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## **Network Algorithms**

#### Anton Betten

Department of Mathematics Colorado State University

April, 2006

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#### Typical Network Problems

Minimum Cost Spanning Tree All Pairs Shortest Distance / Paths Maximum Network Flow Travelling Sales Person (TSP) Graph Clustering

#### **Combinatorial Optimization**

What is an Optimization Problem? What is a Global Optimum? What is a Local Optimum? Lin-Kernighan 2-opt Local Search Application: The Domino Portrait Problem

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### Abstract

The talk presents some ideas on how combinatorial optimization can be used to design efficient algorithms for graphs and networks. Local Search is a relatively simple method which was proven to be effective in many areas, for instance graph clustering problems.

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Typical Network Problems:

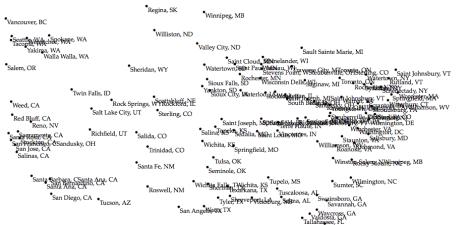
- 1. Minimum Cost Spanning Tree
- 2. All Pairs Shortest Distance / Paths
- 3. Maximum Network Flow (between two nodes, called source and target)

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- 4. Travelling Sales Person (TSP)
- 5. Clustering

#### Minimum Cost Spanning Tree:

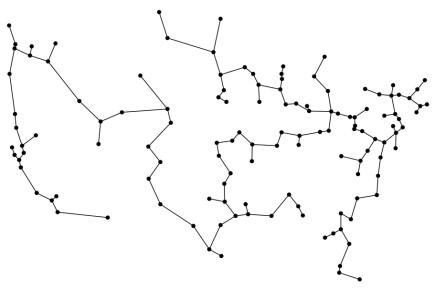
# Find the cheapest spanning tree ("connect the dots without creating cycles")



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Algorithms by Kruskal and by Prim, very effective:

"Add the cheapest edge which is still possible until everything is connected."

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#### All Pairs Shortest Distance / Paths

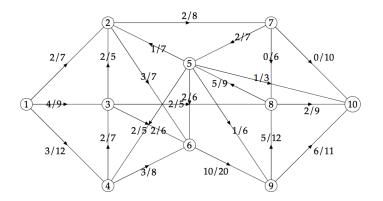
Dijkstra's algorithm



#### Maximum Network Flow

Algorithm of Ford and Fulkerson:

"augment the current flows until no augmenting path can be found anymore"



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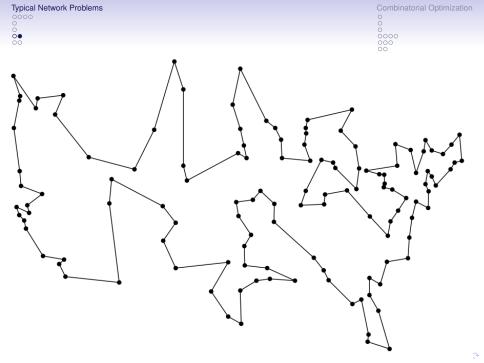
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#### **Travelling Salesman**

Visit all cities on a cyclic tour.

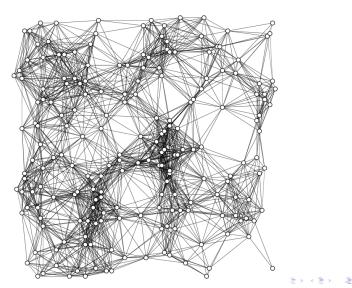
Algorithm: Lin / Kernighan: "2-opt"



Typical Network Problems

Combinatorial Optimization

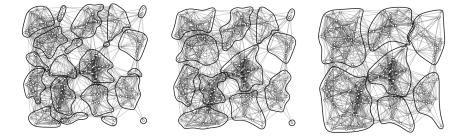
#### Graph Clustering:



Typical Network Problems

Combinatorial Optimization

#### find "clusters", for instance:



Example taken from Andrew King: *Graph Clustering with Restricted Neighbourhood Search,* Ph.D. thesis, University of Toronto, Department of Computer Science.

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## What is an Optimization Problem?

An instance of an optimization problem is a pair (F, c) where

1. *F* is a set, whose elements are called "feasible solutions" 2.  $c: F \to \mathbb{R}$  a cost function

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# What is a Global Optimum?

An element  $x \in F$  with  $c(x) \leq c(y)$  for all  $y \in F$  is called a global optimum.

It is often too hard determine a global optimum.

The set *F* may be prohibitively large.

Typical	Network	Problems
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## What is a Local Optimum?

An element  $x \in F$  with  $c(x) \le c(y)$  for all  $y \in F$  which are "close" to x is called local optimum.

For this to make sense, one needs to define a concept of "neighborhood"

This is problem dependent.

Sometimes it is hard to find even a single point in *F*.

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## Lin-Kernighan 2-opt

Let F be the set of all tours, i.e. sequences

 $[i_1, i_2, \ldots, i_n]$  which are permutations of the cities  $1, \ldots, n$ 

the tour is  $i_1 - i_2 - i_3 - \cdots - i_n - i_1$  (cyclically).

The size of F is prohibitively large

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### Lin-Kernighan 2-opt

#### Let

$$c([i_1, i_2, \ldots, i_n]) = \sum_{j=1}^{n-1} \operatorname{dist}(i_j, i_{j+1}) + \operatorname{dist}(i_n, i_1),$$

i.e., the cost of a tour is the sum of the distances travelled.

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## Lin-Kernighan 2-opt

#### Start with a random tour $x \in F$ ,

$$x = [i_1, i_2, \dots, i_n]$$
  
i.e.,  
$$i_1 \mapsto i_2 \mapsto \dots \mapsto i_n \mapsto i_1$$

Typical Network Problems

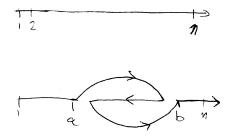
Combinatorial Optimization

## Lin-Kernighan 2-opt

Choose two random numbers a, b with  $1 \le a \le b \le n$  and a, b at cyclic distance  $\ge 2$ .

Reconnect as follows:

 $i_1 \mapsto \cdots \mapsto i_a \mapsto i_{b-1} \mapsto i_{b-2} \mapsto \cdots \mapsto i_{a+1} \mapsto i_b \mapsto \cdots \mapsto i_n \mapsto i_1.$ 

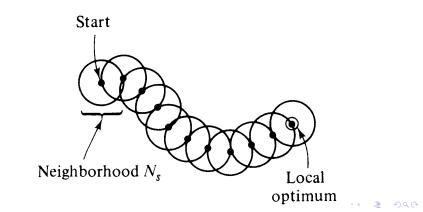


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Typical Network Problems
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## Local Search

Idea: given  $x \in F$ we try to find an improvement in a "neighborhood" N(x)



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## Local Search: Variable Depth

Idea:

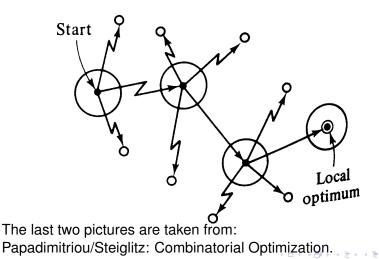
do a (random) number of neighbor's neighbors.

Only the last of this chain of neighbors is compared to the current point.

The hope is that this allows us to go through a valley (or climb over a mountain)

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#### Local Search: Variable Depth



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# Application: The Domino Portrait Problem

# We want to approximate a foto portrait using Dominos (double nine, say).

We wish to use a fixed number of complete sets.

Typical Network Problems

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Bader Al-Shamarey: Two Topics in Combinatorial Optimization. Ph.D. thesis, CSU, 2007.