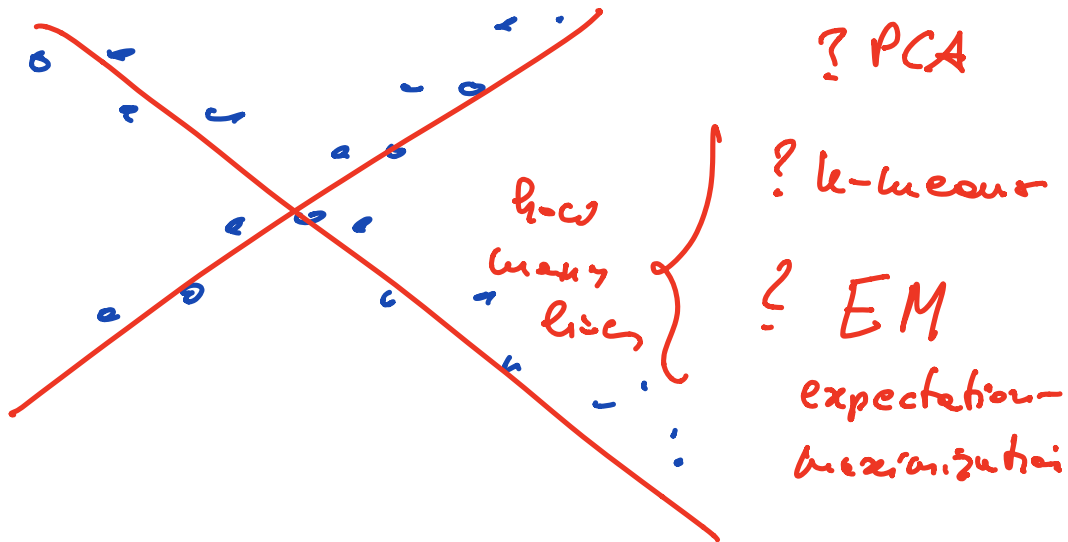


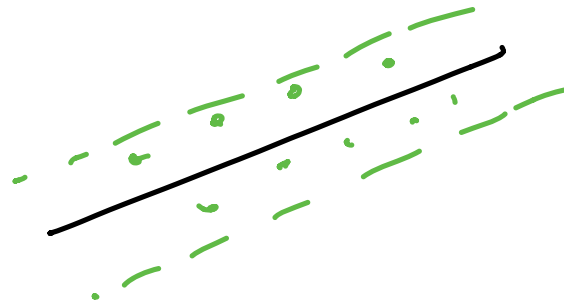
Abstraction : line fitting

① multiple line detection

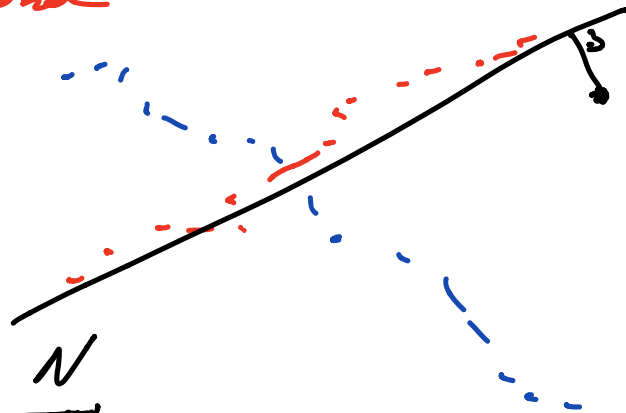


## Chicken and egg

If we know the line equation  
then we can decide which point  
corresponds to which line



To find the line equation we  
need to know which points  
correspond to the line



$$\frac{1}{N} \sum_{i=1}^N (x_i \cos \theta + y_i \sin \theta - d)^2 \Rightarrow \min_{\theta, d}$$

$$\frac{\partial}{\partial d} \sum ( \quad )^2$$

$$= \frac{1}{N} \sum (x_i \cos \theta + y_i \sin \theta - d) = 0$$

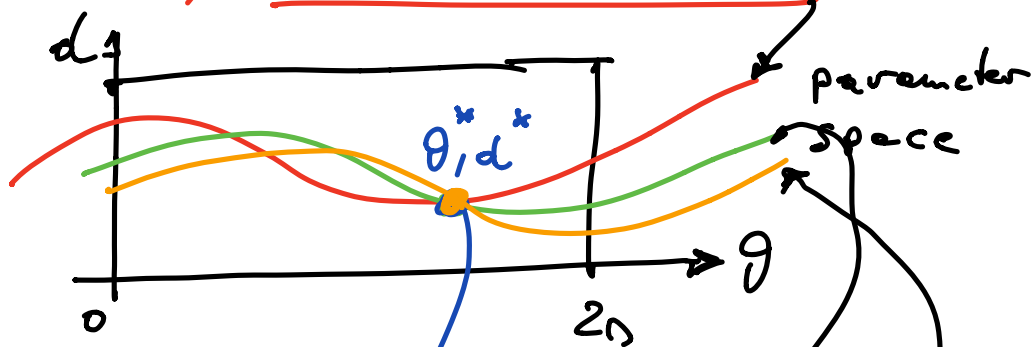
$$\frac{1}{N} \cos \theta \sum x_i + \sin \theta \frac{1}{N} \sum y_i = d$$

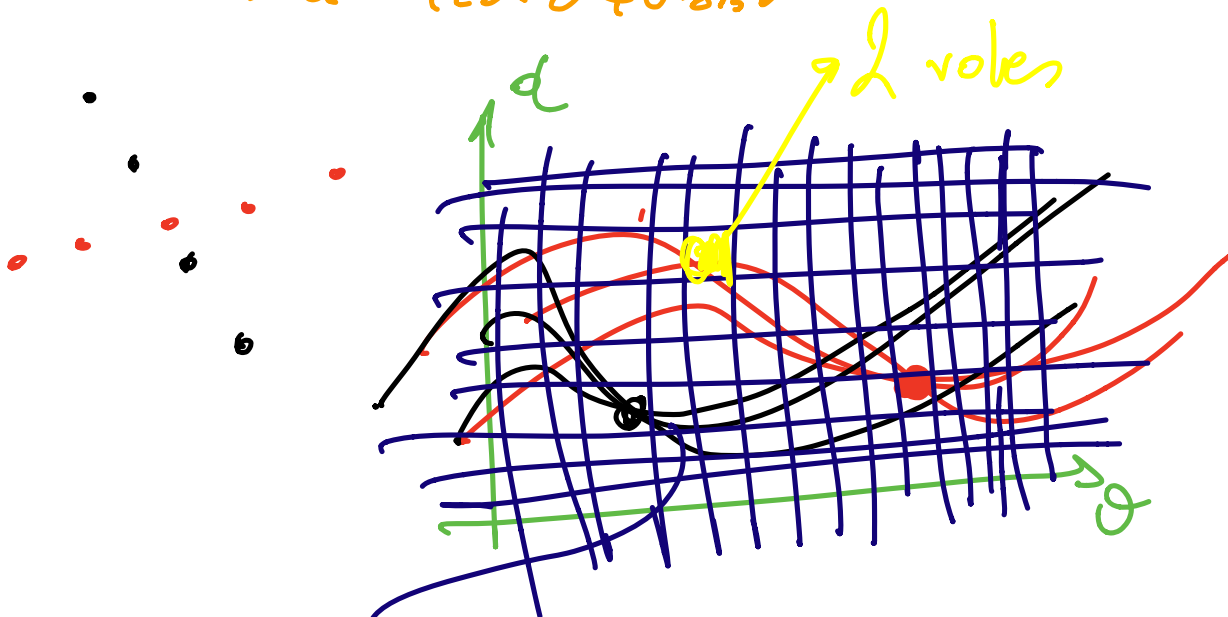
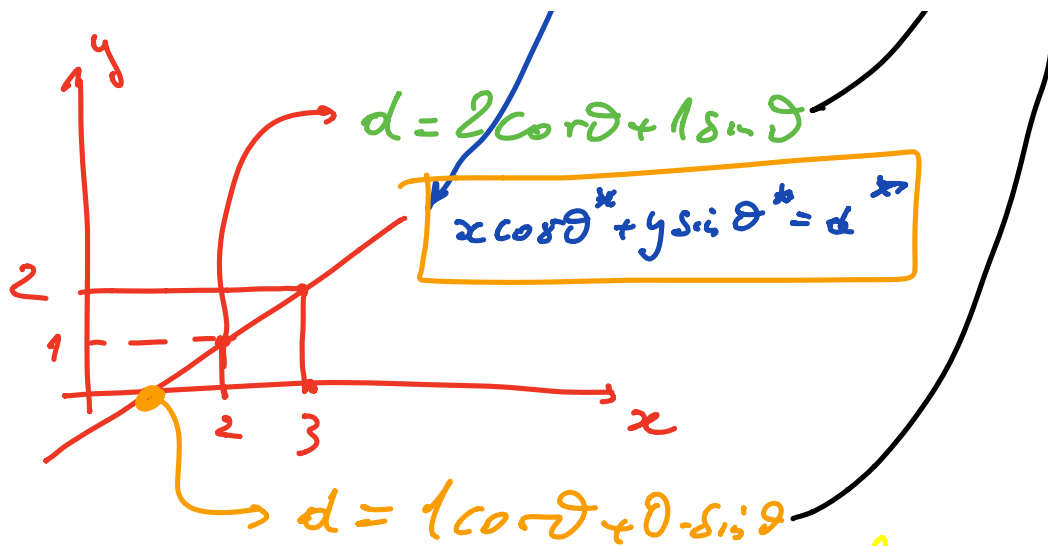
$$\cos \theta \bar{x} + \sin \theta \bar{y} = d$$

Alternative: Solve by voting  
in parameter space

$$d = x \cos \theta + y \sin \theta$$

$$(x, y) = (3, 2) \quad d = 3 \cos \theta + 2 \sin \theta$$





every cell  $(\theta, d)$   
 we count the votes (how many  
 curves go through this cell)

$$V(\theta, d) = \sum_{i=1}^N \mathbb{1}(|x_i \cos \theta + y_i \sin \theta - d| < \epsilon)$$

# Hough Transform

- circle detection (3 parameters)
- pure rotation estimation (3 parameters)  
 $\hookrightarrow \begin{pmatrix} x_2 \\ y_2 \end{pmatrix} \sim R \begin{pmatrix} x_1 \\ y_1 \end{pmatrix}$

#parameters > 3 : prohibitive

(ellipse detection,  
proj. transformation)

---

## RANSAC P3P

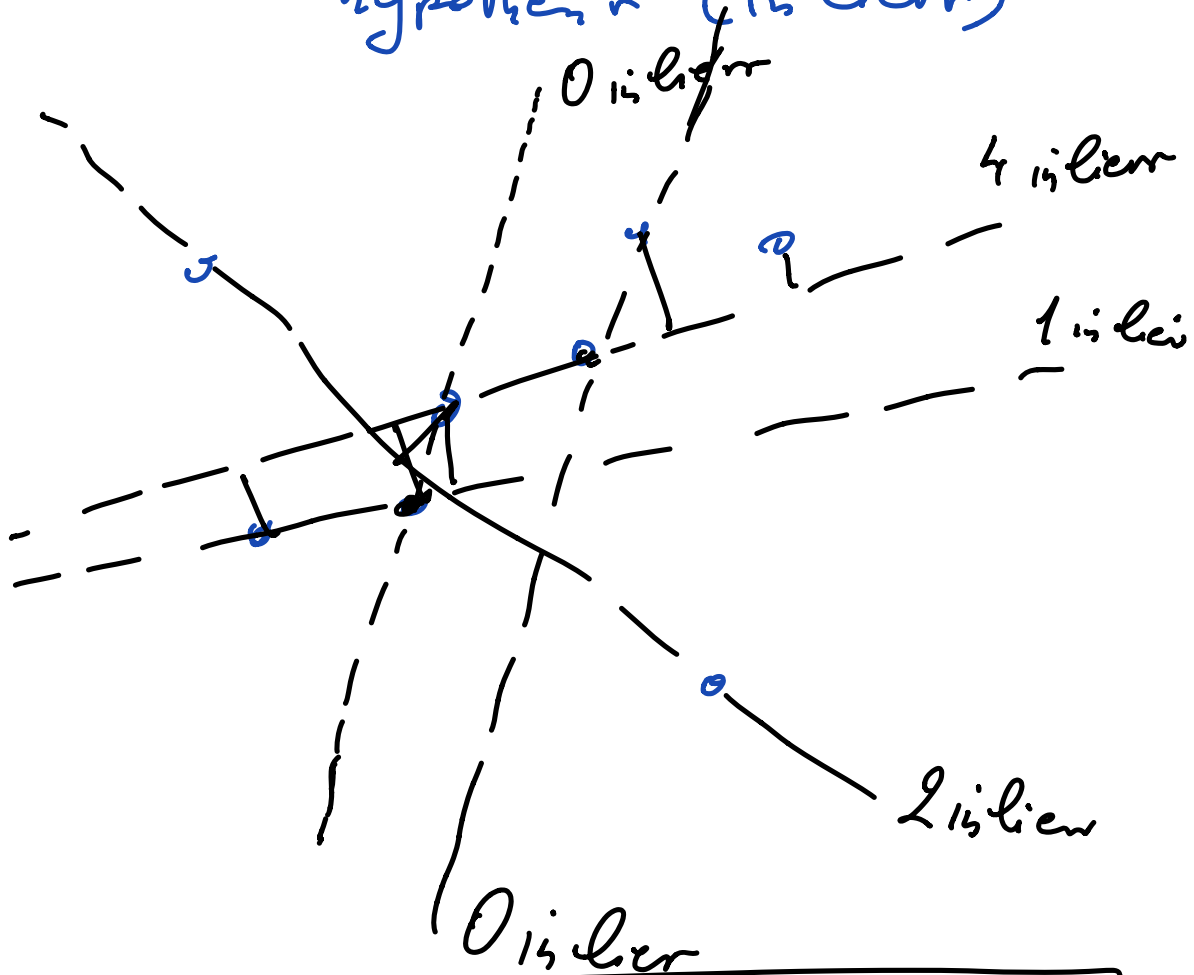
not about multiple models  
(lines)  
but one model (line, proj.  
transform)  
and many outliers.

Let's do it for the line fork

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Hypothesis: Two points define a line

Test: Which points satisfy the hypothesis (islier)

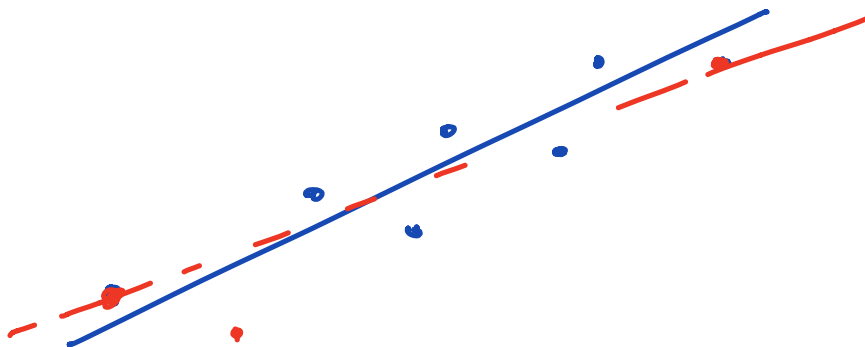


# threshold on islier

- choose all  $\binom{n}{2}$  pairs
- keep one with max. #  
inlier ( $>$  threshold)

the best line is none of them  
(does not pass through any  
pair) This is only an inlier

selection  $\Rightarrow$  find a  
line  $\arg \min_{\theta, d} \sum_{i=1}^N (x_i \cos \theta + y_i \sin \theta - d)^2$



Instead of exhaustive  $\binom{n}{2}$

1. choose a pair
2. count inliers ( $\text{dist} < \epsilon$ )
3. keep the maximum
4. if  $\text{max} > \# \text{inliers}$  STOP

OUTPUT: inlier points

---

- choose a pair for a line
- in general choose minimal set

minimal set for line : 2 points

- plane in 3D : 3 points

- circle : 3 points

- ellipse : 5 points

- line in 3D : 2 points

- wifi-based localization : 3





- proj. transformation : 4 Corresp.
- PnP : 3 correspondes
- Procrustes : 3 correspondes

this is the reason we discarded  
all minimal solutions.

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office hours Tue 6:30p →

in class review Wed

office hour noon Saturday