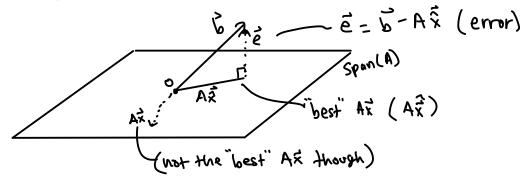
## Week Il (ribsheet Notes: 23

## LEAST SQUARES

Super useful in Stats, ML, and their applications when to use: 1) overdetermined systems

- more equations than unknowns
- real world: more samples than features
- 2) to deal with noise and errors

Given system  $A\vec{x} = \vec{b}$  where A and  $\vec{b}$  are known, approximate  $\vec{b}$  with  $\vec{b} = A\vec{x}$ :



Span(A): by defin, all the linear combinations of A's cols another interpretation: if we vary  $\vec{x}$ , all values of  $A\vec{x}$ 

the best  $A\vec{x}$  must be the <u>projection</u> of  $\vec{b}$  onto spon (A).

Formula:  $A^TA\vec{x} = A^T\vec{b}$  "normal equations"

$$\vec{x} = (\vec{A} \vec{A}) \vec{A} \vec{b}$$

Requirement: A has linearly independent columns