

Orienteering and related problems: mini-survey and open problems

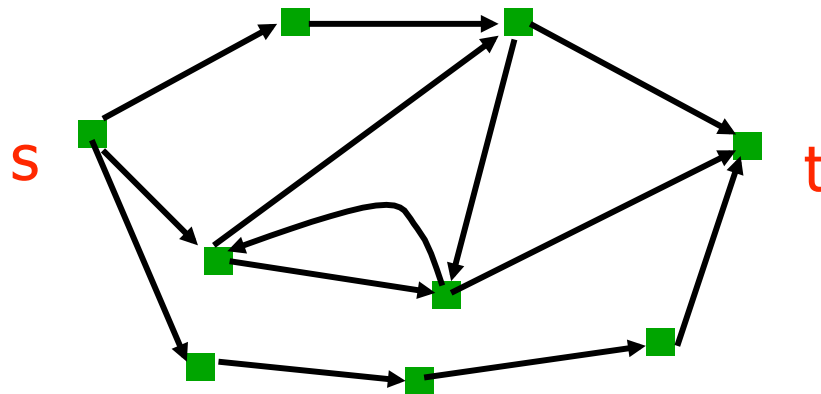
Chandra Chekuri

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Orienteering

Input: Graph (undir or dir) G , nodes s, t and budget B

Goal: find $s \rightarrow t$ walk/path P of length $\leq B$ that maximizes number of nodes in P

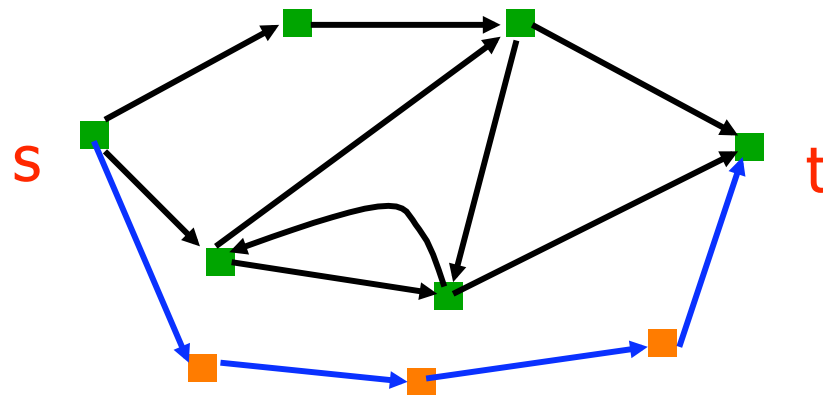


$B = 6$

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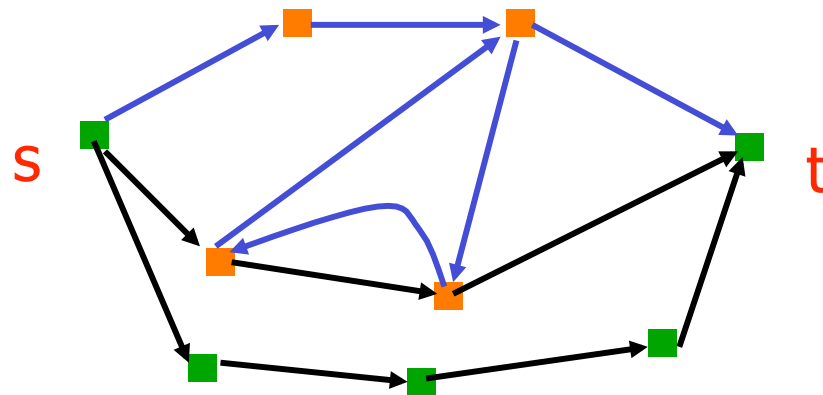


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Orienteering: known results

Undirected graphs

- Approx. algorithms
 - $(2+\varepsilon)$ for points in \mathbb{R}^2 [Arkin-Mitchell-Narasimhan'98]
 - 4 [Blum-Chawla-Karger-Lane-Meyerson-Minkoff'03]
 - 3 [Bansal-Blum-Chawla-Meyerson'04]
 - $(1+\varepsilon)$ for points in \mathbb{R}^d , d fixed [Chen-HarPeled'05]
 - $(2+\varepsilon)$ [C-Korula-Pal'08]
- Hardness:
 - APX-hard [BCKLMM'03]

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Directed Graphs

- Approx. algorithms
 - $O(\log n)$ in *quasi-poly* time [C-Pal'05]
 - $O(\log^2 n)$ [C-Korula-Pal'08] [Nagarajan-Ravi'07]
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Close gap for directed graphs

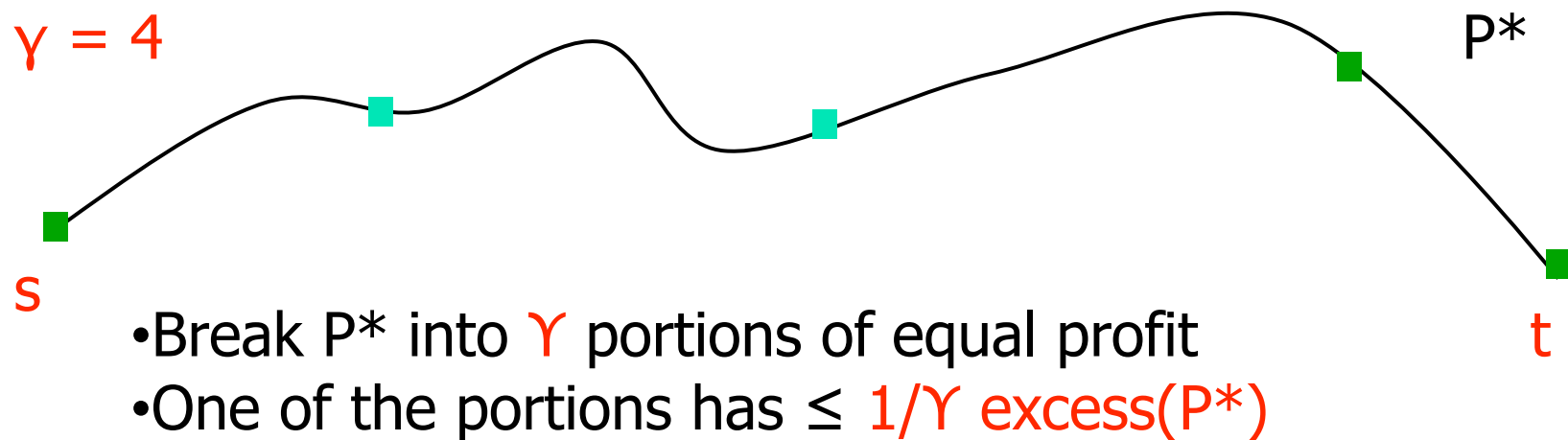
Orienteering: Key Idea [BCKLMM]

- Reduce to k-Stroll problem via the intermediate problem called *min-excess* problem
- The k-Stroll problem
 - **Input:** Graph G , nodes s, t and integer k
 - **Goal:** Find min-cost s - t walk/path that visits k nodes
- Min-excess problem
 - **Input:** Graph G , nodes s, t and integer k
 - **Goal:** Find s - t walk/path P that visits k nodes and minimizes *excess of P* = $\text{len}(P) - \text{dist}(s,t)$

Orienteering via Min-Excess

[BCKLMM'03, BBCM'04]

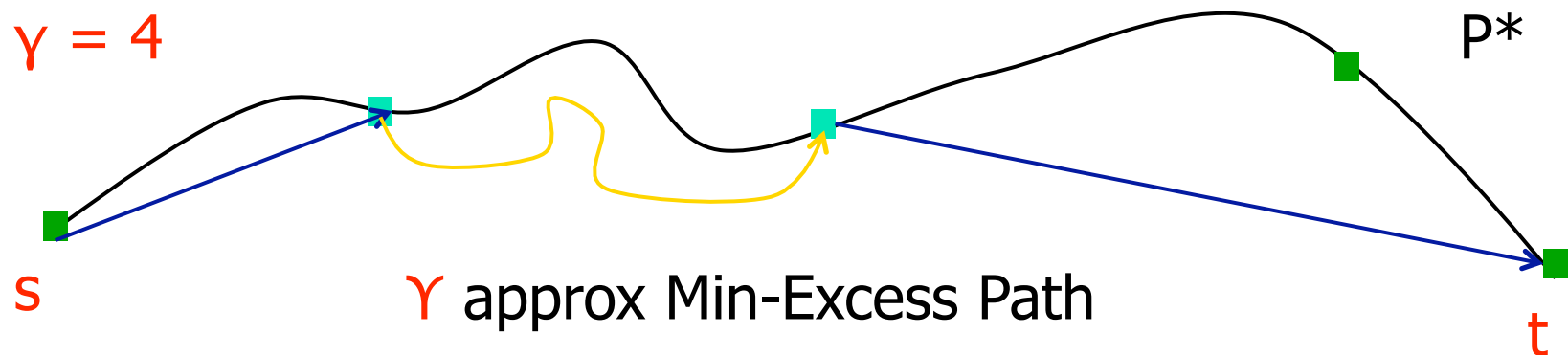
Theorem: γ approx for Min-Excess implies
 $\text{ceiling}(\gamma)$ approx for Orienteering



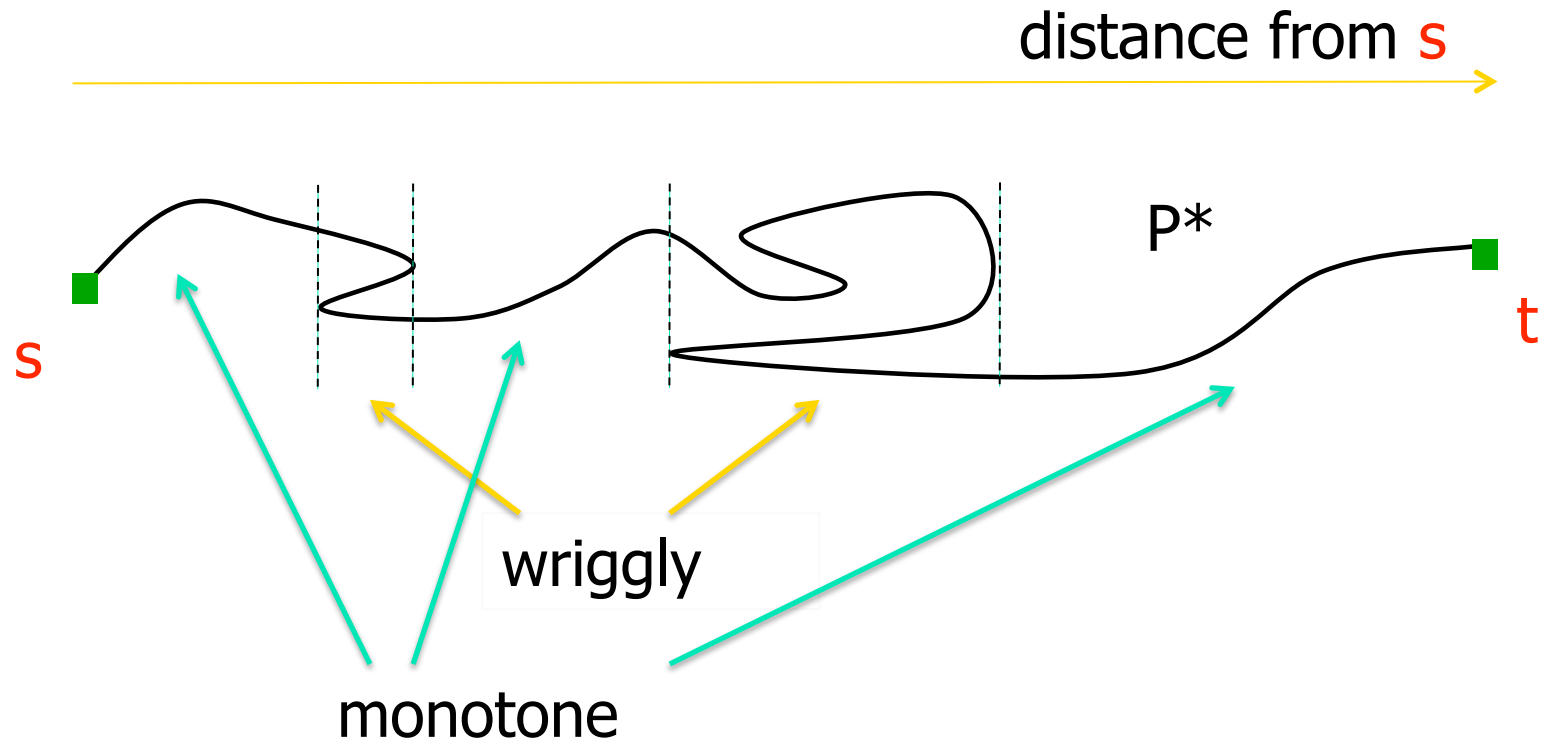
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[BCKLMM'03, BBCM'04]

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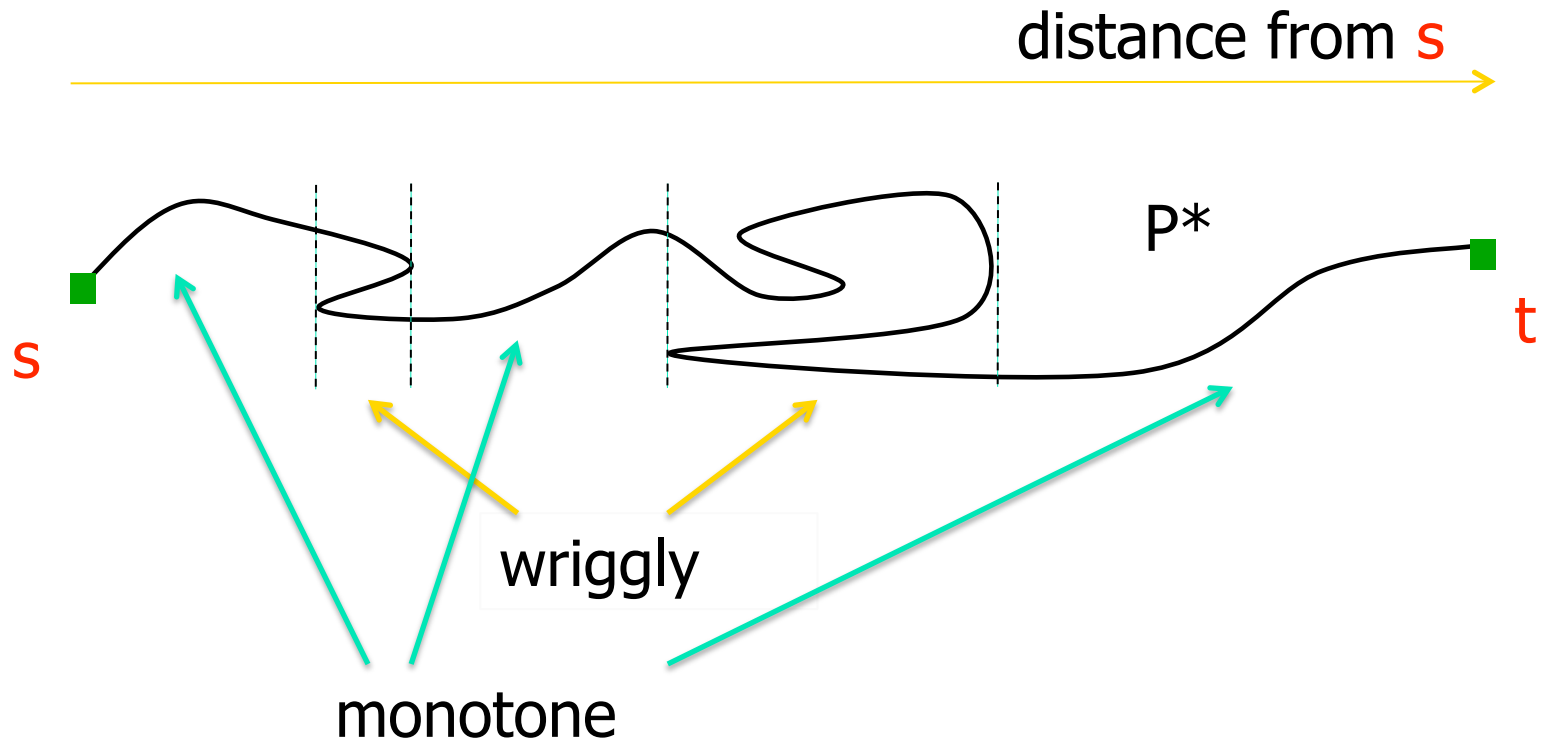


Min-Excess via (approx) k-Stroll



wiggly portions have large excess: use k-stroll approx
monotone portions: use exact algorithm
stitch via dynamic programming

Min-Excess via (approx) k-Stroll



[BCKLMM'03]

Theorem: β approx for k-Stroll implies $O(\beta)$ for min-excess

k-Stroll and Orienteering

[BCKLMM'03]

Theorem: α approx for k-Stroll implies $O(\alpha)$
approx for Orienteering

Algorithms for k-Stroll

- Undir graphs: $(2+\epsilon)$ [Chaudhuri-Godfrey-Rao-Talwar'03]
- Directed graphs: ??

Is there a non-trivial approx. for dir k-Stroll?
Is the problem very hard?

Algorithms for k-Stroll in dir graphs

- $k=n$ is asymmetric TSP Path problem (ATSPP)
 - $O(\sqrt{n})$ approx [Lam-Newman'05]
 - $O(\log n)$ approx [C-Pal'06]
- Bicriteria (α, β) approx: output path with k/α vertices and cost $\beta \text{ OPT}$
 - $(O(\log^2 k), O(1))$ approx [C-Korula-Pal'08] [Nagarajan-Ravi'07] (*different approaches*)
 - Bi-criteria approx sufficient for Orienteering

Improve k-Stroll bi-criteria approx

Orienteering with Time-Windows

Orienteering-TW

- Each node v has a time window $[R(v), D(v)]$
- v counted only if it is visited in its window

Deadline-TSP: $R(v) = 0$ for all v

Goal: Find s - t walk to max # of nodes visited

Orienteering with Time-Windows

[Bansal-Blum-Chawla-Meyerson'04]

α approx for Orienteering implies

- $O(\alpha \log n)$ approx for Deadline-TSP
- $O(\alpha \log^2 n)$ approx for Orienteering-TW

$\alpha = O(1)$ for undir and $\alpha = O(\log^2 n)$ in dir graphs

Orienteering with Time-Windows

Conjecture: there is an $O(\log n)$ approx for Orient-TW in undirected graphs

Is the problem $\omega(1)$ -factor hard in directed graphs?

Evidence for conjecture:

- $O(\log n)$ approx in quasi-poly time even in directed graphs. [C-Pal'05]
- $O(\alpha \log L_{\max})$ approx [C-Korula'07] where L_{\max} is max window length assuming integer data

Orienteering with Time-Windows

[C-Korula'07]

Two simple algorithms:

- $O(\alpha \log L_{\max})$ approx assume integer data and is L_{\max} is max window length
- $O(\alpha \max(\log n, \log (L_{\max}/L_{\min})))$

Difficult case: L_{\max}/L_{\min} is super-poly in n

Orienteering with Time-Windows

[C-Korula'07]

Idea for $O(\log L_{\max})$ approx

Lemma: Let $[a,b]$ be an interval with a, b integer and $m = b-a$. Then $[a,b]$ can be *partitioned* into at most $2 \log m$ *disjoint* sub-intervals such that

- length of each sub-interval is a power of 2
- sub-interval of length 2^i starts at multiple of 2^i
- at most 2 intervals of each length

Proof of Lemma

- $[a, b]$ interval with a and b integers
- If a, b are *even* integers, recurse on $[a/2, b/2]$ and multiply each interval by 2
- If a, b are *odd*, recurse on $[a+1, b-1]$ and add $[a, a+1]$ and $[b-1, b]$
- If a is *odd* and b is even, recurse on $[a+1, b]$ and add $[a, a+1]$
- If a is *even* and b is *odd*, recurse on $[a, b-1]$ and add $[b-1, b]$

Orienteering with Time-Windows

- Apply lemma to each $[R(v), D(v)]$
- Consider all sub-intervals of length 2^i .
- These intervals start at a multiple of 2^i hence they are *either disjoint or completely overlap*
- Can use Orienteering in each interval and stitch across disjoint intervals using dynamic prog.

- At most $\log L_{\max}$ classes and one of them has $\text{OPT}/2\log L_{\max}$ profit

Fixed-parameter Tractability

Observation: There is an $O(4^k \text{ poly}(n))$ time algorithm that gives optimum profit if there is a solution that visits at most k nodes.

Follows from “color-coding” scheme of
[Alon-Yuster-Zwick]

A more complex path problem

SOP-TW

- $f: 2^V \rightarrow \mathcal{R}^+$ a monotone submodular set function on the nodes V
- Each node v has a *time window* $[R(v), D(v)]$.

Goal: find path P s.t nodes in P are visited in time windows and $f(P)$ is maximized

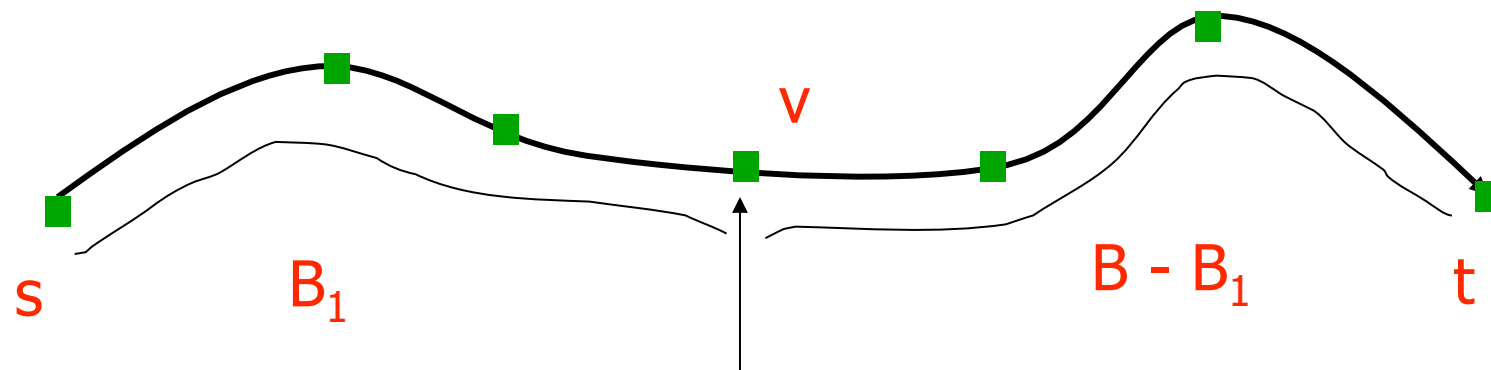
Algorithm for SOP-TW

[C-Pal'05]

Theorem: There is a quasi-poly time $O(\log n)$
approx. for SOP-TW

Recursive Greedy Alg: idea

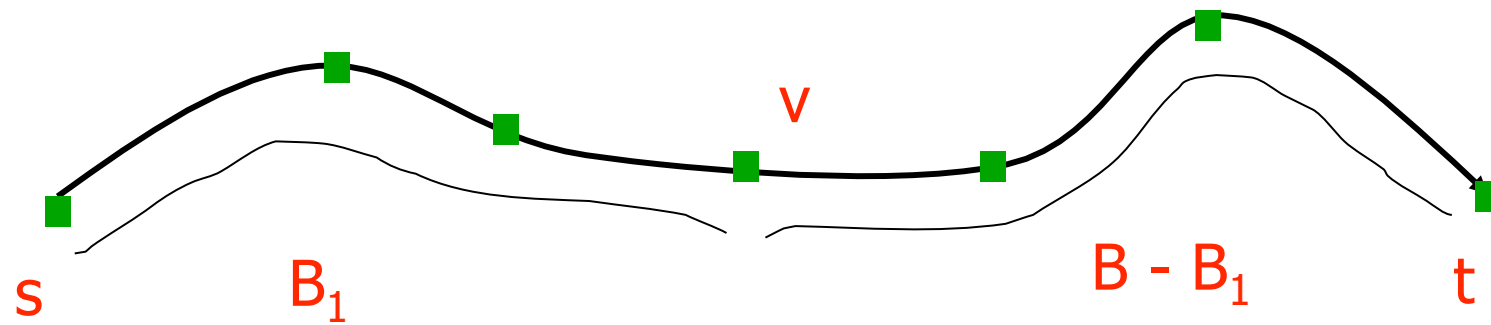
Unknown optimum path P^*



middle node v

time to reach $v = B_1$

Recursive Greedy Algorithm



$RG(f, s, t, B, i)$

Savitch's algo for optimization ?

1. "Guess" v and $B_1 \in [R(v), D(v)]$
2. $P_1 = RG(f, s, v, B_1, i-1)$
3. $P_2 = RG(f_{P_1}, v, t, B-B_1, i-1)$
4. return $P = P_1$ concat P_2

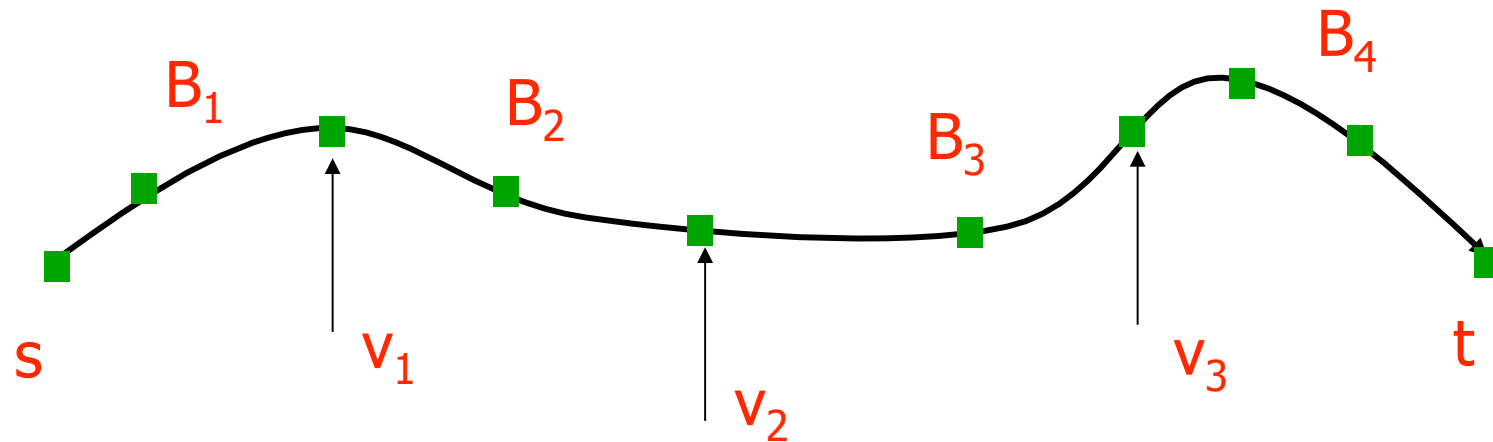
Analysis

Theorem: $RG(f,s,t,B,\log n)$ yeilds an $O(\log n)$ approximation

Running time with recursion depth i : $(nB)^{O(i)}$

Can improve to $(n \log B)^{O(i)}$: quasi-poly

Guessing more



Running time $O(n^a \log n)$

Approximation: $\log n / \log(a+1)$

$\log^{1-\varepsilon} n$ approximation in $\exp(n^\varepsilon)$ time
(sub-exponential time)

Applications

Quasi-poly algorithms:

- $O(\log^2 n)$ approx for group Steiner problem in undir graphs. Current approx. is $O(\log^3 n)$ and hardness is $\Omega(\log^{2-\epsilon} n)$. SOP-TW is hard to within $\Omega(\log^{1-\epsilon} n)$ factor.
- $O(\log n)$ approx for Orienteering with time varying profits at nodes
- $O(\log n)$ approx for Orienteering with multiple disjoint time windows for each node v .



Questions

Obvious: change quasi-poly to poly.

Conjecture: $O(\log^2 n)$ approx. for group Steiner via LP.

Is there a non-trivial poly-time (poly-log?) approx for Orienteering with multiple time windows?

Group Steiner problem

Set cover + Steiner tree = group Steiner

Undirected graph $G = (V, E)$

Groups: S_1, S_2, \dots, S_k , each $S_i \subseteq V$

Goal: find minimum cost tree $T = (V', E')$ such that
 $|V' \cap S_i| \geq 1$ for $1 \leq i \leq k$

Group Steiner problem

$O(\log^2 n)$ approx if G is a tree

$O(\log^3 n)$ approx for general graphs

[Garg-Konjevod-Ravi'98 + ...]

$\Omega(\log^{2-\epsilon} n)$ approx not possible even on trees
unless NP contained in quasi-polynomial time

[Halperin-Krauthgamer'03]

SOP and group Steiner

Simple observation:

α -approx for SOP implies $2^\alpha \log k$ approx for group Steiner problem

Consequences:

$O(\log^2 n)$ approx for group Steiner problem in quasi-poly time

$\Omega(\log^{1-\varepsilon} n)$ hardness for SOP unless NP is contained in quasi-poly time

Reduction size lower bound

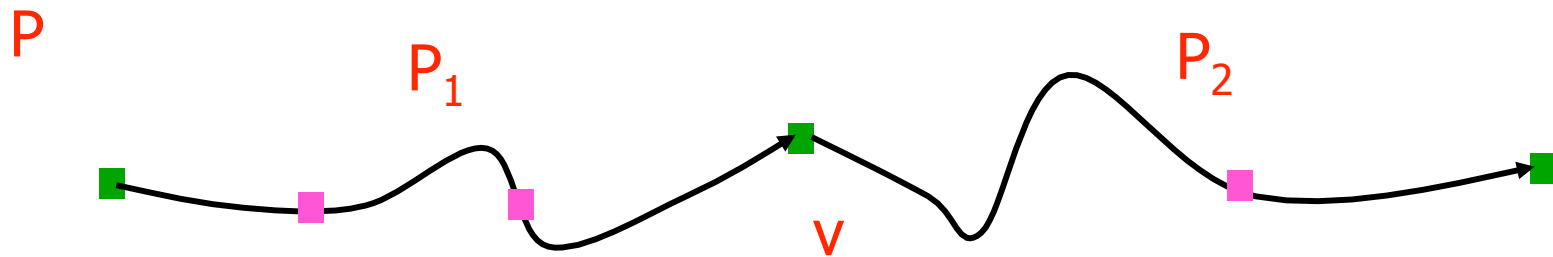
Unless $NP \subseteq \text{quasi-polytime}$ no $\log^{2-\epsilon} n$ approx. for group Steiner problem [Halperin-Krauthgamer'03]

Can we obtain $\log^{2-\epsilon} n$ hardness under $P \neq NP$?
Can reduction size be polynomial?

No, unless $NP \subseteq \text{sub-exponential time}$

From $\log^{1-\epsilon} n$ approx in subexp time for SOP

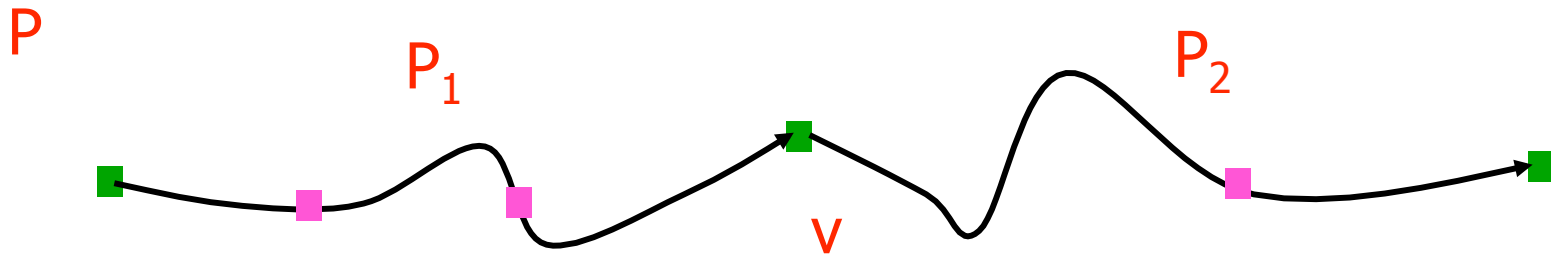
Proof



$$|P_1| \geq |P_1^*| / \log(k/2)$$

$$|P_2| \geq ? / \log(k/2)$$

Proof



$$|P_1| \geq |P_1^*| / \log(k/2)$$

$$\begin{aligned} |P_2| &\geq |P_2^* \setminus P_1| / \log(k/2) \\ &\geq (|P_2^*| - |P_1|) / \log(k/2) \end{aligned}$$

Proof contd

$$|P| \geq (|P^*| - |P|) / \log(k/2)$$

$$\begin{aligned} |P| &\geq |P^*| / (1 + \log(k/2)) \\ &\geq |P^*| / \log k \end{aligned}$$

Lemma: α approx for recursive step implies $\alpha+1$ approx for greedy step

[Fisher-Nemhauser-Wolsey'78]

Open Problems: Summary

	Undir Graphs	Dir Graphs
Orienteering	$2+\epsilon$	$O(\log n)^*$ $O(\log^2 n)$
k-Stroll	$2+\epsilon$?
Orienteering-TW	$O(\log^2 n)$ $O(\log L_{\max})$	$O(\log n)^*$ $O(\log^4 n)$ $O(\log^2 n \log L_{\max})$
Multiple TWs/node	$O(\log n)^*$	$O(\log n)^*$

Only APX-hardness for all of the above problems!

* : quasi-poly running time