



# **Algorithm Theory**

# 01 - Introduction

Dr. Alexander Souza

Winter term 11/12

### Organization



Lectures:	Tue Wed	14-16 16-17	101-00-026 101-00-026	
Exercises:	Thu Thu Fri Fri 3 out o <mark>Regist</mark>	8-10 8-10 12-14 12-14 of these 4 grou ration during t	101-01-018 051-00-034 101-00-018 078-00-014 Ips will take place <mark>biweekly</mark> his class, teamwork up to 3 stude	ents
	Sheet 1 will be out on Wed.,26.10. Hand-in biweekly during Wedclass			
	Web page:	Contains slides, recording, schedule, sheets, grouping etc.		
http://lak.informatik.uni-freiburg.de/ → Teaching → Winter Term 2011/12 → Algorithm Theory				

#### Organization



Final exam: Date and Time: t.b.a. Admission 1 exercise presented during the tutorials 50% of total exercise points

More Details: Kursvorlesung, 3+1 SWS 6 ECTS Credits Lectures in English Tutorials supervised by Thomas Janson English: Mahdi German: Geißer, Jarecki Camtasia recording available

#### Literature



Th. Ottmann, P. Widmayer:Algorithmen und Datenstrukturen4th Edition, Spektrum Akademischer Verlag,Heidelberg, 2002

Th. Cormen, C. Leiserson, R. Rivest, C. Stein: Introduction to Algorithms, Second Edition MIT Press, 2001

**Original literature** 

### Algorithms and data structures



Design and analysis techniques for algorithms

- Divide and conquer
- Greedy approaches
- Dynamic programming
- Randomization
- Amortized analysis

#### Algorithms and data structures



Problems and application areas

- Geometric algorithms
- Algebraic algorithms
- Graph algorithms
- Data structures
- Internet algorithms
- Optimization methods
- Algorithms on strings





# **Divide and Conquer**

Winter term 11/12

### The divide-and-conquer paradigm



- Quicksort
- Formulation and analysis of the paradigm
- Geometric divide-and-conquer
  - Closest pair
  - Line segment intersection
  - Voronoi diagrams

Quicksort: Sorting by partitioning





function Quick (S: sequence): sequence;

```
{returns the sorted sequence S}
```

begin

 $S_1 < v$ 

 $\begin{array}{l} \mbox{if $\#S <= 1$ then Quick:=S$} \\ \mbox{else } \{ \mbox{choose pivot element $v$ in $S$;} \\ \mbox{partition $S$ into $S_1$ with elements $< $v$,} \\ \mbox{and $S_r$ with elements $> $v$} \\ \mbox{Quick:= $Quick($S_1$) $v$ $Quick($S_r$) } } \end{array}$ 

 $S_r > v$ 

end;



## Formulation of the D&C paradigm

Divide-and-conquer method for solving a problem instance of size *n*:

#### 1. Divide

- $n \le c$ : Solve the problem directly.
- n > c: Divide the problem into k subproblems of sizes  $n_1, \dots, n_k < n$  (k  $\ge 2$ ).

#### 2. Conquer

Solve the *k* subproblems in the same way (recursively).

#### 3. Merge

Combine the partial solutions to generate a solution for the original instance.

#### Analysis



*T(n)* : maximum number of steps necessary for solving an instance of size n

$$T(n) = \begin{cases} a & n \le c \\ T(n_1) + \dots + T(n_k) & n > c \\ + \text{ cost for divide and merge} \end{cases}$$

**Special case:** k = 2,  $n_1 = n_2 = n/2$ cost for divide and merge: DM(n)

$$T(1) = a$$
$$T(n) = 2T(n/2) + DM(n)$$

Geometric divide-and-conquer



#### **Closest Pair Problem:**

# Given a set *S* of *n* points, find a pair of points with the smallest distance.



#### **Divide-and-conquer method**



- **1. Divide:** Divide S into two equal sized sets  $S_i$  und  $S_r$ .
- **2.** Conquer:  $d_l = mindist(S_l)$   $d_r = mindist(S_r)$
- **3. Merge:**  $d_{lr} = \min\{d(p_l, p_r) \mid p_l \in S_l, p_r \in S_r\}$ return  $\min\{d_l, d_r, d_{lr}\}$



#### **Divide-and-conquer method**



- 1. Divide: Divide S into two equal sets  $S_l$  und  $S_r$ . 2. Conquer:  $d_l = mindist(S_l)$   $d_r = mindist(S_r)$ 3. Merge:  $d_r = min\{d(p_r, p_r) \mid p_r \in S_r, p_r \in S_r\}$
- **3. Merge:**  $d_{lr} = \min\{d(p_l, p_r) \mid p_l \in S_l, p_r \in S_r\}$ return  $\min\{d_l, d_r, d_{lr}\}$

Computation of  $d_{lr}$ :







- 1. Consider only points within distance *d* of the bisection line, in the order of increasing y-coordinates.
- 2. For each point *p* consider all points *q* within y-distance at most *d*; there are at most 7 such points.

### Merge step





 $d = \min \{ d_l, d_r \}$ 

#### Implementation



- Initially sort the points in S in order of increasing x-coordinates
  O(n log n).
- Once the subproblems  $S_l$ ,  $S_r$  are solved, generate a list of the points in S in order of increasing y-coordinates (merge sort).

Running time (divide-and-conquer)



$$T(n) = \begin{cases} 2T(n/2) + an & n > 3\\ a & n \le 3 \end{cases}$$

- Guess the solution by repeated substitution.
- Verify by induction.

Solution: O(n log n)

#### Guess by repeated substitution



$$T(n) = \begin{cases} 2T(n/2) + an & n > 3\\ a & n \le 3 \end{cases}$$

T(n) =

### Verify by induction



$$T(n) \leq an \log n$$
  $T(n) = \begin{cases} 2T(n/2) + an & n > 3\\ a & n \leq 3 \end{cases}$ 

$$n = 2^i$$
$$i = 1: \text{ ok}$$

$$i > 1$$
  
 $T(2^i) =$ 

Line segment intersection



Find all pairs of intersecting line segments.



#### Line segment intersection



Find all pairs of intersecting line segments.



The representation of the horizontal line segments by their endpoints allows for a vertical partitioning of all objects.



- **Input:** Set S of vertical line segments and endpoints of horizontal line segments.
- **Output:** All intersections of vertical line segments with horizontal line segments, for which at least one endpoint is in *S*.

#### 1. Divide

**if** |*S*| > 1

then using vertical bisection line *L*, divide *S* into equal size sets  $S_1$  (to the left of *L*) and  $S_2$  (to the right of *L*) else *S* contains no intersections



#### 1. Divide:



2. Conquer:

ReportCuts(S<sub>1</sub>); ReportCuts(S<sub>2</sub>)



#### 3. Merge: ???

Possible intersections of a horizontal line-segment h in  $S_1$ 



**Case 1:** both endpoints in  $S_1$ 



**Case 2:** only one endpoint of h in  $S_1$ 

**2 a)** right endpoint in  $S_1$ 





#### **2 b)** left endpoint of h in $S_1$



### Procedure: ReportCuts(S)



#### 3. Merge:

Return the intersections of vertical line segments in  $S_2$  with horizontal line segments in  $S_1$ , for which the left endpoint is in  $S_1$ and the right endpoint is neither in  $S_1$  nor in  $S_2$ .

Proceed analogously for  $S_1$ .



#### Implementation



Set S

- *L*(*S*): y-coordinates of all left endpoints in *S*, for which the corresponding right endpoint is not in *S*.
- *R*(*S*): y-coordinates of all right endpoints in *S*, for which the corresponding left endpoint is not in *S*.
- V(S): y-intervals of all vertical line-segments in S.

#### Base cases



S contains only one element s.

**Case 1:** s = (x, y) is a left endpoint  $L(S) = \{y\}$   $R(S) = \emptyset$   $V(S) = \emptyset$ 

**Case 2:** s = (x, y) is a right endpoint  $L(S) = \emptyset$   $R(S) = \{y\}$   $V(S) = \emptyset$ 

**Case 3:**  $s = (x, y_1, y_2)$  is a vertical line-segment  $L(S) = \emptyset$   $R(S) = \emptyset$   $V(S) = \{ [y_1, y_2] \}$ 

#### Merge step



Assume that  $L(S_i)$ ,  $R(S_i)$ ,  $V(S_i)$  are known for i = 1,2.  $S = S_1 \cup S_2$ 

L(S) =R(S) =V(S) =

- *L, R*: ordered by increasing y-coordinates linked lists
- V: ordered by increasing lower endpoints linked list

### Output of the intersections









Initially, the input (vertical line segments, left/right endpoints of horizontal line segments) has to be sorted and stored in an array.

**Divide-and-conquer:** 

T(n) = 2T(n/2) + an + size of outputT(1) = O(1)

 $O(n \log n + k)$  k = # intersections

### Computation of a Voronoi diagram



**Input:** Set of sites.

**Output:** Partition of the plane into regions, each consisting of the points closer to one particular site than to any other site.



### **Definition of Voronoi diagrams**



**P**: Set of sites

 $H(p | p') = \{x | x \text{ is closer to } p \text{ than to } p'\}$ 

Voronoi region of *p*:

$$VR(p) = \bigcap_{p' \in P \setminus \{p\}} H(p \mid p')$$

### Computation of a Voronoi Diagram



**Divide:** Partition the set of sites into two equal sized sets.

**Conquer:** Recursive computation of the two smaller Voronoi diagrams.

**Stopping condition:** The Voronoi diagram of a single site is the whole plane.



Merge: Connect the diagrams by adding new edges.

### Computation of a Voronoi diagram



**Output:** The complete Voronoi diagram.



**Running time:** O(n log n), where n is the number of sites.