**CS142: Algorithm Engineering** 

# Geometry processing

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#### What is geometry processing?

- Graph studies the relationship of objects
- Geometry studies the locations of the objects themselves



#### Lots of real-world applications



#### Every area requires geometry processing





#### Data mining / Data science





#### Machine learning / Artificial intelligence



#### Geometric Information Systems (GIS)



## Computational biology



#### **Computer graphics**



### **Computational Geometry**

- Started in mid 70's
- Focused on abstracting the geometric problems, and design and analysis of algorithms for these problems
- Most problems well-solved in the sequential setting, but many problems in other settings remain open
- UCR CS 133 Computational Geometry
- MIT 6.838 Geometric Computation

#### Good references for sequential geometric algorithms



"Four Dutchmen"

"The elephant book"

Har-Peled's book

# Why "computation" geometry?

#### Ways to represent a line

• What you did in high school:

$$y = kx + b$$

## Floating-point error

- float a = 0.65f;
- float b = 0.6f;
- float c = a b;
- What is c?
- 0.0499999523!
- Need to avoid division because we cannot divide a number by 0, but it is hard to check if a floating-point number is 0

### Ways to represent a line

• What we use in computation geometry:

Pick two points:  $(x_1, y_1), (x_2, y_2)$ 

- To represent a segment
- Use two endpoints:

$$(x_1, y_1), (x_2, y_2)$$

#### Inner (dot, scalar) product

- $(x_1, y_1) \cdot (x_2, y_2) = (x_1x_2 + y_1y_2)$
- $(x_1, y_1) \cdot (x_2, y_2) = ||(x_1, y_1)|| ||(x_2, y_2)|| \cdot \cos \theta$
- Digit sign indicates "front" or "back"

 $(x_2, y_2)$  $(x_1, y_1)$ 



#### Outer (cross, vector) product

- $(x_1, y_1) \cdot (x_2, y_2) = (x_1y_2 y_1x_2)$
- $(x_1, y_1) \cdot (x_2, y_2) = ||(x_1, y_1)|| ||(x_2, y_2)|| \cdot \sin \theta$
- Digit sign indicates "right" or "left"



#### An example: checking if two segments intersect

• And  

$$(\overrightarrow{AB} \times \overrightarrow{AD}) \cdot (\overrightarrow{AB} \times \overrightarrow{AC}) < 0$$

$$D = (x_4, y_4)$$

$$(\overrightarrow{CD} \times \overrightarrow{CA}) \cdot (\overrightarrow{CD} \times \overrightarrow{CB}) < 0$$

 $A = (x_1, y_1)$   $C = (x_3, y_3)$ 

#### An example: finding the intersection of two segments

$$\frac{\left(\overrightarrow{AB}\times\overrightarrow{AD}\right)\cdot C - \left(\overrightarrow{AB}\times\overrightarrow{AC}\right)\cdot D}{\overrightarrow{AB}\times\overrightarrow{AD}-\overrightarrow{AB}\times\overrightarrow{AC}}$$

$$D = (x_{4}, y_{4})$$

$$B = (x_{2}, y_{2})$$

$$A = (x_{1}, y_{1})$$

$$C = (x_{3}, y_{3})$$

Another useful component: polar angle

#### • theta=atan2(y1,x1)



# Convex Hull, Triangulation, and others

#### Convex hull

- A set is **convex** if every line segment connecting two points in the set is fully contained in the set
- Example applications: nearest/farthest point to a line, point



#### How to construct a convex hull

- Dozens of algorithms sequentially, a few parallel ones for 2D
- Randomized incremental construction
- Only requires  $O(\log n)$  rounds if adding all possible points [BGSS SPAA 2020]



#### What's triangulation for?



### What's a good triangulation?



- No points are in the circumcircle of each triangle
- Getting practical parallel algorithms for DT is notoriously hard



• Again, consider the incremental construction



• Again, consider the incremental construction



- Again, consider the incremental construction
- 2D parallel version is given in [BGSS SPAA 2016 / JACM 2020]
- Higher-D version is in [BGSS SPAA 2020], since k-D DT can be subsumed by (k + 1)-D convex hull



#### **Point location**

- In a 2D plane, decide which polygon a query point belongs to
- Example solution: trapezoidal decomposition (open)



**Range Searches** 

#### Example range searches

- Nearest neighbor search
- *k*-nearest neighbor (*k*NN) search
- Near neighbor counting
- Rectangular range search
- Rectangle queries
- Three-sided queries
- Segment (stabbing) queries

- Ray-scene intersection queries
- Collision detection
- etc.

# Building blocks in other algorithms / systems

## Classic (sequential) data structures

- Quad/octree
- k-d tree
- Interval tree
- Segment tree
- Range tree
- Priority tree
- Other augmented trees
  - R-tree, bounding volume hierarchy (BVH)

#### Why trees?





# Each interior tree node acts as a fast-pass check for the subtree nodes

• No need to traverse the subtree if the traversal can be pruned



# Each interior tree node acts as a fast-pass check for the subtree nodes

 No need to traverse the subtree if the query misses the bounding box



#### Example range searches

- Nearest neighbor search
- k-nearest neighbor (kNN) search
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- etc.

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# "Modern" Geometry Problems

#### Problems that are less "classic" (from MIT 6.838)

- Clustering
- Range searches in "high" (>5) dimensions
- Low-distortion embeddings

- Geometric algorithms for modern architecture
- Geometric algorithms for streaming data

## **Course announcement**

Mon 2/15	Presidents Day Training 4 out	
Wed 2/17	Geometric algorithms	
Mon 2/22	Graph algorithms	Project proposal due
Wed 2/24	Road ahead	
Mon 3/1	Training problems analysis (by students)	
Wed 3/3	Training problems analysis (by students)	
Mon 3/8	Project presentation 1	
Wed 3/10	Project presentation 2	

#### Score distribution for 142

- Four problem-solving assignments (20%)
- Three performance-engineering assignments (30%)
- Final project (20%)
- Quiz (5%)
- Final exam (25%)
- Class participation (10%, bonus)

## Tentative score-to-grade mapping

- A+: very top performance in the class
- A: 85%
- A-: 80%
- B+: 75%
- B: 70%
- C: 65%
- D: 60%

### Performance so far

- More than 50% of you are doing very well
- Many of you are heading toward an A+
- However, a few of you have not done much
- You need to submit reports
  - This is the **fifth** time I mentioned it in the class?
  - If you missed some before, you can send it to me via email (with 20% penalty)
  - The rule is the rule
- This is an elective course
  - For any reason you don't like it, you can drop it
  - If you fail, it's unlikely that you can make up (not sure about your next offering)





- Implement an algorithm that you like
  - Can be sequential or parallel
  - You should optimize the performance
  - You will write a report and give a short class presentation

#### Examples

#### • Parallel algorithms:

• Parallel mergesort, parallel BFS, parallel hashtable, parallel median-finding, parallel LCS, and other challenging problems

#### Sequential algorithms:

- BSTs (AVL tree, red-black tree, treap), Prim and Dijkstra with efficient priority queue, I/O-efficient dynamic programming, convex hull, nearest point, Rabin-Karp / KMP, other non-trivial graph algorithms
- Don't make it too hard or too easy

#### Rules

#### • Up to two in a group, but less recommended

- Unless you have a clear plan on how to distribute the work evenly
- Before next Wednesday (2/24), submit a brief proposal about:
  - What you want to do, what algorithm you want to implement, how you are going to evaluate it
  - I will review it and give you optional feedback (like too easy or too hard for you)
- You will give an 8-min class presentation on March 8 and 10 (25%)
  - Others can attend optionally
- Final report due March 12 (75%)

# Training problems analysis

Mon 2/15	Presidents Day	Training 4 out
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### What is that?

- There are in total 11 problems (A in Training 1, A and C in Training 3 are not included)
- One of you will give a 10-minute presentation about one problem
  - What the problem is
  - What your solution is and why it is correct
  - How to program and what optimization you use
  - If there are other interesting solutions
  - (You need to have solved that problem already)

#### • You will get 3-5 bonus candies

- 3 candies by default
- Up to 2 bonus candies for good presentations (talk quality and problem difficulty)

#### The process

- Reservation link
- Then, I will run a bipartitegraph matching and assign you to a problem
- Q&As are welcome, and I will also be part of that

Training 1			
B Maximum Identity Matrix			
C Go Straig	ht		
Training 2			
А	Ski	Yan	Yihan
В	Counting Candies	Yihan	
С	Sort the train		
Training 3			
В	Symmetry Makes Perfect		
D	More Office Hours		
Training 4			
A	Selling candies	Yan	Xiaojun
В	Easy sorting	Yan	
С	Share candies		
D	Swans	Xiaojun	