



Ticket to Ride: Concepts in Graph Theory

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Semesterprojekt: Implementierung eines Brettspiels, WS 18/19

Agenda

- Last week
 - [Technical refinement](#) for new user stories
 -
- Today (w/ POs), 13:30
 - Sprint #1 [Review Meeting](#); bring a laptop & presentable prototype
 - Sprint #2 kickoff; present your Sprint Backlog
 - short talk on
 - Ticket to Ride: concepts in graph theory
 - Coding guidelines / conventions

Ticket to Ride and Graph Theory

- $G = (V,E)$, V =Cities, E = Railways.
- Each vertex of the graph represents one city in Europe
- An edge connects two cities
- Each edge has a color and a length (cost)
- The graph has more edges than any player can claim
- The set of cities and edges is a player's *edge-induced* subgraph
- *Connected components*: Player's subgraphs don't have to be connected
- Paths and Cycles
 - A destination ticket is met, when there is a path between the two cities
 - Creating cycles do not increase coverage, and thus do not help meeting destination tickets (but may block other players)

Graph Algorithms

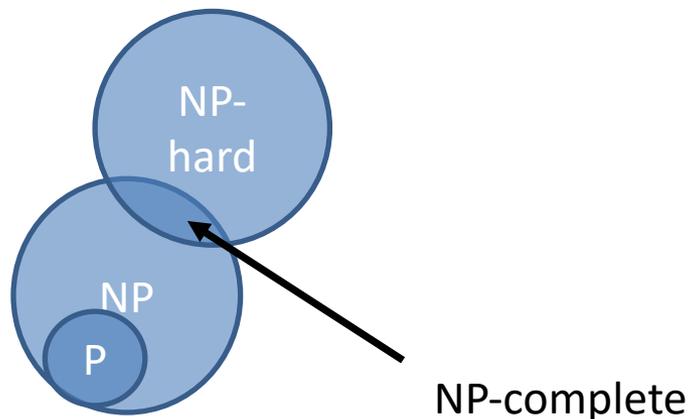
- Concepts known from: “Algorithmen und Datenstrukturen”
 - Graph representations: Adjacency List, Adjacency Matrix
 - Shortest paths: Dijkstra, Floyd Warshall
 - Graph traversal: BFS, DFS
 - Minimum Spanning Tree: Prim, Kruskal
 - Topological sorting of directed graphs.

Ticket to Ride Rules and their Concepts in Computer Science

- What is the best representation of the board?
 - *Adjacency matrix or adjacency list?*
- Given a destination ticket, what is the shortest path?
 - *Shortest path: Dijkstra*
- How to fulfill destination tickets with the least amount of trains?
 - *Minimum spanning tree on subgraph (Minimum Steiner tree)*
- Calculating the final score:
 - List of routes claimed by a player
 - *Lookup in graph data structure (adjacency matrix or adjacency list)*
 - List of destination tickets fulfilled by a player.
 - *Graph traversal: DFS / BFS*
 - 10 point bonus is awarded to player with the longest route on the board.
 - *Longest path in a tree / graph*

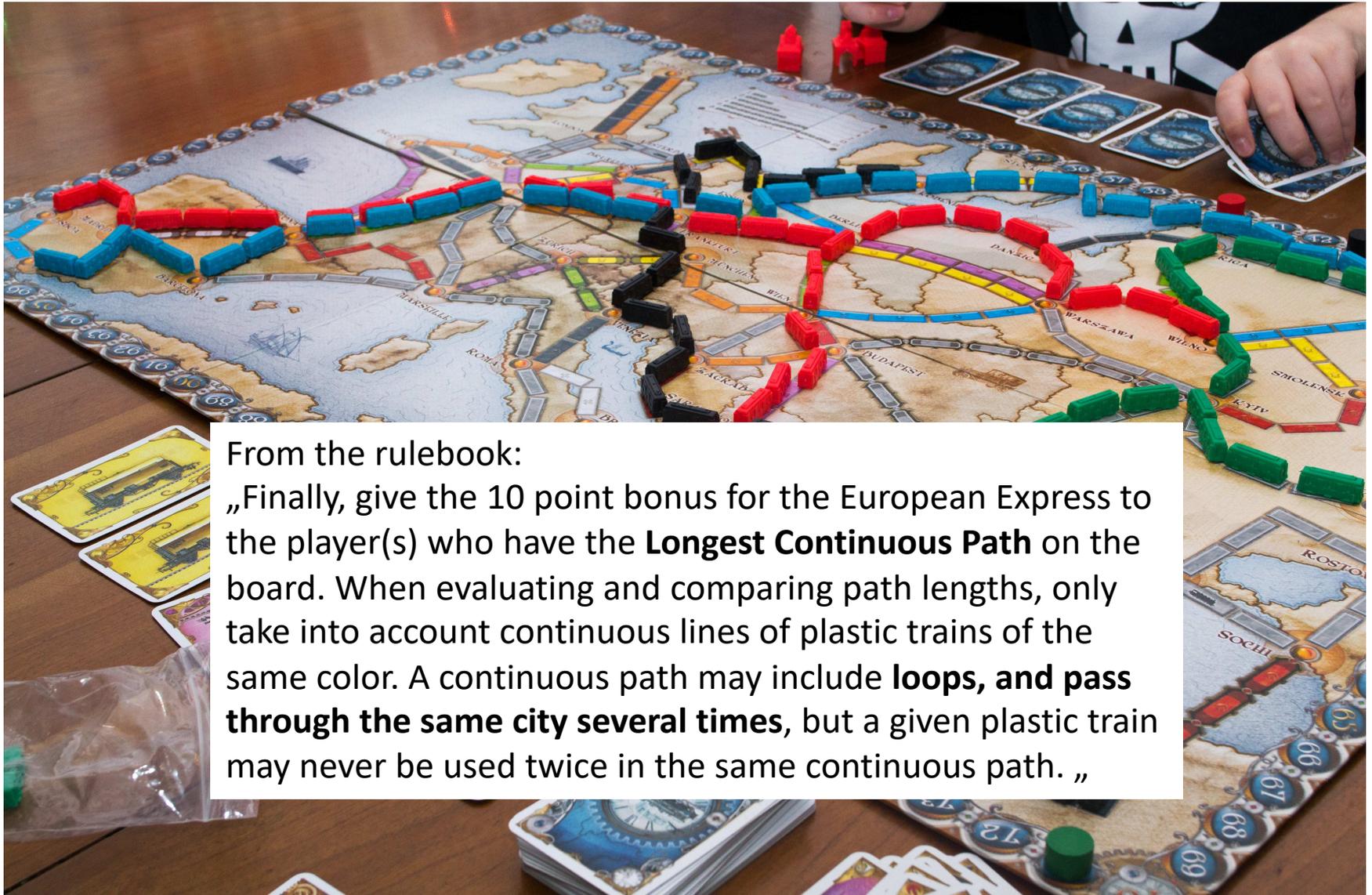
P, NP, NP-hard, NP-complete

- Definition:
 - P is the set of **decision problems** that can be solved in polynomial time
 - NP is the set of **decision problems** where we can **verify** a solution in polynomial time
 - NP-hard: at least as hard as NP (using polynomial time reduction)
 - NP-complete: it is NP-hard and in NP



What the world might look like...

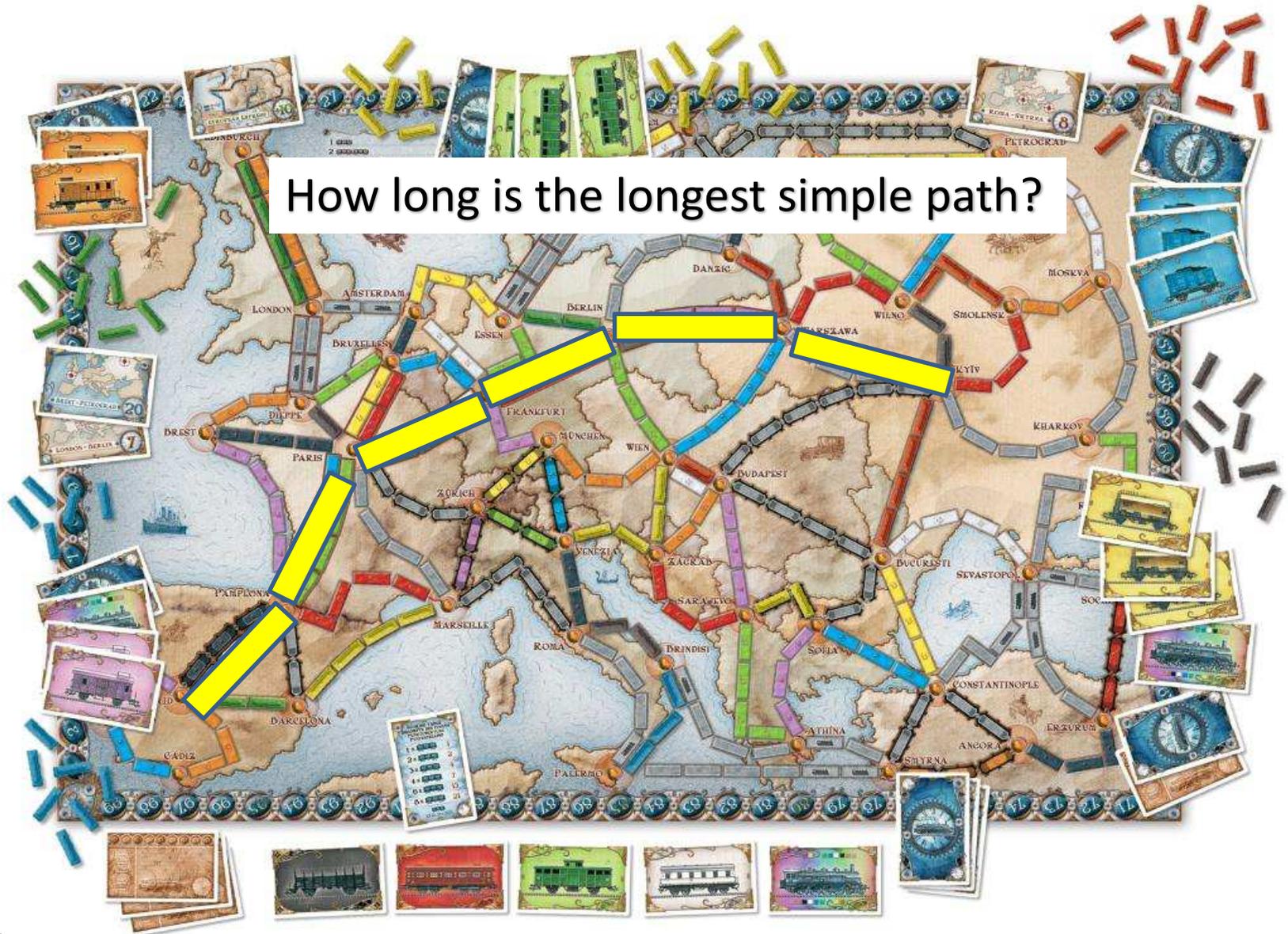
Longest Simple Path



From the rulebook:

„Finally, give the 10 point bonus for the European Express to the player(s) who have the **Longest Continuous Path** on the board. When evaluating and comparing path lengths, only take into account continuous lines of plastic trains of the same color. A continuous path may include **loops, and pass through the same city several times**, but a given plastic train may never be used twice in the same continuous path. „

Acyclic Graph / Undirected Tree



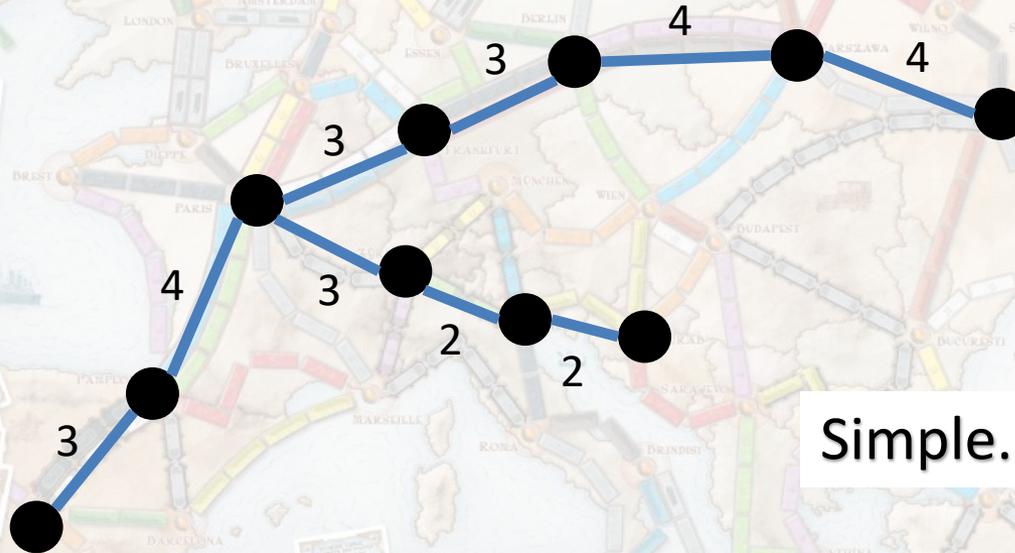
Acyclic Graph / Undirected Tree

How long is the longest simple path?

Simple...

Acyclic Graph / Undirected Tree

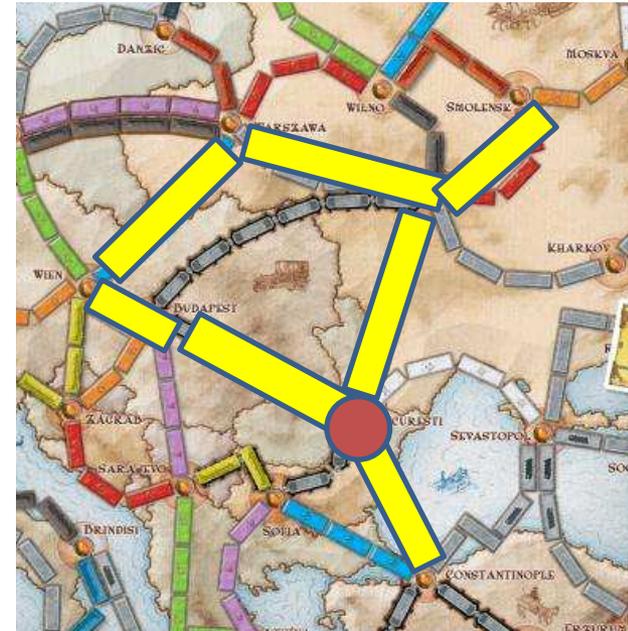
How long is the longest simple path?



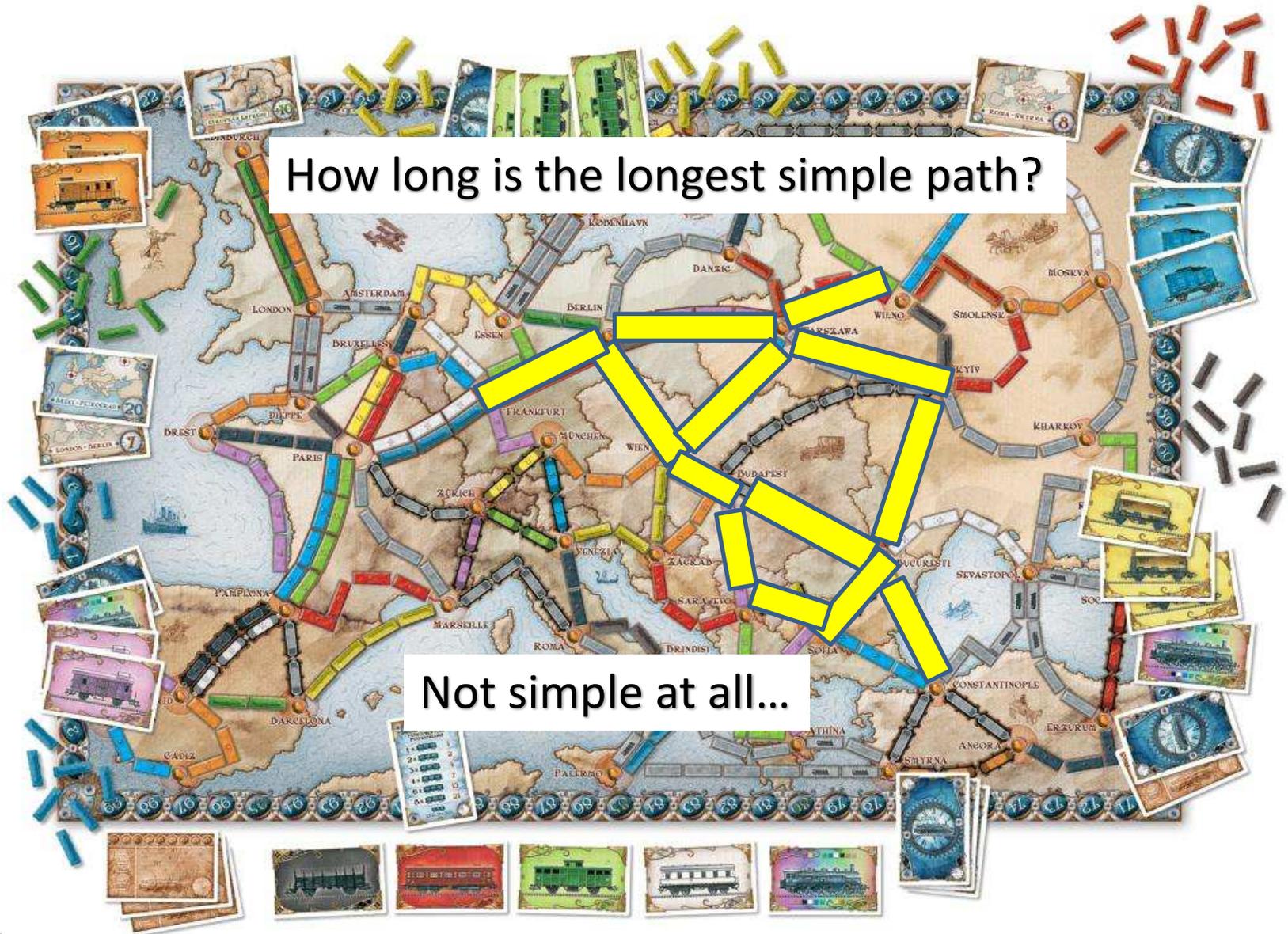
Longest Simple Path

- There is an algorithm for finding the longest simple path in undirected trees using two Depth-First-Searches:
 - Start DFS from a random vertex v and find the farthest vertex v' away.
 - Now, start a DFS from v' to find the vertex v'' farthest away from it. This path is the longest path in the graph.

- Does this still work in a cyclic graph?



Cyclic, Undirected Graph



Cyclic, Undirected Graph

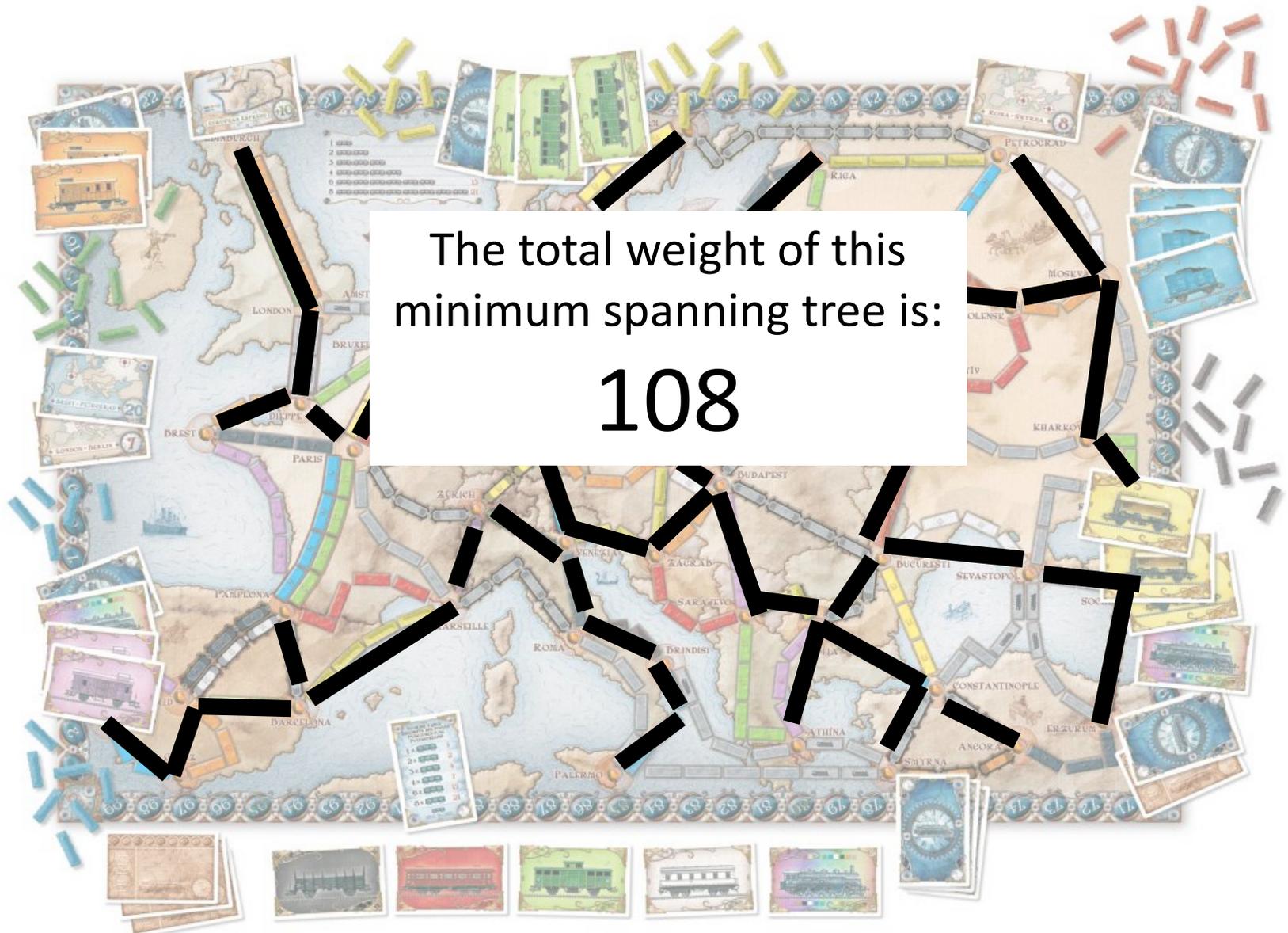
How long is the longest simple path?

Not simple at all...

Reformulation

- Is there a path in the player's edge-induced subgraph, that visits all edges? **NP-hard**
 - Check for Euler path of the full graph is in **P**
 - But if there is no Eulerian path, we have to check $O(2^n)$ many subsets
- Finding the longest simple path in a cyclic graph is NP-hard. Thus, there is likely to be no polynomial time algorithm.
- There are approximate algorithms in polynomial time.
- For final scoring, we need the **exact length** of the longest path (not an approximation).
- Side note: finding the longest simple path in an undirected tree (acyclic graph) is in polynomial time.

A MST for Ticket to Ride



Minimum Spanning Tree (Forest)

- A spanning tree of the full graph would guarantee that any destination ticket is fulfilled.
- But payers do not have enough train tokens to claim a spanning tree of the full graph (45 vs 108).
- Thus, the best strategy is to capture a minimum spanning tree or forest of a subset of vertices (based on the destination tickets).
- **Steiner Tree / Forest:** Given an undirected, weighted graph $G=(V,E)$ and a subset of vertices V' , referred to as terminals, we search the subgraph G' with minimum weight, that connects all terminals (and may include additional vertices).

Shortest Path on Destination Ticket



Minimum-Weight Subtree on Destination Tickets

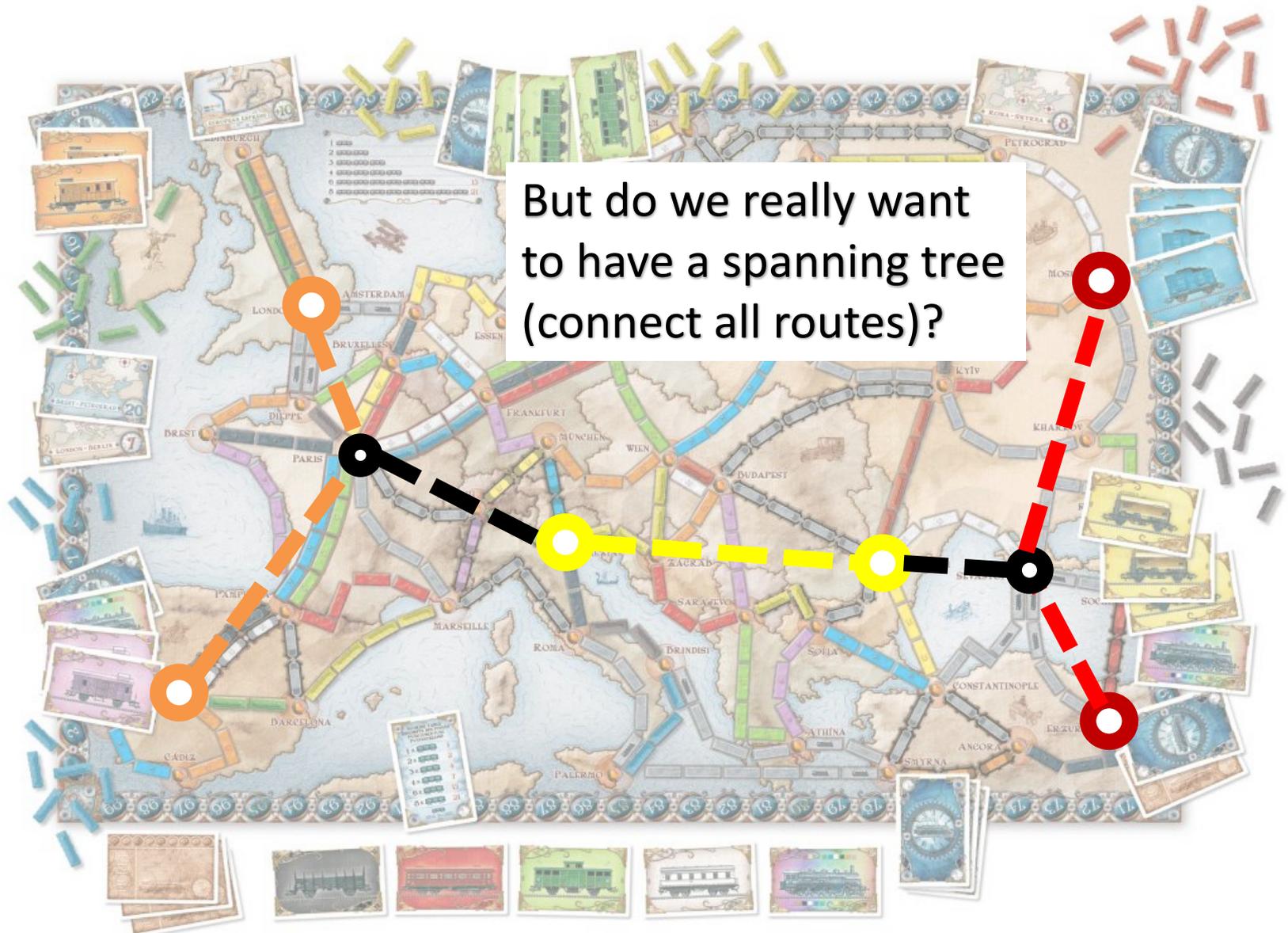
3 destination tickets, 6 cities, find the subgraph with minimum weight.

Dijkstra? MST? ...?

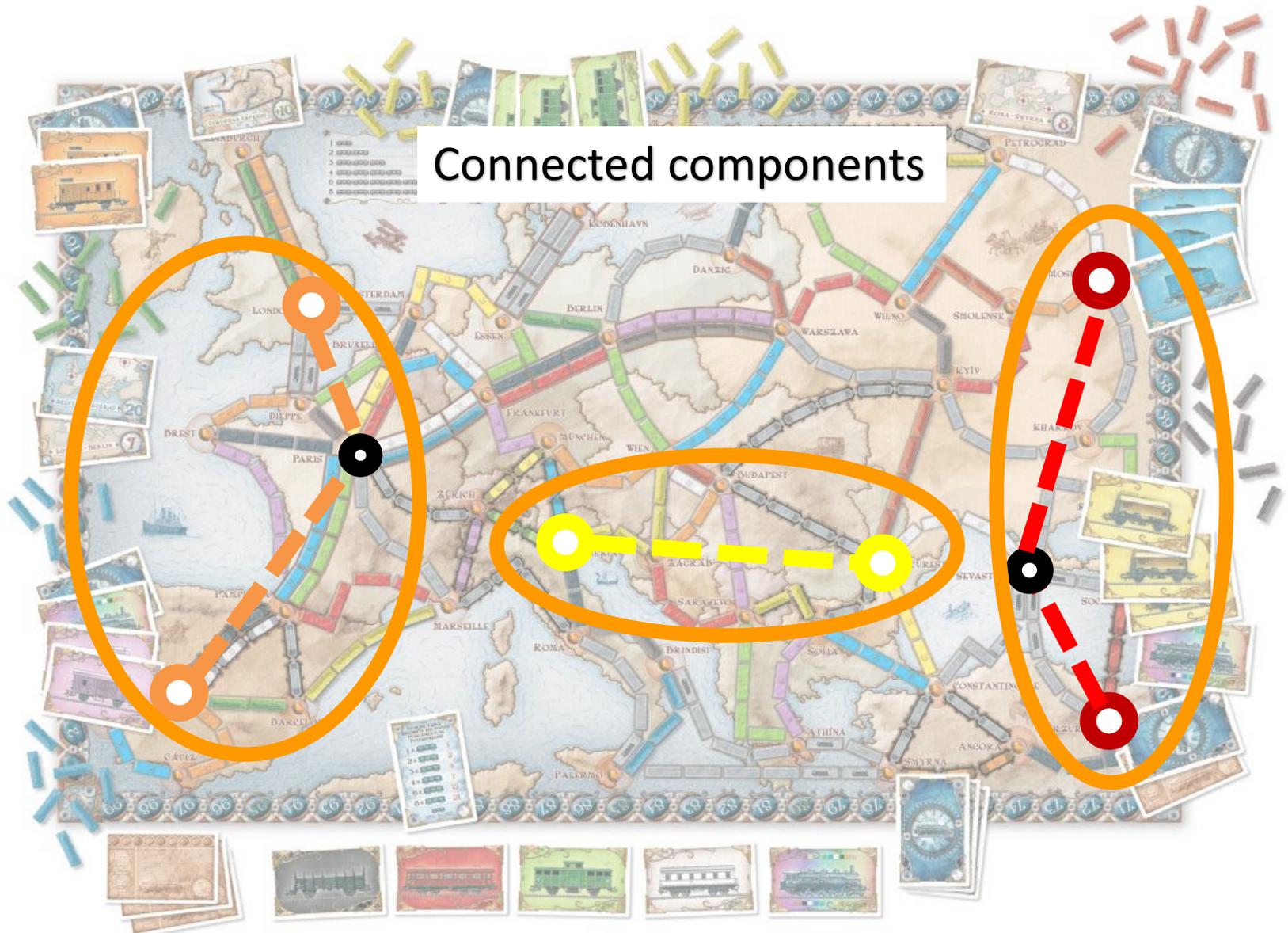
MST: we don't know which **subset of nodes** to include!

Dijkstra: single source shortest path for **two** cities.

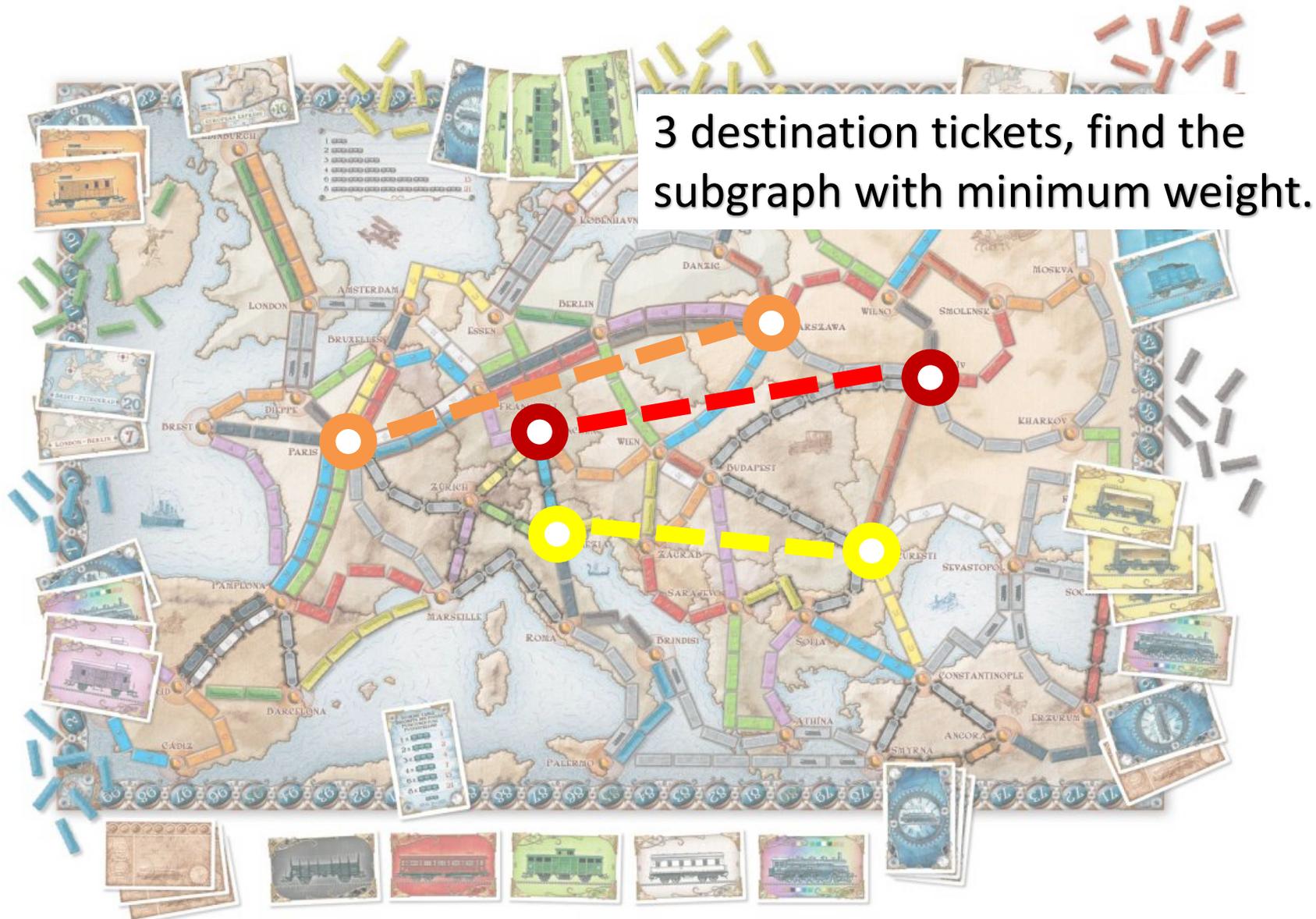
Minimum-Weight Subtree on Destination Tickets



Minimum-Weight Subtree on Destination Tickets

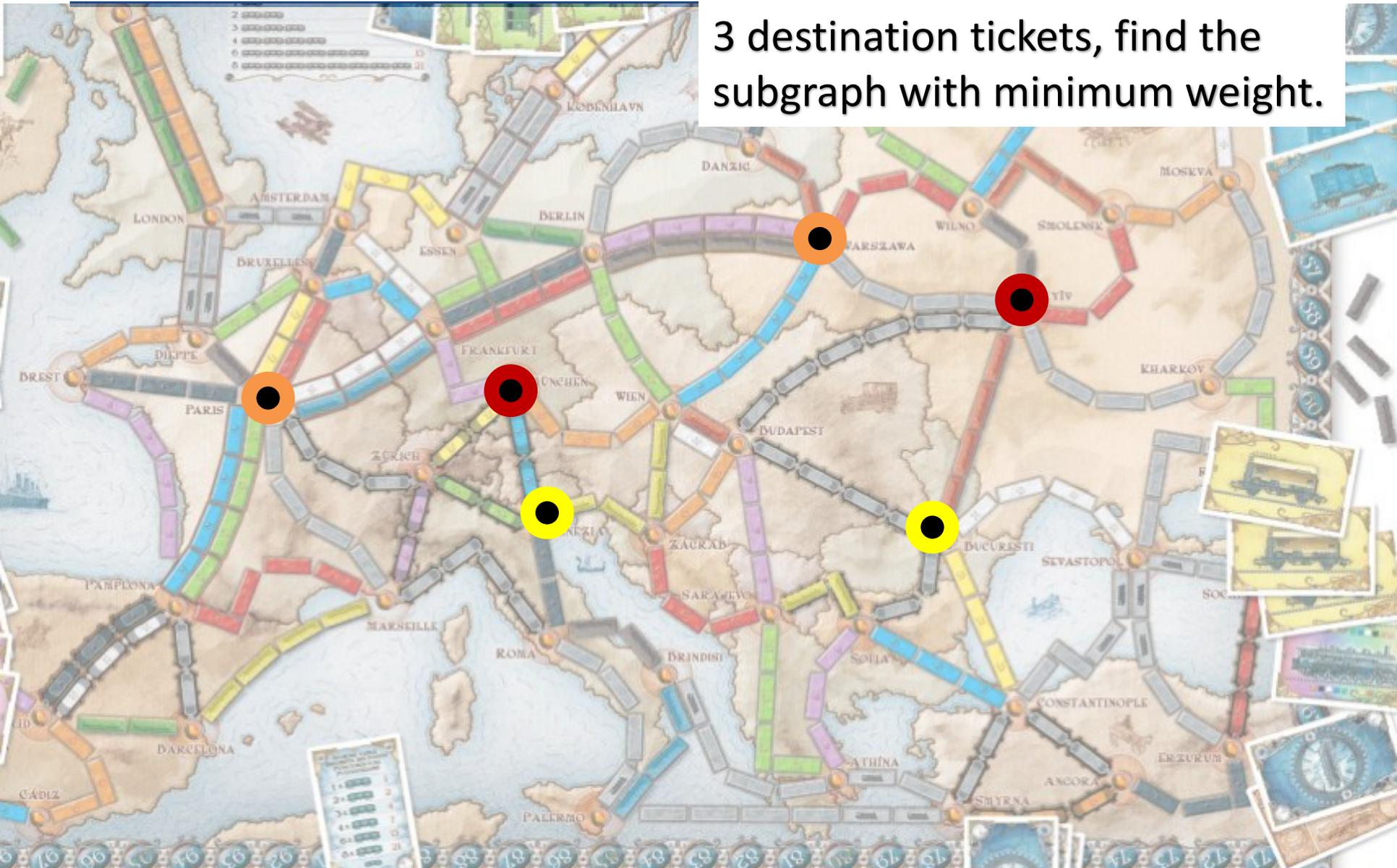


Minimum-Weight Subtree on Destination Tickets

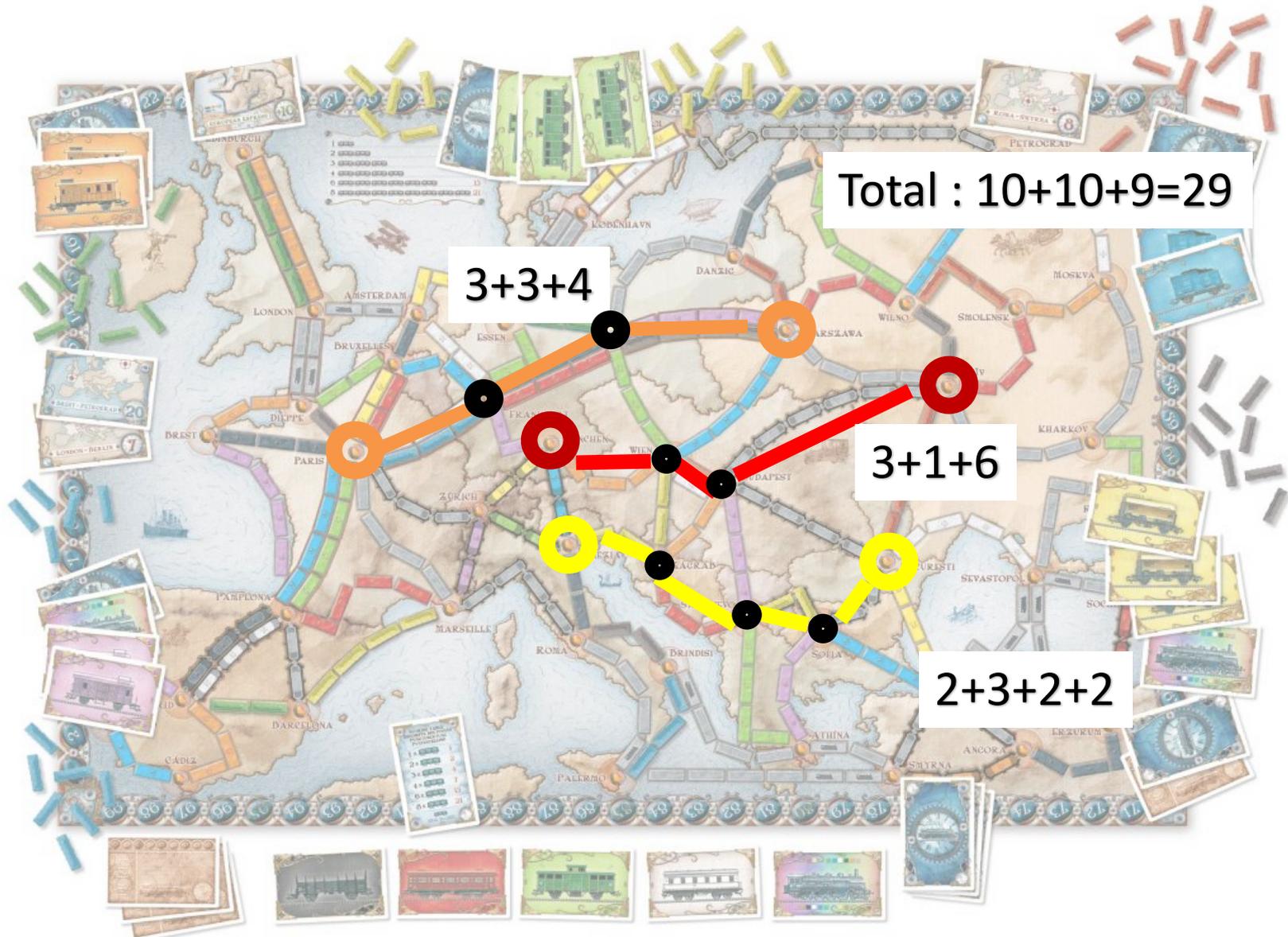


Minimum-Weight Subtree on Destination Tickets

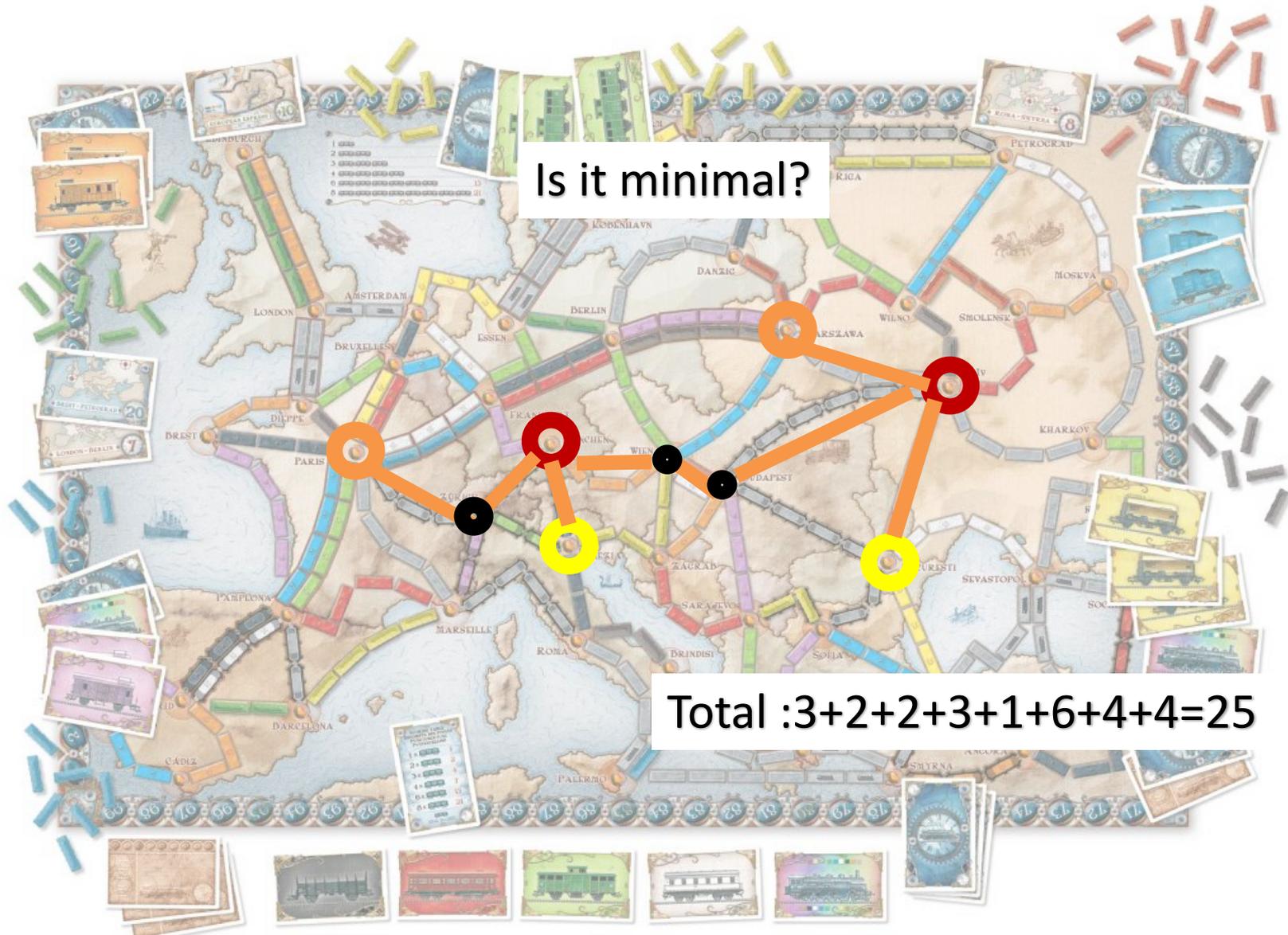
3 destination tickets, find the subgraph with minimum weight.



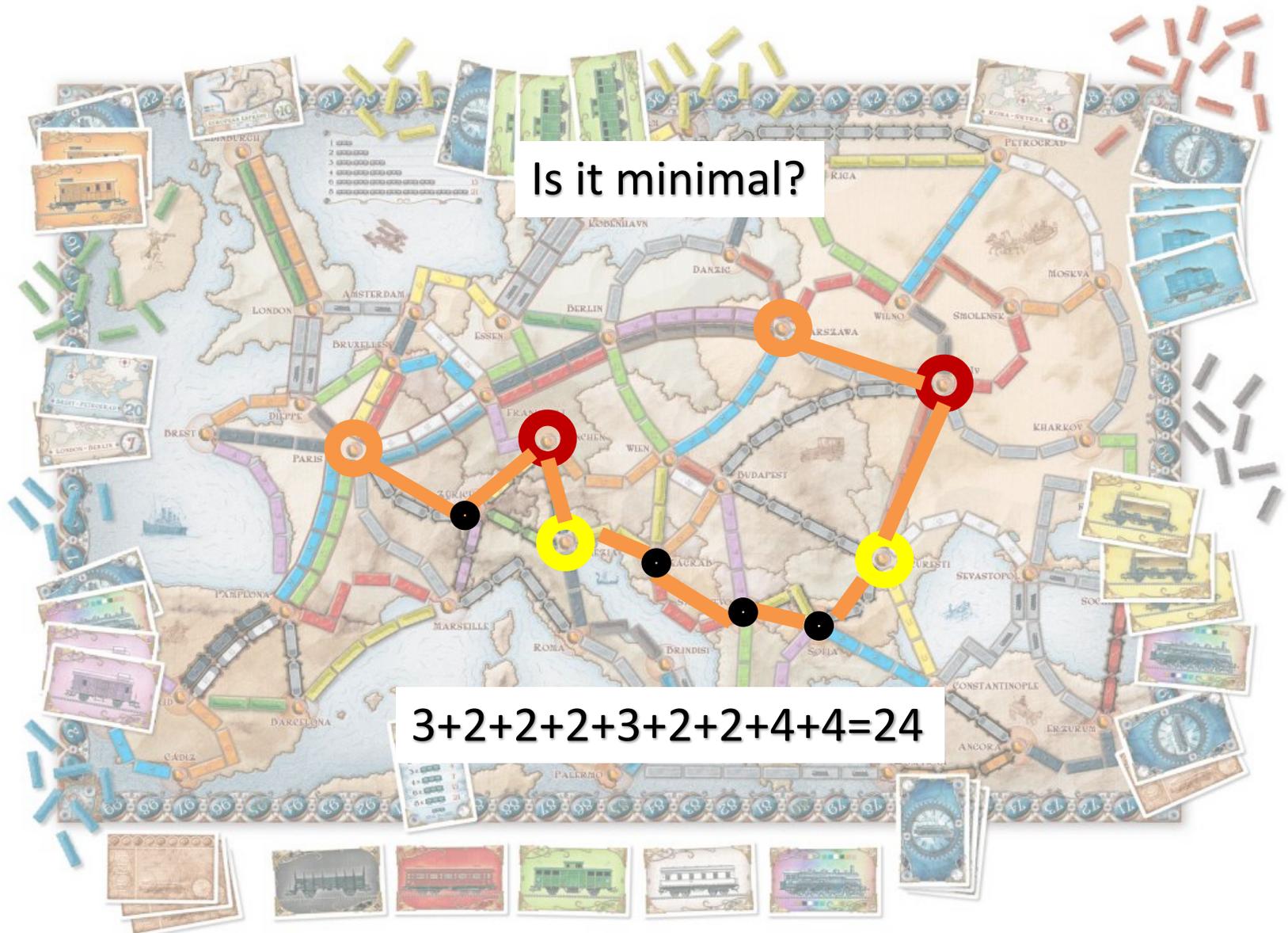
Using Dijkstra...?



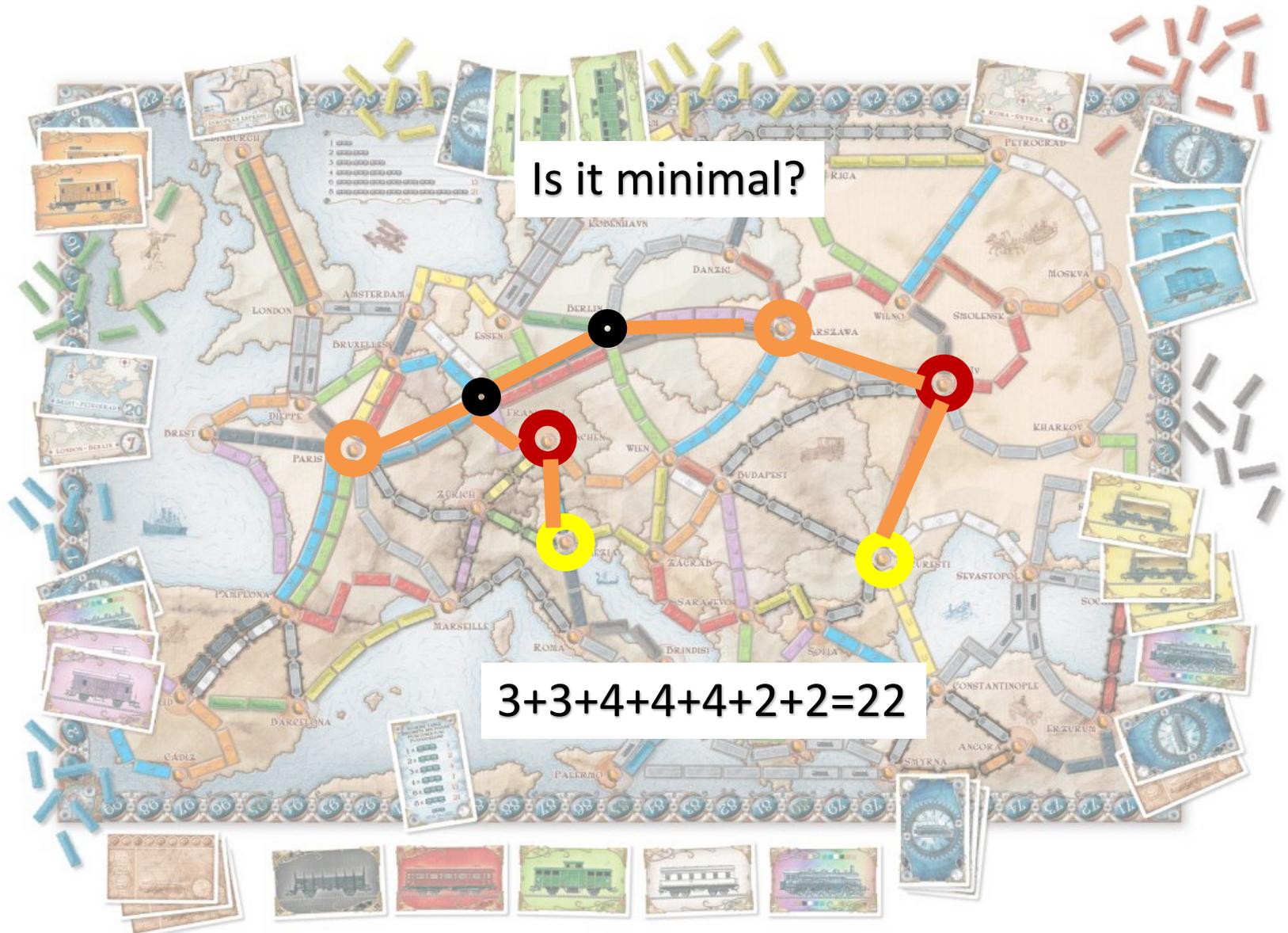
A Spanning Tree on the Subgraph...



A Spanning Tree on the Subgraph...



A Spanning Tree on the Subgraph...



NP-hardness

- We are dealing with NP-hard **optimization problems** [1]:
 - „**LONGEST PATH**: Given a non-negatively weighted graph G and two vertices u and v , what is the longest simple path from u to v in the graph? A path is *simple* if it visits each vertex at most once.“
 - „**STEINER TREE**: Given a weighted, undirected graph G with some of the vertices marked, what is the minimum-weight subtree of G that contains every marked vertex? If *every* vertex is marked, the minimum Steiner tree is just the minimum spanning tree; if exactly two vertices are marked, the minimum Steiner tree is just the shortest path between them.“

[1] Garey and Johnsons, „Computers and Intractability: A Guide to the Theory of NP-Completeness“

Steiner Tree / Forest in Cyclic Graphs is NP-hard

- Steiner Tree optimization problem is NP-hard, thus there is likely to be no exact polynomial time algorithm.
- Naïve approach:
 - for each subset of nodes: // $2^{|V|}$ -Subsets
 - compute the MST. // $O(|E| + |V| \log |V|)$
 - pick the subset with minimum costs.
- There are *heuristic* algorithms with polynomial time, that have upper bound guarantees on the maximum cost.
- Finding a good algorithm is part of the AI-Challenge.

Literature

- 21 NP-Hard Problems:
<http://web.engr.illinois.edu/~jeffe/teaching/algorithms/2009/notes/21-nphard.pdf>
- Taking Students Out for a Ride: Using a Board Game to Teach Graph Theory: <http://www.cs.xu.edu/csci390/13s/p367-lim.pdf>
- *Garey and Johnsons, „Computers and Intractability: A Guide to the Theory of NP-Completeness“*