

# Exploring Sparse Graphs with Advice

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# Outline

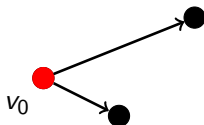
- 1 Introduction
  - Online graph exploration problem
  - Advice complexity
- 2 Structural Observations
  - The optimal solution  $S^*$
  - Graph induced by the edges of  $S^*$
- 3 The Algorithm
  - Idea of the algorithm
  - Advice complexity
- 4 General Graphs
  - Transforming unbounded graphs
- 5 Lower Bound
  - Idea
- 6 Summary

# Online Graph Exploration

Task: find a shortest tour visiting every vertex of an unknown graph  $G$  at least once.

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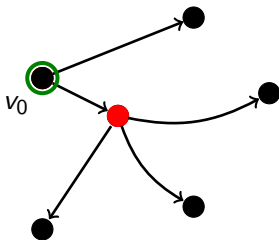
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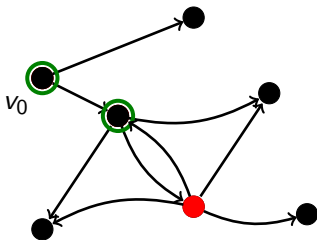
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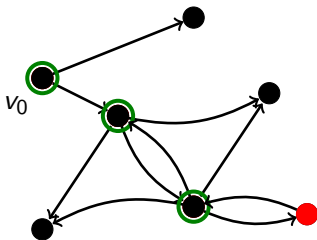
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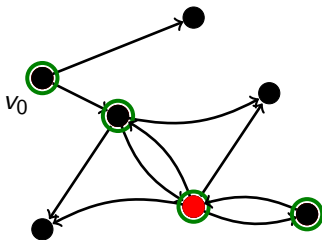
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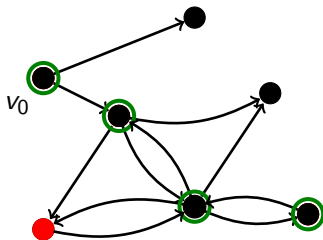


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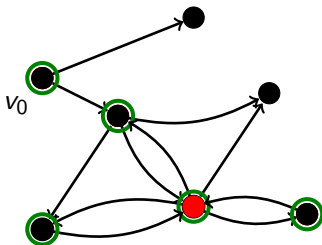
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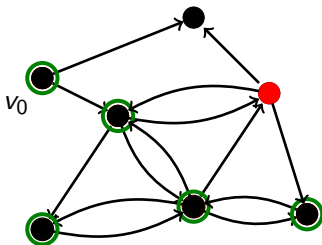
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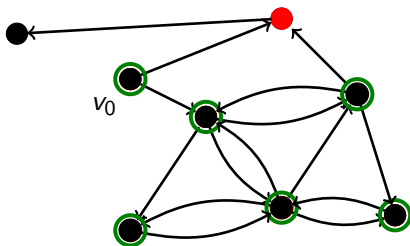
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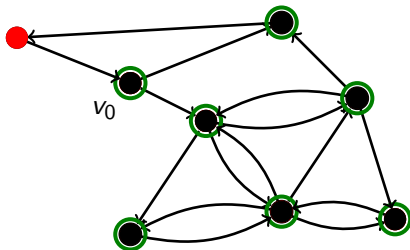
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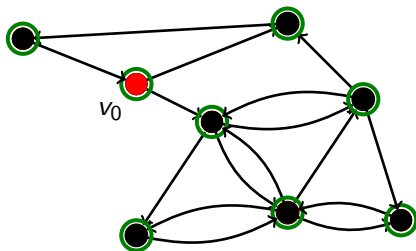
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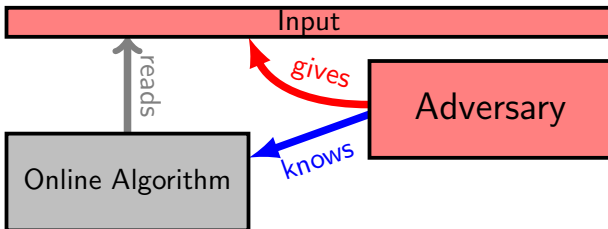
Algorithm can "buy" information about the future.

# The Oracle

Algorithm and oracle are a team and play against an adversary.

The classical setting:

- ▶ The algorithm receives the input step by step.
- ▶ Adversary knows algorithm and prepares worst-case input.

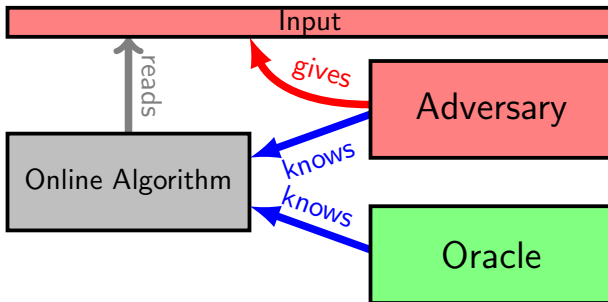


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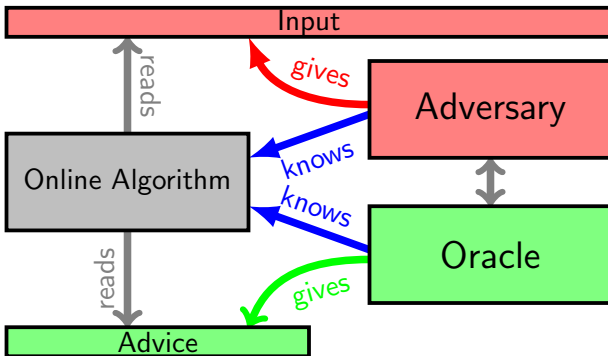


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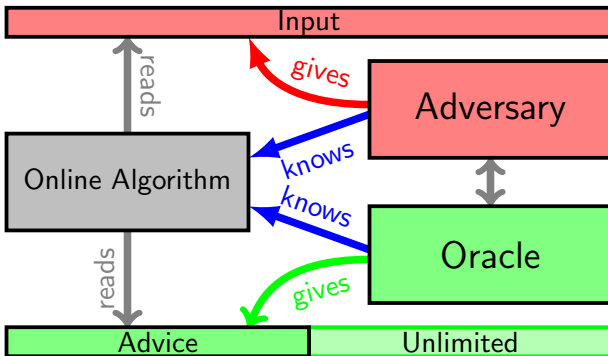


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# Problem and Setting Together

- ▶ Adversary constructs  $G$ .
- ▶ Oracle knows  $G$  and the optimal exploration tour  $S^*$ .
- ▶ Algorithm does not know  $G$ .
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We will show an algorithm that needs at most  $\mathcal{O}(m)$  bits of advice.

# Edges

For sake of simplicity, we assume that every vertex in  $G$  has at most two incoming edges and at most two outgoing edges.

$G = (V, E)$  is strongly connected with  $|V| = n$  and  $|E| = m$ .

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The edges are classified with respect to  $S^*$ :

- ▶  $E_0$ : Set of edges that are never used in  $S^*$ .
- ▶  $E_1$ : Set of edges that are used precisely once in  $S^*$ .
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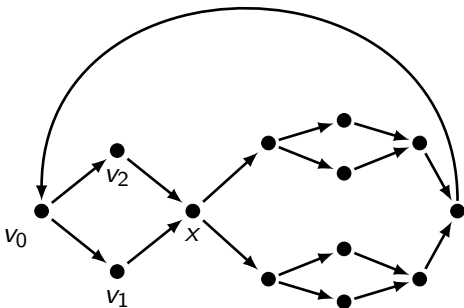
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→  $\log(3) \cdot m$  bits of advice.

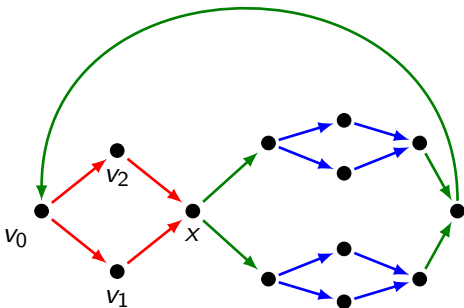
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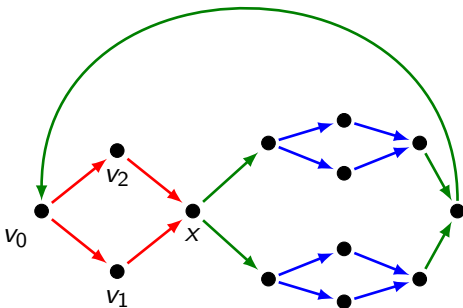
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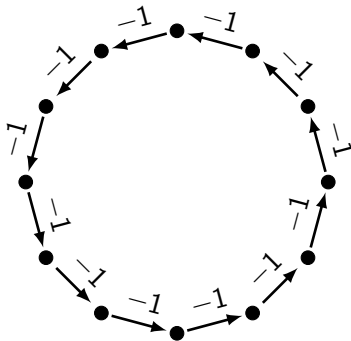


But the oracle can choose an optimal solution  $S^*$  that fulfills certain properties.

# Properties of $S^*$

The oracle fixes an optimal solution such that the edges from  $E_{Multi}$  do not form a cycle.

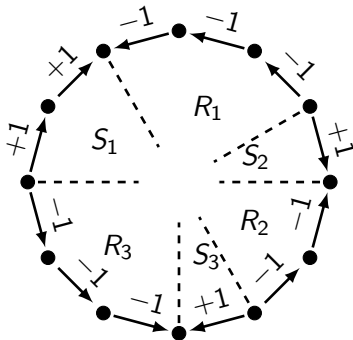
Obviously the edges from  $E_{Multi}$  cannot form a directed cycle.



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Even in the underlying undirected graph.



$R_i$  and  $S_i$  are paths of edges from  $E_{Multi}$  to the same vertex.

# The Graph Structure

The graph  $F = (V, E_{Multi})$  is a forest.

Even the underlying undirected graph of  $F$  is cycle-free.

The Graph  $G_{S^*} = (V, E_1 \cup E_{Multi})$  contains cycles.

Thus, every cycle contains at least one edge from  $E_1$ .

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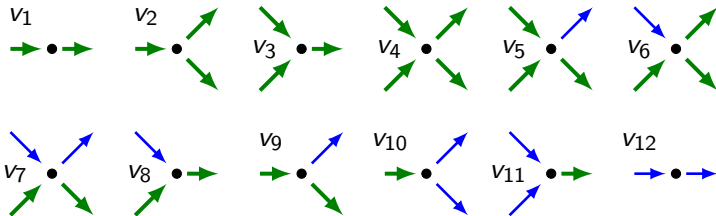
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There are only twelve edge configurations possible:



## Rough Idea

A vertex that is visited  $x$  times in  $S^*$  is part of  $x - 1$  interchangeable cycles.

Last traversal is part of the “main” cycle that starts and ends at  $v_0$ .

The interchangeable cycles can be traversed in any order.

The algorithm needs to be careful:

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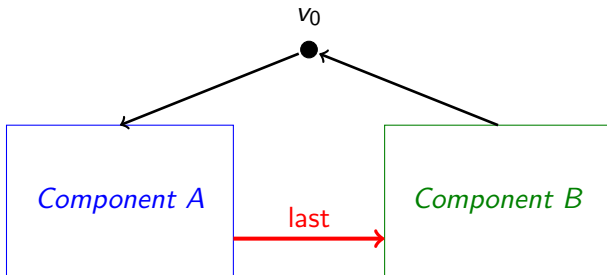
- ▶ Finish all interchangeable cycles before continuing the “main” cycle.
- ▶ Edges cannot be traversed more often than in  $S^*$ .



# What can go wrong?

The algorithm needs to avoid to cut off components.

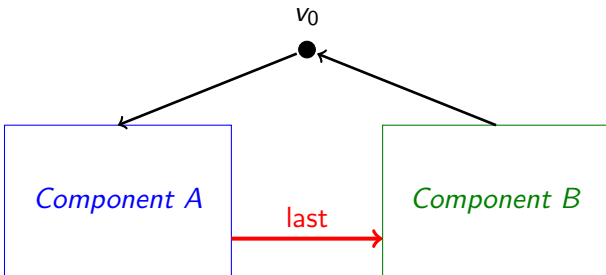
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The algorithm asks for every vertex once, which of the two outgoing edges is *last*.  $\rightarrow n$  bits of advice.

# Number of Traversals $\#_{S^*}$

$2n + \log(3)m$  bits of advice tell the algorithm which edges are used precisely once, never, more than once and which edges are *last*.

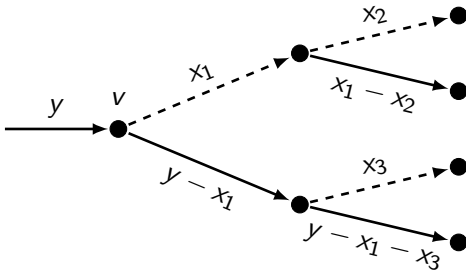
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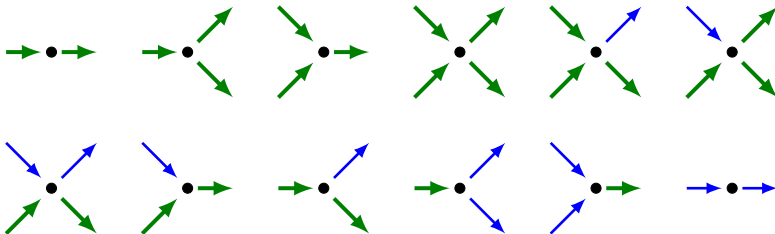
The numbers of traversals influence each other.



If  $\#_{S^*}(e)$  is known, the algorithm will not make any mistake.

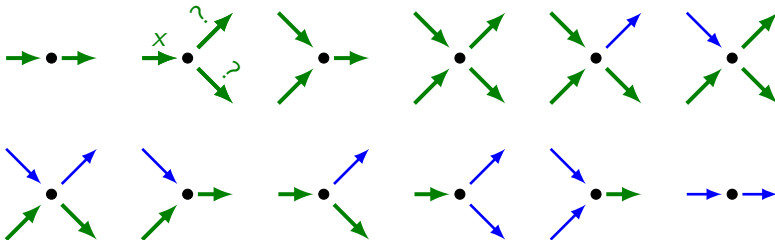
# Heavy and Light Edges

Remember the edge configuration for  $G_{S^*} = (V, E_1 \cup E_{Multi})$ .



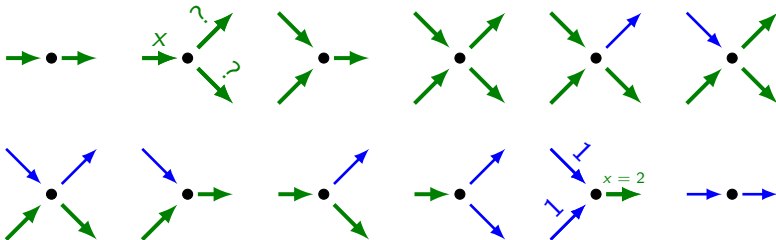
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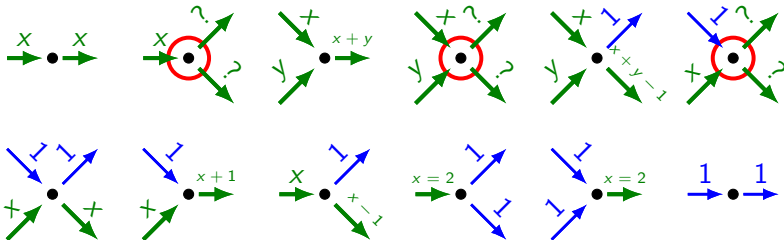
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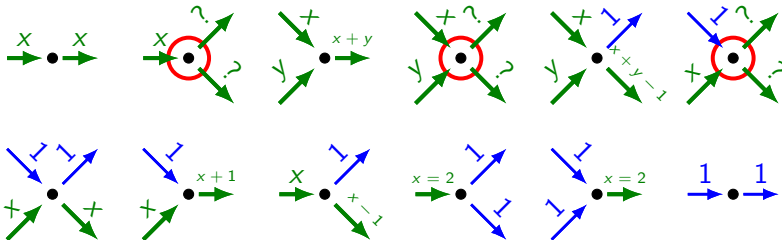


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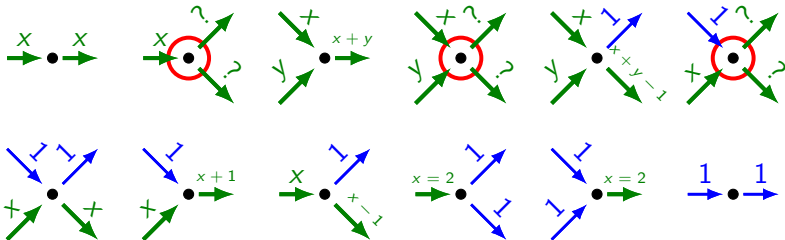


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Ask which edge is less often used:  $\#_{S^*}(e_1) \leq \#_{S^*}(e_2)$ ?

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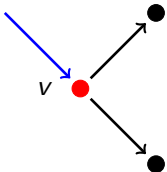
The less often used edge is called *light*.

Additionally, the algorithm asks for its precise number of traversals.

# Traversing the Edges from $E_{Multi}$

The algorithm follows the path of *heavy* edges.  
(Relatively large and unknown number of traversals)

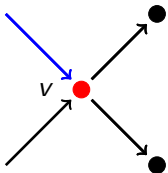
The algorithm enters a vertex  $v$  for the first time.



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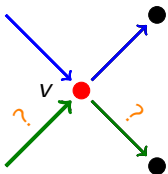
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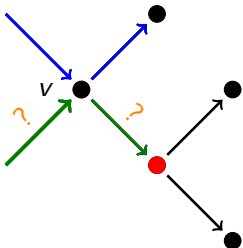
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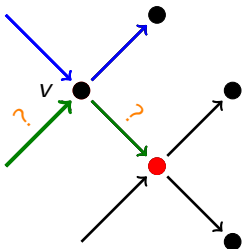
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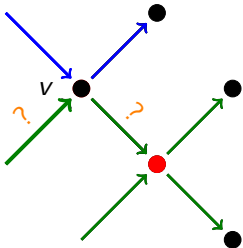
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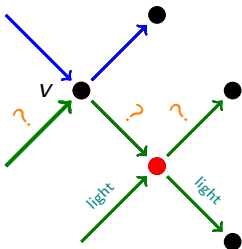




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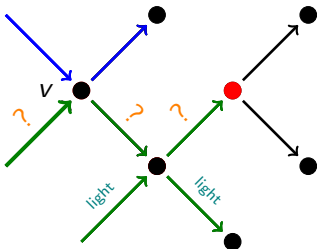
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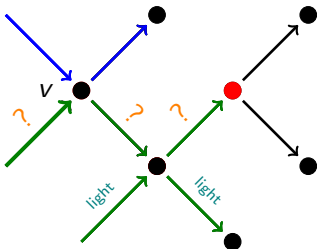
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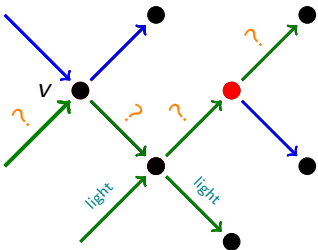
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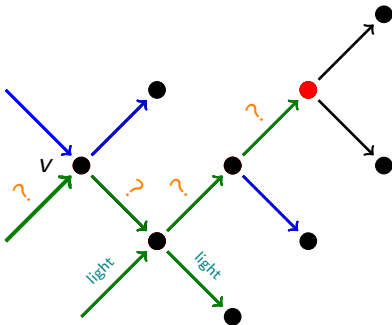
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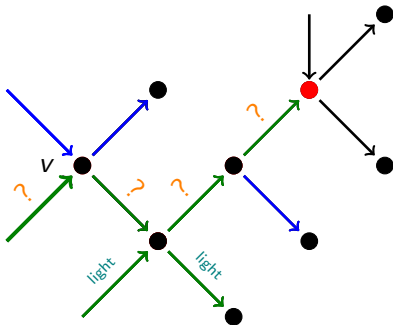
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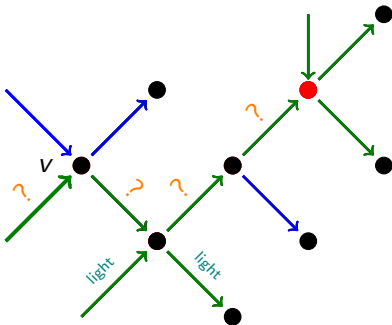
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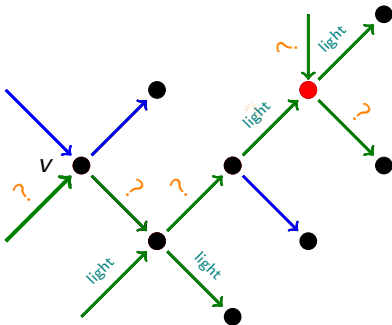
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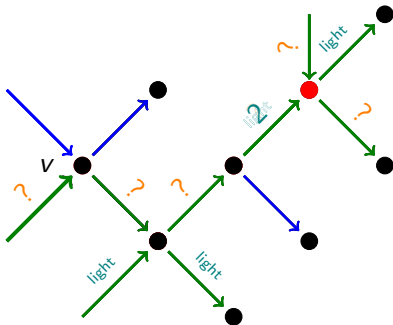




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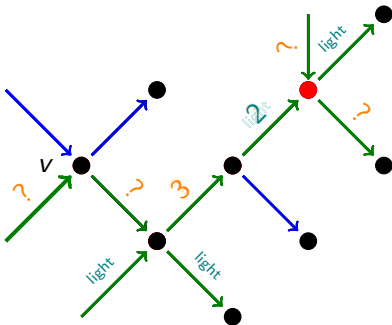
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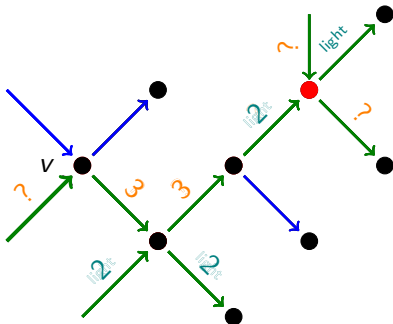
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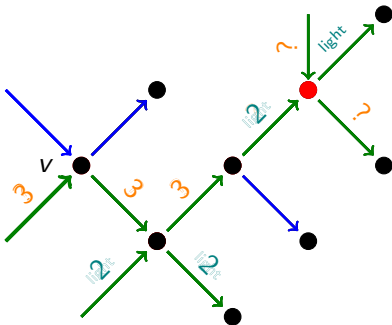
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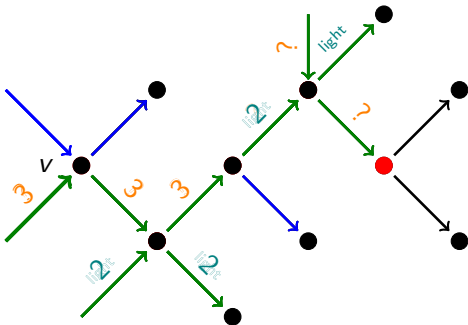
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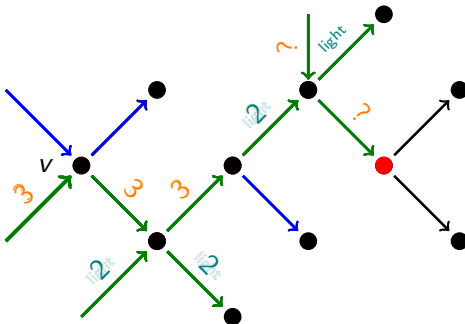
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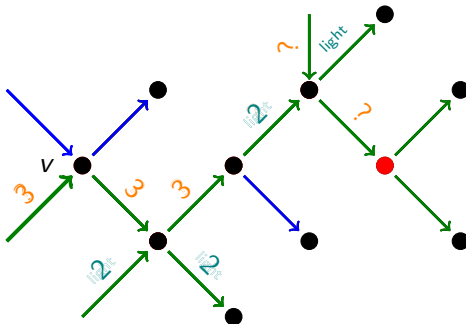
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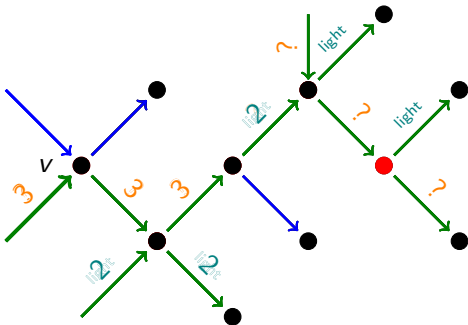
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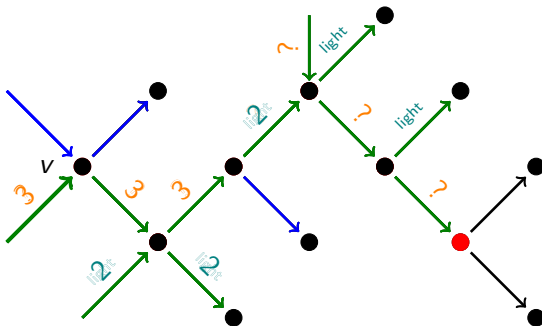




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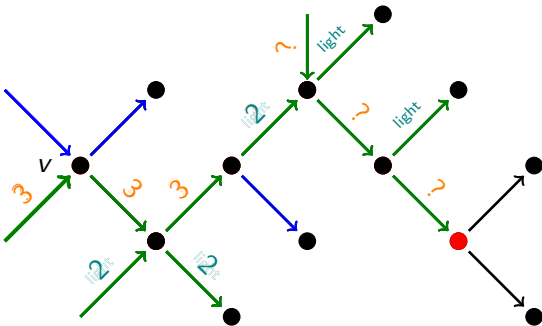
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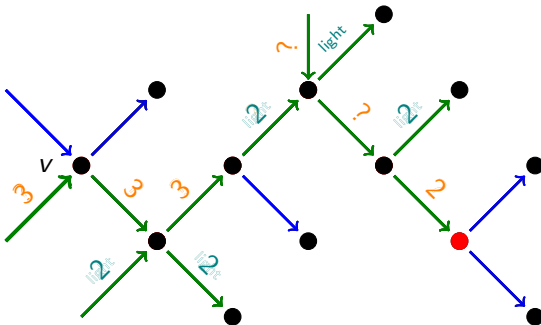




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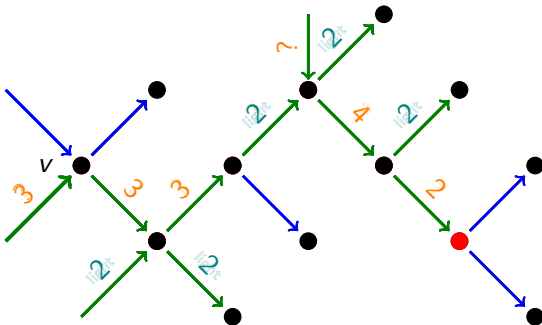
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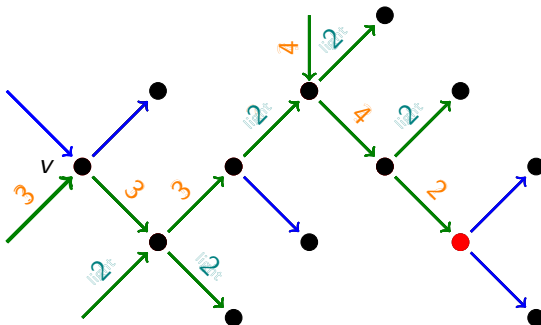
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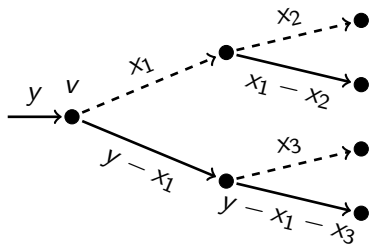
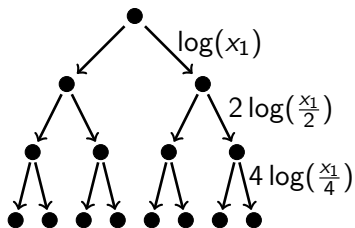
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For every pair of multi-edges, the algorithm asks for the *light* edge and its **number of traversals**.

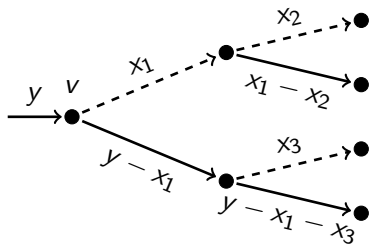
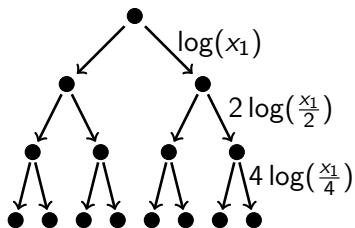


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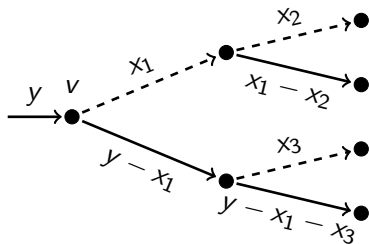
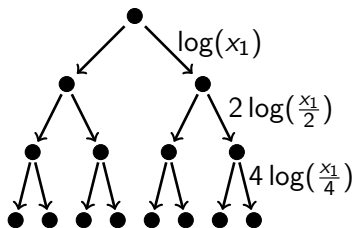
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Per induction:  $g(y) \leq \frac{5}{2}y$

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## Theorem

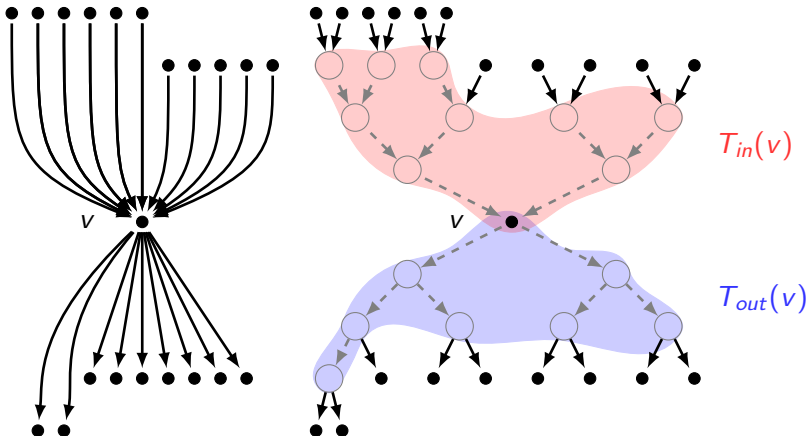
*There exists an online algorithm which solves the graph exploration problem using  $4n + (\log(3) + 5)m$  bits of advice on a given unknown directed graph  $G = (V, E)$  with in- and outdegree bounded by 2.*



# Unbounded Degree Graphs

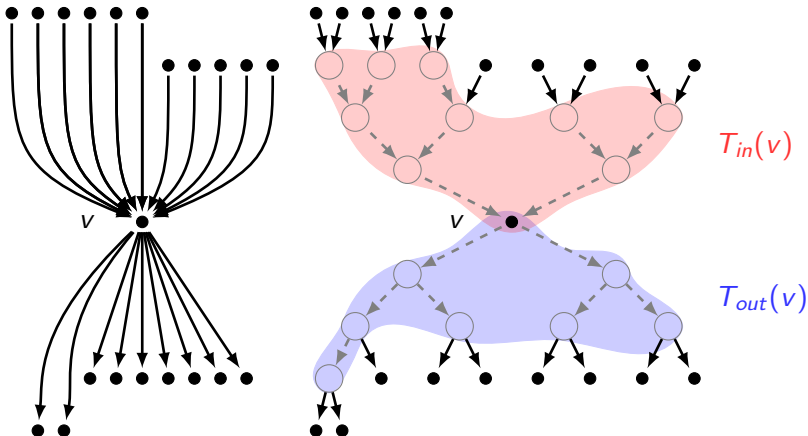
Oracle and algorithm agree on a transformation of the graph.

Virtual vertices and edges are added to reduce the vertex degree.



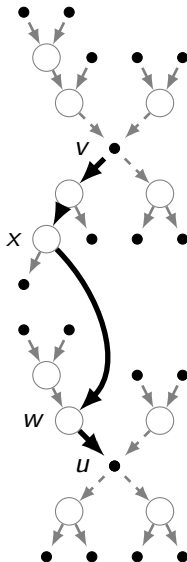
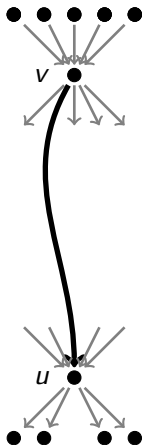
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The virtual edges are always in  $E_{Multi}$ .

# Edges after Transforming the Graph



## Lower Bounds with Advice

A technique to prove lower bounds is the partition tree:

Try to find a family of instances  $\mathcal{I}$  with the same prefix.

These instances should require different decisions to compute the optimal solution.

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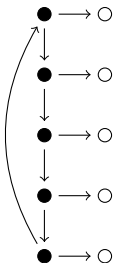
The main argument is that every instance needs a different advice string.

Thus, **every** algorithm needs at least

$$|\mathcal{I}| = 2^{\log_2(|\mathcal{I}|)} > 2^{b(|\mathcal{I}|)}.$$

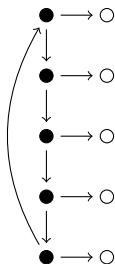
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An instance from  $\mathcal{I}$  consists of two parts.  
Part  $A$  consists of cycles with length  $x = 5$ .



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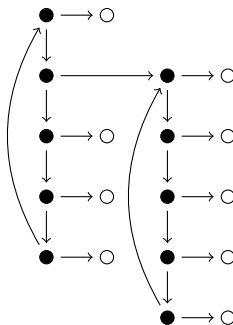
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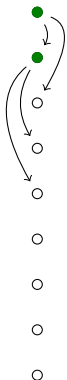
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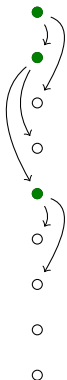
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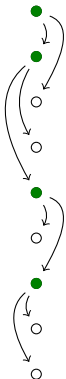
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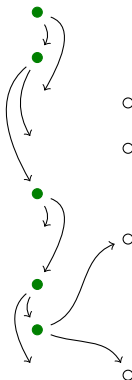
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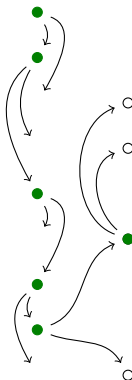
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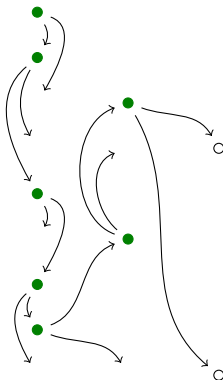
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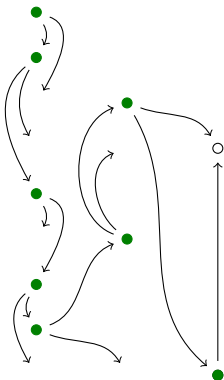
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Thus, we need slightly more than  $n$  bits of advice to solve the lower bound construction optimal.

# Results

$n \log(n)$  is the known upper bound for the advice complexity.

Improvement for sparse graphs:

<b>graph model</b>	<b>exploration</b>	<b>upper bound</b>
directed	cyclic	$2n + 23m$
directed	path	$2n + 23m + \lceil \log(n) \rceil$
undirected	cyclic	$\log(6)(n + m) + 42m$
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The input graph can be weighted or unweighted.

The algorithm works mainly with the number of traversals.



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The input graph can be weighted or unweighted.

The algorithm works mainly with the number of traversals.

The lower bound is slightly larger than  $n$ .

# Future Work

The newest result:

## Theorem

*There exists an online algorithm with advice that uses  $5.25n$  bits of advice to solve the graph exploration problem on **directed graphs with a bounded outdegree of two**.*

The lower bound construction is a directed graphs with a bounded outdegree of two.

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# Thanks for your attention!