# CS3383 Unit 5.2: Travelling Salesperson Problem

David Bremner

March 31, 2018



#### Outline

#### **Combinatorial Search**

Travelling Salesperson problem Dynamic Programming for TSP Branch and Bound

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# Travelling Salesperson Problem

#### TSP

Given 
$$G = (V, E)$$
  
Find a shortest tour that visits all nodes

Brute Force



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# Travelling Salesperson Problem

#### TSP

Given 
$$G = (V, E)$$
  
Find a shortest tour that visits all nodes

#### Brute Force

- $\blacktriangleright$  *n*! different tours
- Each one takes  $\Theta(n)$  time to test
- ▶ Using Stirling's approximation for *n*!

$$n\cdot n!\in \Theta(n^{n+\frac{3}{2}}e^{-n})$$

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# Subproblems for Dynamic Programming

# C(S,j) length of shortest path starting at 1, visiting all nodes in S and ending at j.

Recurrence

$$C(S,j) = \min_{i \in S \smallsetminus \{j\}} C(S \smallsetminus \{j\},i) + d_{ij}$$

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# Dynamic Programming for TSP

$$\begin{array}{l} C[\{1\},1] \leftarrow 0 \\ \text{for s} = 2 \ \text{to n do} \\ \text{for } \forall \ \text{subsets S of size } s \ \text{do} \\ C[S,1] \leftarrow \infty \\ \text{for } j \in S \smallsetminus \{1\} \ \text{do} \\ C[S,j] \leftarrow \min_{i \in S \smallsetminus \{j\}} C[S \smallsetminus \{j\},i] + d_{ij} \\ \text{end} \\ \text{end} \\ \text{end} \\ \text{return } \min_{j} C[V,j] + d_{j1} \end{array}$$

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### Branch and Bound

In general dynamic programming is too slow (not surprising since it's exact)

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In practice people use an enhanced backtracking method called branch and bound.

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### Branch and Bound

In general dynamic programming is too slow (not surprising since it's exact)

In practice people use an enhanced backtracking method called branch and bound.

#### lower bounds

- Suppose we are minimizing some function f(·).
  We need some function lowerbound such that
  lowerbound(P<sub>i</sub>) ≤ f(P<sub>i</sub>) for all subproblems P<sub>i</sub>
  - $\blacktriangleright$  lowerbound is faster to compute than f

# Branch and Bound in General

```
def BranchAndBound (P_0):
       S \leftarrow \{P_0\}
       best \leftarrow \infty
       while S \neq \emptyset:
              (P, S) \leftarrow \mathsf{pop}(S)
              for P_i \in expand(P):
                      if test (P_i) = SUCCESS:
                             best \leftarrow \min(\text{best}, f(P_i))
                      elif lowerbound(P_i) < \text{best}:
                             S \leftarrow S \cup \{P_i\}
       return
                    best
```

# Subproblems for B&B TSP

# $\begin{array}{l} [a,S,b] \mbox{ path from } a \mbox{ to } b \mbox{ passing through } S \\ \mbox{ completed by cheapest path from } b \mbox{ to } a \mbox{ using } V\smallsetminus S. \\ P_0 \end{tabular} \left[a, \{\end{tabular}\}, a\right] \end{array}$

# Subproblems for B&B TSP

$$[a, S, b]$$
 path from  $a$  to  $b$  passing through  $S$   
completed by cheapest path from  $b$  to  $a$  using  $V \setminus S$ .  
 $P_0$   $[a, \{a\}, a]$ 

Expand

$$\mathsf{expand}([a,S,b]) = \{ \, [a,S \cup \{ \, x \, \}, x] \mid x \in V \smallsetminus S \, \}$$

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We need to connect

$$\blacktriangleright a \text{ to some } a' \in V \setminus S$$



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We need to connect

- a to some  $a' \in V \setminus S$
- $\blacktriangleright b$  to some  $b' \in V \smallsetminus S$
- ▶ a' to b' using all nodes of  $V \setminus S$ .
- The last one is a (very special) spanning tree of  $V \ge S$ .