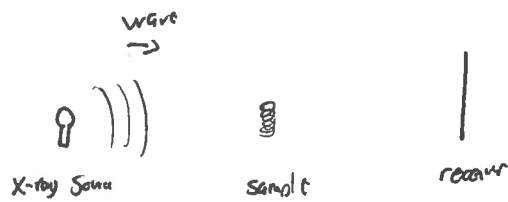


Phase Retrieval problem:

Let  $x_0 \in \mathbb{R}^n$  unknown. Let  $a_i \in \mathbb{R}^n$  known  $i=1 \dots m$

Given  $|\langle a_i, x_0 \rangle|$ , find  $x_0$ .

Application: X-ray crystallography



At receiver, measure <sup>squared modulus of</sup> diffraction pattern

Why the name?

Measurements  $|\langle a_i, x_0 \rangle|$  lose  $\pm$  sign (or in complex case, the phase  $e^{2\pi i \theta}$ ). If we had these phases, we would know  $\langle a_i, x_0 \rangle$  and could solve for  $x_0$  by linear algebra.

Questions:

How many measurements do we need?

Algorithm for recovery

Robustness to noise and gross errors?

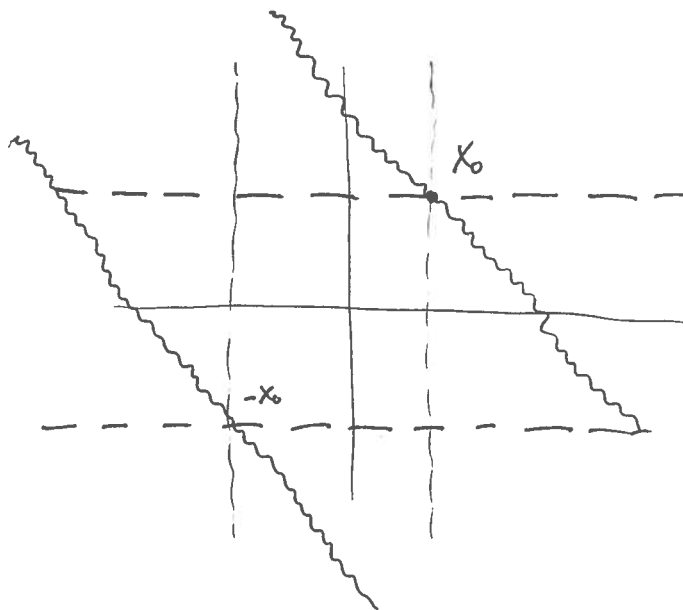
Degeneracies:  $x_0$  &  $-x_0$  give same measurements in  $\mathbb{R}$  case

$x_0$  &  $e^{i\theta} x_0$  — — — — —  $\mathbb{C}$  case

Can only recover  $x_0$  up to global phase

Activity:

Draw a picture of recovery task in  $\mathbb{R}^2$   
with 3 measurements

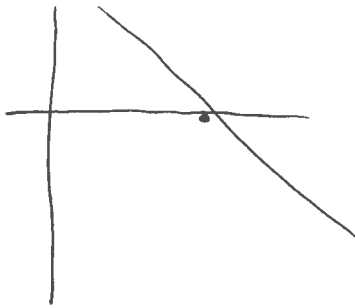


Find points where these pairs of lines intersect.

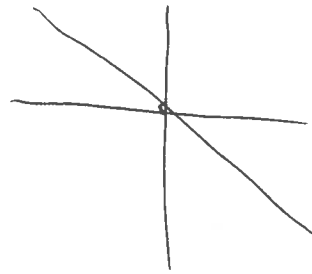
## Combinatorial Algorithm

$$\text{Let } b_i = |\langle a_i, x_0 \rangle|.$$

Loop over all signs  $\langle a_i, x_0 \rangle = \pm b_i$   
Search for consistency



Not consistent



Consistent

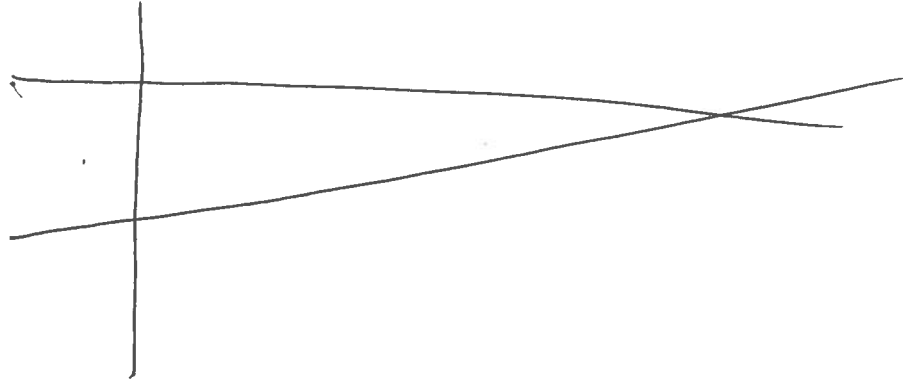
Problems:

Exponential work

in complex case would have to try continuum of cases

Activity:

Draw the point that minimizes sum of squares of distances to these lines



Each line is eqn  $a_i \cdot x = b_i$  for  $\|a_i\| = 1$

$$\begin{pmatrix} -a_1 \\ -a_2 \\ -a_3 \end{pmatrix} x = \begin{pmatrix} b_1 \\ b_2 \\ b_3 \end{pmatrix} .$$

What is  $\underset{x}{\operatorname{argmin}} \|Ax - b\|_2$

# Greedy Algorithm

- Initialize signs of  $\langle x_0, a_i \rangle$
- Solve  $\langle x, a_i \rangle = \pm b_i$
- Update signs by which branch is closer

