

Some Inapproximability Results

Being exposed to approximability, it is natural to ask whether we can approximate every NP-hard problem, or how well we can hope to approximate any problem in polynomial time. In this lecture, we will show that some problems do **not** have a polynomial-time c -approximation algorithm for any constant $c \geq 1$, **unless** $P = NP$. We will also see how some reductions do not preserve approximations.

We first consider the **Travelling Salesperson Problem** (TSP). Before presenting the problem formally, we need to define a Hamilton Cycle and the **Hamilton Cycle Problem**:

Given a graph $G(V, E)$, a **Hamilton Cycle** of G is a cycle in the graph that starts at an arbitrary vertex v , visits every vertex in G exactly once then returns to v .

Problem: The Hamilton Cycle Problem (the decision problem)

Input: A graph $G(V, E)$.

Problem: Return 1 iff G has a Hamilton cycle.

Recall a complete graph is just a graph whose vertices are **all** pairwise adjacent: a clique on n vertices.

We state the following theorem without proof¹:

Theorem 1. *The Hamilton Cycle Problem is NP-Complete.*

The Travelling Salesperson Problem is defined as:

The Travelling Salesperson Problem

Input: An edge-weighted complete graph $G(V, E, w)$ where $w : E \rightarrow \mathbb{R}^+$

Problem: Return a Hamilton Cycle \mathcal{C} on G where $\sum_{e \in \mathcal{C}} w(e)$ is minimized.

Clearly, by Theorem 1, the TSP is NP-hard (the optimization problem), however as we will show next, it cannot be approximated in polynomial time by any constant $c \geq 1$, unless $P = NP$.

How can we prove such a claim: By contradiction! If TSP has no constant c factor approximation algorithm, then there is **no** algorithm A such that:

$$OPT(G) \leq A(G) \leq c \cdot OPT(G)$$

for any graph G . We will show that if we do have such an algorithm, then we can solve the Hamilton Cycle Problem in polynomial time, thus contradicting Theorem 1.

Proof. Suppose there exists a constant c factor approximation algorithm A for TSP. This means (since TSP is a minimization problem) that given a graph $G(V, E)$, algorithm A outputs a Hamilton cycle of total weight **at most** $c \cdot OPT(G)$ (by definition of c -approximation).

Now suppose we're given an instance of the Hamilton Cycle Problem, a graph $G(V, E)$. We construct a graph $G'(V, E')$ where G' is the complete graph on V the vertex set of G , and we assign positive weights to the edges $e \in E'$ as follows:

¹Since you already proved it in A3.

$$w(e) = \begin{cases} 1 & \text{if } e \in E \\ cn + 1 & \text{if } e \notin E \end{cases}$$

Let's run algorithm A on G' . Since A is a c -approximation, we know that:

$$OPT(G') \leq A(G') \leq c \cdot OPT(G')$$

Now consider the graph G . We have two possible cases: Either G has a Hamilton cycle or it does not.

1. If G has a Hamilton Cycle, then by our above construction, G' has a TSP solution of value n , since we're only using edges with weight $w(e) = 1$. Thus the optimal solution to $A(G')$ is n . Therefore if $A(G')$ output a cycle with value at most cn then there **must be** a Hamilton Cycle in G .
2. If G does not have a Hamilton Cycle, then the algorithm **must** have used one of the edges e where $e \in E' \setminus E$ and $w(e) = cn + 1$. Therefore $A(G')$ would output a Hamilton Cycle with total value **at least** $cn + 1$, greater than the c -approximation!

Therefore to check if G has a Hamilton Cycle in poly-time, we just need to run $A(G')$ and check the value of the output. Ha! A polynomial time algorithm for the Hamilton Cycle decision problem. So unless $P = NP$, the c -approximation algorithm A does not exist. \square

This example captures the limitations of approximability. We next show that if even if we have strong duality results, some reductions are **not approximation preserving**. What do we mean by this? Well let's consider two complementary problems we've seen before: Vertex Cover and Independent Set.

Prove to yourself that for any graph $G(V, E)$, G has a vertex cover of size k if and only if G has an independent set of size $n - k$. In fact, Gallai proved the following theorem:

Theorem 2. *Let $G(V, E)$, be a graph on n vertices, α the size of the smallest vertex cover and β the size of its largest independent set. Then $n = \alpha + \beta$.*

It follows from Gallai's Theorem that the MIS (maximum independent set) of G is $\beta = n - \alpha$; and we've developed a simple polynomial time 2-approximation algorithm for MVC (minimum vertex cover). So intuitively, we should be able to somehow conclude a constant approximation algorithm out of this for the MIS problem. Let A denote the 2-approximation algorithm for MVC, and let ALG denote the value returned by $A(G)$. We could compute ALG and return $n - ALG$ for the MIS; maybe $n - ALG$ is a good approximation for the MIS. It turns out this does not tell us *anything* useful with respect to the MIS, and here's why:

By the definition of approximation, we know that:

$$\begin{aligned} OPT \leq ALG \leq 2OPT &\implies \alpha \leq ALG \leq 2\alpha \quad (\text{Since } \alpha \text{ is the minimum VC, thus the OPT solution.}) \\ &\implies n - \beta \leq ALG \leq 2(n - \beta) \quad (\text{Using Gallai's equality.}) \\ &\implies n - ALG \leq \beta \end{aligned}$$

So what the last inequality tells us is that $n - ALG$ (which recall is what we hoped to use to approximate the MIS) is upper bounded by the optimal value of the MIS, namely β . Well duh! We already know that; our goal is to approximate how close we are to the optimal β .