

# Formulação matemática do Problema Inverso

# Estrutura

- Problema Inverso
  - Otimização
- Problema Inverso linear
  - Mínimos Quadrados
- Problema Inverso não-linear
  - Método de Gauss-Newton
- Aspectos geométricos
  - Problema linear 1D
  - Problema não-linear 1D
- Exercícios

# Problema Inverso

## (Otimização)

$$\bar{d} = \begin{bmatrix} d_1 \\ \vdots \\ d_N \end{bmatrix}_{N \times 1}$$

dados observados

$$\bar{g}(\bar{p}) = \begin{bmatrix} g_1(\bar{p}) \\ \vdots \\ g_N(\bar{p}) \end{bmatrix}_{N \times 1}$$

dados preditos

# Problema Inverso

## (Otimização)

$$\bar{d} = \begin{bmatrix} d_1 \\ \vdots \\ d_N \end{bmatrix}_{N \times 1}$$

dados observados

$$\phi(\bar{p}) = [\bar{d} - \bar{g}(\bar{p})]^T [\bar{d} - \bar{g}(\bar{p})]$$

$$\phi(\bar{p}) = \sum_{i=1}^N [d_i - g_i(\bar{p})]^2$$

$$\bar{g}(\bar{p}) = \begin{bmatrix} g_1(\bar{p}) \\ \vdots \\ g_N(\bar{p}) \end{bmatrix}_{N \times 1}$$

dados preditos

norma L2  
(função escalar)

# Problema Inverso

## (Otimização)

O Problema Inverso consiste em determinar um vetor de parâmetros  $\bar{p}^*$ ,  $M$ -dimensional, que minimiza a função  $\phi(\bar{p})$

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$$\bar{\nabla} \phi(\bar{p}^*) = \bar{0}_{M \times 1}$$

norma L2  
(função escalar)

# Problema Inverso (Otimização)

$$\bar{\nabla} \phi(\bar{p}) = -2 \bar{G}(\bar{p})^T [\bar{d} - \bar{g}(\bar{p})]$$

↑  
matriz  $N \times M$   
transposta

↑  
vetor  $N \times 1$

# Problema Inverso linear

(Mínimos Quadrados)

$$\bar{g}(\bar{p}) = \bar{B}\bar{p} + \bar{b}$$

matriz  $N \times M$       vetor  $M \times 1$       vetor  $N \times 1$



# Problema Inverso linear

## (Mínimos Quadrados)

$$\bar{g}(\bar{p}) = \bar{B}\bar{p} + \bar{b}$$

matriz  $N \times M$       vetor  $M \times 1$       vetor  $N \times 1$

$$\bar{p}^* = \left( \begin{matrix} \bar{B}^T \bar{B} \end{matrix} \right)^{-1} \bar{B}^T [\bar{d} - \bar{b}]$$

Estimador de Mínimos Quadrados

# Problema Inverso não-linear

(Método de Gauss-Newton)

$$\bar{g}(\bar{p}) \neq \bar{B}\bar{p} + \bar{b}$$

↑  
diferente

# Problema Inverso não-linear

(Método de Gauss-Newton)

$$\bar{g}(\bar{p}) \neq \bar{B}\bar{p} + \bar{b}$$

$$\bar{p} = \bar{p}_0 + \Delta\bar{p}$$

$$\Delta\bar{p} = \left( \bar{G}(\bar{p}_0)^T \bar{G}(\bar{p}_0) \right)^{-1} \bar{G}(\bar{p}_0)^T [\bar{d} - \bar{g}(\bar{p}_0)]$$

Método de Gauss-Newton

# Aspectos geométricos

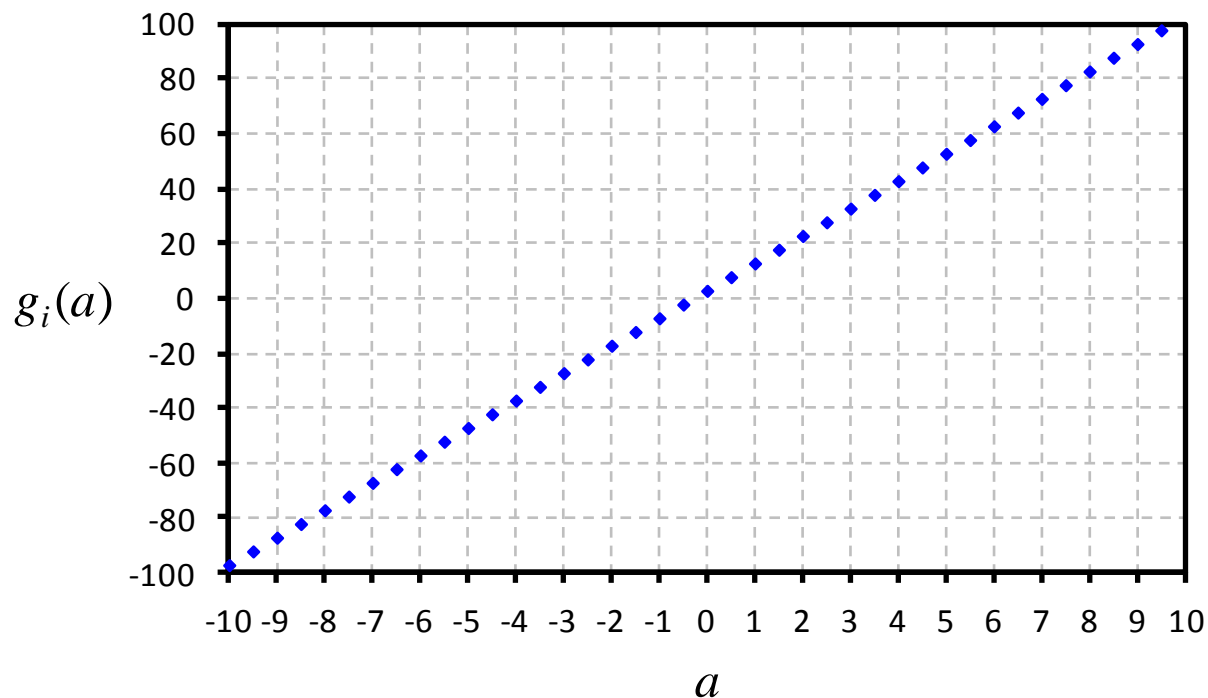
## (Problema linear 1D)

$$g_i(a) = a x_i + b$$

# Aspectos geométricos

## (Problema linear 1D)

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# Aspectos geométricos

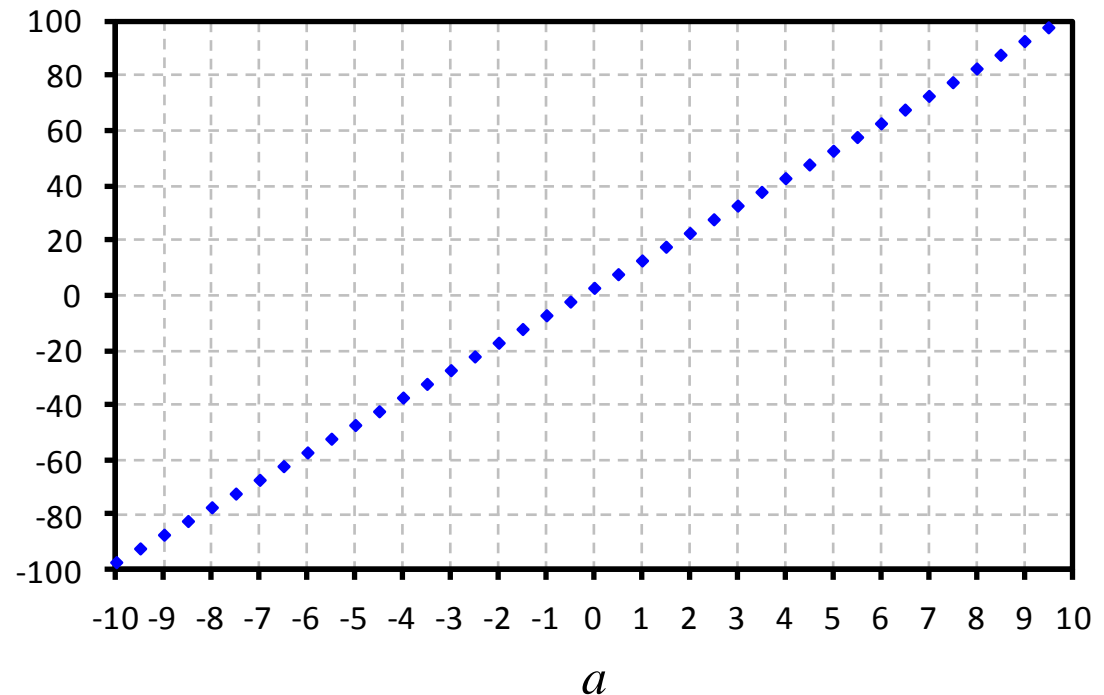
## (Problema linear 1D)

$$g_i(a) = a x_i + b$$

$$\begin{bmatrix} g_1(a) \\ g_2(a) \\ g_3(a) \end{bmatrix} = \begin{bmatrix} a x_1 + b \\ a x_2 + b \\ a x_3 + b \end{bmatrix}$$

$$\begin{bmatrix} d_1 \\ d_2 \\ d_3 \end{bmatrix}$$

$g_i(a)$



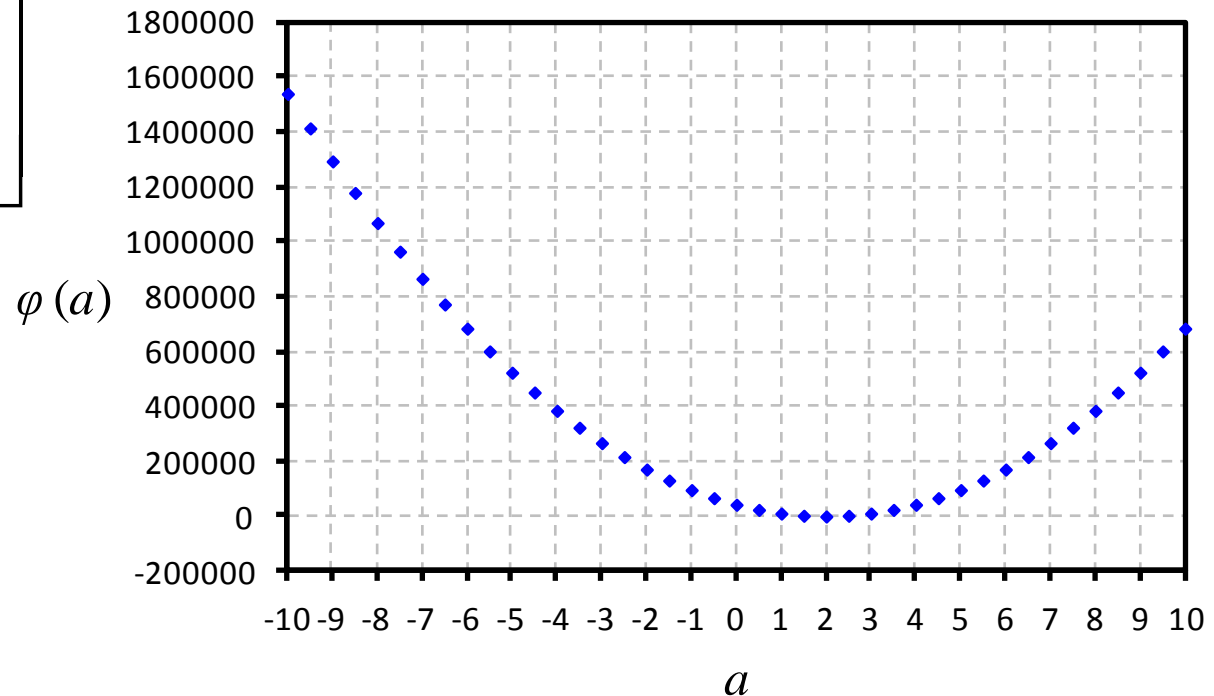
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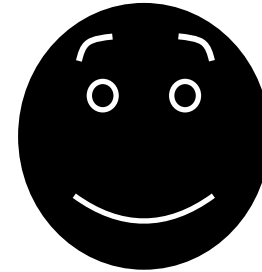
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# Aspectos geométricos

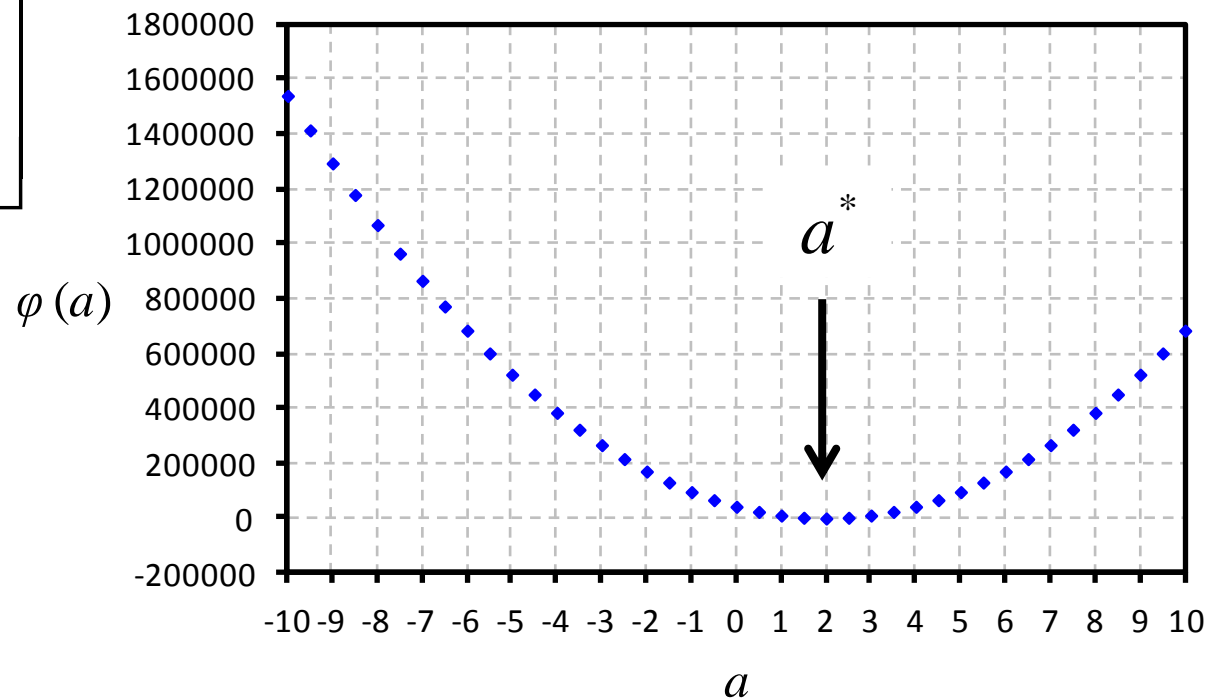
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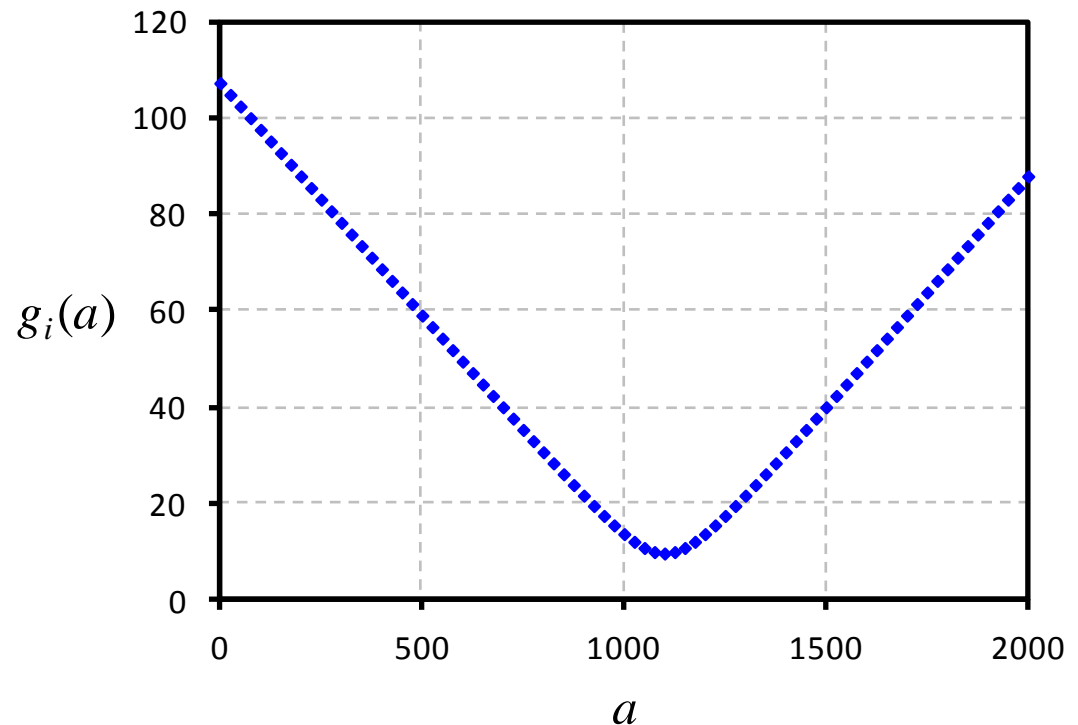
(Problema não-linear 1D)

$$g_i(a) = \alpha[(x_i - a)^2 + (y_i - b)^2]^{1/2}$$

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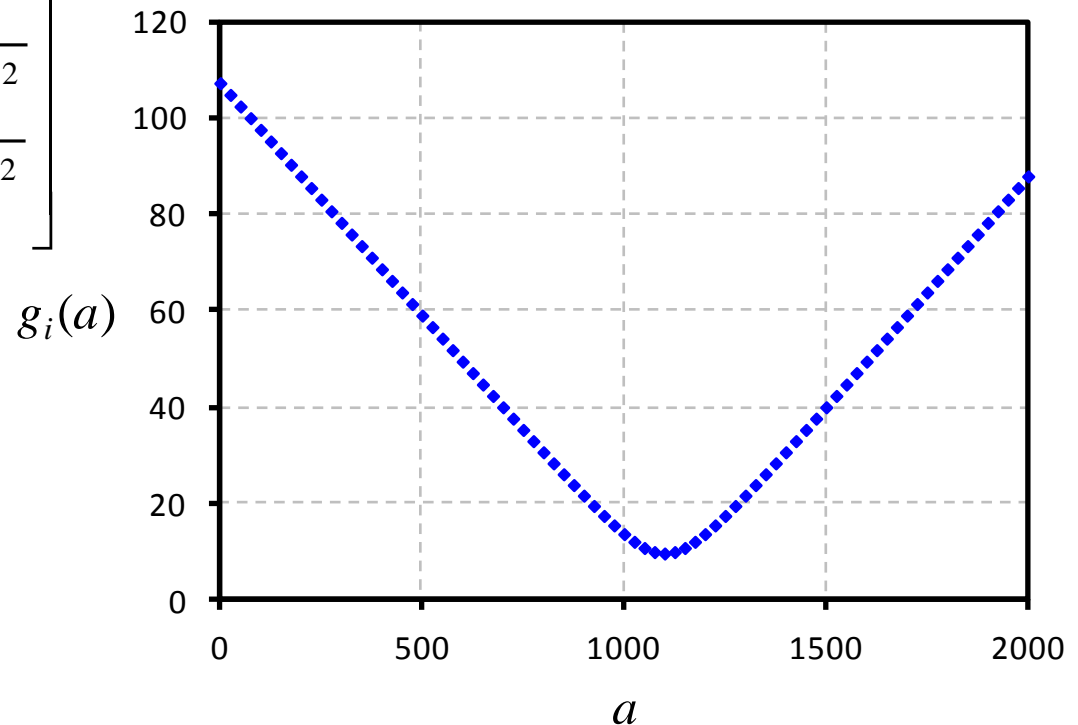
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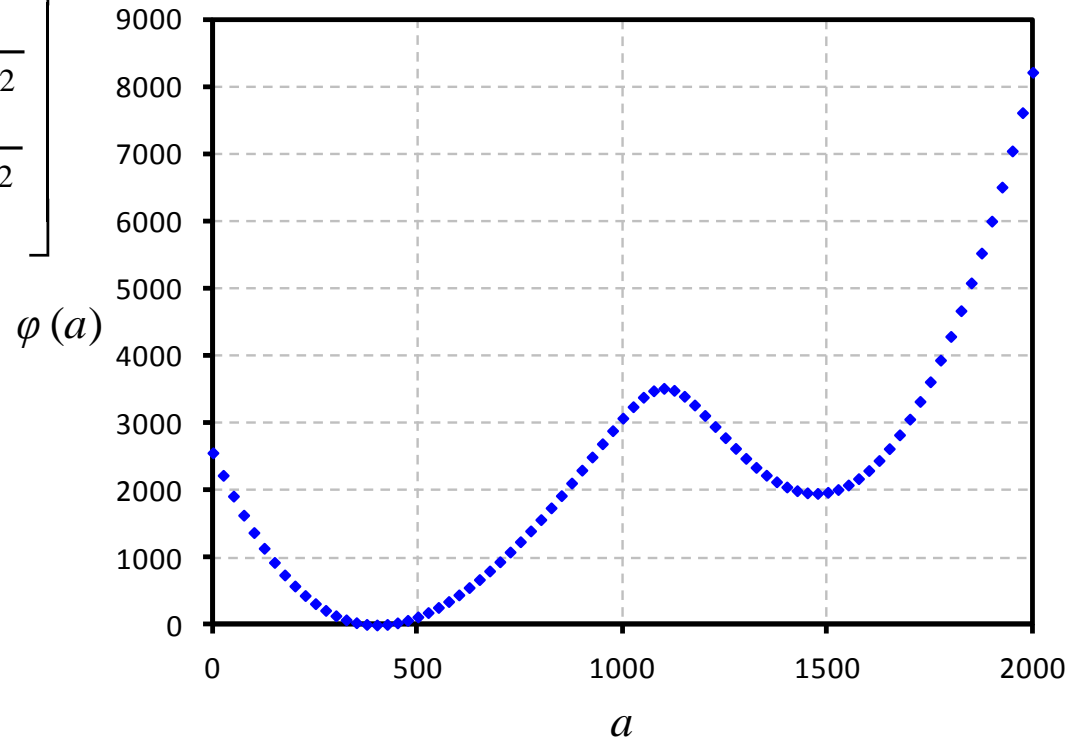
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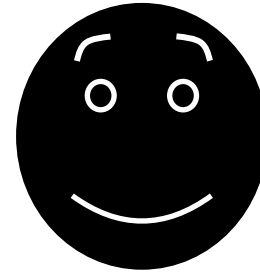
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# Aspectos geométricos

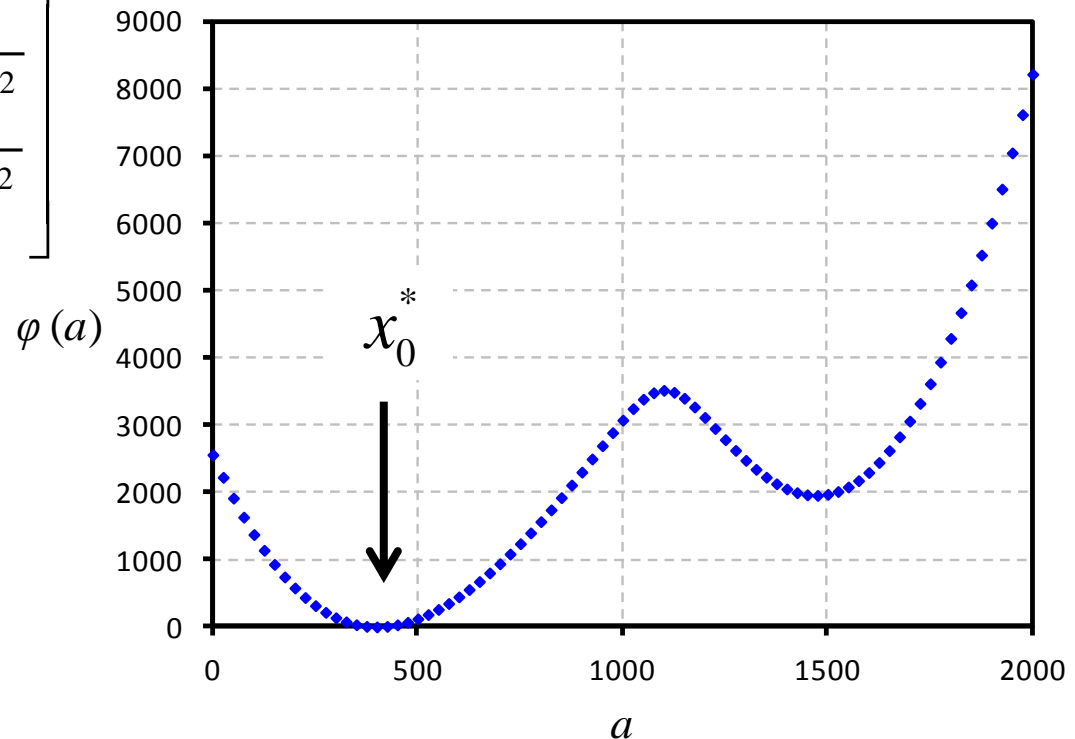
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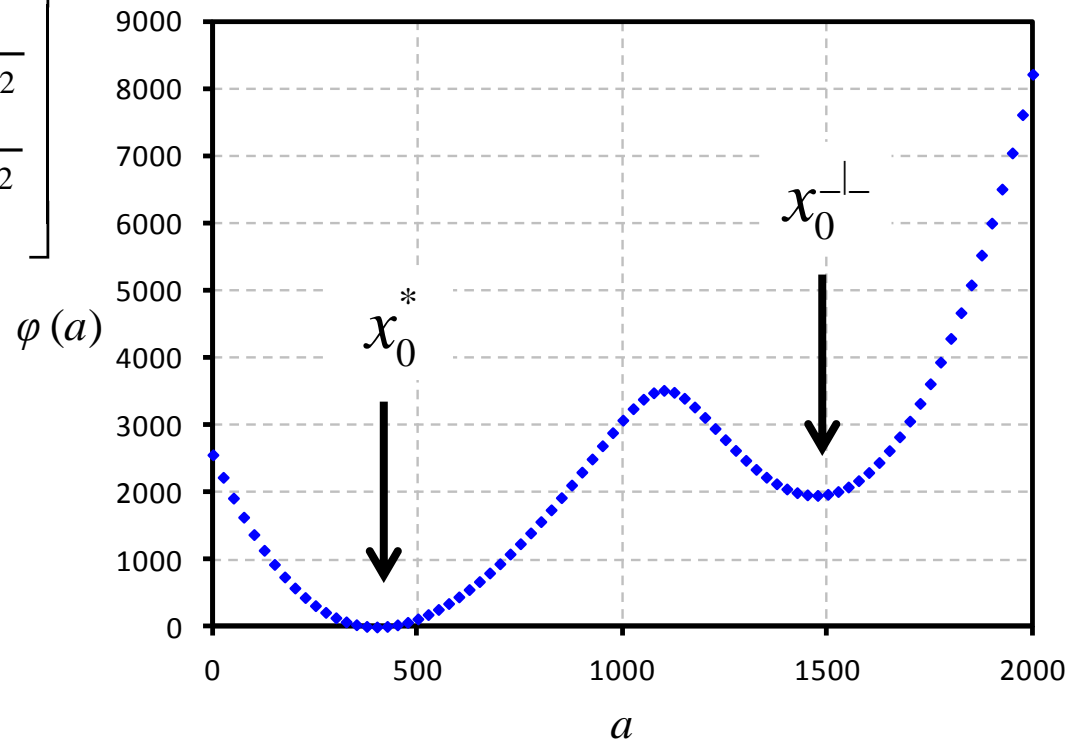
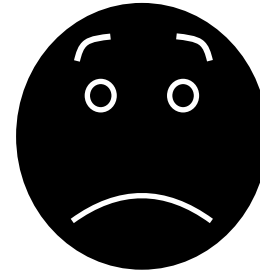
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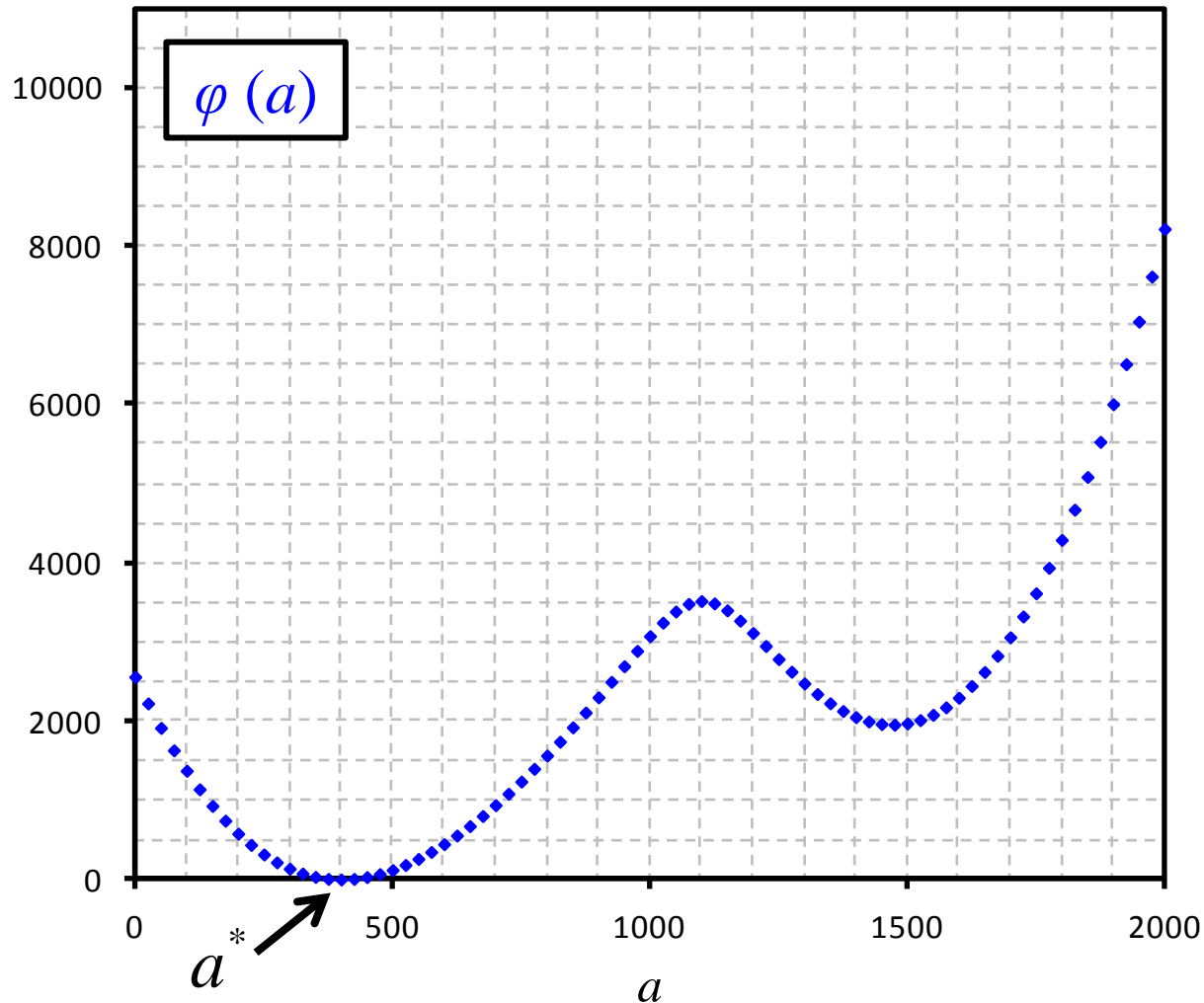
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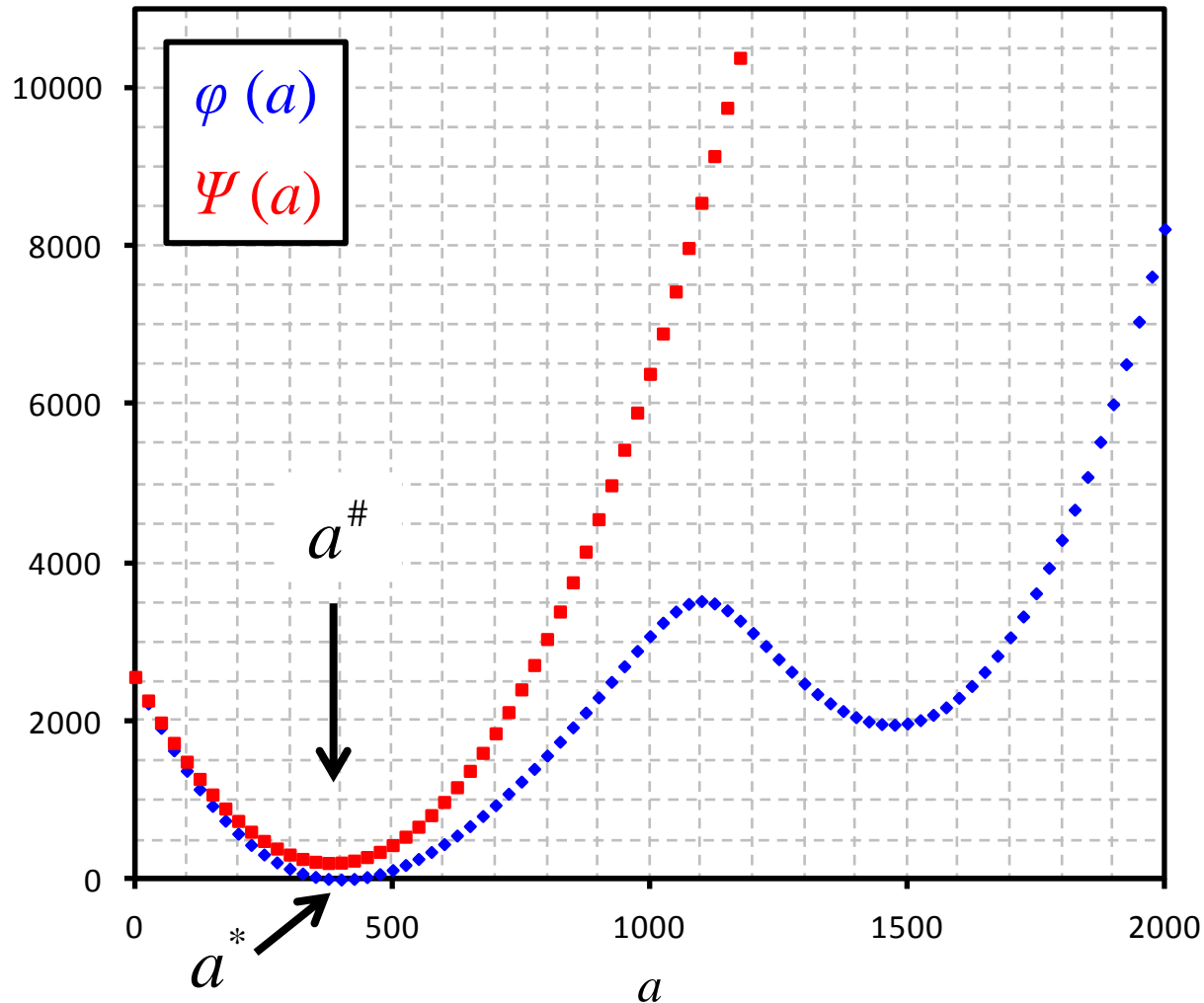
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(Problema não-linear 1D)



# Aspectos geométricos

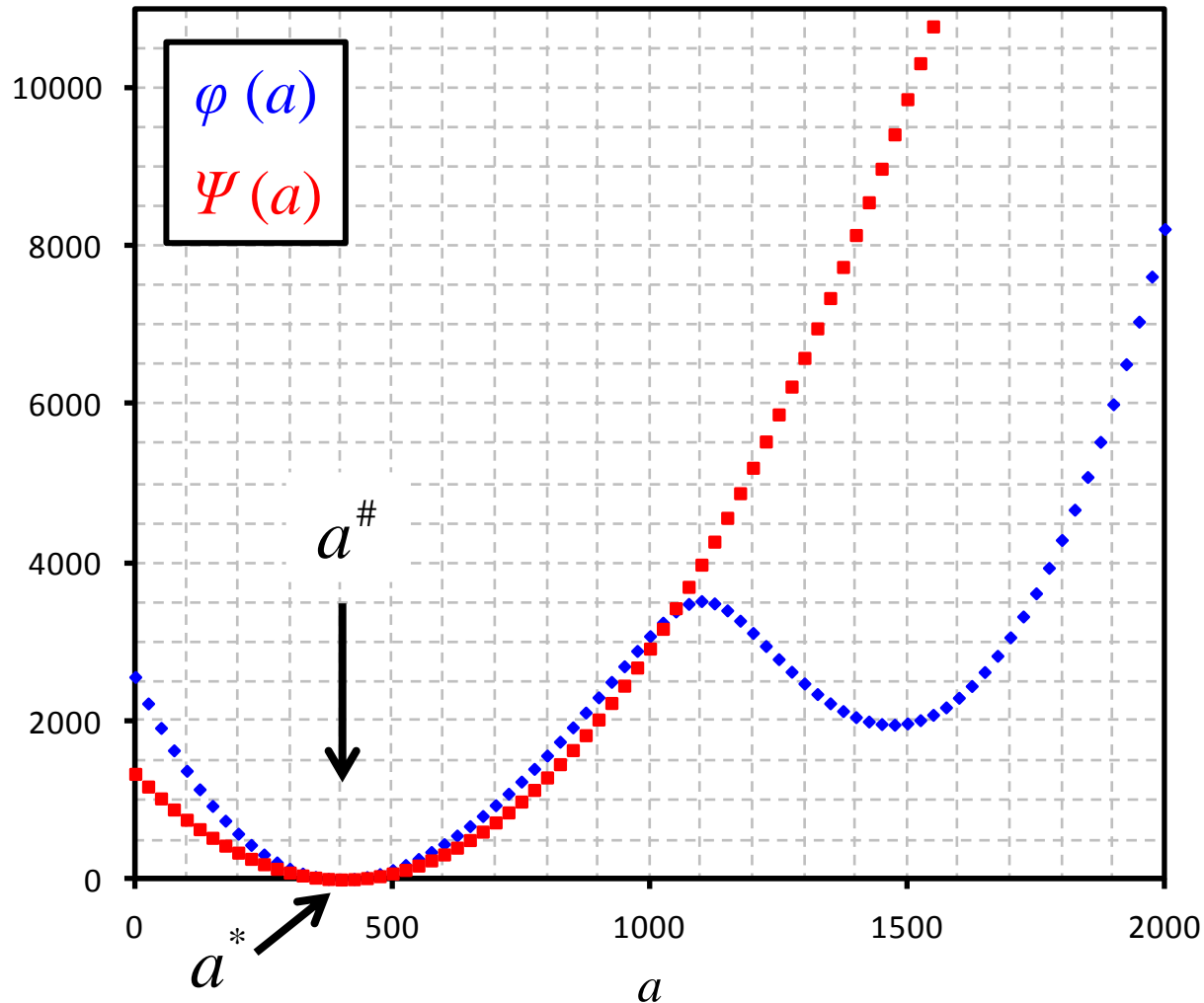
(Problema não-linear 1D)





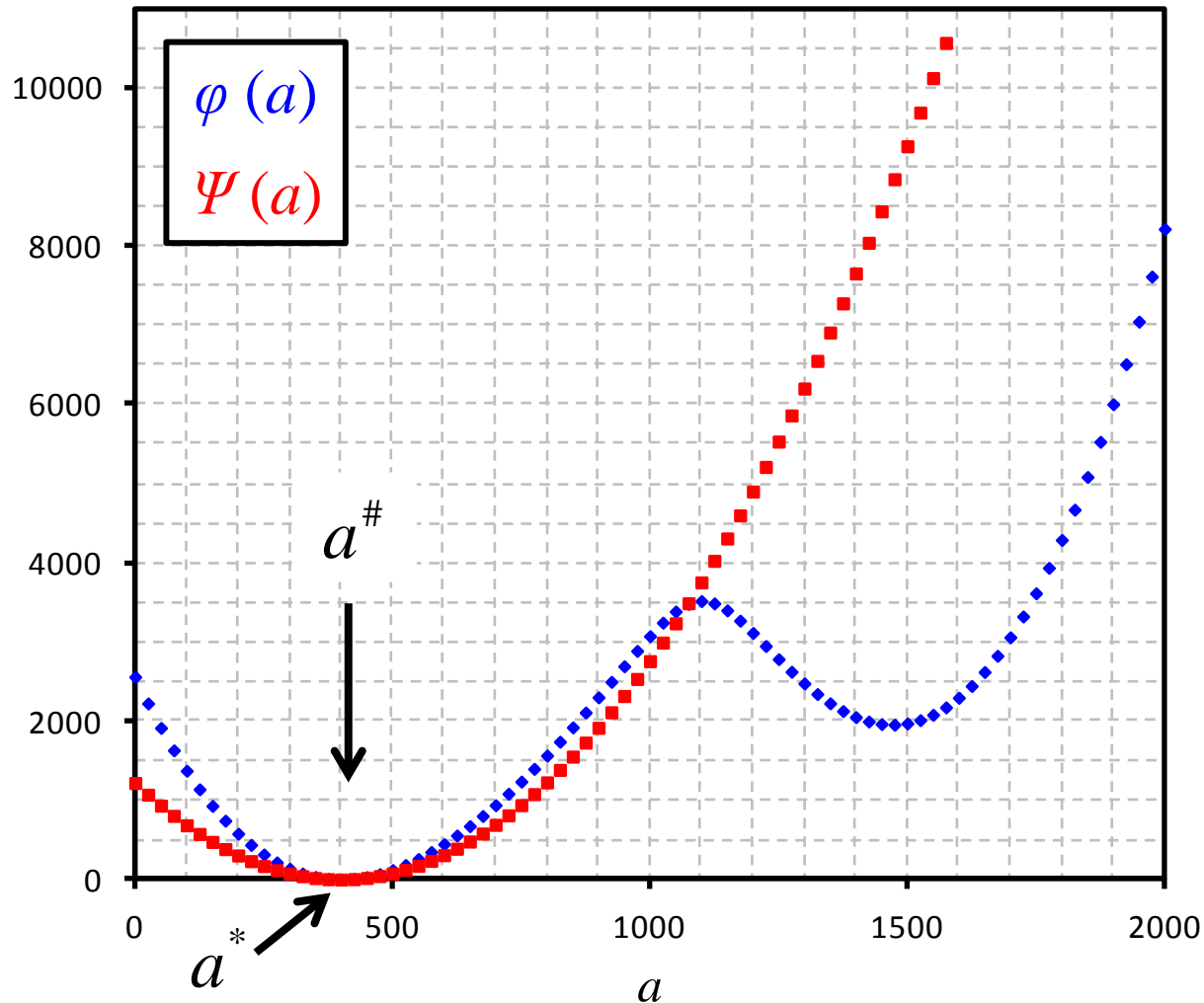
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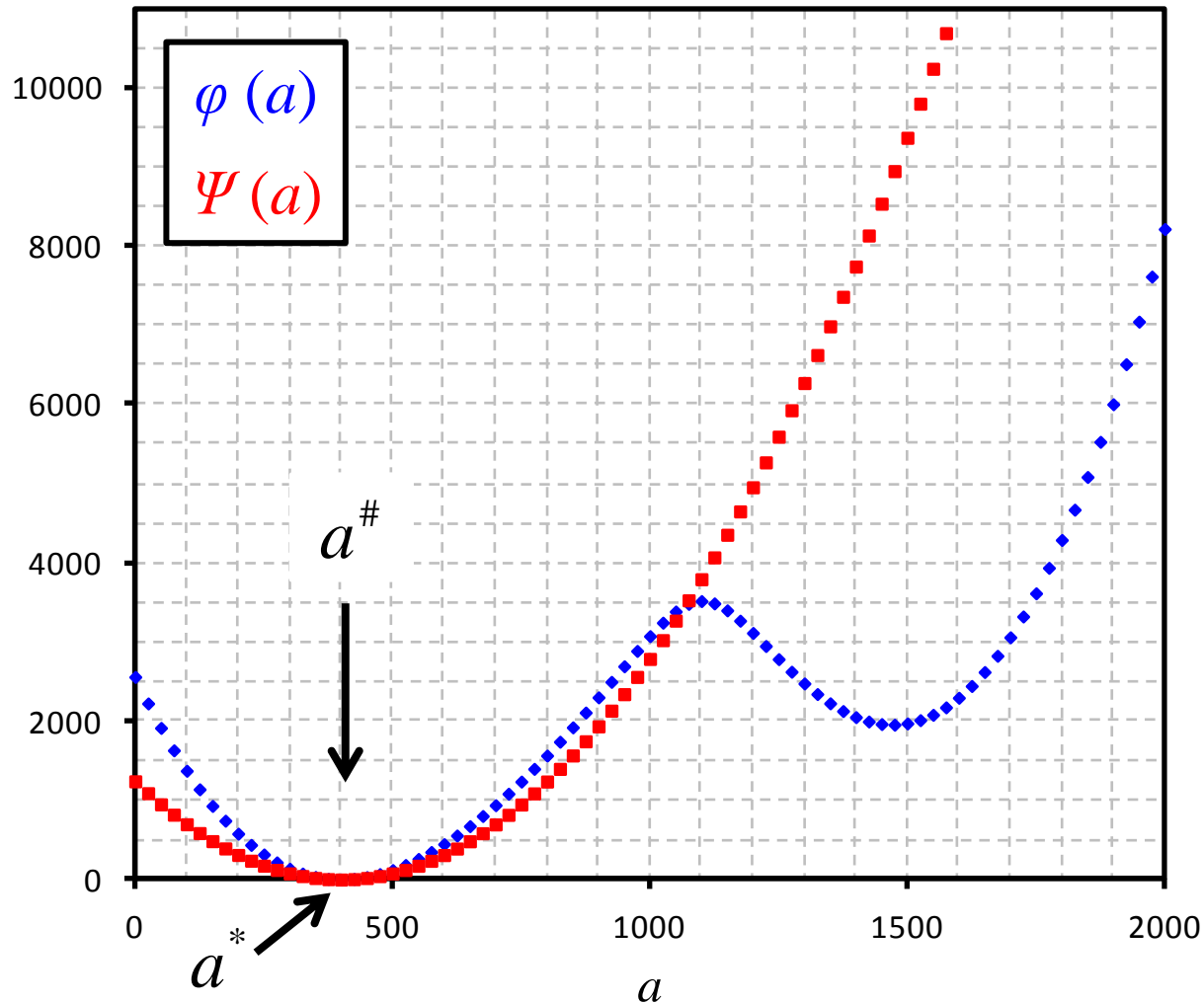
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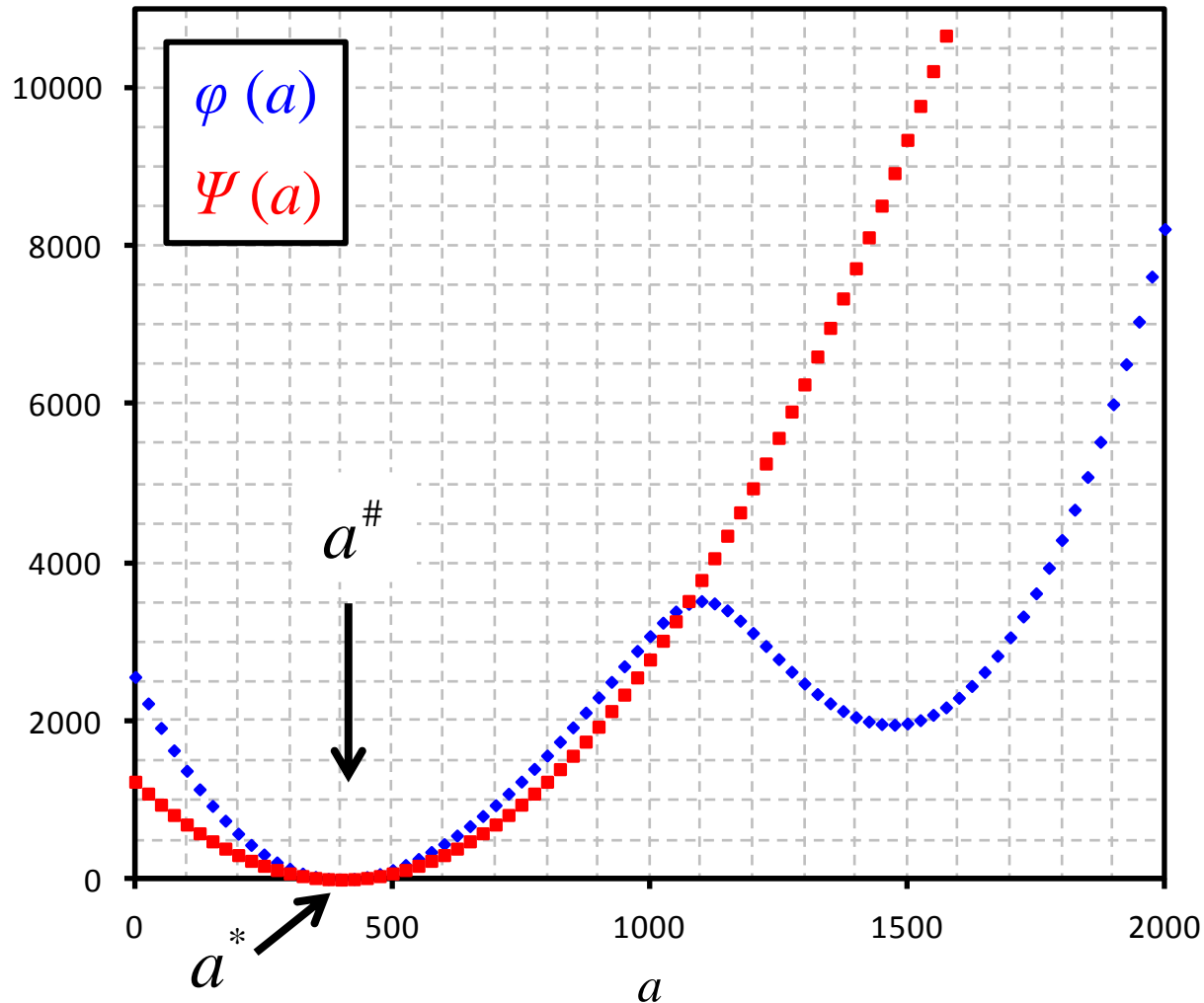
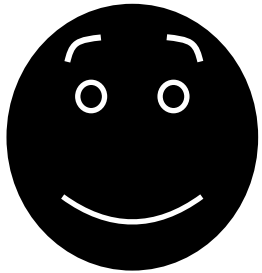
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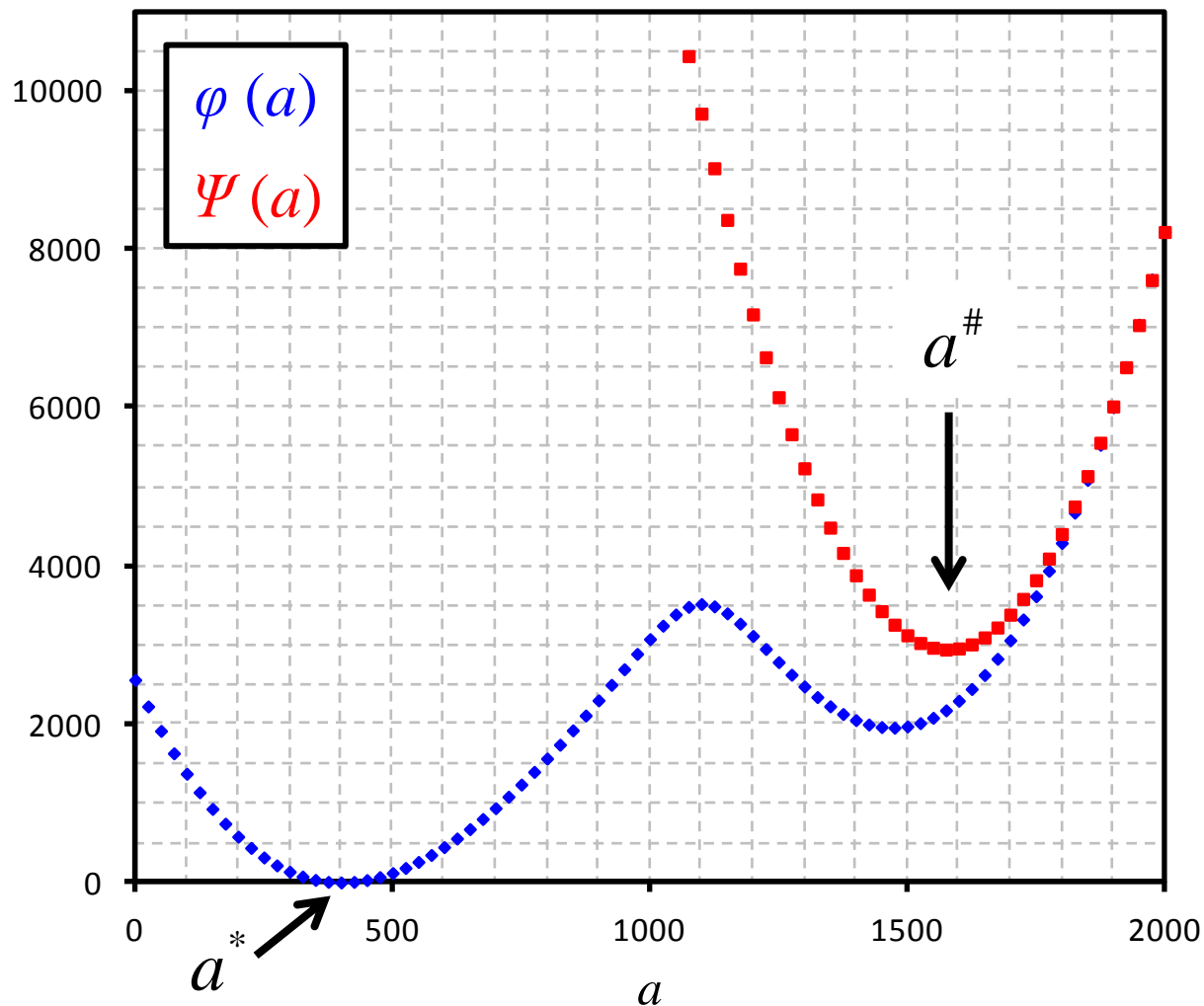
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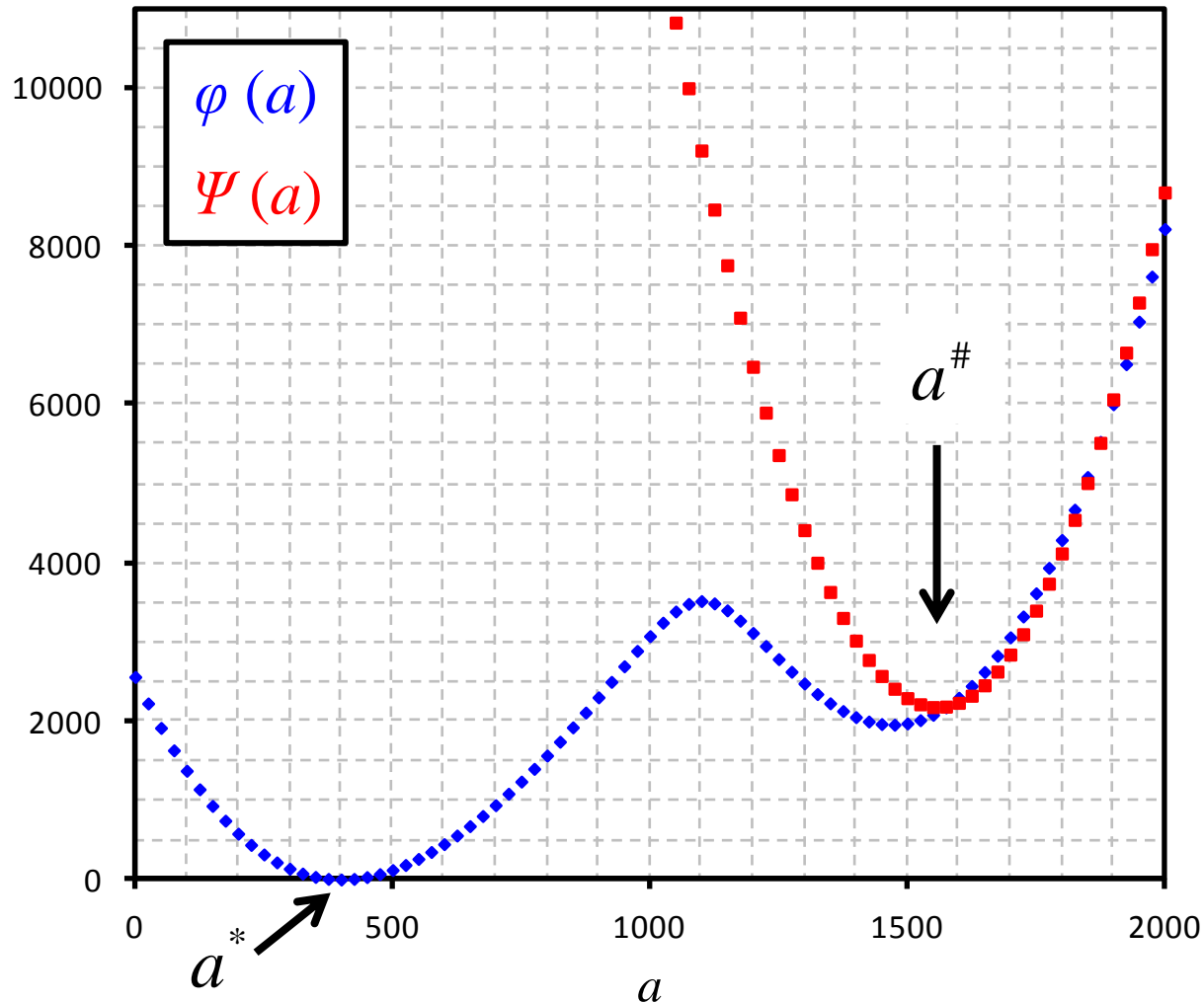
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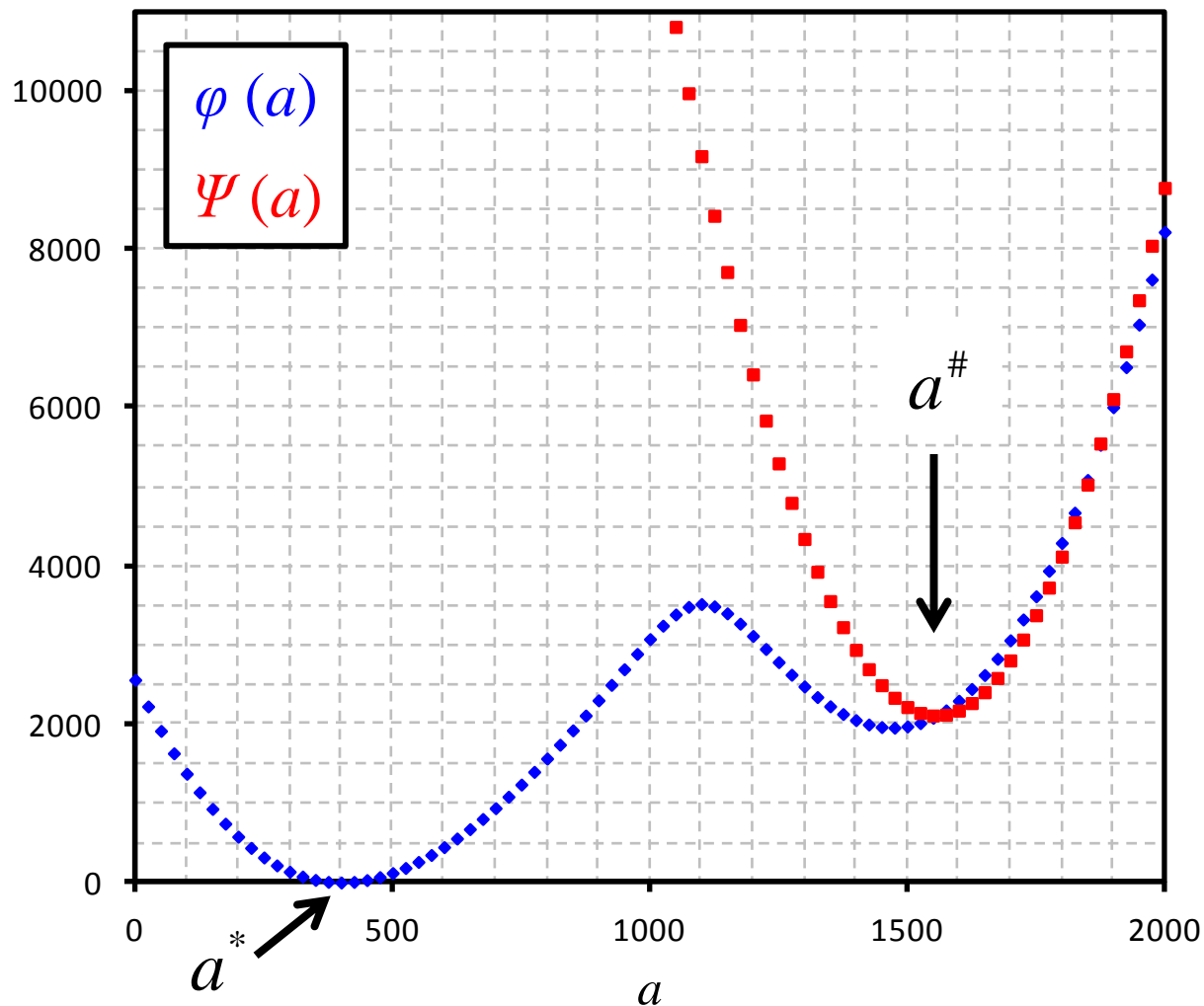
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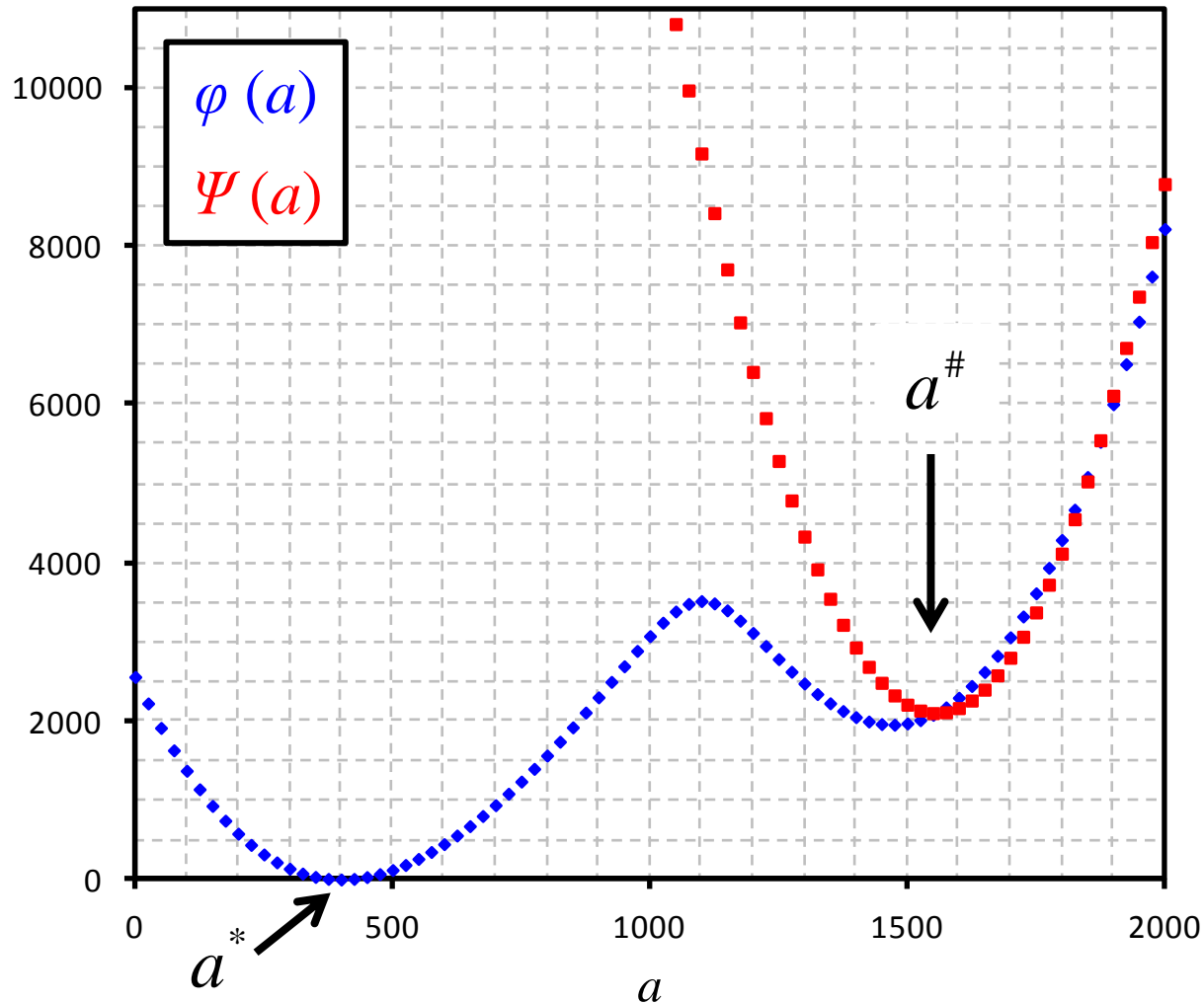
# Aspectos geométricos

(Problema não-linear 1D)



# Aspectos geométricos

## (Problema não-linear 1D)





# Exercícios

- Formular o Problema Inverso linear 1D
  - Equação de Mínimos Quadrados
- Formular o Problema Inverso não-linear 1D
  - Equação do método de Gauss-Newton