variável de frequência dependem da unidade definida para t:
      - Se t representa o tempo e está em segundos: μ representa ciclos/s (Hz)
      - Se t representa o espaço e está em metros: μ representa ciclos/metro

### A Transformada Discreta de Fourier



- Dada a natureza continua da transformada de Fourier, ela n\u00e3o pode ser implementada em um computador.
- A transformada discreta de Fourier é:

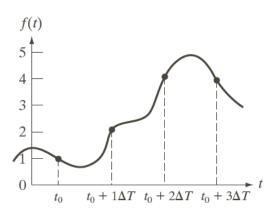
$$F(u) = \sum_{x=0}^{M-1} f(x)e^{-j2\pi ux/M}, \qquad u = 0,1,2,...,M-1$$

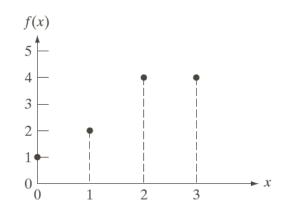
A transformada inversa discreta de Fourier é :

$$f(x) = \frac{1}{M} \sum_{u=0}^{M-1} F(u) e^{j2\pi ux/M}, \qquad x = 0,1,2,...,M-1$$



- DFT:  $F(u) = \sum_{x=0}^{M-1} f(x)e^{-\frac{j2\pi ux}{M}}$
- $F(0) = \sum_{x=0}^{3} f(x) = [f(0) + f(1) + f(2) + f(3)]$
- F(0) = 1 + 2 + 4 + 4 = 11
- $|F(0)| = \sqrt{(11)^2 + (0)^2} = 11.0$







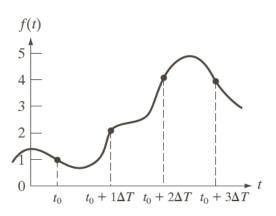
• DFT: 
$$F(u) = \sum_{x=0}^{M-1} f(x) e^{-\frac{j2\pi ux}{M}}$$

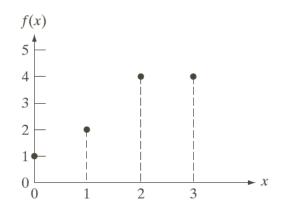
• 
$$F(1) = \sum_{x=0}^{3} f(x)e^{-j2\pi(1)x/M}$$

• 
$$F(1) = 1e^{-j2\pi(1)0/4} + 2e^{-j2\pi(1)1/4} + 4e^{-j2\pi(1)2/4} + 4e^{-j2\pi(1)3/4}$$

• 
$$F(1) = 1e^0 + 2e^{-j\pi/2} + 4e^{-j\pi} + 4e^{-j3\pi/2} = -3 + 2j$$

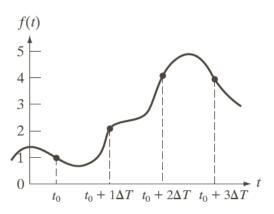
• 
$$|F(1)| = \sqrt{(-3)^2 + (2)^2} = 3.61$$

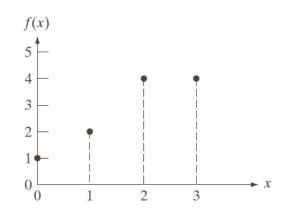






- DFT:  $F(u) = \sum_{x=0}^{M-1} f(x)e^{-\frac{j2\pi ux}{M}}$
- $F(2) = \sum_{x=0}^{3} f(x)e^{-j2\pi(2)x/M}$
- F(2) = -(1+0j)
- $|F(2)| = \sqrt{(-1)^2 + (-0)^2} = 1.0$





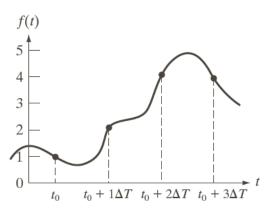


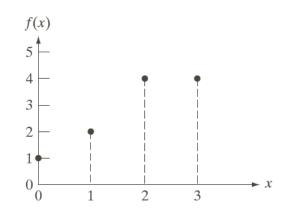
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$$F(0) = 1 + 2 + 4 + 4 = 11$$

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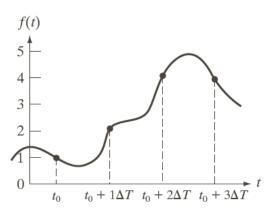
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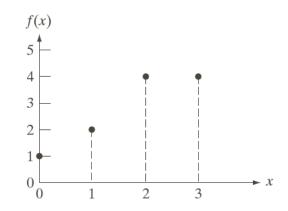
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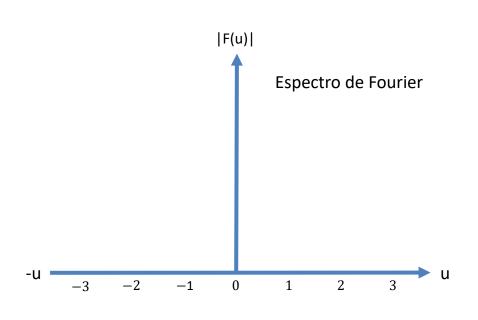
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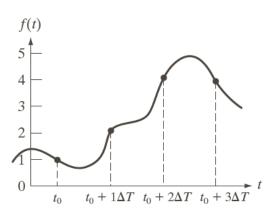


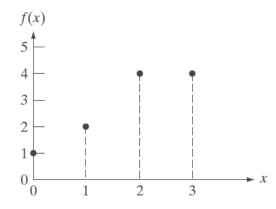




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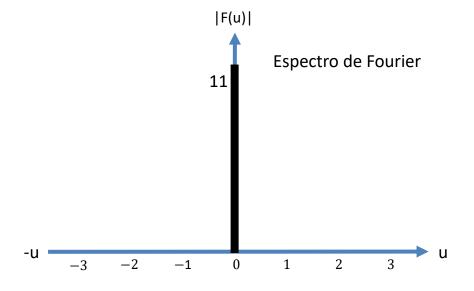


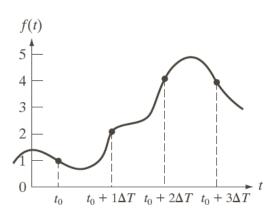


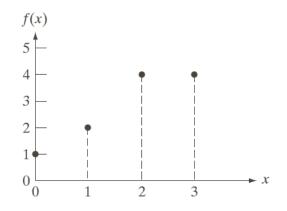
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$$F(0) = 1 + 2 + 3 + 4 = 11$$

$$- |F(0)| = 11.0$$









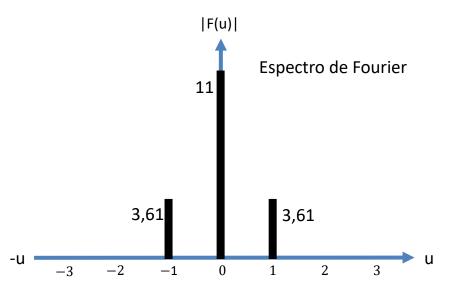
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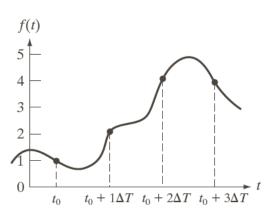
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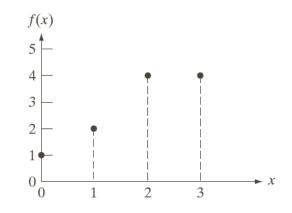
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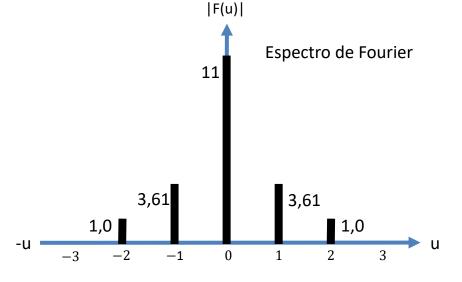
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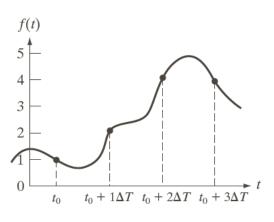
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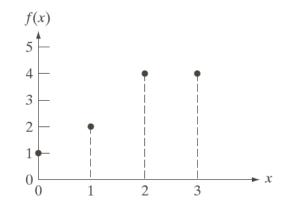
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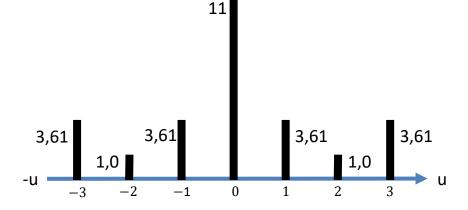
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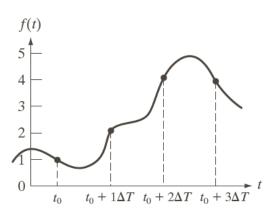
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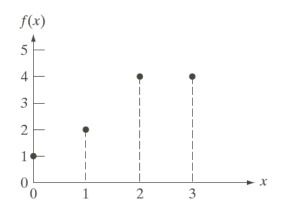
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|F(u)|

Espectro de Fourier







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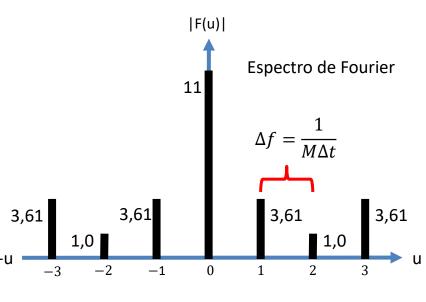
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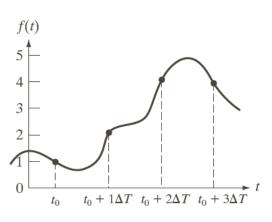
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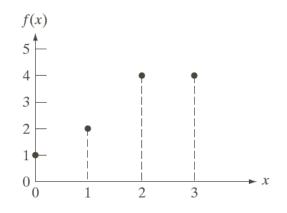
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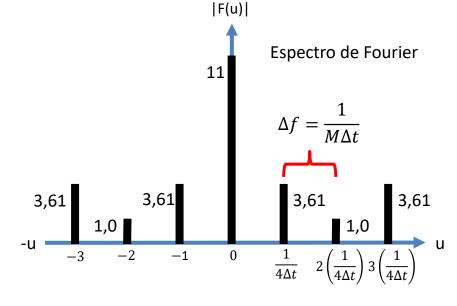
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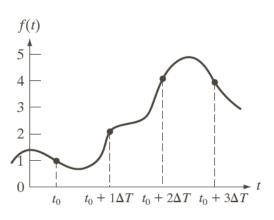
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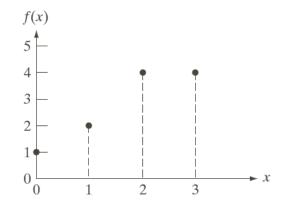
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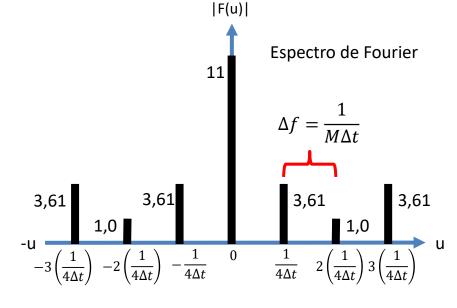
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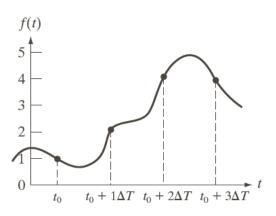
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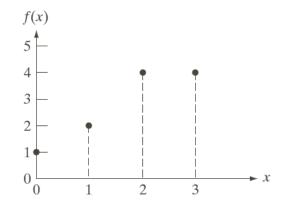
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# Bibliografia



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# **FIM**