

Graph Exploration Algorithms

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Outline

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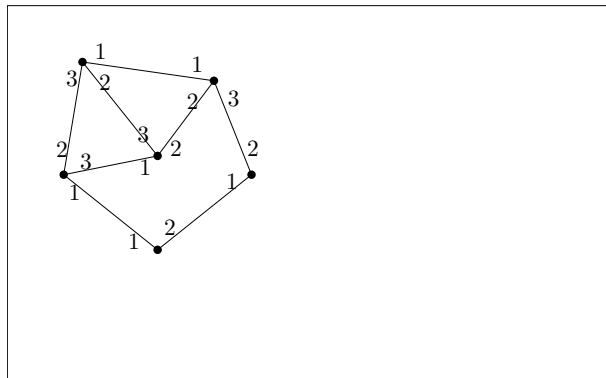
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 - exploration **time** of **labeled** graphs

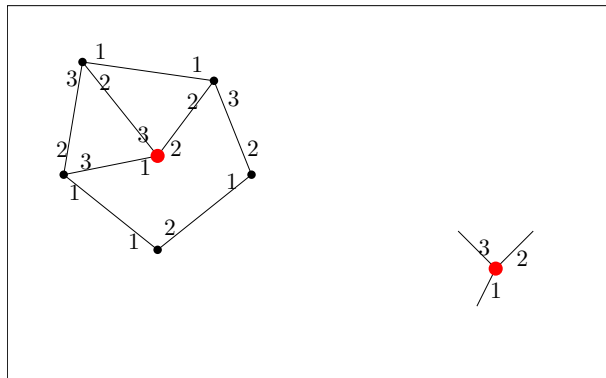
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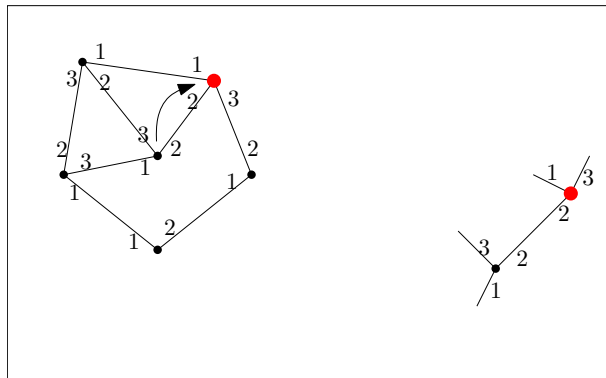
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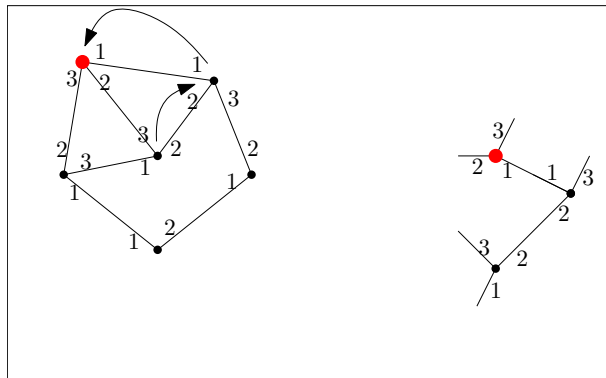
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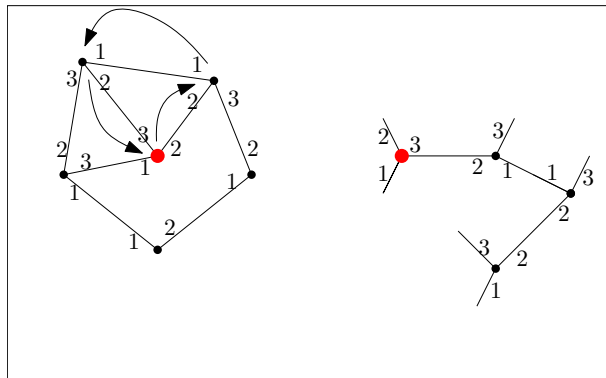
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- impact of knowledge
 - Note: size of advice for an arbitrary n -node graph is $\Theta(n \log n)$ for connected monotone edge search [Nisse & Soguet'07] ($\log n$ bits of advice are provided to vertices having *whiteboards*)

Unknown labeled graphs

- vertices have unique identifiers
- agent is able to distinguish incident edges

Exploring unknown labeled graphs

Theorem (Panaite & Pelc'99)

There exists an exploration algorithm with penalty¹ $3n$ for any n -node graph.

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- *greedy approach does not work (penalty $\omega(n)$)*

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Piecemeal exploration

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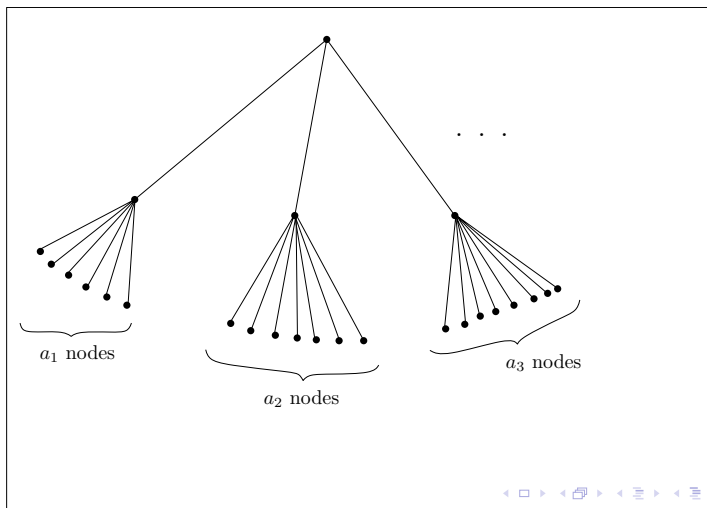
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- agent initially located at a **homebase**
- agent has a **battery** of limited size B : it needs to return to the homebase to recharge after at most B edge traversals)
- minimize the number of **trips** (i.e., recharging events)
 - (closely related model to *tethered* agents)

Piecemeal exploration — offline version (complexity)

Simple reduction from 3-partition (Instance: $S = \{a_1, \dots, a_{3m}\}$.
Q.: is there a partition of S into m sets of the same sum W ?)

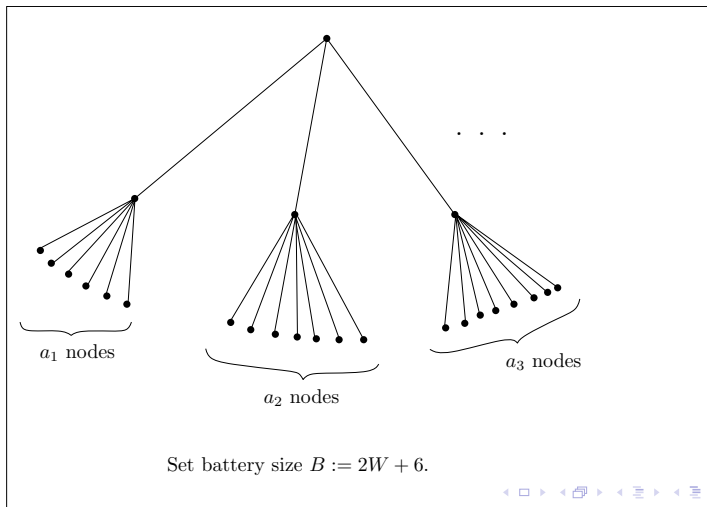
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Piecemeal exploration (short survey)

Theorem (Awerbuch et al.'99)

There exists a $O(m + n^{1+o(1)})$ -time piecemeal exploration algorithm with battery size $(2 + \alpha)r$ in any undirected graph, where r is the radius of the graph and $\alpha > 0$ is some constant.

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Theorem (Duncan, Kobourov & Kumar'06)

There exists a $O(m/\alpha)$ -time piecemeal exploration algorithm with battery size $2(1 + \alpha)r$ in any undirected graph, where r is the radius of the graph and $\alpha > 0$ is some constant.

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- equivalent to piecemeal exploration when we insist that each agents needs to return to the homebase; different without this assumption
- we aim at a stronger algorithm that uses **local** communication
- approach that sometimes works: start with **global** communication and then patch your solution

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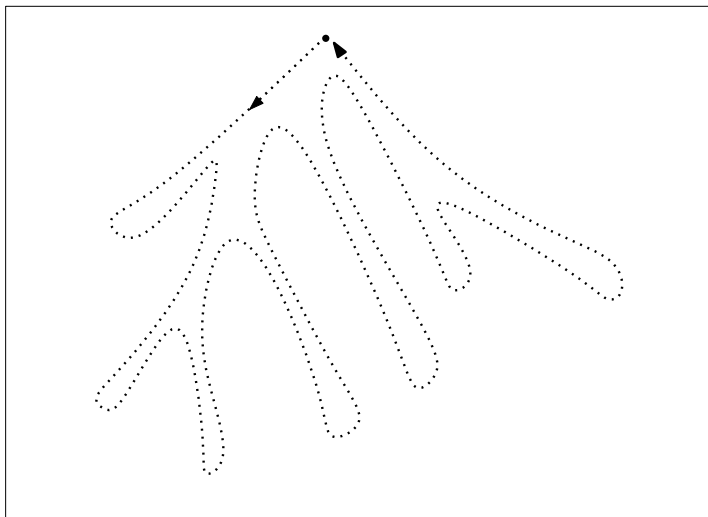
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- Example 2: keep the battery size B but increase the number of agents [our second example below; without returning to the homebase]

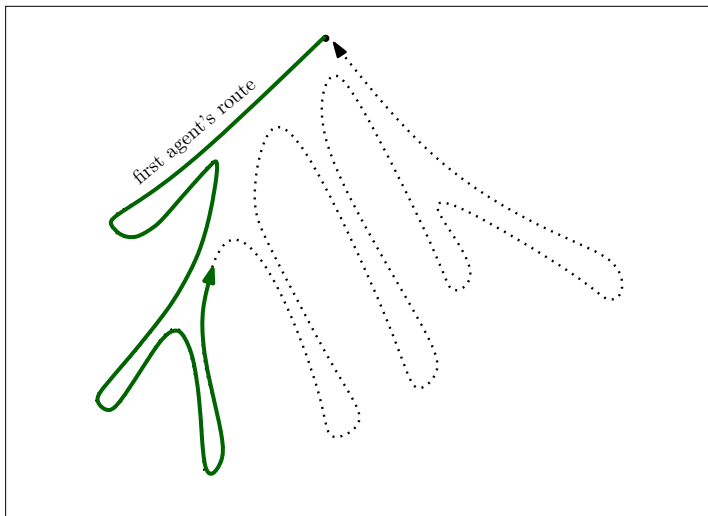
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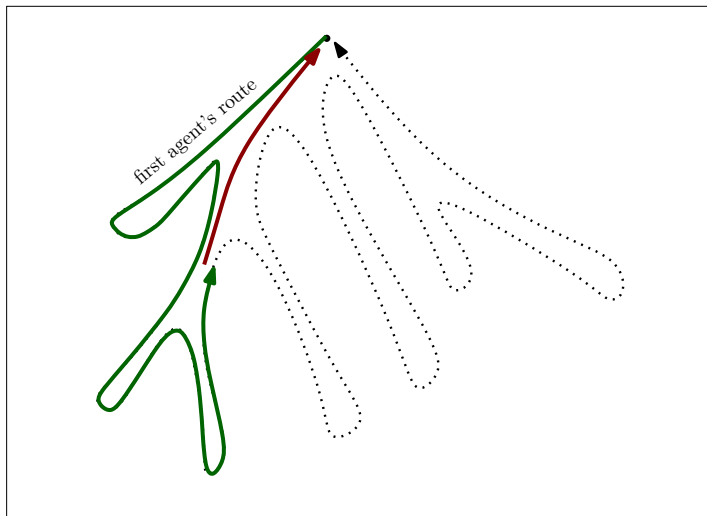
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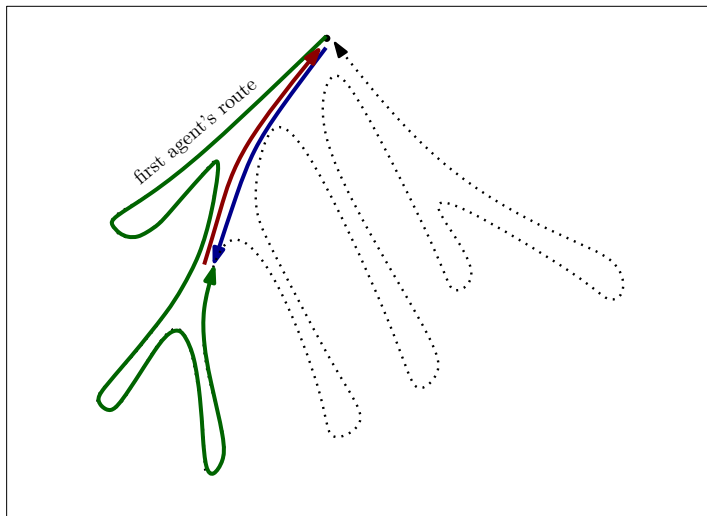
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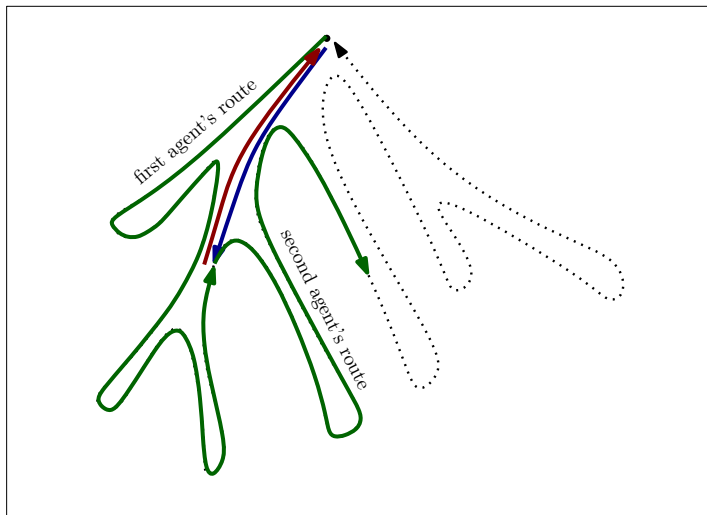
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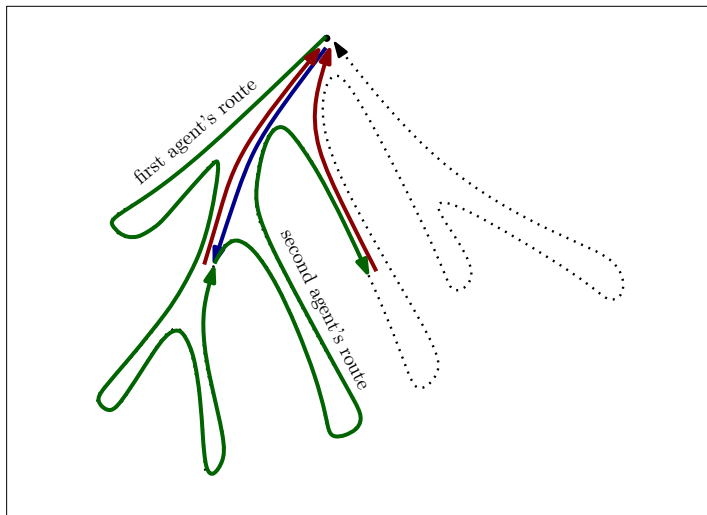
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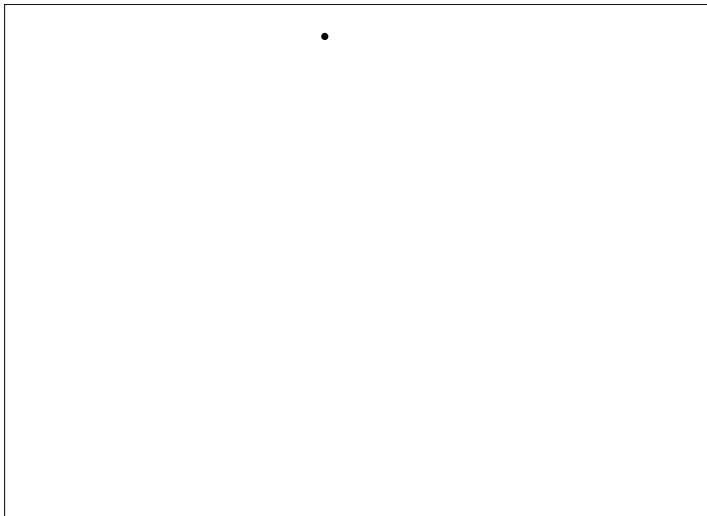
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Theorem (Dyenia, Korzeniowski & Schindelbauer'06)

There exists a 8-competitive algorithm that explores any unknown input tree by energy constrained agents using local communication.

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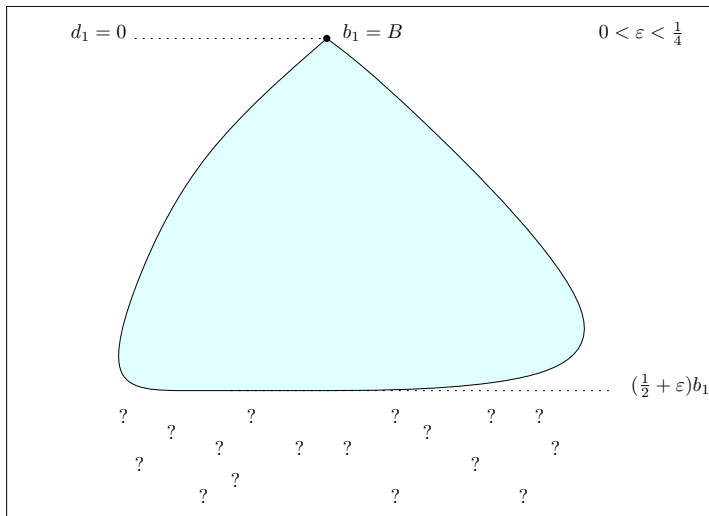
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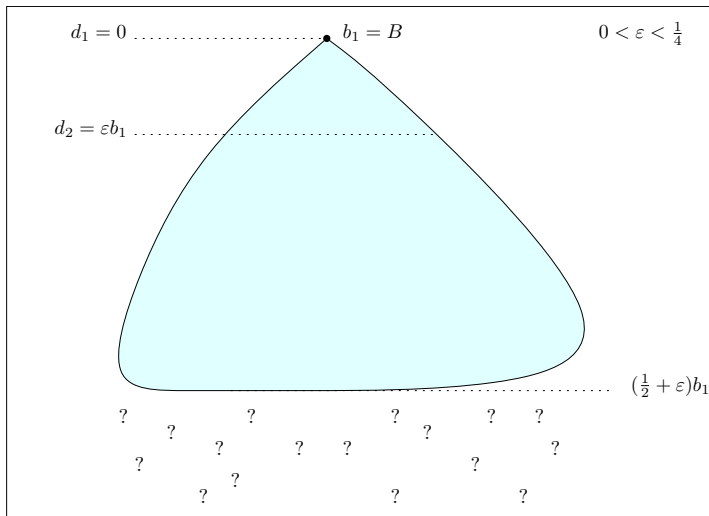
$d_1 = 0$ ● $b_1 = B$

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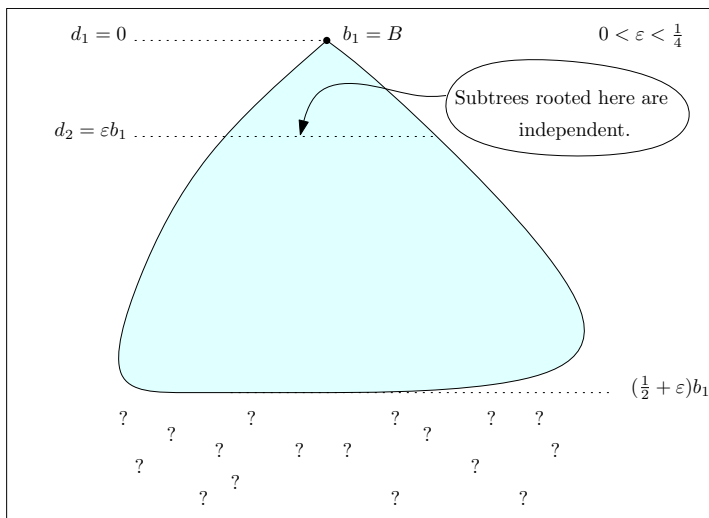
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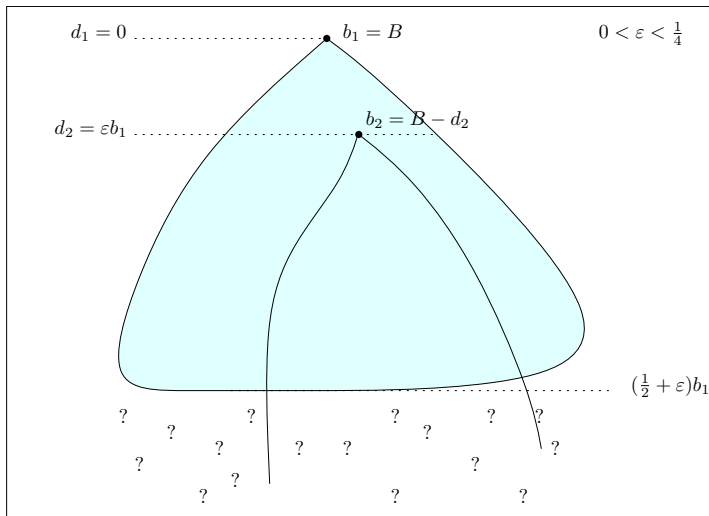
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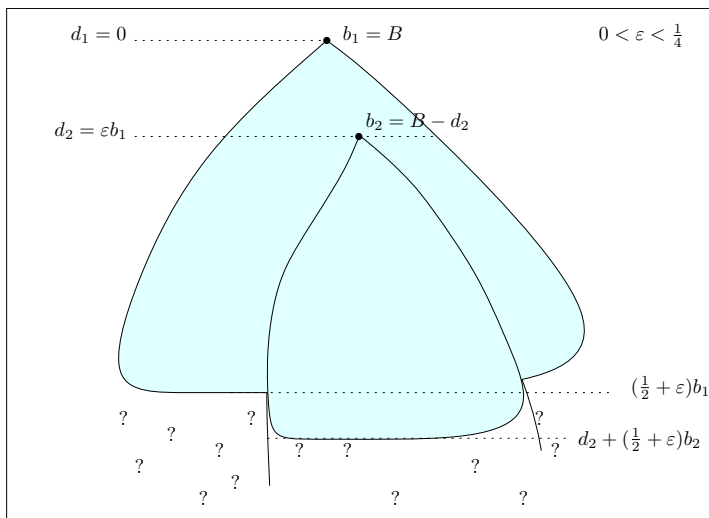
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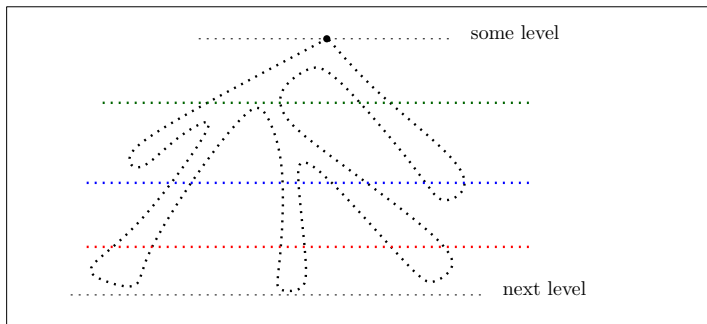
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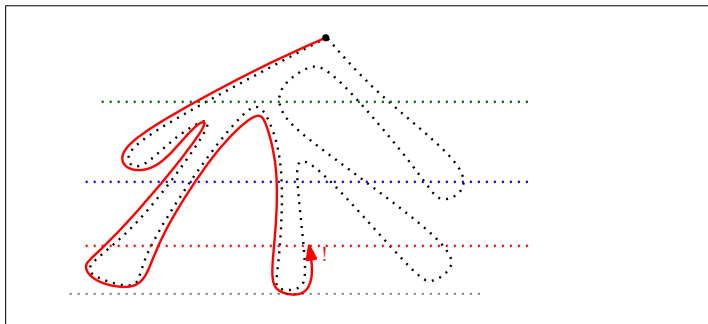


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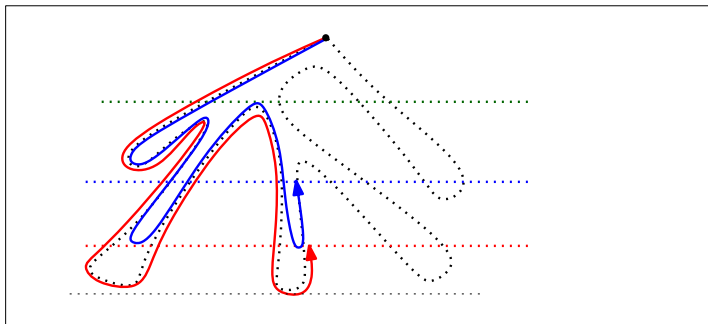


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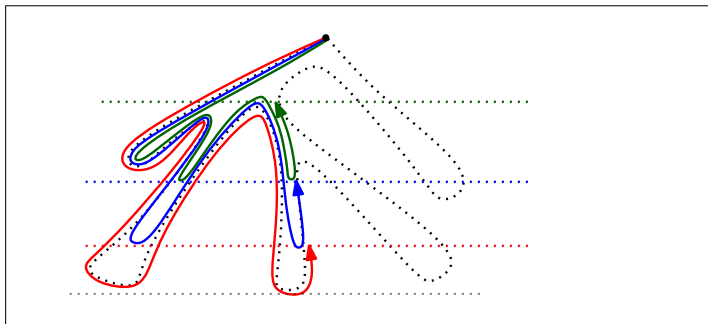


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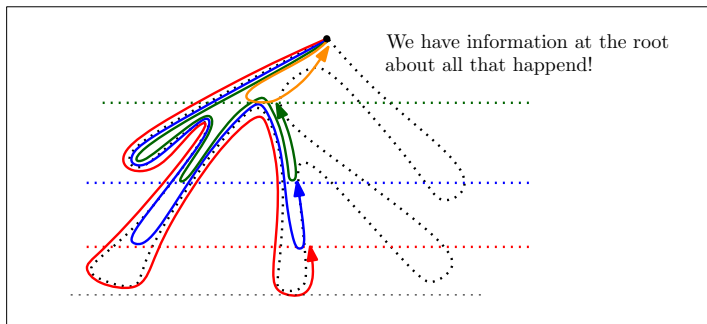


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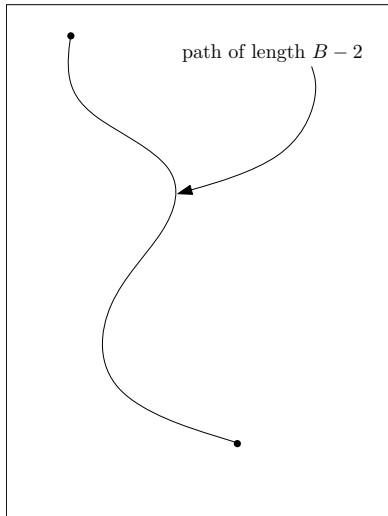
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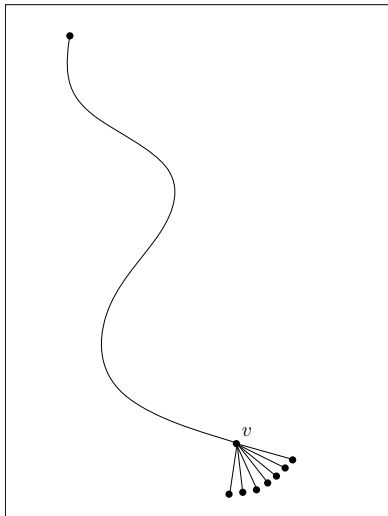
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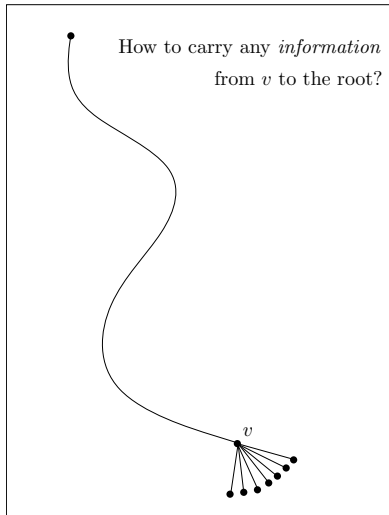
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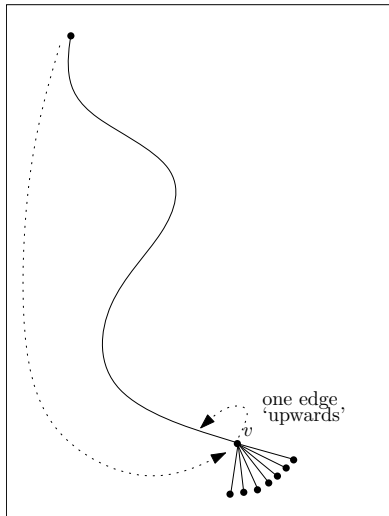
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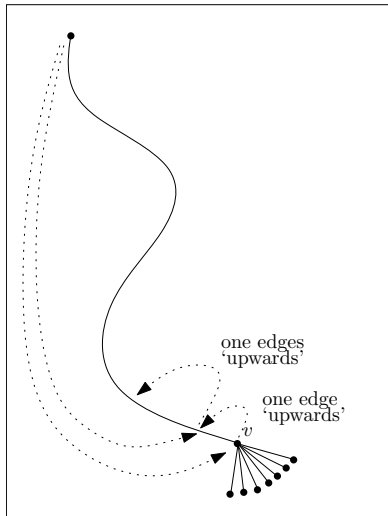
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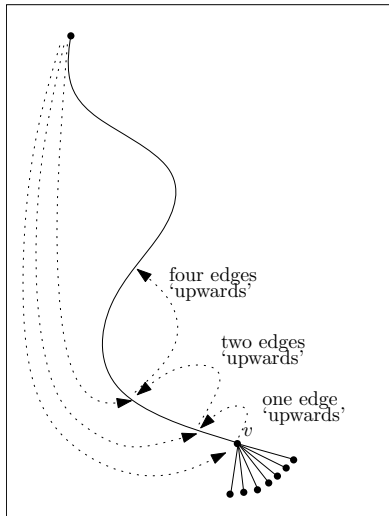
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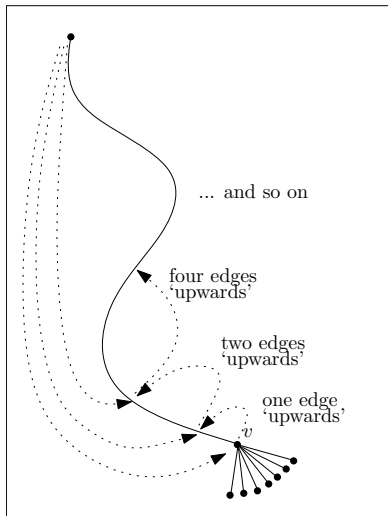
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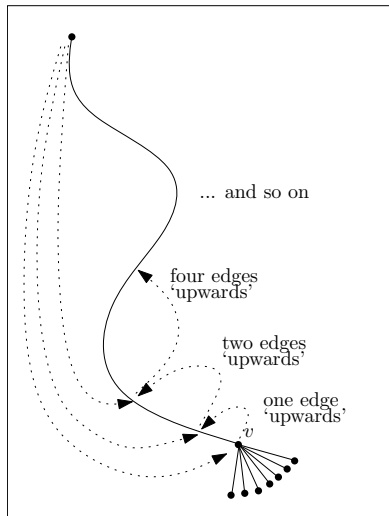


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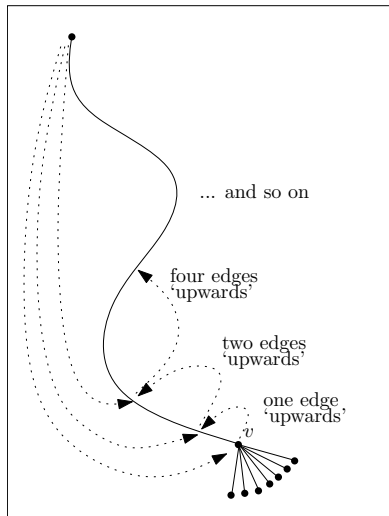
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- this information is the number of leaves
- Claim: $\Omega(\log B)$ agents are necessary for some graphs.

Exploration time

- a team of k robots start at the root of a tree
- the goal is to explore the tree

Unknown tree exploration — a short survey

- time $O(D + n/\log k)$ using whiteboards at nodes [Fraigniaud et al.'06]
 - this gives competitive ratio of $O(k/\log k)$ w.r. offline optimal $O(D + n/k)$
 - intermediate algorithmic step via global communication

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- exploration in time $O(D)$ with a polynomial number of agents [D. et al.'13]
 - time $D(1 + \frac{1}{c-1} + o(1))$ using Dn^c for any $c > 1$; global communication (Example 3)
 - time $D(1 + \frac{2}{c-1} + o(1))$ using Dn^c for any $c > 1$; local communication (Example 4)
 - time $O(D \log n)$ using $k = (2 + \varepsilon)nD$ agents and local communication in general graph, for any $\varepsilon > 0$

Example 3: Fast tree exploration (global communication)

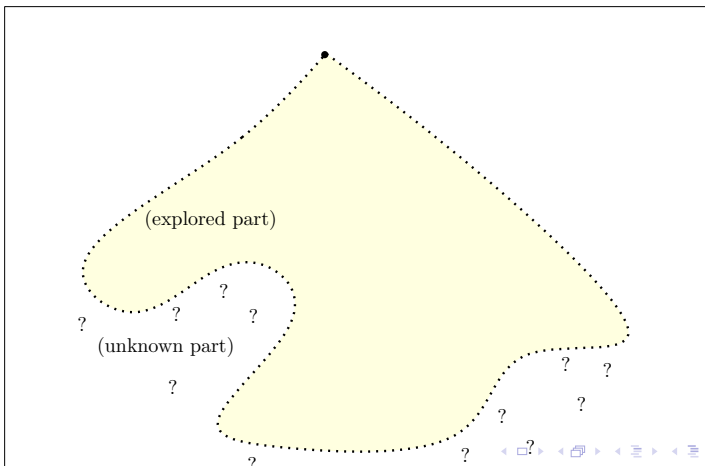
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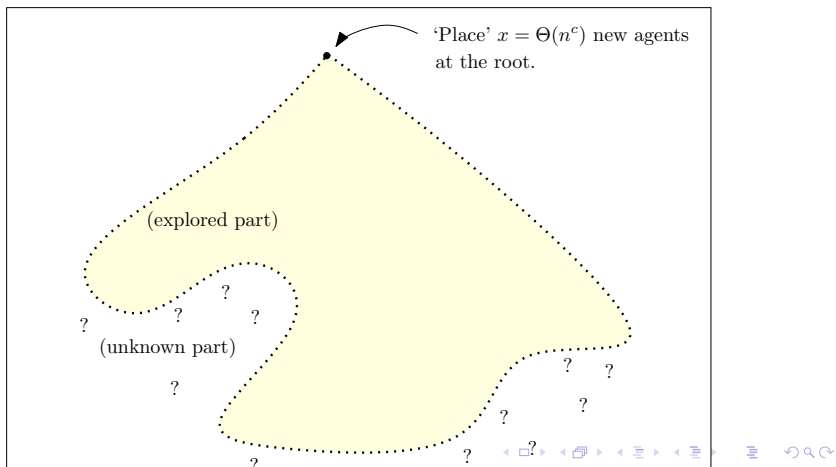
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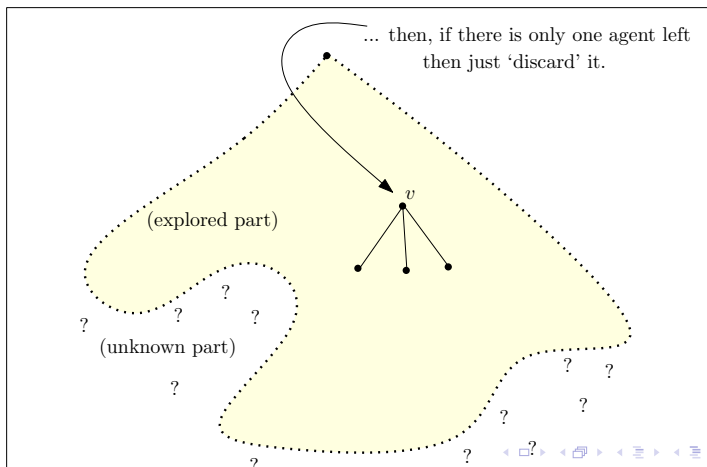
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Example 4: Fast tree exploration (local communication)

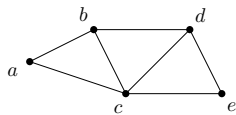
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- The goal: exploration **also** in time $O(D)$ with **polynomial** number of agents
- Single *step* is as follows:

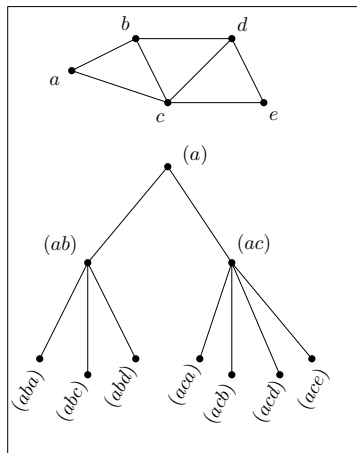


Fast graph exploration



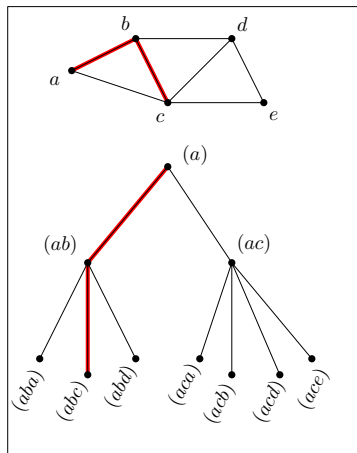
Fast graph exploration

- we simulate exploration of G by exploring a 'virtual' tree \mathcal{T}



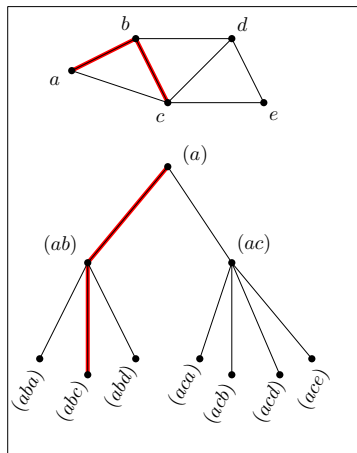
Fast graph exploration

- we simulate exploration of G by exploring a 'virtual' tree \mathcal{T}
- one virtual move in \mathcal{T} gives one step in G



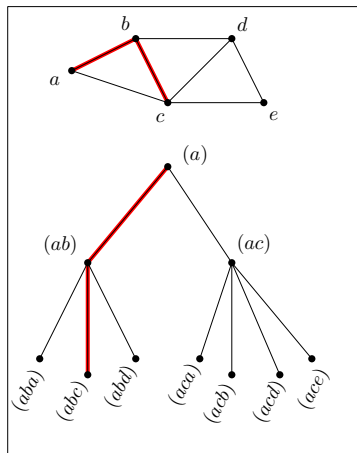
Fast graph exploration

- we simulate exploration of G by exploring a 'virtual' tree \mathcal{T}
- one virtual move in \mathcal{T} gives one step in G
- agent placed on P in \mathcal{T} is present at the end vertex of P in G



Fast graph exploration

- we simulate exploration of G by exploring a 'virtual' tree \mathcal{T}
- one virtual move in \mathcal{T} gives one step in G
- agent placed on P in \mathcal{T} is present at the end vertex of P in G
- the size of \mathcal{T} is exponential but it is enough to explore a polynomial-size subtree



Thank you!