# Connected Components Alexander S. Kulikov Steklov Mathematical Institute at St. Petersburg, Russian Academy of Sciences

University of California, San Diego

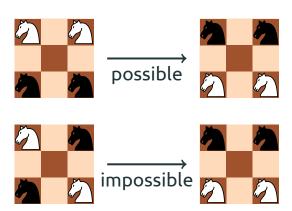
### The Heaviest Stone



There are *n* stones of different weights. An expert knows the weights and wants to convince the court that a particular stone is the

heaviest one. For this, he repeatedly uses a pan balance to compare the weights of some two stones. What is the minimum number of comparisons required?

## Guarini Puzzle, Revisited



can we check this automatically instead of manually?

#### Hm...

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- They both can be solved by analyzing connected components of an underlying graph!

#### Outline

#### **Connected Components**

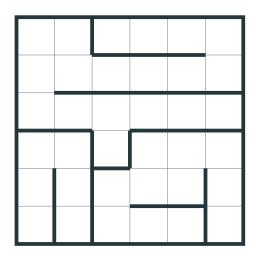
Guarini Puzzle: Program

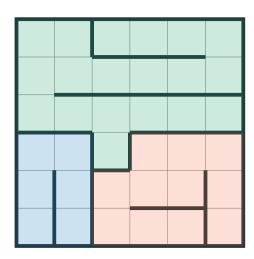
Lower Bound

The Heaviest Stone

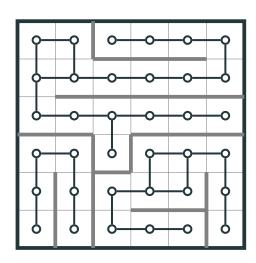
Directed Acyclic Graphs

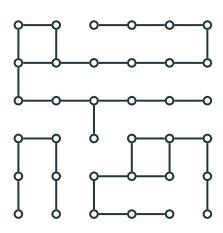
Strongly Connected Components

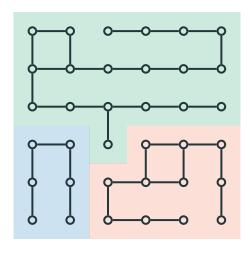




0	0	0	0	0	0
0	0	0	0	0	0
0	0	0	0	0	0
0	0	0	0	0	0
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- Two nodes are connected, if there is a path between them
- It is transitive: if u and v are connected and v and w are connected, then u and w are connected, too
- A graph is connected, if any two of its nodes are connected. In other words, there is a path between any two of its nodes

### **Connected Components**

The nodes of any undirected graph can be partitioned into subsets called connected components:

- Any node belongs to exactly one connected component
- Any two nodes from the same connected component are connected
- Any two nodes from different connected components are not connected









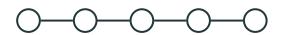














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## Revisiting the Guarini Puzzle

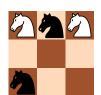




Given two configurations, check whether one is reachable from the other one

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- Join two nodes by an edge if their configurations are within a single move from each other



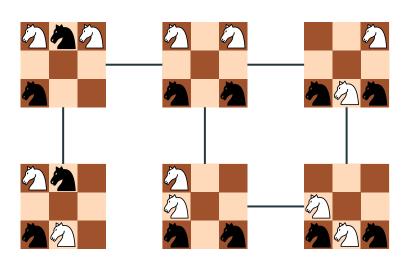












### Solution

Then, one configuration is reachable from the other one, if and only if they belong to the same connected component!

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#### Theorem

An undirected graph G(V, E) has at least |V| - |E| connected components.

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- The theorem is useless for graphs with  $|\mathit{E}| \geq |\mathit{V}|$

### Proof

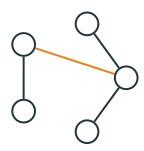
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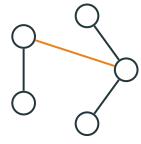
- Start with an empty graph (containing no edges)
- Initially, the number of connected components is |V|, it is indeed at least |V| |E| = |V|
- Each time when we add a new edge, |V| |E| decreases by 1
- At the same time, the number of connected components either decreases by 1 or stays the same

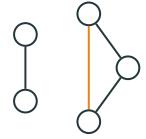
## Illustration



decreases

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### The Heaviest Stone



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- but is it optimal?
- yes!

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- Note that we are not even interested in the results of comparisons performed by the expert
- If there were less than n 1 comparisons, then the graph contains at least two connected components
- But this means that the court is still not sure about the heaviest stone!

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### DAGs

### Definition

A directed acyclic graph, or simply a DAG, is a directed graph without cycles.

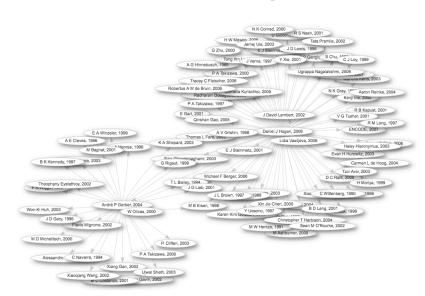
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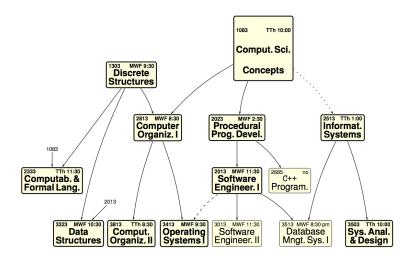
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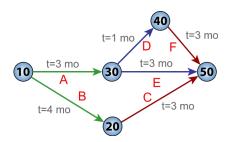


### Citation Graph



## **Prerequisite Graph**





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- We want to process jobs one by one
- How to find an order of jobs satisfying all constraints?
- If there is a cycle in the graph, then there is no such order
- It turns out that this is the only obstacle: if the graph is acyclic, then there is an ordering of its vertices satisfying all the constraints!

## **Topological Ordering**

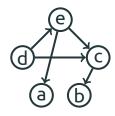
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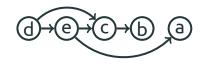
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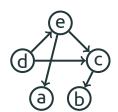
 We'll show that every DAG has a sink a node with no outgoing edges

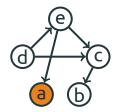
### **Every DAG Can Be Ordered**

#### Theorem

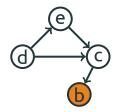
Every DAG has a topological ordering.

- We'll show that every DAG has a sink a node with no outgoing edges
- Take a sink, put it to the end of the ordering, remove it from the graph (this keeps the graph acyclic), and repeat





(a)





































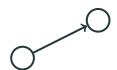
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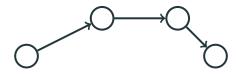
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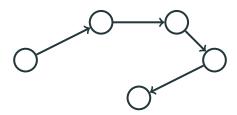
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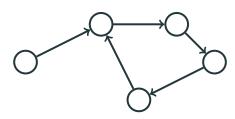
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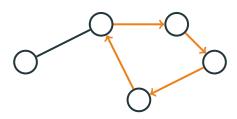
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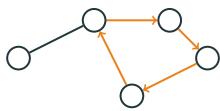
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• A contradiction!

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Connected Components

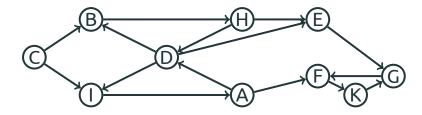
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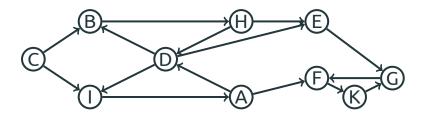
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Directed Acyclic Graphs

# Is This Graph Connected?

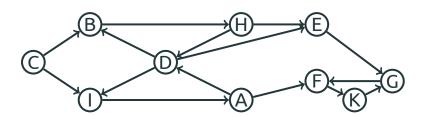


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 On one hand, this graph is connected: it cannot be "pulled apart"

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- On one hand, this graph is connected: it cannot be "pulled apart"
- On the other hand, it is not connected:
   e.g., there is no path from A to C

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