# COT 4521: INTRODUCTION TO COMPUTATIONAL GEOMETRY



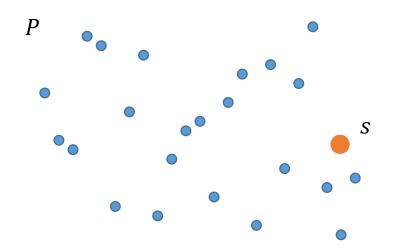
#### **Searches**

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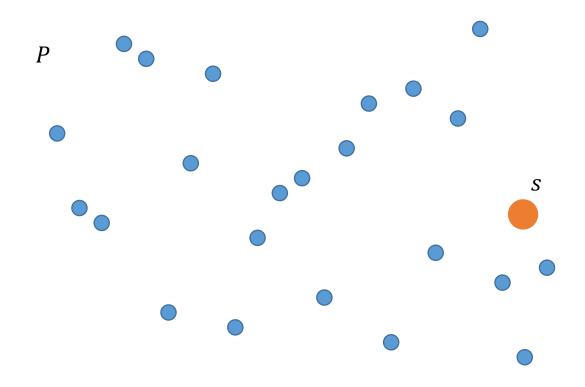
#### POINT SEARCHES

- PROBLEM DEFINITION: GIVEN A SET OF POINTS P IN  $\mathbb{R}^d$  PROVIDE A DATA STRUCTURE THAT GIVEN AN INPUT SEARCH LOCATION s returns the k nearest points
  - For simplicity we will primarily consider d=2 and k=1



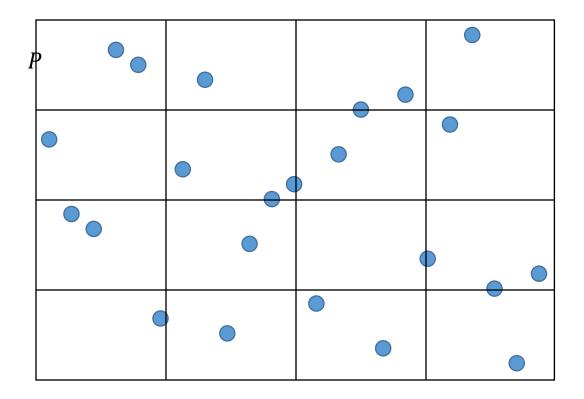


## POINT SEARCHES: IDEAS?





# <u>Grids</u>





#### GRID ALGORITHMS

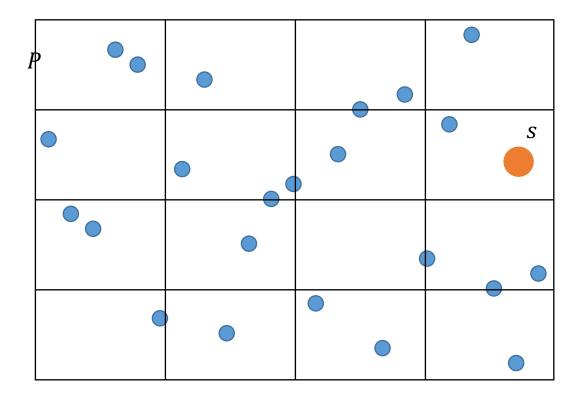
- CONSTRUCTION
  - Find extrema
  - Divide space by predetermined number of size of interval
  - Place points into grid cells



#### GRID ALGORITHMS

#### SEARCH

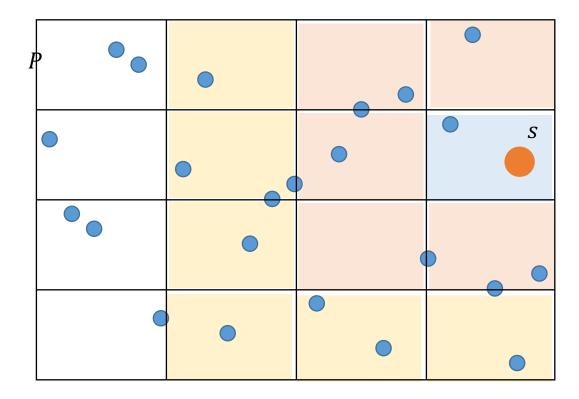
- Given a search location
- Identify closest grid cell
- Find closest point inside of cell with distance d
- Perform the same search
  with neighboring cells in all
  directions until cell distance
  is > d





#### **GRID ALGORITHMS**

- SEARCHING FOR THE CLOSEST POINT CP
- SEARCH RING WHILE d(Ring) < d(CP)
- SEARCH CELL IF d(Cell) < d(CP)
- FOR EVERY POINT  $p_i$  IN THE CELL
  - If  $d(p_i) < d(CP)$ ,  $CP = p_i$





#### FINDING DISTANCE

POINT-POINT DISTANCE?

POINT-CELL DISTANCE?

POINT-RING DISTANCE?



## **GRIDS**

- Construction
  - O(n)
- SEARCH
  - Best Case: O(1)
  - Worst Case: O(n)
  - Average case: 2D  $O\left(\frac{n}{r^2}\right) = O(1)$ , generally  $O\left(\frac{n}{r^d}\right) = O(1)$
- SPACE
  - In 2D  $O(r^2 + n)$ , generally  $O(r^d + n)$

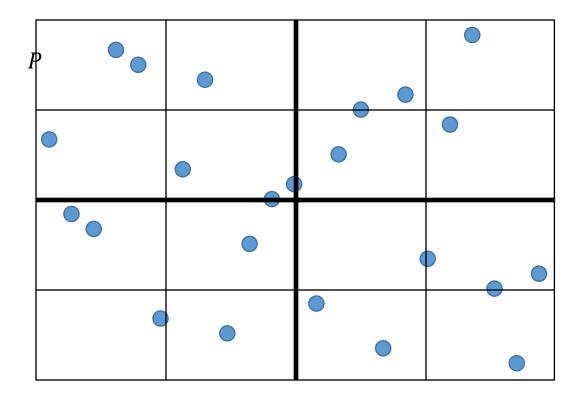


#### **GRIDS**

• EXAMPLES OF FAILURE CASES?



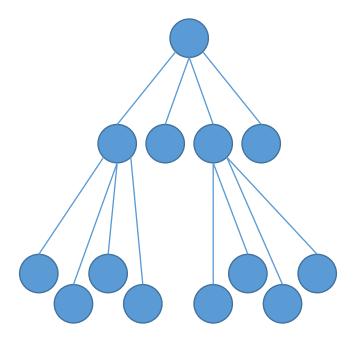
# **QUADTREES**





## **QUADTREE ALGORITHMS**

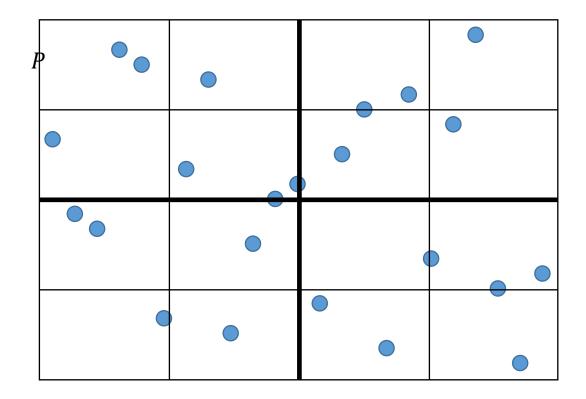
- CONSTRUCTION
  - Find extrema
  - Divide space in half both horizontally and vertically
    - Ideas?
  - Place points into appropriate quadrant
  - Recurse until termination condition
    - Ideas?





#### **QUADTREE**

- SEARCH
  - Given a search location
  - Recursively identify closest leaf
  - Find closest point inside of leaf with distance d
  - Perform the same search with neighboring leaves





#### QUADTREE

- Construction
  - $O(n \log n)$
- SEARCH
  - Average case:  $O(\log n + k)$ 
    - where k is the size of the leaf nodes
  - Worst Case: O(n)
- SPACE: IN  $O(n \log n)$ 
  - \*Octree—3D version of quadtree

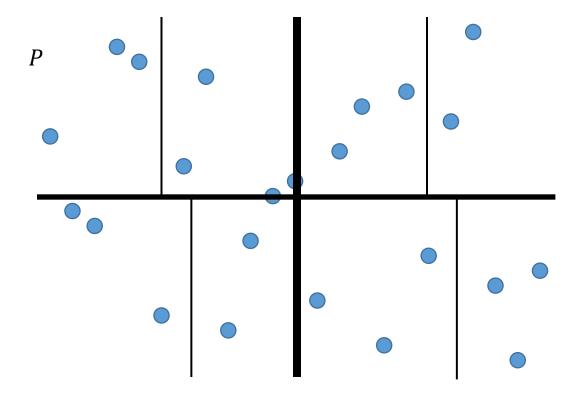


#### **QUADTREES**

• EXAMPLES OF FAILURE CASES?



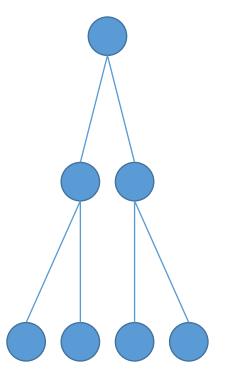
# **KD-Tree**





#### **KD-Tree Algorithms**

- CONSTRUCTION
  - Find extrema
  - Divide space in half
    - Ideas?
  - Place points into appropriate half
  - Recurse until termination condition
    - Ideas?

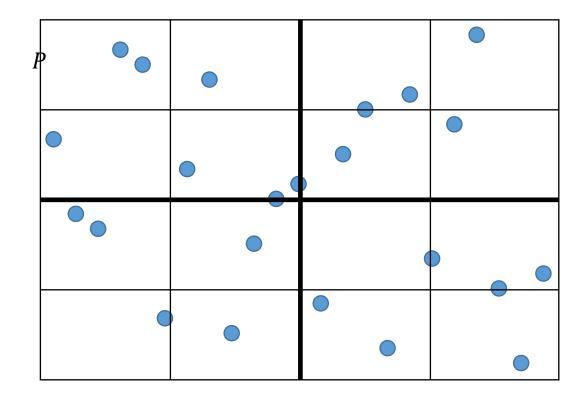




#### KD-Tree Algorithms

#### SEARCH

- Given a search location
- Recursively identify closest leaf
- Find closest point inside of leaf with distance d
- Perform the same search with neighboring leaves





#### KD-Tree

- Construction:
  - $O(n \log n)$
- SEARCH
  - Average case:  $O(\log n + k)$ , where k is the size of the leaf nodes
  - Worst Case:  $O(\log n + k)$
- SPACE:
  - $O(n \log n)$

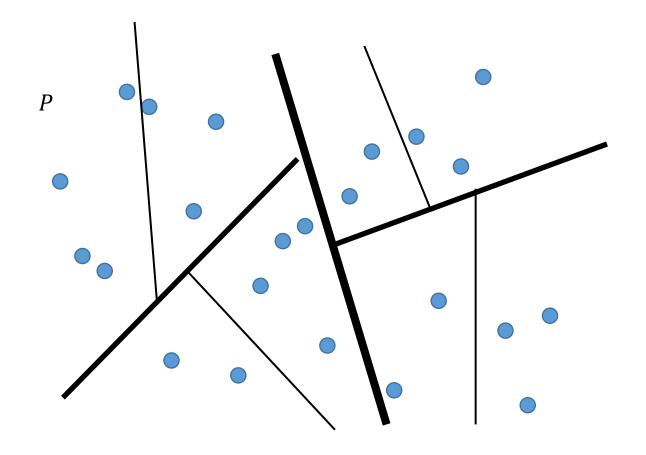


#### KD-Tree

• EXAMPLES OF FAILURE CASES?



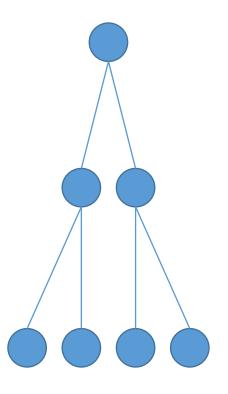
# BINARY SPACE PARTITION (BSP)





#### **BSP ALGORITHMS**

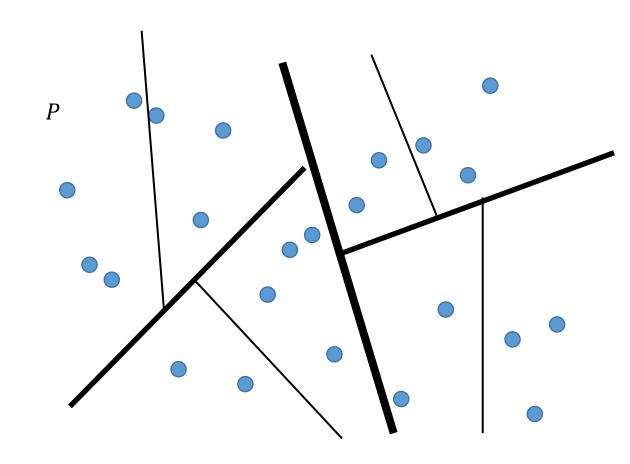
- CONSTRUCTION
  - Find extrema
  - Divide space in half
    - Ideas?
  - Place points into appropriate half space
  - Recurse until termination condition
    - Ideas?





#### **BSP ALGORITHMS**

- SEARCH
  - Given a search location
  - Recursively identify closest leaf
  - Find closest point inside of leaf with distance d
  - Perform the same search with neighboring leaves





#### BINARY SPACE PARTITION

- Construction
  - $O(n \log n)$
- SEARCH
  - Average case:  $O(\log n + k)$ 
    - where k is the size of the leaf nodes
  - Worst Case:  $O(\log n + k)$
- SPACE:
  - $O(n \log n)$



#### BINARY SPACE PARTITION

• EXAMPLES OF FAILURE CASES?



## **TASKS**

- CLOSEST POINT SEARCH
  - Task covered thus far
- K-NEAREST NEIGHBORS SEARCH (NEXT)

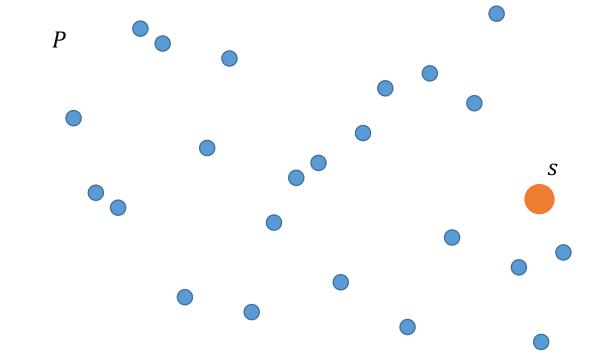
RANGE SEARCH

• Clustering (we'll talk about this next lecture)



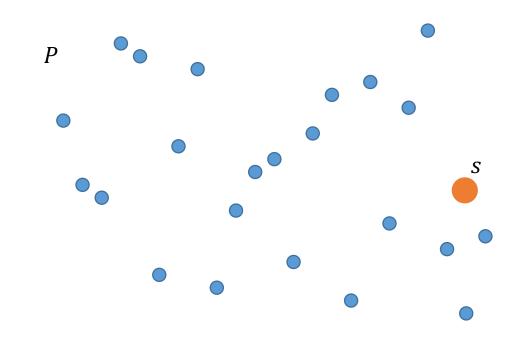
PROBLEM: GIVEN A SET
 OF POINTS P, FIND THE
 K-NEAREST NEIGHBORS
 EFFICIENTLY

• IDEAS?



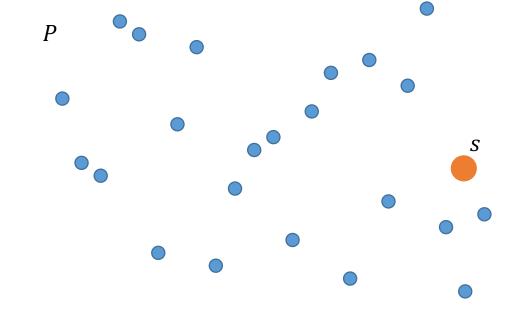


- Use spatial partitioning of Your choice
- KEEP A LIST OF K LENGTH FOR THE CLOSEST POINTS
- SEARCH PERFORMED SIMILARLY TO CLOSEST POINT SEARCH, EXCEPT THAT OUR STOPPING CONDITION IS ON THE FURTHEST POINT IN THE LIST
- How do we store the k points most efficiently?





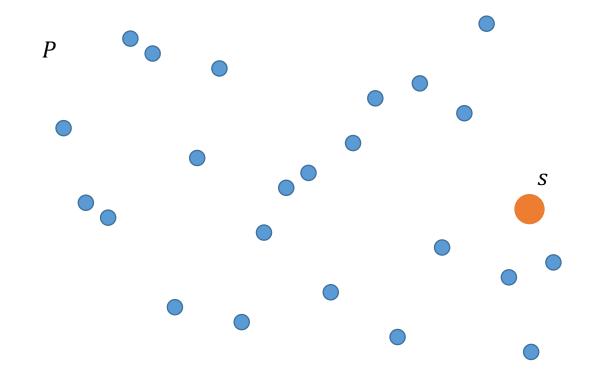
- MAKE THE LIST EFFICIENT BY KEEPING IT SORTED
  - use a balanced binary tree—
     O(log k) insertion costs
  - Or insertion sort—O(k) insertion cost





PROBLEM: GIVEN A SET
 OF POINTS P, FIND THE
 POINTS WITHIN
 INTERVALS IN BOTH
 DIRECTIONS EFFICIENTLY

• IDEAS?

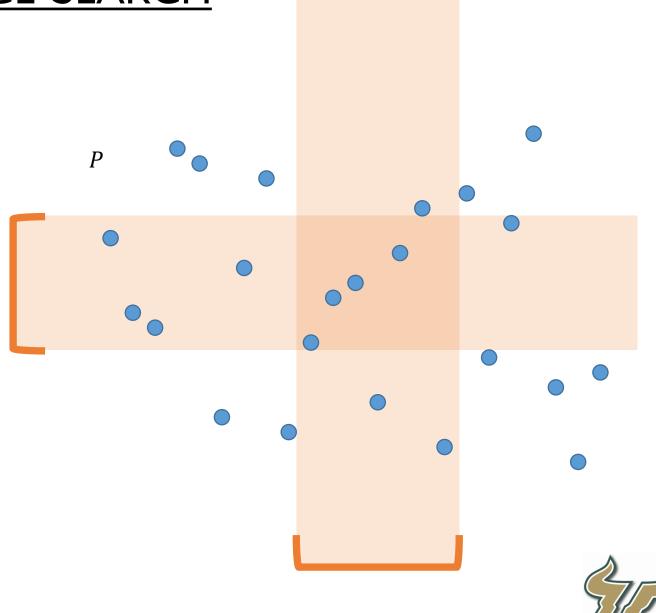


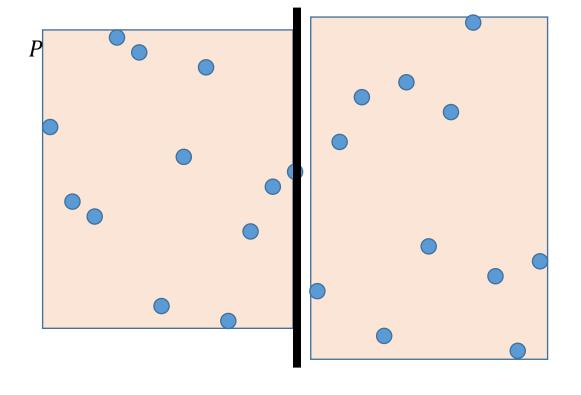


## **RANGE SEARCH**

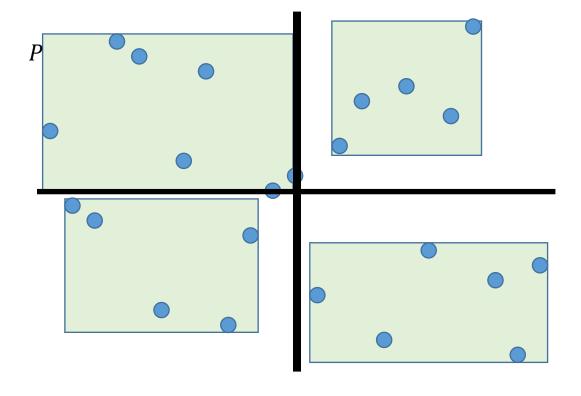
PROBLEM: GIVEN A SET
 OF POINTS P,
 EFFICIENTLY FIND THE
 SET OF POINTS WITHIN
 A SPECIFIED RANGE

• IDEAS?

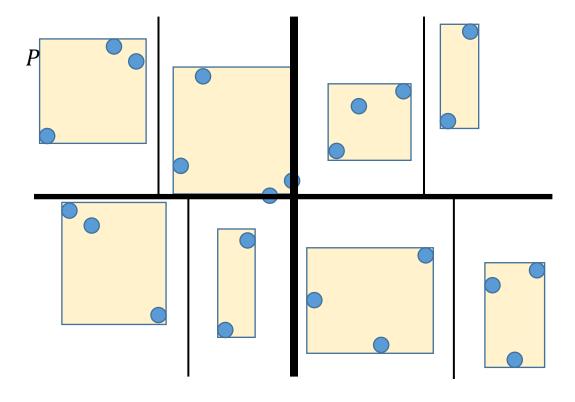




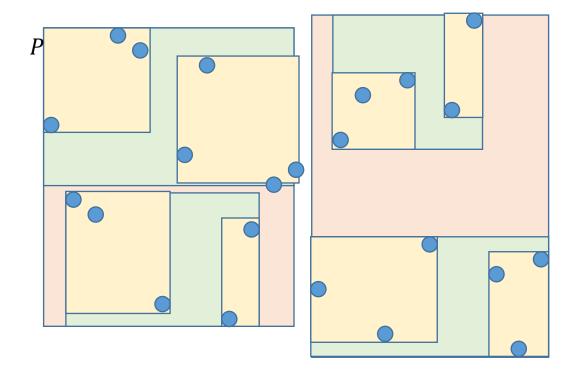














• BUILDING DATA STRUCTURE:  $O(n \log n)$ 

- SEARCH
  - Average case:  $O(\log n + k)$ 
    - where k is the size of the leaf nodes
  - Worst Case:  $O(\log n + k)$
- SPACE: IN  $O(n \operatorname{LOG} n)$



