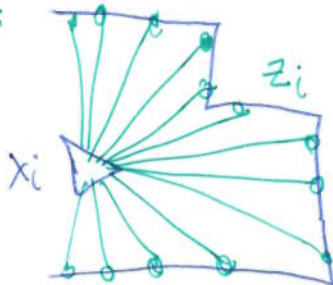


## \* Point Cloud Registration

PC here can be 3D or 2D, set of points

Ex:



$$Z_i = \{p_1, p_2, \dots, p_k\}$$

points from sensor (range-finder)  
observed at pose  $x_i$ .

Problem: find the transformation from a pair of poses  $x_i, x_j$ , such that (homogeneous coord)

$$\boxed{{}^jT_i z_i = z_j} \quad \text{for all points in } Z.$$

Called registration, alignment, scanmatching. (2D)

Now, this definition considers 2 unrealistic things:

1- point to point correspondence is correct.

2- we sample the same points from  $x_i$  and  $x_j$

## \* SVD methods (Aron'87)

If we have enough points, we can assume true the previous considerations

then, we define a cost function to minimize.

$$J(z_i, z_j) = \sum_k \|z_j^k - {}^jT_i z_i^k\|^2$$

the solution is found by decoupling Translation and Rotation:

$${}^i t_i + E \{ z_i \} = E \{ z_j \} \quad (\text{same centroids translated.})$$

and then apply an SVD solution. of a cost term

$$\sum z_i, z_j.$$

Only 2 points in 2D  
3 points in 3D.

Drawbacks:

sensitive to outliers

requires known correspondences

### \* RAUSAC (Fischler '81)

↳ Random sample consensus (General alg. for param. estimation)

We reject/eliminate outliers by sampling a subset of observation correspondences  $z_j^i, z_i^i$  minimal for solving:

- SVD-registration  $(z_j^i, z_i^i) = {}^i T_i^j$  solve the registration

-  $J(z_i, z_j, {}^i T_i^j)$  test the hypothesis.

Create a consensus set

## \* Iterative closest point (ICP)

given two point clouds,  $z_i, z_j$  with no a priori correspondences.

1) find closest points

$$d(p_i, z_j) = \min_{p_{z_j} \in z_j} \|p_{z_j} - p_i\| \quad , \quad p_i \in z_i$$

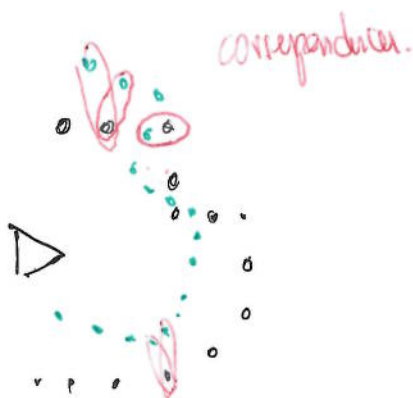
$$(p_i \in T_i z_i)$$

Brute force search of a single point vs all the other points. (Kd-tree)

2) Align the pointcloud  $z_j$  and  $\{p_i\}$  with correspondences.

3) Do while convergence.

Ex:



Of course there will be outliers but iteratively we get rid of them.

SVD techniques are not the most convenient.  $\Rightarrow$

Gradient based techniques work best.

$$T_i = T_i^0 \oplus \alpha \nabla_T J(z_i, z_j)$$

(next Prob Rob Ch 9)