## Least Squares and Nonlinear Least Squares

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## Least squares

- Imagine you plan to solve the problem Ax=y
- but you have many datapoints so that the dimensions of A are mxn
- where m>n
- In python we might make an example matrix A like this, m = 3, n = 2
- $\triangleright$ A = np.array([[2,3],[1,5],[4,1]],float)
- and y has m values
- >y = np.array([1,2,3],float)
- this problem is over constrained

## Least squares solution

You can show that the solution to this problem can be properly written

$$Ax = b$$

$$A^{T}Ax = A^{T}b$$

$$x = (A^{T}A)^{-1}A^{T}b$$

## Non-linear least squares

- By analogy we can write the non linear least squares problem as
- beta is the parameter vector that describes f for any input x
- J, the Jacobian describes the gradient of the error in y with each  $\beta i$

Consider  $y=f(x,\beta)$ 

 $J\Delta\beta = \Delta y$ , which is overconstrained

$$J^T J \Delta \beta = J^T \Delta y$$

J is the Jacobian

 $\Delta \beta$  is an update to parameter vector  $\beta$ 

 $\Delta y$  is the error,  $\Delta y = y - f(x, \beta)$ , in this iteration