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Descrizione generata automaticamente con attendibilità bassa

Advanced Algorithms: Exercises Swiss Knife

Immagine che contiene simbolo, clipart, creatività

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# Graphs

## Properties of graphs

*Let be a simple, connected graph with vertices and edges. Then:*

1. *is a tree*
2. *is connected*
3. *is acyclic (i.e., is a forest)*

*Prove the previous properties*.

Solution

1. In the summation, every edge is counted exactly twice
2. In a simple graph, there are possible pairs of vertices
3. Fix a root on a vertex (so, consider as rooted tree, thanks to the equivalence between rooted tree and “free” tree). Then represent father-child relationships, which are (which means each non-root node has a unique father)
4. is a tree that may have cycles it can only have more edges than a tree
   1. Consider connectivity removes edges and keeps the graph connected without cycles, thanks to edges
5. is a tree that may not be connected it can only have less edges than a tree
   1. If it is a tree without cycles, it is a forest, and its maximum edges are

## DFS Exercises

1. *Given a graph and two vertices determine, if it exists, a path from to*
2. *Given a graph return a cycle (if any)*

Solution

* 1st exercise ( path)
  + add a field .
  + Modify s.t. when a is labeled
    - then
  + Run . Check if has been visited
    - NO: then return “No path”
    - YES: starting from , follow the “parent” label, so as to build a path from to
  + Complexity: where is the number of edges of connected component
* 2nd exercise (cycle) 🡪 we go back thanks to back edges because they “close” the cycles
  + add a field and add a field
  + is a then
  + is a then
    - then is an ancestor of in the DFS tree
  + Run DFS on each connected component
  + Check all the edges
    - as soon as an edge is found as
    - and
    - then return a cycle adding to all the edges found in the path from to
    - if no is found, then return “No Cycles” (it would be a tree)

Complexity for both algorithms: 🡪 invoked DFS once for each connected component

## Uniqueness of MSTs

Exercise (uniqueness of MSTs):

*Show that if the weights of the edges are all distinct then there exists exactly one MST.*

(*Hint: cut and paste argument – similar to the theorem correctness*)

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Descrizione generata automaticamente con attendibilità bassaSolution (with details of lesson but also other including Wikipedia and other sources)

Assume there are two MST different from each other, so the contrary and so an edge in one but not in the other; since weights are distinct, with min weight, call it , without loss of generality (not introducing any artificial assumption), and the argument is a cut-and-paste one (this choice will be unique, considering edge weights are all distinct from each other):

* add to this creates a cycle ; is (M)ST no cycles has an edge

* + because was chosen as the unique lowest-weight edge (only edge with minimum weight not in the other) among those belonging to exactly one of and
  + therefore the weight of must be greater than the weight of
* remove from get a new spanning tree with weight (so, smaller weight): contradiction, because is an MST!

Two conclusions can be done:

* more generally, if the edge weights are not all distinct then only the (multi-)set of weights in minimum spanning trees is certain to be unique; it is the same for all minimum spanning trees
* when the edge weights are not all distinct, it's possible for multiple different MSTs to exist
  + however, while the actual arrangement of edges in these MSTs may vary, the set of weights of the edges across all MSTs will remain the same
* conversely, *if weights are not all distinct, generally multiple MSTs can exist*

Other exercises

1. *Is the converse true? (e.g., are weights necessarily unique for every possible graph and this has to hold for every graph)*

Solution

No: think of as a tree (literally only thing professor will write – lame, I know, I added more).

A connected graph with repeated edge weights and this can still have a unique minimum spanning tree. Considered the trivial example of being a tree; in this case, there are no cycles, so any spanning tree will be minimal, hence unique, regardless of repeated edge weights.

In conclusion, we might say:

* Distinct weights guarantee a unique MST
* Repeated weights can have multiple MSTs
  + but the set of weights used will always be the same across all of them

1. *Show that the second best MST, that is, the spanning tree of second-smallest total weight, is not necessarily unique (here we look for only one graph)*

Solution

Immagine che contiene calligrafia, diagramma, linea, Carattere

Descrizione generata automaticamenteThere will be a unique MST, but for the second best, according to where the cut will be displaced, there will definitely be more than one, given the cut can be done on more than two edges at a time.

If you want a complete formal explanation, see the book solution to this exercise [here](https://viterbi-web.usc.edu/~shanghua/teaching/Spring2010/public_html/files/HW2_Solutions_A.pdf) (look for problem B in the link).

## Kruskal Union-Find

*Argue that the complexity of (and of ) is .*

Solution

Initially, . can only increase because of a Union in which the root of the tree of points to another root (depth increases by 1 by construction). This happens only when the tree of gets merged to a tree of size not smaller (at least as big) when the depth of increases, the size of the tree of at least doubles.

* How many times can this happen?
  + times (at most)
    - therefore the depth of cannot increase more than times

So, we have two different algorithms with complexity . To reach complexity is still an open problem (there are slightly faster algorithms, but not not others optimal able to reach ).

## Dijkstra with Heaps

*Write an implementation of Dijkstra’s algorithm with heaps.*

Solution

(almost identical to Prim’s implementation with heaps)



(This algorithm gives only the length of the path, but it’s not difficult to also insert the actual path inside of this one)

*Complexity:*

* considering graph as adjacency list, vertices and edges
* iterations because of heap usage

Total number of operations: (there are operations on heaps)

## Eulerian Circuit in Linear Time

Problem:

*Given an undirected graph, an eulerian circuit is a cycle that traverses all the edges only once.*

*Show it can be solved in linear time.*

Solution

To solve the problem of finding an Eulerian circuit in an undirected graph in linear time, we can use the following algorithm:

1. Check if the graph is connected and has at most two vertices with odd degrees. If there are more than two vertices with odd degrees, then an Eulerian circuit cannot exist.
2. If there are exactly two vertices with odd degrees, start the Eulerian circuit at one of them. Otherwise, start from any vertex.
3. Traverse the graph using the following strategy:
   * At each vertex, choose an unvisited edge (if one exists) and traverse it.
   * If there are no unvisited edges at the current vertex, backtrack to the previous vertex.
4. If you can traverse all the edges and end up at the starting vertex, then an Eulerian circuit exists. Otherwise, an Eulerian circuit does not exist.

This algorithm works in linear time because it visits each edge exactly twice (once during the traversal and once during backtracking) and performs constant-time operations at each vertex. Therefore, the time complexity is , where is the number of vertices and is the number of edges in the graph.

There is an existing algorithm doing this done by *Hierholzer*, which showed the sufficient condition in Euler theorem, which states “a graph is connected if an only if has all nodes of even degree or if it has exactly two nodes of even degree”. It works for both directed and undirected graphs and works as follows:

*Preconditions*:

* All vertices in the graph must have even degrees

*Steps*:

* Start at any vertex (each one can be a starting point) and follow a trail of edges until returning to the starting vertex. This forms a partial circuit
* If the partial circuit covers all edges, the algorithm is complete. Otherwise, select any vertex in the current circuit that has unused edges and start a new circuit from that vertex, merging it into the previous circuit
* Repeat step 2 until all edges have been used
  1. At some point, we will visit a vertex and there will be no edges to follow
  2. Remember that Eulerian Cycle properties, every vertex should have even degrees or equal in-out degrees
  3. If we are stuck the first time it means that we formed a cycle, and the vertex that we are stuck on is the starting vertex. This means we returned where we started.
* The algorithm terminates when a complete Euler circuit is formed, where each edge is traversed exactly once, backtracking from the whole stack and holding complete knowledge of the structure

Hierholzer's algorithm has a linear runtime, making it an efficient method for finding an Euler circuit in a graph that meets the necessary requirements.

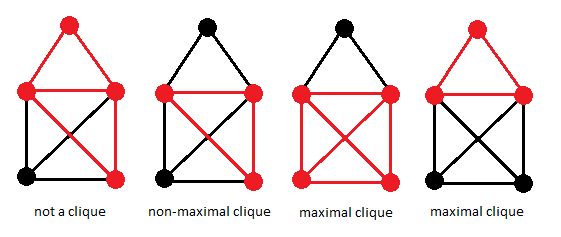
# NP-Hardness

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Descrizione generata automaticamente

## Clique is NP-Hard

* (Maximum) Clique: compute the longest complete subgraph
  1. other name for a complete graph (from now on, the problem will be called Clique)
  2. below, a useful figure to clearly see the problem

*Show that Clique is NP-Hard*.

Solution (a nice graphical explanation [here](https://opendsa-server.cs.vt.edu/ODSA/Books/Everything/html/clique_to_independentSet.html))

Immagine che contiene schizzo, disegno, clipart

Descrizione generata automaticamenteDecision version:

* Input:
* Output: in a clique of size ?

We operate a reduction from Maximum Independent Set (Ham. circuit is not really related to it; as you can see [here](https://www.cs.cmu.edu/~avrim/451f11/lectures/lect1108.pdf), one can use 3SAT in order to show Clique is NP-complete). Figure here shows Independent Set.

* *Intuition*
  1. clique: vertices with all edges between them
  2. maximum independent set: vertices with no edges between them
* *Definition*
  1. given a graph , its edge-complement has the same vertex and an edge set such that (so, no common edges)
* *Observation*
  1. a set of vertices is independent in is a clique in the largest independent set in has the same size as the largest clique in

Immagine che contiene disegno, schizzo, diagramma, Line art

Descrizione generata automaticamenteTo make it super complete, let’s draw the schema of what we are doing – takes time, givemn the constant work needed to traverse all edges *and* vertices:

## Vertex Cover is NP-Hard

* (Minimum) Vertex Cover: compute the smallest vertex in a given graph
  1. From now on, only called Vertex Cover

*Show that Vertex Cover is NP-Hard*.

Solution (once again, a nice graphical explanation of this one [here](https://opendsa-server.cs.vt.edu/ODSA/Books/Everything/html/independentSet_to_vertexCover.html))

Decision version:

* Input:
* Output: in a vertex cover of size ?

We operate a reduction from Maximum Independent Set (once again, this is the most similar problem to the one we are proving)

* *Observation*
  1. a set of vertices is independent in is a vertex cover of
     1. in blue there is an independent set (actually the biggest one)
     2. Immagine che contiene linea, Arte bambini, diagramma, design

        Descrizione generata automaticamentethe other ones are the vertex cover

the longest independent set in has size , where is the size of the smallest vertex cover of

Independent set:

* Input:
* Output: in an independent set of size

Immagine che contiene calligrafia, schizzo, disegno, Line art

Descrizione generata automaticamenteOnce again, let’s represent this in a complete way:

## More Reductions can be made

Exercise

* *Show that*:

*these 3 problems are equivalent*.

Solution (official = shorter)

* “same” as
* we can consider the following figure for this one
  1. consider a clique of size 4 in the middle (left)
  2. if you take the complement of this one (right)
* has a clique of size has a vertex over of size
  1. Immagine che contiene linea, schizzo, diagramma

     Descrizione generata automaticamenteproof: see the book (§ - p. 1106 of 4th edition – theorem 34.12)

Solution (longer and better explained)

1. Suppose that we have an efficient algorithm for solving Independent Set, it can simply be used to decide whether has a vertex cover of size at most , by asking it to determine whether G has an independent set of size at least

Given an instance of the Vertex Cover problem, consisting of a graph and an integer representing the size, we construct an instance of the Independent Set problem as follows:

1. Let (i.e., the graph for the Independent Set instance is the same as the original graph G).
2. Let (i.e., the target size of the independent set is the number of vertices in minus the size of the vertex cover ).

To show that this reduction is correct, we need to prove the following:

1. If has a vertex cover of size , then has an independent set of size .
2. If has an independent set of size , then G has a vertex cover of size .

Let’s prove both (1) and (2):

* Suppose is a vertex cover of size in . Then, the set is an independent set in (since covers all the edges, no two vertices in can be adjacent). Furthermore,
* Suppose is an independent set of size in . Then, the set is a vertex cover in (since is independent, every edge must have at least one endpoint in ). Furthermore, .

1. To show that , we need to provide a polynomial-time reduction from the Clique problem to the Vertex Cover problem. Here's one way to construct the reduction:

Given an instance of the Clique problem, consisting of a graph and an integer , we construct an instance of the Vertex Cover problem as follows:

1. Let (i.e., the graph for the Vertex Cover instance is the same as the original graph G).
2. Let (i.e., the target size of the vertex cover is the number of vertices in minus the size of the clique ).

To show that this reduction is correct, we need to prove the following:

1. If has a clique of size , then has a vertex cover of size .
2. If has a vertex cover of size , then has a clique of size .

Proof of (1): Suppose is a clique of size in . Then, the set is a vertex cover in (since is a clique, every edge must have at least one endpoint in ). Furthermore, .

Proof of (2): Suppose is a vertex cover of size in . Then, the set is a clique in (since is a vertex cover, every edge must have both endpoints in , which means is a clique). Furthermore, .

# Approximation Algorithms

## Lower Bound for Vertex Cover Greedy Algorithm

Very first algorithm you can think of? Use a *greedy approach*:

* select the vertex for the highest degree
* “remove” the touched edges
* repeat

Exercise: *show a LB on for this algorithm* – *the higher, the better* ( *is difficult*)

*(Hint: try to prove the best you can – it should be a constant factor)*

Solution

One possible idea is the following:

* take a round of vertices
* consider levels of vertices adding more

Immagine che contiene calligrafia, disegno, schizzo, diagramma

Descrizione generata automaticamenteWe call this problem: “degree-based greedy approximation for vertex cover”. Consider the following:

This image demonstrates a general idea for constructing a "bad" input instance to show a lower bound on the approximation ratio. The approach is to create a graph with multiple levels, where each level has more vertices than the previous level, but with fewer edges connecting to the next level.

The reasoning goes like this:

* Start with a single vertex (labeled "Greedy" in the image)
* At the next level, add a few vertices that are all connected to the first vertex
* At the next level, add more vertices that are only connected to the previous level vertices
* Continue adding more and more vertices at each level, with fewer connections to the previous level

The idea is that the greedy algorithm will pick all the vertices in the first level, then all the vertices in the second level, and so on, resulting in a large vertex cover. However, the optimal vertex cover would be to pick the intermediate level vertices, which can cover all the edges with fewer vertices.

The greedy algorithm, by design, will select the vertex with the highest degree at each step. This means:

* It will select the single vertex at the first level.
* Then, it will select all vertices at the second level (since they have the highest degree at that point).
* Next, it will select all vertices at the third level (since they are now the highest degree vertices remaining).

Therefore, the total size of the vertex cover produced by the greedy algorithm is:

However, the optimal vertex cover for this graph is to select the vertices at the second level. This covers all edges in the graph using only vertices.

By comparing the greedy solution size to the optimal solution size , we get an approximation ratio of:

(for large values of )

Immagine che contiene calligrafia, testo, diagramma, Arte bambini

Descrizione generata automaticamenteThe following considers a simpler idea instead:

1. In a bipartite graph where and are the two disjoint vertex sets, and contains edges only between and
2. Consider the vertex in that has the maximum degree (i.e., connected to the most vertices in V)
3. The greedy algorithm will select and all its neighbors in
4. However, the optimal solution is to select only the neighbors of in (and not itself)
5. This gives a lower bound on the approximation ratio

The key observation is that by selecting the highest degree vertex in , the greedy algorithm is making the worst possible choice compared to the optimal solution of just selecting 's neighbors in

This lower bound holds because:

* Greedy picks and vertices in , so size is
* Optimal just picks the vertices in that are neighbors of

So the approximation ratio is at least , which approaches as grows large.

## Approximation Factor of Approx Vertex Cover

The algorithm is:

*Complexity*:

Exercise: *show that the approximation factor of is exactly 2.*

Solution

Immagine che contiene calligrafia, manubrio, tipografia

Descrizione generata automaticamente

Consider the algorithm:

* The algorithm starts with an empty set (vertex cover set) and the original edge set . It iteratively selects an arbitrary edge ( from and adds both vertices and to the vertex cover set . It then removes all edges from that are incident on either or
* The algorithm continues this process until becomes empty, meaning all edges have been covered by the selected vertices in . Finally, it returns as the approximate vertex cover

The key observation is that for each edge selected, at least one of or must be present in the optimal vertex cover . This is because must cover all edges, and is an edge in the original graph.

Therefore, during each iteration when an edge is processed, the algorithm adds at most two vertices to V', while the optimal vertex cover must contain at least one of these two vertices.

Consequently, we can establish the following inequality:

The bound is tight; ensuring the greedy choice is 2 vertices and the optimal choice is just one vertex, we will have that .

## Approx Vertex Cover edit to select only one vertex

Immagine che contiene linea, diagramma

Descrizione generata automaticamenteSolution

Immagine che contiene calligrafia, Carattere, testo, bianco

Descrizione generata automaticamente

Consider the *star graph*, a bipartite graph with one internal node (given vertices) and leaves. The optimal choice would select one vertex then the greedy selects the leaf nodes. This would imply removing all edges connected to the intermediate node and, as such, we guarantee to select one vertex at a time, ensuring . Selecting only one vertex can be really bad unless you trick the algorithm a bit.

In this structure:

1. The optimal vertex cover () contains only the central vertex, covering all edges. So .
2. The modified approximation algorithm selects one endpoint vertex per edge. For the star graph, this means it will select all n-1 leaf vertices.
3. Therefore, the size of the approximate vertex cover produced by the algorithm is .
4. Since and , the approximation ratio .

So for the star graph, the approximation ratio achieved by the modified algorithm is exactly , which matches the lower bound claim of in the image.

## 2-Approximation Vertex Cover Algorithm Using DFS

Exercise (not made in 2023-2024, but put here for studying purposes and for future generations):

*Immagine che contiene schizzo, linea, triangolo, origami

Descrizione generata automaticamenteConsider the following approximation for :*

* *run DFS from an arbitrary vertex*
* *return all the non-leaf vertices of the DFS tree*

*Show that this is a 2-approximation algorithm for .*

Solution

We will show two things:

* show that is at most
* show that there are instances for which the algorithm does not improve (so, bad input instances, like other ones showed here) – upper bound of said algorithm

Immagine che contiene linea, diagramma, schizzo, Arte bambini

Descrizione generata automaticamenteHere, a large enough matching in the DFS tree will be shown:

So:

* given the graph , let be the root and choose one child and add to the matching
* levels consider all vertices not touched by any edge of ; choose a child and add to
* By construction, we select on non-leaf nodes of and possibly some leaf nodes
* So, we have

Each non-leaf vertex selected corresponds to an edge covered by the maximum matching.

* Since each edge in the matching is incident to two vertices, selecting one non-leaf vertex covers at least one edge
* Therefore, the number of non-leaf vertices selected is at most twice the size of the maximum matching

matching of ,

* Immagine che contiene schizzo, disegno, Line art, bianco

  Descrizione generata automaticamentesince we are comparing the number of nodes to the number of edges

To show the factor is tight, consider a cut between a vertex and some other vertex . It’s trivial that the set of nodes given back is exactly the two vertices . This is shown on the right.

So, we could select the graph that consists of only two vertices and a single edge between them.

* Then, the approximation algorithm will always select both of the vertices, whereas the minimum vertex cover is only one vertex
* More generally, we could pick our graph to be edges on a graph with vertices so that each connected component only has a single edge

This works also in a tree, because starting from the leaf nodes, only the “intermediate” node, thanks to the matching, constitutes the minimal link thanks to which the vertex cover (minimum, remember) is guaranteed.

## Approx Metric TSP returning a solution of a specified cost

Given the algorithm:

Given this analysis:

Let denote an optimal tour for the given set of vertices.

Let’s give the intuition behind the algorithm:

1. cost of is “low” (actually, the lowest)
2. Immagine che contiene Line art, schizzo, clipart, disegno

   Descrizione generata automaticamentetriangle inequality “shortcuts” do not increase the cost

To be more precise, shortcuts in graph theory refer to edges that directly connect two vertices that are not adjacent in the original graph.

1. Immagine che contiene schizzo, disegno, Line art, clipart

   Descrizione generata automaticamenteLower bound to the cost of (=optimal tour) (for vertex cover: )

is a spanning tree

The weight should be:

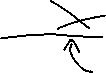
weights on



This is because we obtain a spanning tree by deleting any edge from a tour, and each edge cost is non-negative.

1. Upper bound to the cut of (the returned solution. We want to prove the following:

comes from



The approximation factor keeps being at most twice, so :

*Definition:* given a tree, a full preorder chain is a list with repetitions of the vertices of the tree which identifies the vertices reached from the recursive calls of .

Immagine che contiene calligrafia, Carattere, tipografia

Descrizione generata automaticamenteThe following is an example, quite easy to see I guess (f.p.c. = “full preorder chain” from now on):

The key property is the following: given the full preorder chain traverses every edge exactly two times, we have:

This happens because every edge of appears twice in a f.p.c.

Unfortunately, the f.p.c is generally not a tour since it visits some vertices more than once.

* By the triangle inequality, however, we can delete a visit to any vertex from f.p.c and the cost does not increase
  1. This ensures we only have traversed vertices twice so to ensure a full visit in all the tree, correctly applying the Hamiltonian cycle definition
* By repeatedly applying this operation, we can remove from f.p.c. all but the first visit to each vertex (except for the last occurrence of the root)
* This is like adding a *shortcut* between vertices that *does not increase the cost*

Immagine che contiene disegno, diagramma, schizzo, origami

Descrizione generata automaticamenteSolution

## Show the analysis of Set Cover is tight

Given the following analysis:

We’ll show that , where .



*Property*: if admits a cover with , then admits a cover with .

Immagine che contiene Carattere, bianco, calligrafia, tipografia

Descrizione generata automaticamente*Idea*: try to bound the number of iterations such that the set of remaining elements gets empty.

* residual universe after then of the iteration
* (cardinality of optimal solution)

This is done limiting the number of loops to execute in such a way the set of elements gets empty as soon as possible.

*Lemma*: after the first iterations, the residual universe is at least halved, that

Being greedy, this can be seen as a recursive algorithm selecting a subset then repeating itself on the residual universe as follows:



after iterations (after iterations, the size of residual universe is the ones of remaining sets)

(number) of necessary iterations at each iteration

(because at every iteration, is increased by one)

Consider the “+1” here is present to cover the possible last element remaining to cover.

Let’s prove the lemma in a proper way:



admits a cover size all in (i.e. not yet selected by the algorithm)

(trivial) property: if admits a cover with then admits a cover with (this happens because of the property above, given after iterations, the residual universe has at most as many elements as the sets not yet selected)



Let be those sets, where covers (covering all sets – residual universe after iterations).

We apply the *pigeonhole* principle, which generally states that if items are put into containers, with , then at least one container must contain more than one item.

* In other words and more precisely for the example and context here: given a set of elements where there is an order relation, there is always at least one element whose value is greater than the mean value

There are subsets and there’s the need to cover elements of cardinality . It is possible and there is at least one which covers at least a fraction of all elements: s.t.

We’ll now see that in the first iterations, iteration at least elements get covered:

, let be the selected subset of the algorithm. This subset has the following property:

This is true because at each interaction , the cardinality of the intersection with the residual universe is at least as big as the cardinality of the not selected (each interaction selects the set with biggest cardinality). This property is valid also for , that is:



after the first iterations the algorithm has covered elements

Immagine che contiene Carattere, calligrafia, tipografia, handwritten

Descrizione generata automaticamenteSince is the set of elements not selected by the algorithm after iterations, it follows that:

Immagine che contiene Carattere, tipografia, calligrafia, bianco

Descrizione generata automaticamente

satisfied for (after the iterations, the residual universe is at least halved).

Exercise: *show that there is an input on which achieves an approximation ratio of*

(*Hint: the algorithm chooses the set that contains the largest n. of uncovered elements, whereas chooses a set that contains the second largest n. of uncovered elements)*

Solution

Immagine che contiene disegno, schizzo, calligrafia, diagramma

Descrizione generata automaticamenteConsider the following schema, applying exactly what the hint told – we have 30 elements, in which the optimal choice would be to select both the complete sets of elements, while the algorithm selects progressively only a fraction of those:



* has elements for some
* has:
  1. pairwise disjoint sets with sizes
  2. two additional disjoint sets
     1. each of which contains half of the elements from each

## Markov’s Lemma Application

Exercise

*Assume that:*

1. *LAS VEGAS, with w.h.p; in particular,*
2. *has a worst-case deterministic complexity*

*Show that .*

We will apply the following:

Markov’s lemma: let be a non-negative, bounded (), integer, random variable. Then s.t.

This basically gives an upper bound on the probability that a non-negative random variable is greater than or equal to some positive constant (usually you see the first inequality).

Proof

Immagine che contiene calligrafia, Carattere, bianco

Descrizione generata automaticamenteUsing the upper bound of the lemma:

## Show Karger is tight

Exercise

*Using the analysis of Karger's algorithm, show that the n° of distinct min-cuts in a graph is at most . Also, show that this bound is tight.*

Solution