

Approximations and Heuristics



Travelling Salesperson (TSP)

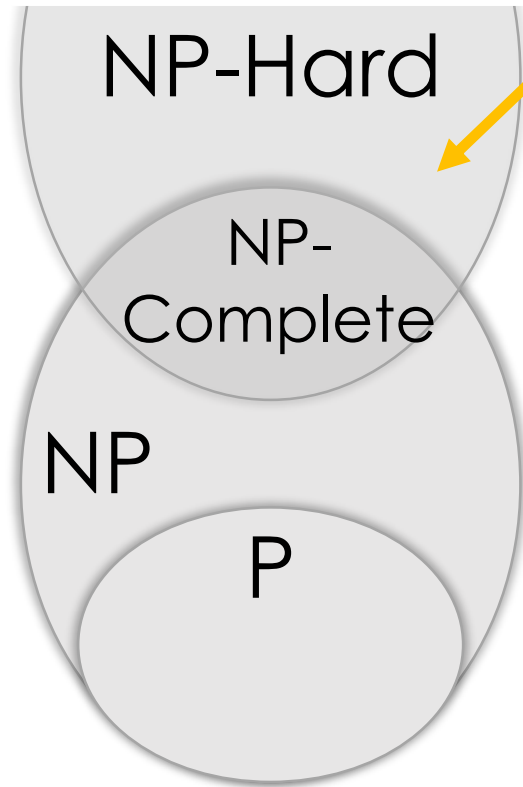


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by Christine Alvarado, Mia Minnes, and Leo Porter, 2015.

By the end of this video you will be able to...

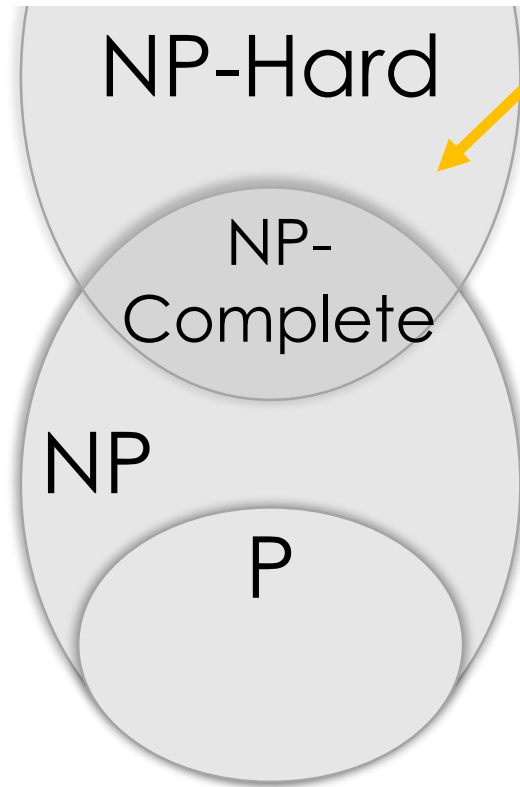
- Use heuristics to find reasonable solutions to hard problems
- Apply the 2-Opt Heuristic to the TSP

Complexity Theory



TSP "optimization**":** given n cities with one Hometown and all pairwise distances, plan a tour starting and ending at Hometown that visits every city exactly once and **has minimum distance**.

Complexity Theory



TSP "**optimization**": given n cities with one Hometown and all pairwise distances, plan a tour starting and ending at Hometown that visits every city exactly once and **has minimum distance**.

Let's relax the "minimum distance" constraint, and find a reasonable solution

Heuristics and Approximation Algorithms

Heuristics and Approximation Algorithms

In TSP, given n cities with one Hometown and all pairwise distances, plan a tour starting and ending at Hometown that visits every city exactly once and has minimum distance.

Greedy algorithm: pick best next choice

Heuristics and Approximations for TSP

Constructions:

Heuristics and Approximations for TSP

Constructions:

Build a solution

Nearest Neighbor (Greedy)

Christofides Algorithm

Heuristics and Approximations for TSP

Constructions:

Nearest Neighbor (Greedy)

Christofides Algorithm

Iterative:

Heuristics and Approximations for TSP

Constructions:

Nearest Neighbor (Greedy)

Christofides Algorithm

Iterative:

Improve a solution

k-opt and Lin-Kernighan

genetic algorithms

MORE!

Heuristics and Approximations for TSP

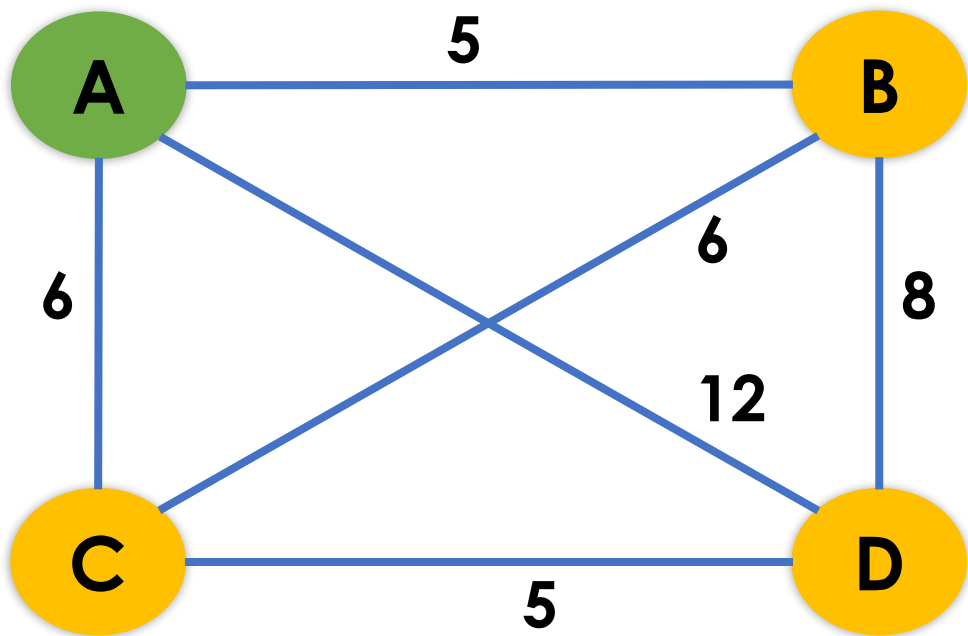
Constructions:

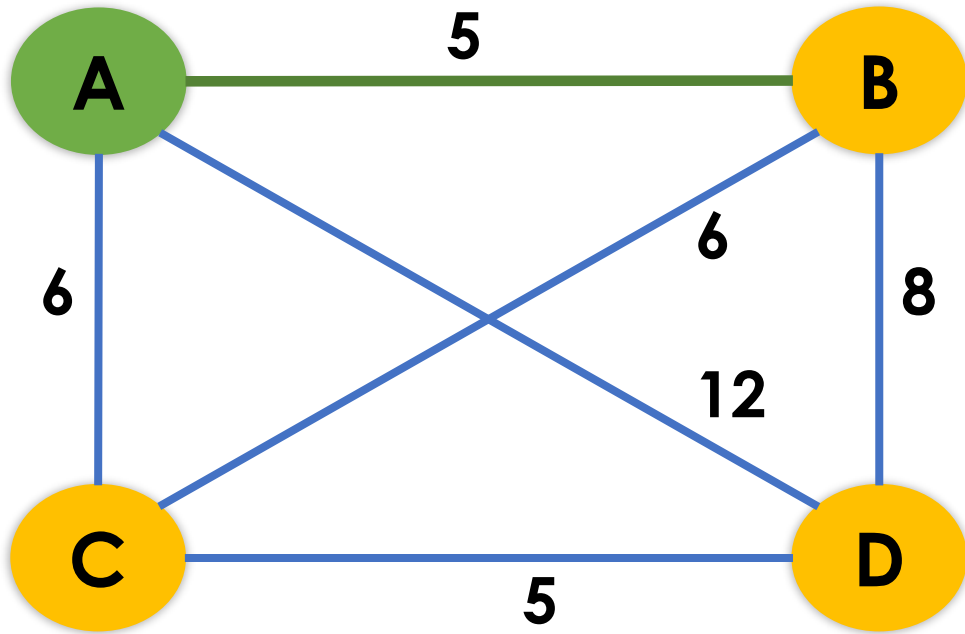
Nearest Neighbor (Greedy)
Christofides Algorithm

**Let's examine a
combination:
Greedy + 2-opt**

Iterative:

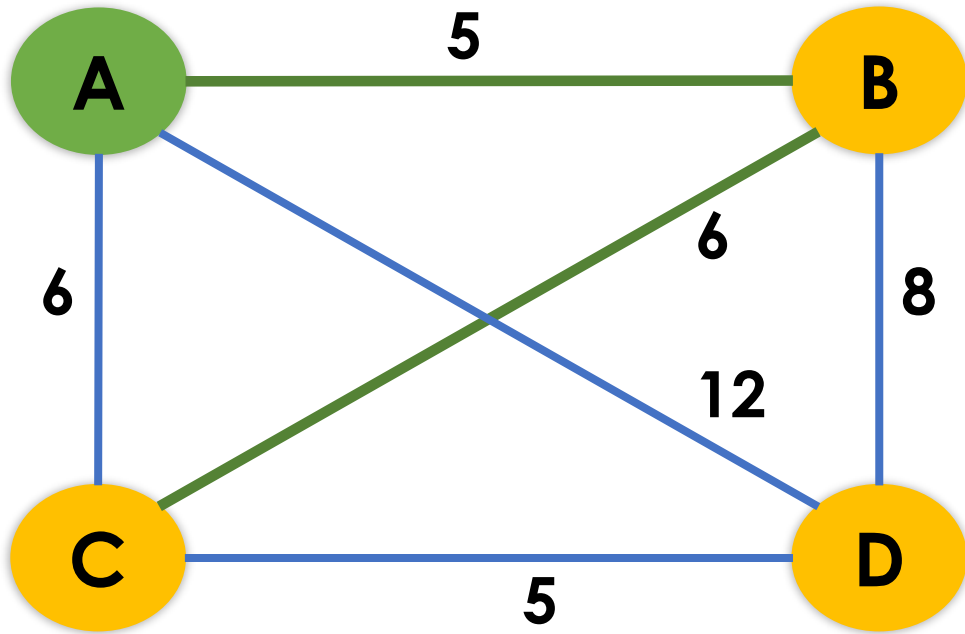
k-opt and Lin-Kernighan heuristics
genetic algorithms
MORE!





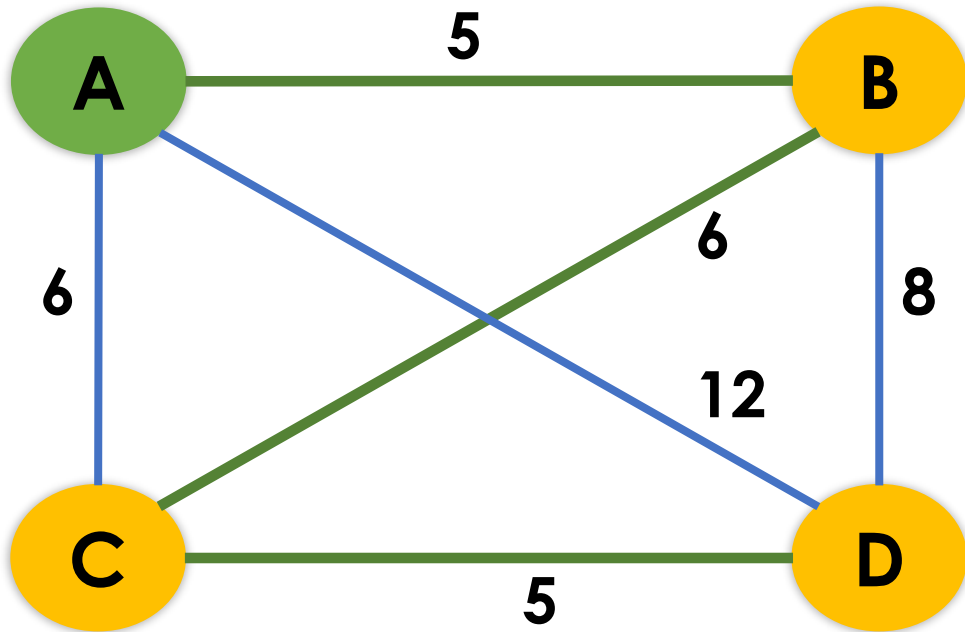
Greedy

$A \rightarrow B$



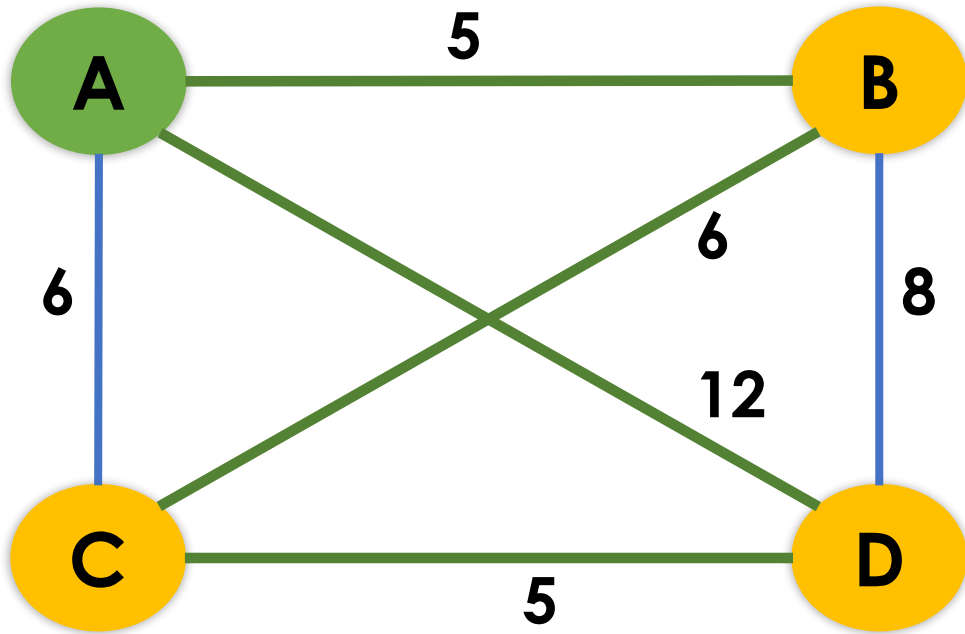
Greedy

$A \rightarrow B \rightarrow C$



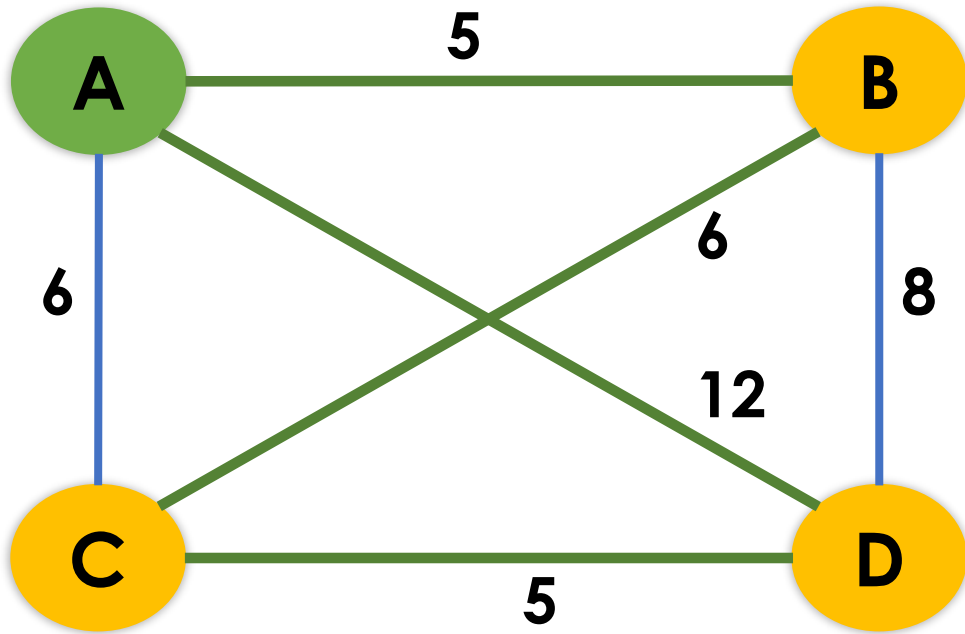
Greedy

$A \rightarrow B \rightarrow C \rightarrow D$



Greedy

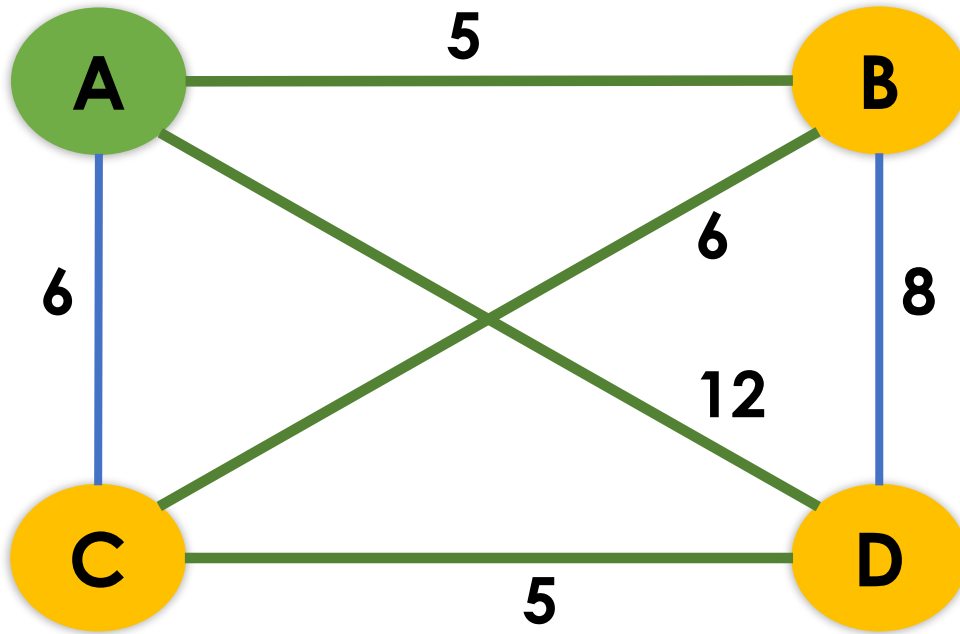
$A \rightarrow B \rightarrow C \rightarrow D \rightarrow A$ L: 28



Greedy

$A \rightarrow B \rightarrow C \rightarrow D \rightarrow A$ L: 28

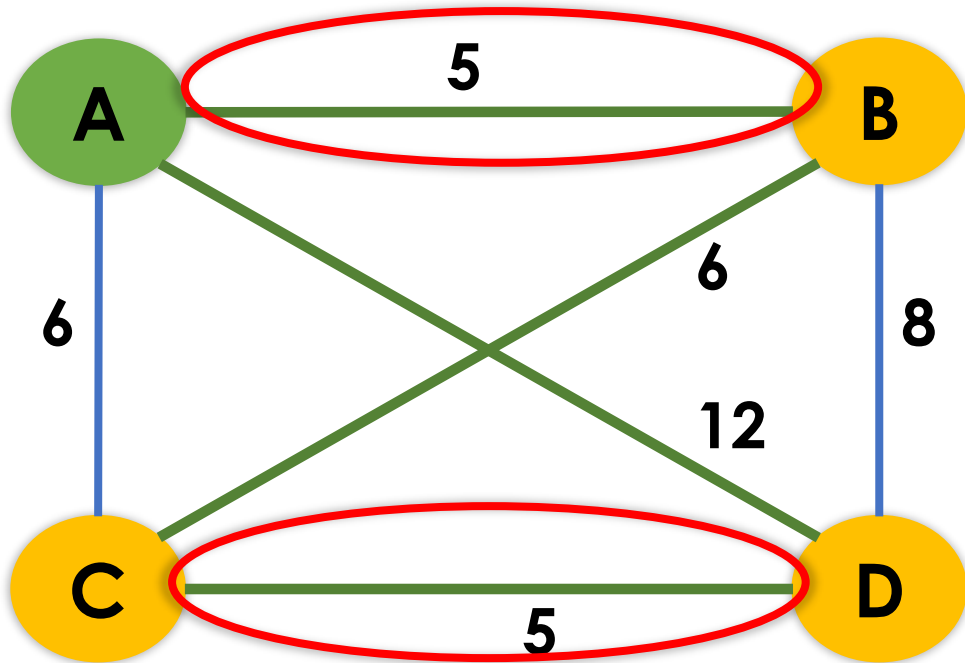
**Let's improve on
this solution**



2-Opt Heuristic

$A \rightarrow B \rightarrow C \rightarrow D \rightarrow A$ L: 28

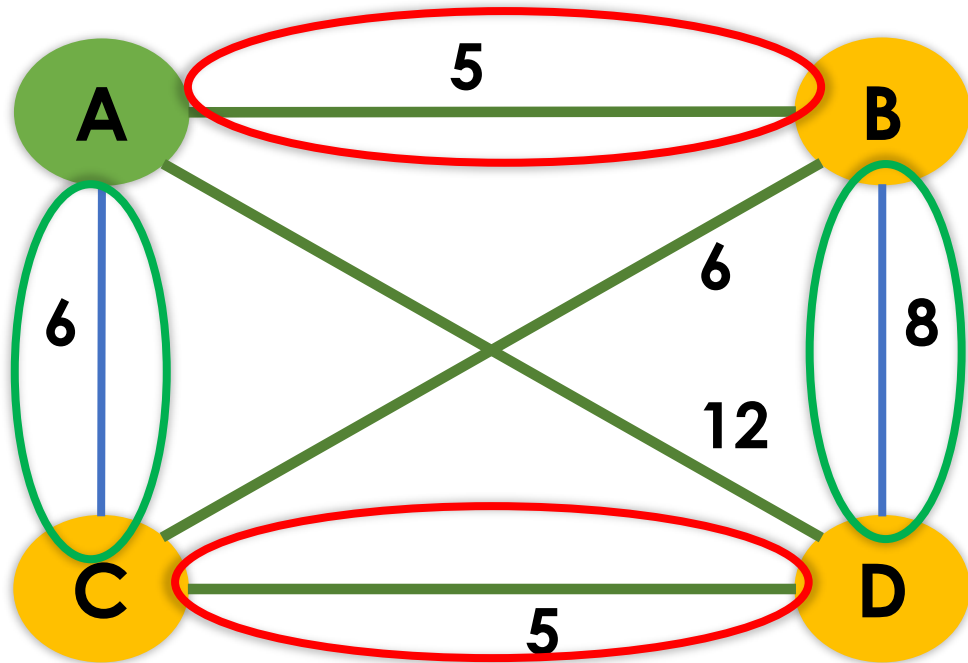
Intuition: Examine pairs of edges, remove them, repair the solution, and see if it's better.



2-Opt Heuristic

$A \rightarrow B \rightarrow C \rightarrow D \rightarrow A$ L: 28

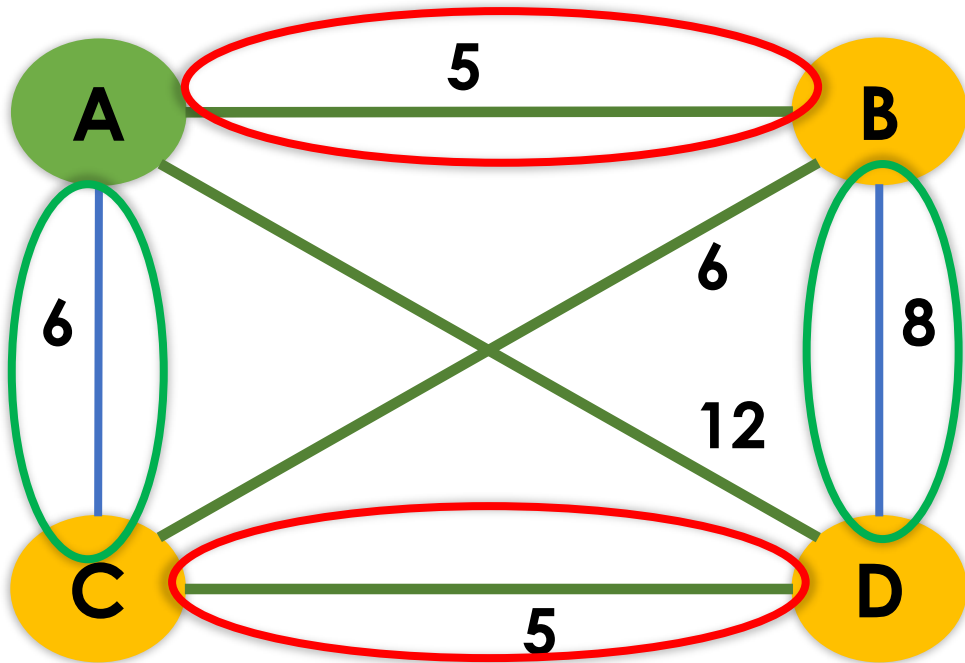
For example, let's remove AB and CD



2-Opt Heuristic

$A \rightarrow B \rightarrow C \rightarrow D \rightarrow A$ L: 28

For example, let's remove AB and CD, then repair the solution by adding AC and BD

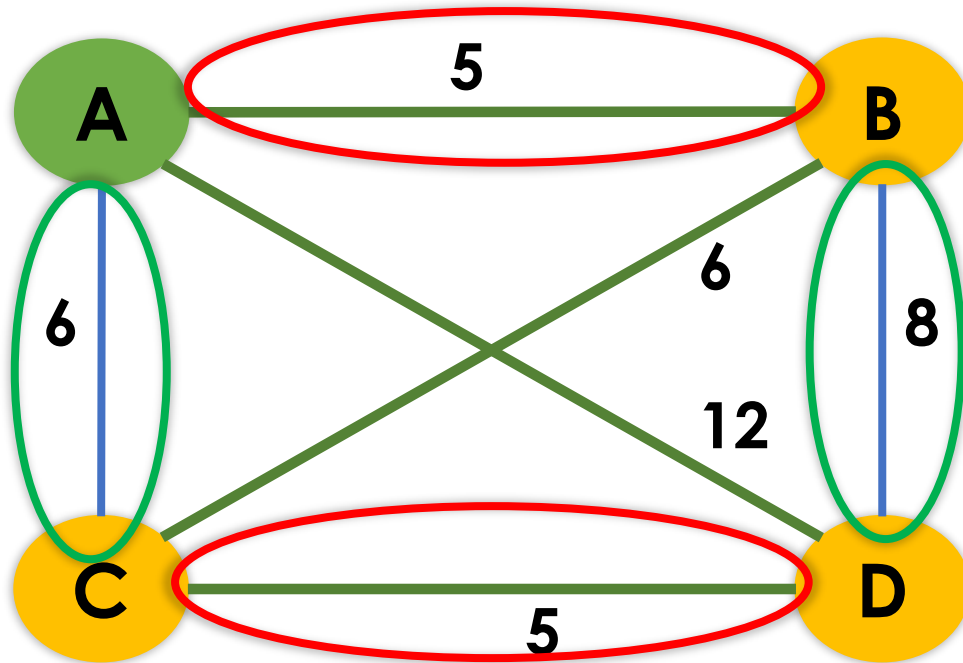


2-Opt Heuristic

$A \rightarrow B \rightarrow C \rightarrow D \rightarrow A$ L: 28

$A \rightarrow C \rightarrow B \rightarrow D \rightarrow A$ L: 31

For example, let's remove AB and CD, then repair the solution by adding AC and BD



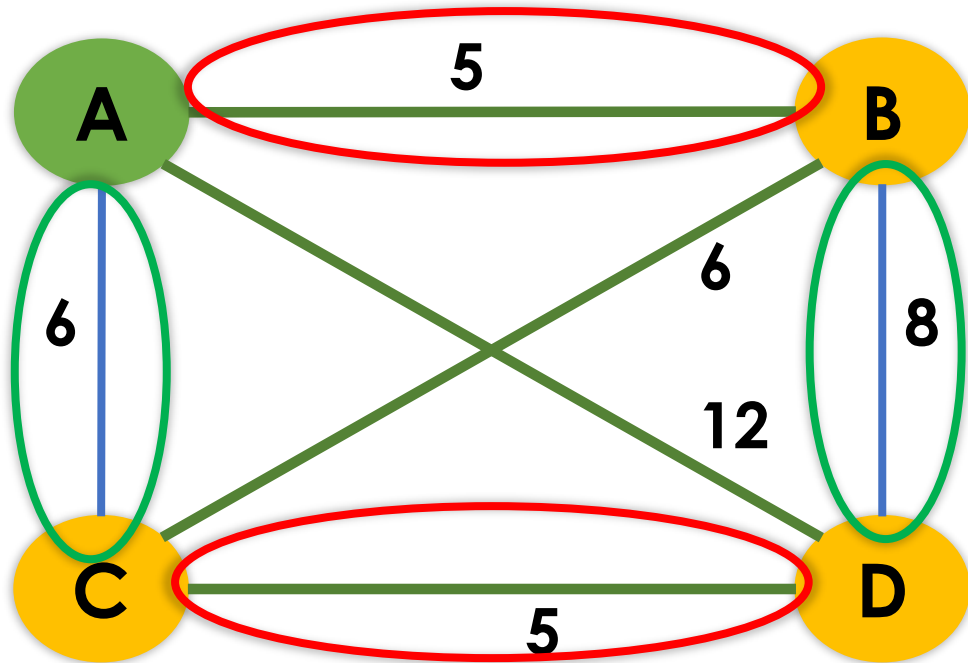
2-Opt Heuristic

$A \rightarrow B \rightarrow C \rightarrow D \rightarrow A$ L: 28

$A \rightarrow C \rightarrow B \rightarrow D \rightarrow A$ L: 31

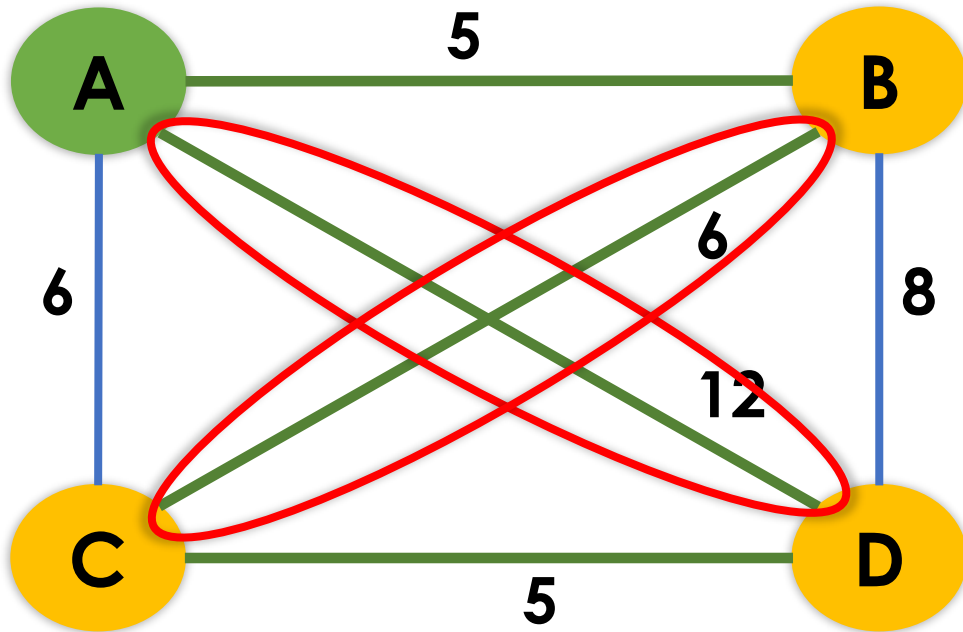
This is worse!

For example, let's remove AB and CD, then repair the solution by adding AC and BD



2-Opt Heuristic

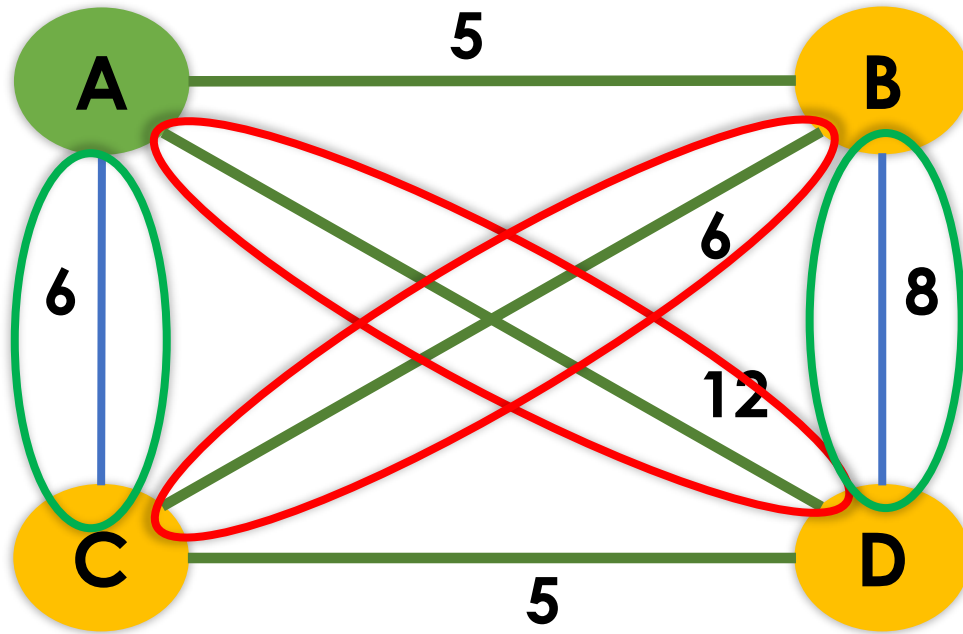
$A \rightarrow B \rightarrow C \rightarrow D \rightarrow A$ L: 28
 ~~$A \rightarrow C \rightarrow B \rightarrow D \rightarrow A$ L: 31~~



2-Opt Heuristic

$A \rightarrow B \rightarrow C \rightarrow D \rightarrow A$ L: 28

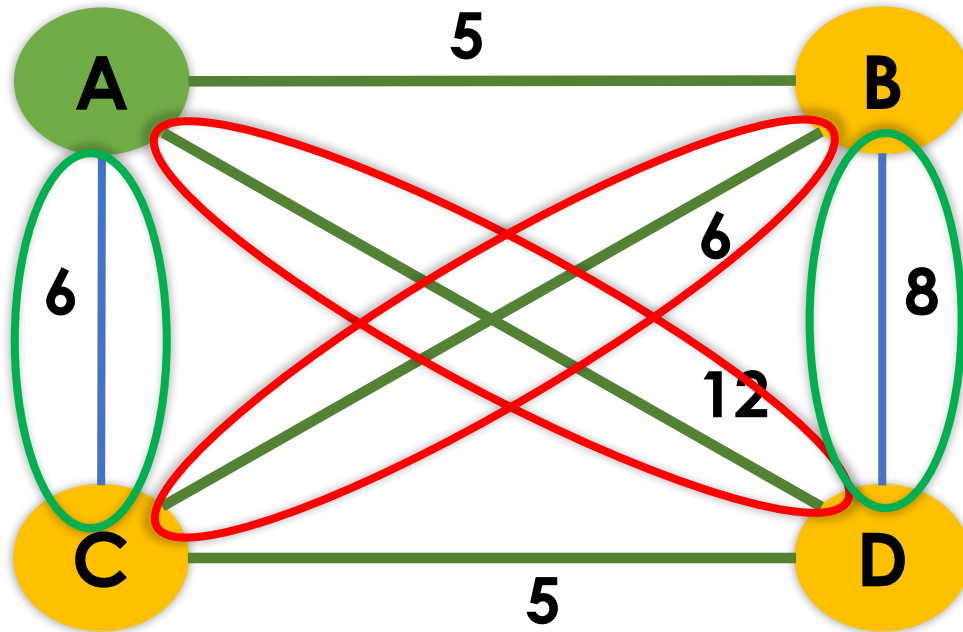
Now, let's remove AB and CD



2-Opt Heuristic

$A \rightarrow B \rightarrow C \rightarrow D \rightarrow A$ L: 28

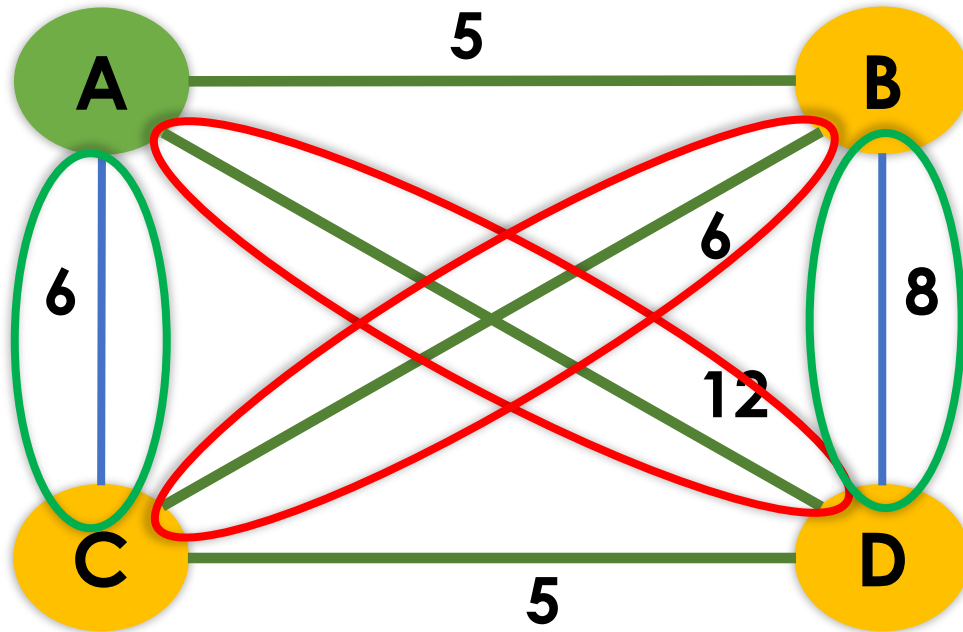
Now, let's remove AB and CD,
then repair the solution by
adding AC and BD



2-Opt Heuristic

$A \rightarrow B \rightarrow C \rightarrow D \rightarrow A$ L: 28
 $A \rightarrow B \rightarrow D \rightarrow C \rightarrow A$ L: 24

Now, let's remove AB and CD,
then repair the solution by
adding AC and BD

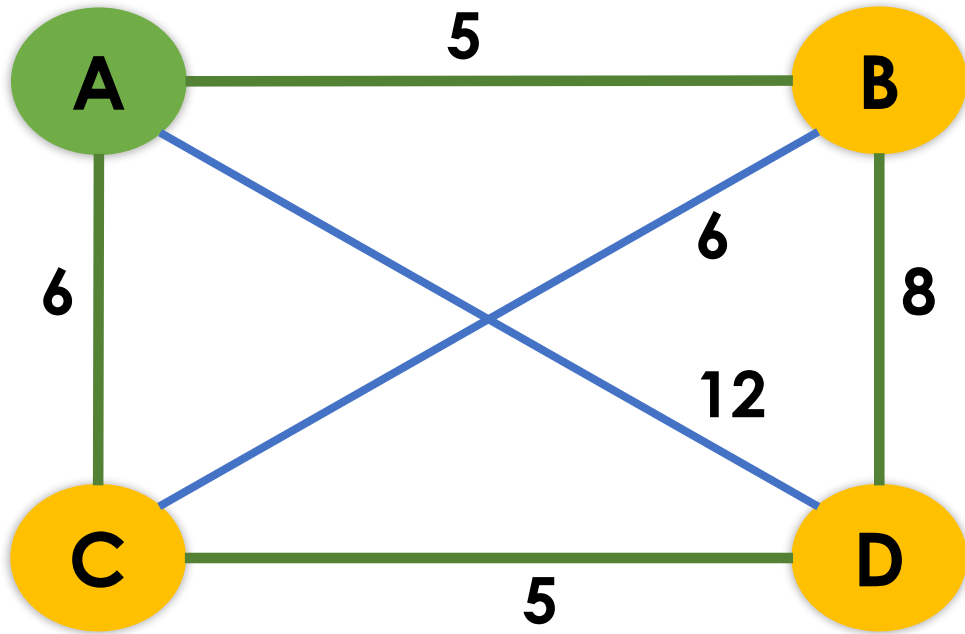


2-Opt Heuristic

$A \rightarrow B \rightarrow C \rightarrow D \rightarrow A$ L: 28
 $A \rightarrow B \rightarrow D \rightarrow C \rightarrow A$ L: 24

This is better!

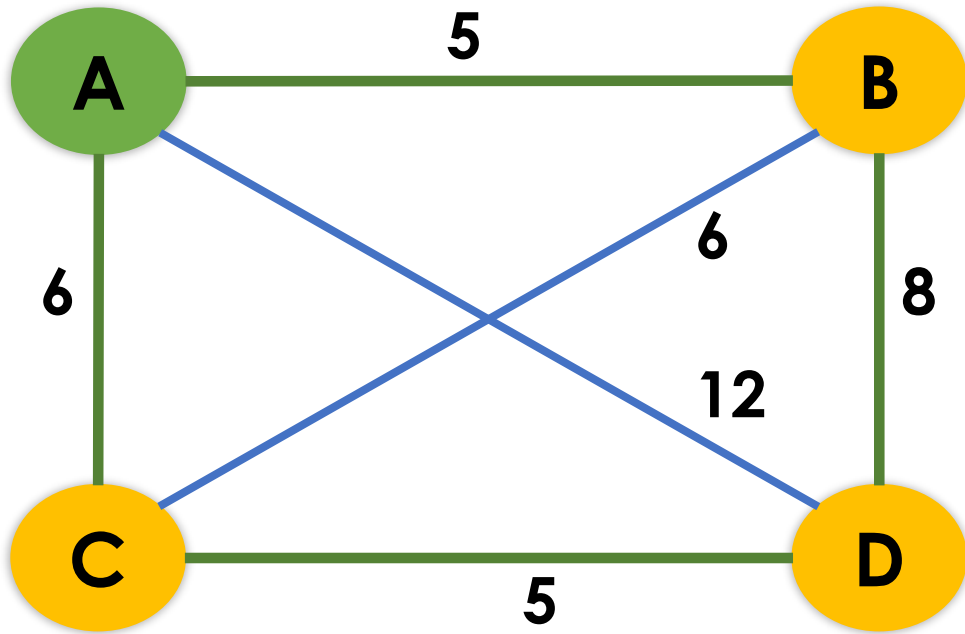
Now, let's remove AB and CD,
then repair the solution by
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2-Opt Heuristic

~~A → B → C → D → A L: 28~~
A → B → D → C → A L: 24

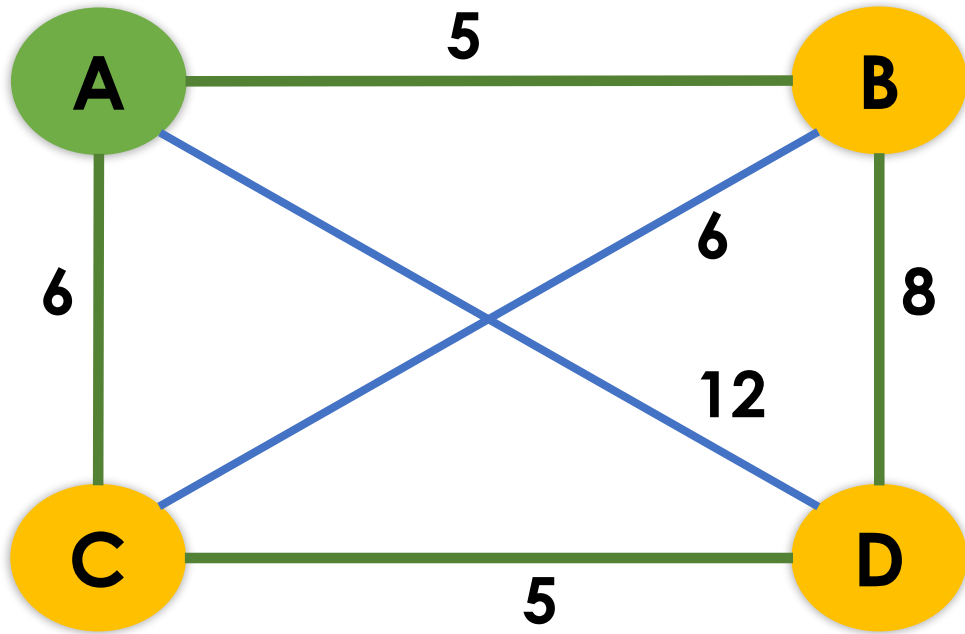
Replace our current solution
with the better solution.



2-Opt Heuristic

$A \rightarrow B \rightarrow D \rightarrow C \rightarrow A$ L: 24

Replace our current solution
with the better solution.

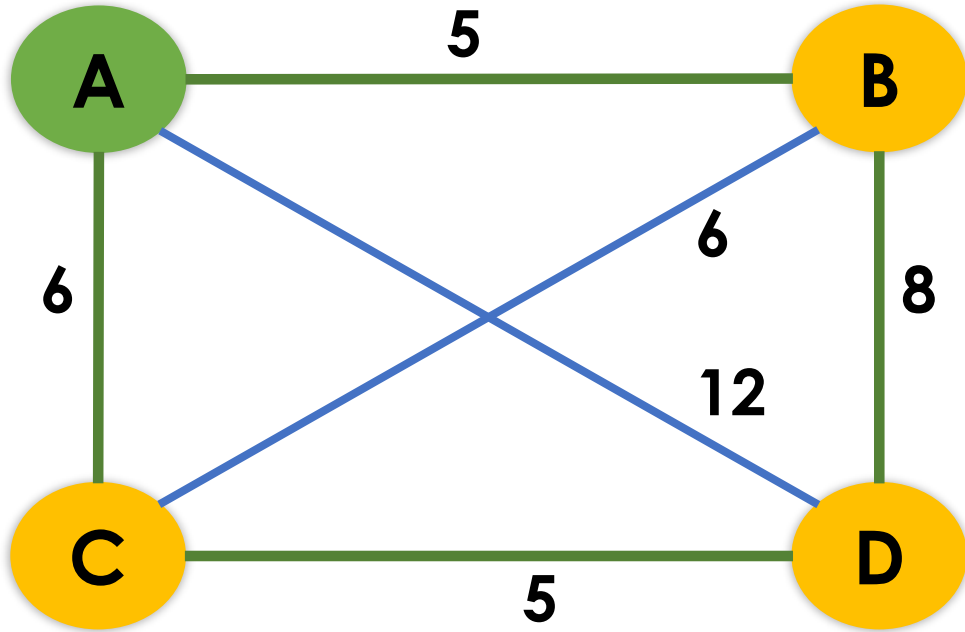


2-Opt Heuristic

$A \rightarrow B \rightarrow D \rightarrow C \rightarrow A$ L: 24

Keep repeating for pairs of edges until no more improvements are found

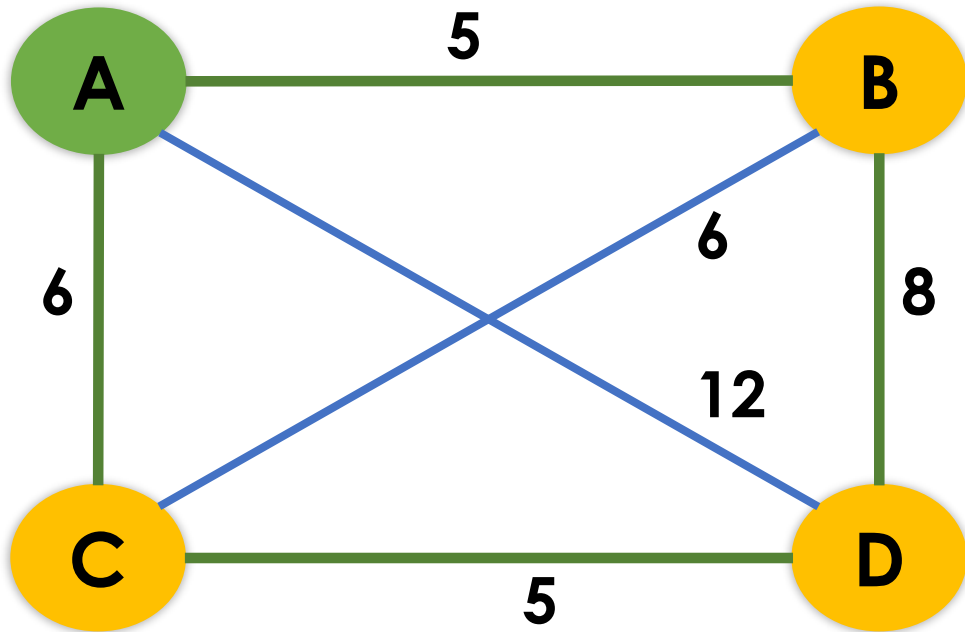
Greedy + 2-Opt Heuristic



$A \rightarrow B \rightarrow D \rightarrow C \rightarrow A$ L: 24

Found optimal solution for
this simple example

Greedy + 2-Opt Heuristic



$A \rightarrow B \rightarrow D \rightarrow C \rightarrow A$ L: 24

Won't necessarily find the optimal, but it's fast - $O(n^2)$ - and can be fairly effective

Heuristics and Approximation Algorithms

Constructions:

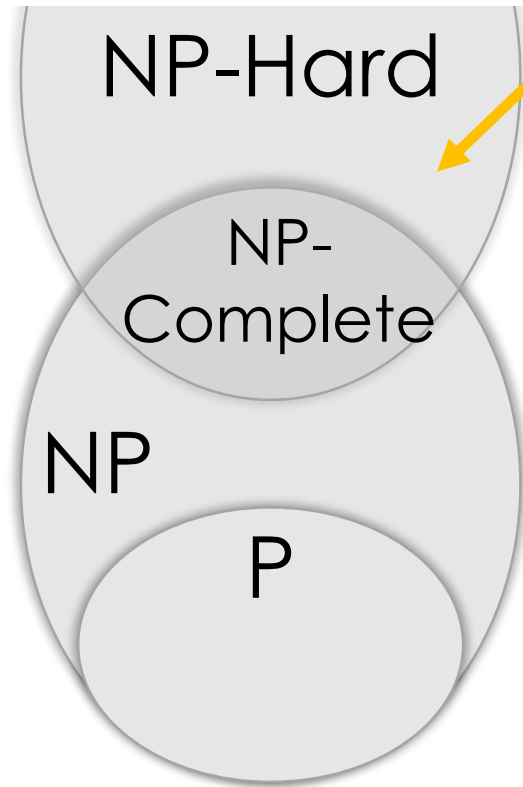
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Iterative:

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**We encourage
you to explore
some of these on
your own.**

Complexity Theory



TSP "**optimization**": given n cities with one Hometown and all pairwise distances, plan a tour starting and ending at Hometown that visits every city exactly once and **has minimum distance**.

Bottom line: if the problem is provably "hard", consider revising the problem constraints