

6.889 — Lecture 15: Traveling Salesman (TSP)

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(figures by Philip Klein)

November 2, 2011

Traveling Salesman Problem (TSP) given $G = (V, E)$ find a *tour* visiting each¹ node $v \in V$.
NP-hard optimization problem, hard even for planar graphs
Polynomial-time approximation for general graphs: Christofides' algorithm achieves $3/2$ approximation

Assumption (all of Lecture 15) undirected planar G , $\ell : E \rightarrow \mathbb{R}^+$

2-approximation simple algorithm, bound approximation ratio in terms of *minimum spanning tree*

- compute *minimum spanning tree* T . let $\ell(T) := \sum_{e \in T} \ell(e)$
- duplicate all edges \rightsquigarrow *Eulerian* graph
- find Eulerian cycle, length at most $2\ell(T)$
- (if G is the complete graph K_n , Eulerian cycle can be converted into Hamiltonian cycle by skipping already visited nodes)

any tour needs to visit all nodes, total length at least $\ell(T)$, hence 2-approximation

Recall: Linear-Time Approximation Schemes for Planar Graphs (L. 8)

Example \min VERTEXCOVER

Algorithm given G and approximation parameter $\epsilon \in (0, 1)$, let $k = 1/\epsilon$

1. BFS in G
2. $G_{ij} \leftarrow$ graph induced by $k + 1$ BFS levels $jk + i$ to $(j + 1)k + i$ (*shift* i , $0 \leq i < k$, and *slice* j)
3. $S_{ij} \leftarrow$ \min VERTEXCOVER of G_{ij} (dynamic programming on graph with tree-width $\mathcal{O}(k)$)
4. $S_i \leftarrow \bigcup_j S_{ij}$
5. RETURN best S_i (best shift i , $0 \leq i < k$, smallest $|S_i|$)

Running Time dynamic program runs in time $2^{\mathcal{O}(k)}|V(G_{ij})|$, overall $2^{\mathcal{O}(k)}n$

Correctness and Approximation Ratio two properties used

3. part of OPT in G_{ij} is a feasible solution for G_{ij} . \rightsquigarrow consequence: $|\text{OPT} \cap V(G_{ij})| \geq |S_{ij}|$
optimum solution OPT induces solution on subgraph G_{ij}
for at least one shift i overlap $|\text{OPT}_i|$ is small² ($\leq |\text{OPT}|/k = \epsilon|\text{OPT}|$)
4. solutions in G_{ij} together form a feasible solution for G , $\bigcup_j S_{ij}$ is a solution for G (for any i)

¹visiting only a subset $U \subseteq V$ to be discussed in Lectures 16 and 17

²define $\text{OPT}_i = \text{OPT} \cap \{\text{all nodes on BFS level } i \bmod k\}$

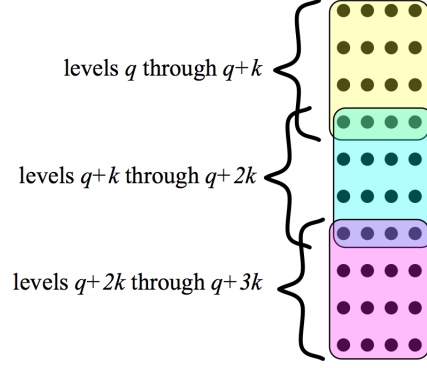


Figure 1: Consecutive slices (subgraphs) overlap by one single level (boundary).

Apply framework to TSP?

Approximation Ratio two properties used

- ✗ 3. part of OPT in G_{ij} is **not necessarily** a feasible solution for G_{ij} , **maybe not a tour!**
optimum solution does not induce a solution on subgraph G_{ij}
- ✓ 4. solutions in G_{ij} form a feasible solution for G , $\bigcup_j S_{ij}$ **can be combined into** a solution for G (for any i)
ok for TSP since tour visits *all* nodes \rightsquigarrow also visits *all* boundary nodes \rightsquigarrow can connect subtours

Modified framework for unit-length graphs

Algorithm given G and approx. parameter $\epsilon \in (0, 1)$, let $k = 3 \cdot 2/\epsilon$ (factor 3 from Euler's $|E| \leq 3|V| - 6$)

1. BFS in G^* (determine levels in dual, conn. components of G_{ij} have cycle boundary, cut-cycle duality)
2. $G_{ij} \leftarrow$ graph induced by $k + 1$ BFS levels $jk + i$ to $(j + 1)k + i$ (shift i , $0 \leq i < k$, and slice j)
choose shift i such that number of edges in level $i \pmod k$ is at most $|E|/k \leq \epsilon|V|/2$
3. $S_{ij} \leftarrow$ TSP of **each component** of G_{ij} (dynamic programming on graph(s) with tree-width $\mathcal{O}(k)$)
4. $S_i \leftarrow \bigcup_j S_{ij}$, “find Eulerian cycle”
5. RETURN best S_i (best shift i , $0 \leq i < k$, however, we already chose good i in Step 2)

Approximation Ratio different property used

3. tour in G_{ij} may be longer than $\text{OPT} \cap G_{ij}$
how much longer? *cannot* bound distortion by $\epsilon \ell(\text{OPT} \cap G_{ij})$, error is not *multiplicative* but *additive*
no bound on overlap with OPT. let ∂G_{ij} be boundary of G_{ij} . then $\text{TSP}(G_{ij}) \leq \ell(\text{OPT} \cap G_{ij}) + \ell(\partial G_{ij})$
4. $\ell\left(\bigcup_j S_{ij}\right) \leq \ell(\text{OPT}) + 2 \cdot \ell(\partial G_i)$, where $\partial G_i := \bigcup_j \partial G_{ij}$ is total boundary
unit-length: total boundary is at most k -fraction, $\ell(\partial G_i) = |\partial G_i| \leq |E|/k \leq \epsilon|V|/2$, total error term is $\epsilon|\text{OPT}|$ since $|V| \leq \text{OPT}$
arbitrary lengths? $\ell(\partial G_i) \leq \ell(E)/k$, no connection to $\ell(\text{OPT})$

Spanner

Problem if graph G has edge lengths $\ell : E \rightarrow \mathbb{R}^+$, boundary cycles may be too long, solution in G_{ij} ?

Algorithm given G and approx. parameter $\epsilon \in (0, 1)$, let $k = 18/\epsilon^2$ (factor is *not* from Euler's formula)

0. compute spanner (sparsify G , obtain subgraph H)

1. BFS in H^*

...

Goal sparse subgraph of G , called *spanner* H , shall have two properties

- total length of edges $V(H)$ proportional to total length of minimum spanning tree in G (trivial for unit-length graphs, since $|E| \leq 3|V| - 6$; for arbitrary non-negative lengths we obtain total length $\leq (1 + 2/\epsilon)\ell(\text{MST})$, factor $3/\epsilon$)
 \rightsquigarrow can bound total length of edges in the overlap/boundary
- distances preserved: $d_H(v, w) \leq (1 + \epsilon)d_G(v, w)$ (cf. *stretch* in Lecture 13)
 \rightsquigarrow paths and distances not distorted by too much, $(1 + \epsilon')^2 \leq (1 + \epsilon)$ for $\epsilon' = \epsilon/3$, factor 3

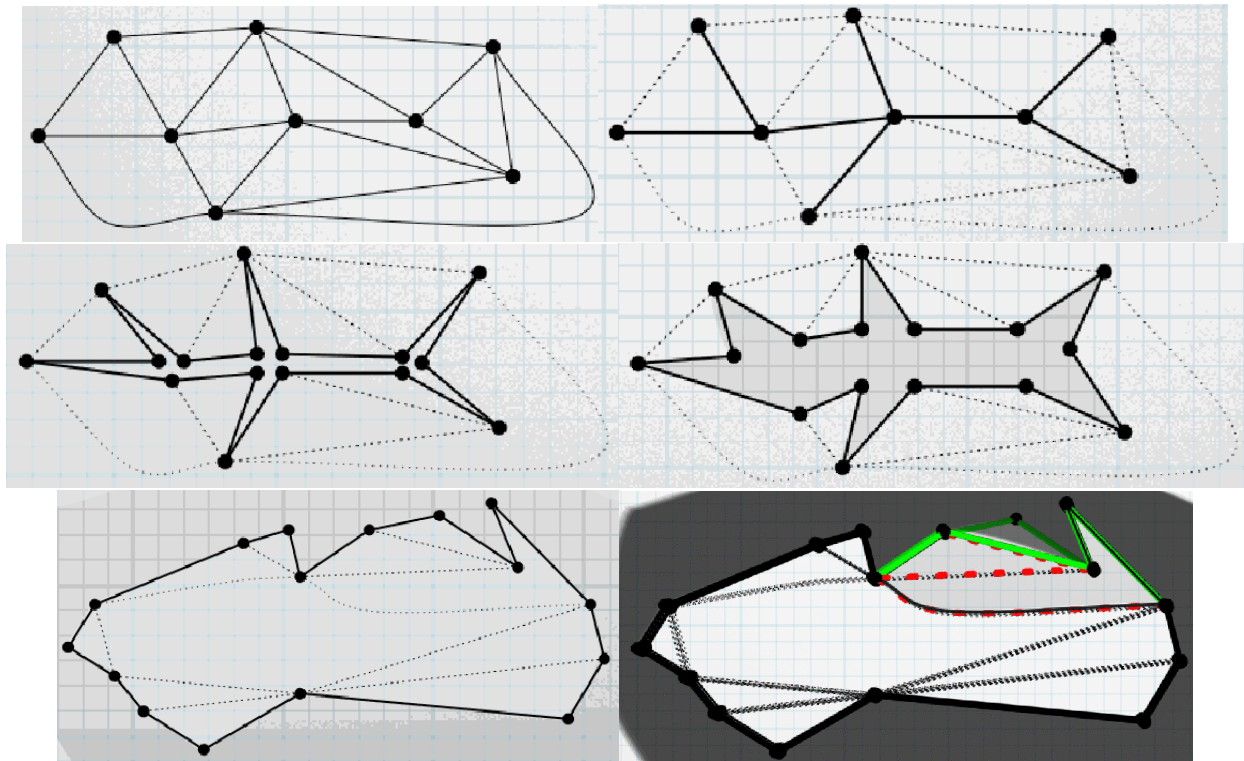


Figure 2: Spanner construction: (i) given an undirected planar graph (ii) compute a minimum spanning tree, (iii) “cut” along the tree to (iv) create a face, (v) make it the infinite face (conceptual step only, not actually necessary), and (vi) add or discard non-tree edges, starting with the leaves of the interdigitating tree.

Spanner analysis total length of spanner edges depends on ϵ and total length of minimum spanning tree. maintain cycle C (initialized by walk around spanning tree, total length twice spanning tree, $2\ell(\text{MST})$). edge $e = uv$ is added if shortest path in cycle is not a $(1 + \epsilon)$ -approximation, $d_C(u, v) > (1 + \epsilon)\ell(u, v)$. if e is added, the total length of C decreases by at least $\epsilon\ell(u, v)$. cycle length can never be negative \rightsquigarrow total length of edges added to the spanner is at most $2\ell(\text{MST})$, hence total length is at most $(1 + 2/\epsilon)\ell(\text{MST})$

Different perspective: contraction decomposition

different view on framework: after spanner step, slicing is *deletion decomposition* (cf. Lec. 9) in the dual (label/partition edges into E_1, E_2, \dots s.t. deleting any part E_i results in a graph with small tree-width).
deletion in dual \Leftrightarrow contraction in primal. \rightsquigarrow *contraction decomposition*

0. compute spanner H
1. BFS in H^*
2. contract all³ edges on level $i \bmod k$ (for best i)
3. compute solution in contracted graph (dynamic programming on graph with tree-width $\mathcal{O}(k)$)
4. lift solution (can augment solution since total boundary is small)
5. return best S_i (for TSP we already chose good i in Step 2)

³except for self-loops

References

The Traveling Salesman Problem is **NP**-hard even for planar graphs [GJT76]. The linear-time approximation scheme for TSP is by Klein [Kle08] (earlier algorithms in [GKP95, AGK⁺98]). A variant (different spanner needed) works for *Subset TSP* [Kle06]. For general undirected graphs, algorithms achieve approximation ratio roughly $3/2$ [Chr76, MS11, GSS11, Muc12]. The existence of a polynomial-time algorithm with approximation ratio better than $220/219$ would imply $\mathbf{P} = \mathbf{NP}$ [PV06].

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