



# Cooperative Weakest Link Games

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# Weakest link scenarios





# Cooperative games

$I$  is a group consisting of  $n$  agents.

$v:2^I \rightarrow \mathbb{Q}$  gives each coalition of subsets of  $I$  a value.

An **imputation**  $(p_1, \dots, p_n)$  divides the value of the grand coalition (i.e.,  $v(I)$ ) between the various agents.

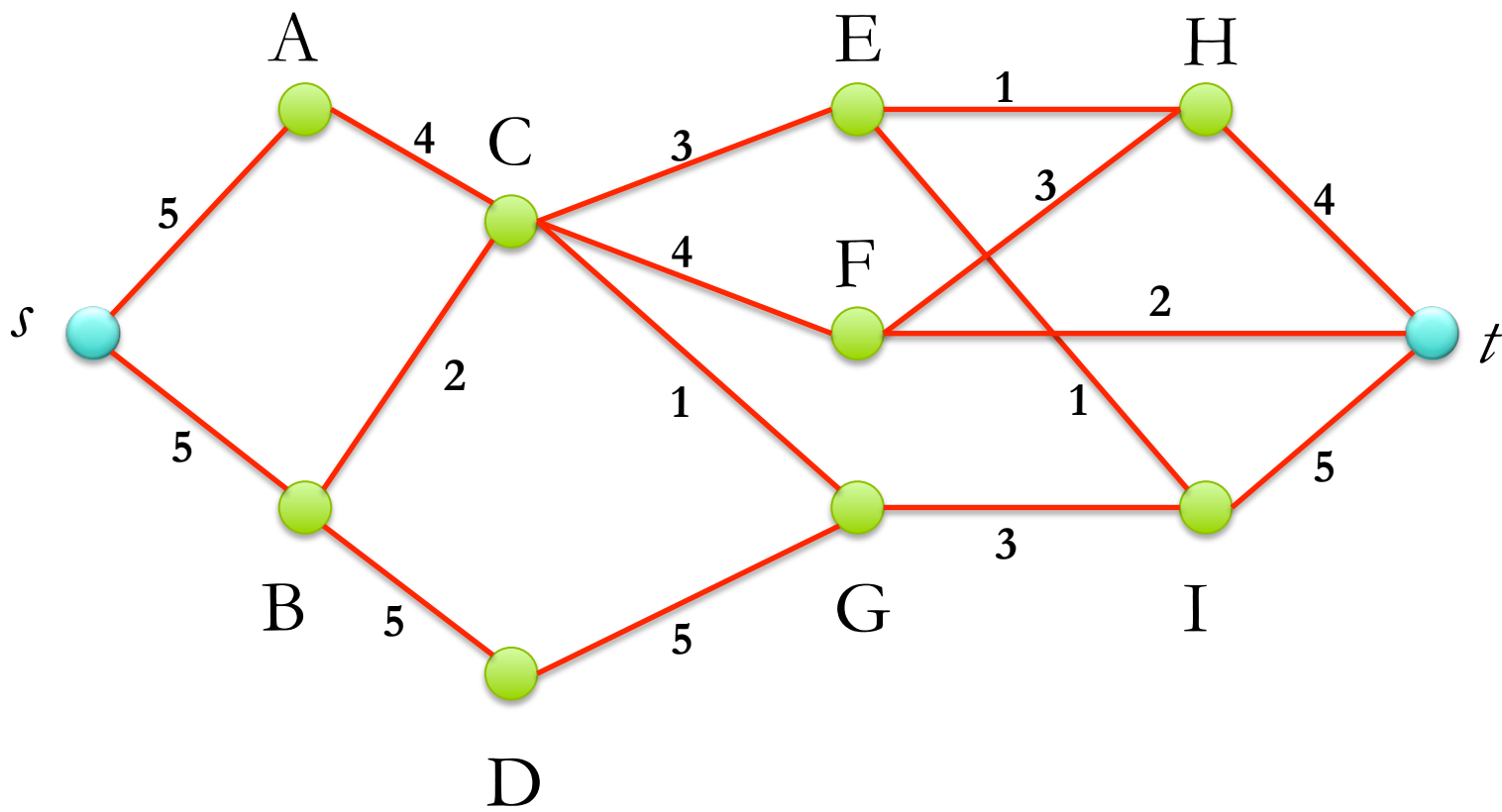


# Weakest link games

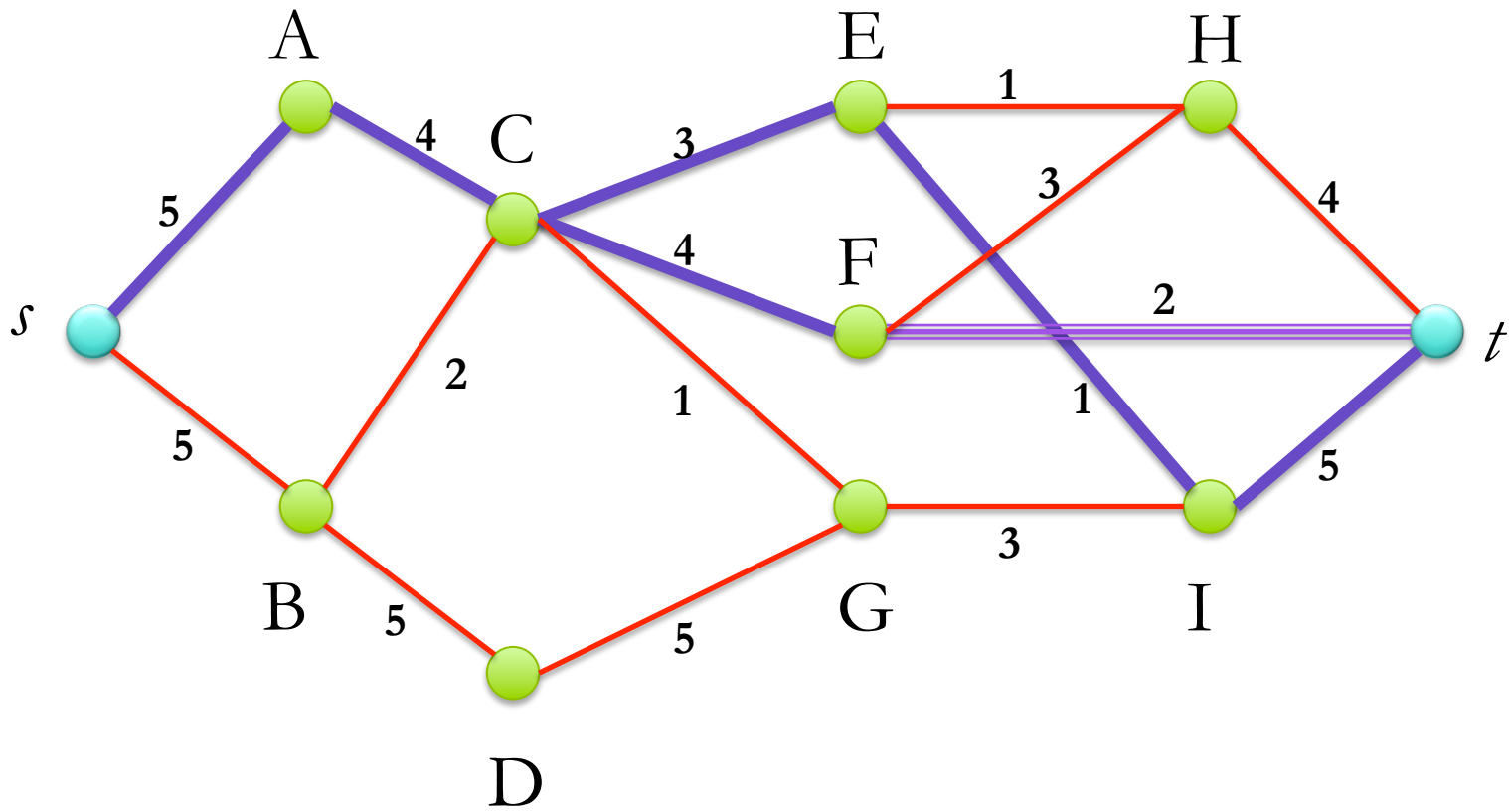
A graph  $G=(V,E)$  with weighted edges and with two special vertices –  $s$  and  $t$ .

Value of a coalition is calculated by taking all paths between  $s$  and  $t$  which is included in the coalition. The value of each path is the weight of the minimal edge. The coalition's value is the maximal of the paths.

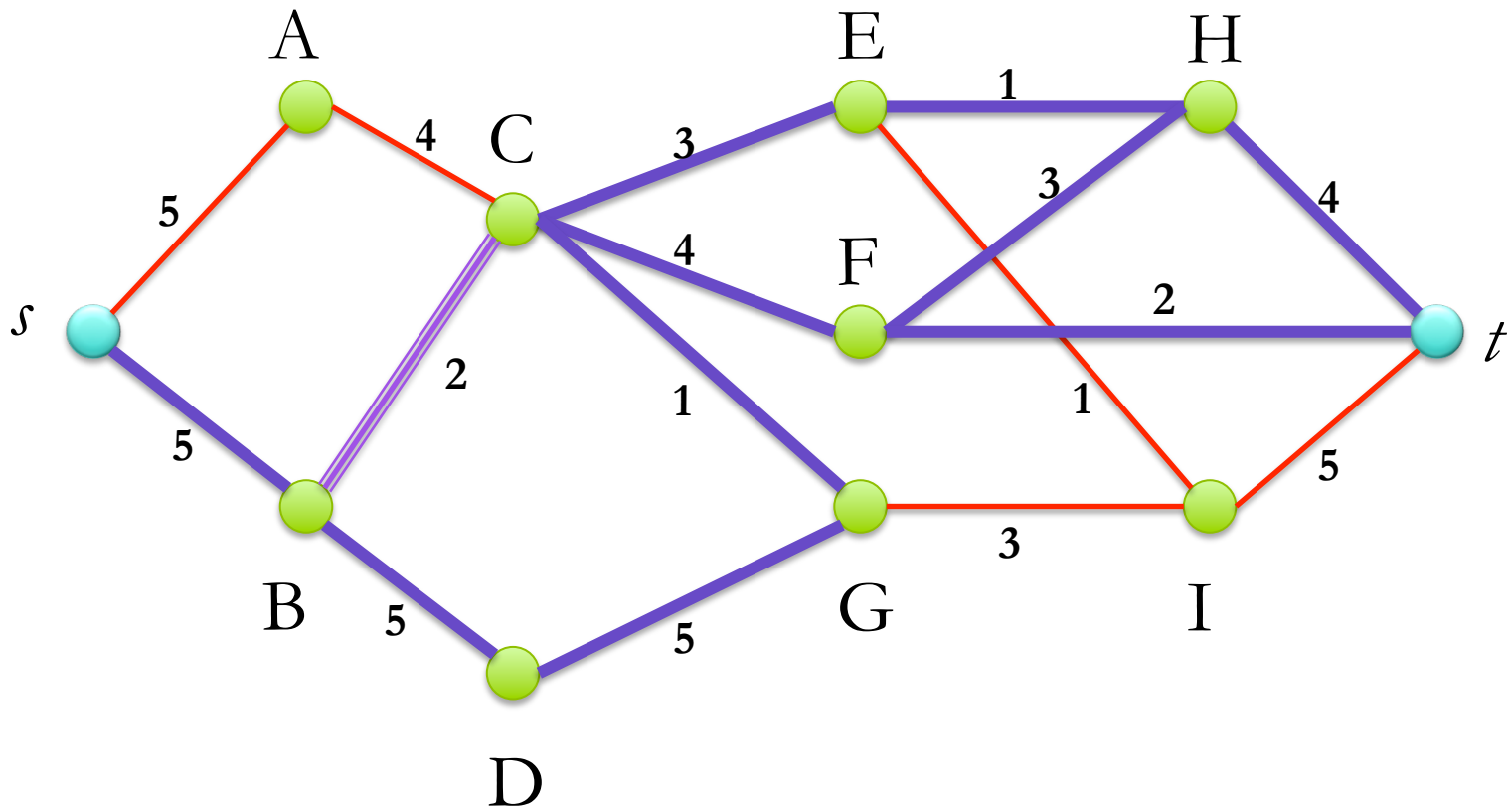
# Weakest link games example



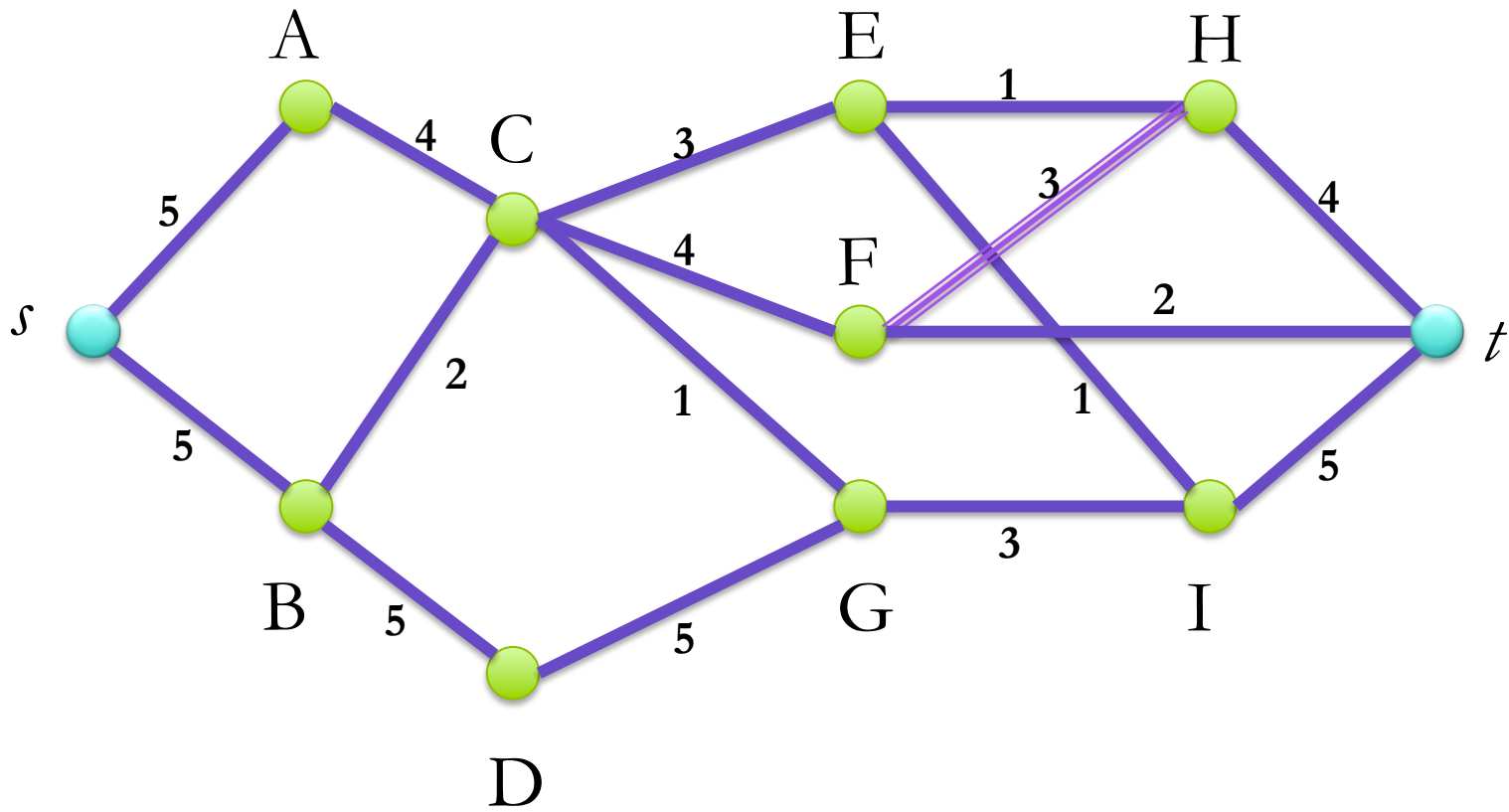
# Weakest link games example



# Weakest link games example



# Weakest link games example







# Core and $\varepsilon$ -core definitions

**Core** is the set of imputations that aren't blocked by any coalition (i.e., no subset of agents has an incentive to leave)

**$\varepsilon$ -core**, for  $\varepsilon > 0$ , is the set of imputations that, for each subset of agents  $C$ , gives its members at least  $v(C) - \varepsilon$ .



# Core – theorem I

Calculating the value of a coalition  $C$  is polynomial

For every value of edge weight  $\tau$  we build a graph with edges of minimal weight  $\tau$ , and see (using DFS) if a path still exists between  $s$  and  $t$ .



## Core – theorem II

Testing if an imputation is in the core (or  $\varepsilon$ -core) is polynomial

For every value of edge weight  $\tau$  we build a graph with edges of minimal weight  $\tau$ , and modify the weight of each edge to be its imputation. We find the shortest path, and if its total weight is below  $\tau$ , we have a blocking coalition.



# Core – theorem III

Emptiness of core (or  $\varepsilon$ -core) is polynomial

Using previous slide's algorithm as a separation oracle, we utilize the Ellipsoid method to solve

the linear program  $\forall C \subset I : \sum_{i \in C} p_i \geq v(C)$

$$\sum_{i \in I} p_i = v(I)$$



# Optimal coalition structure

## definition

A **coalition structure** is a partition of the agents into disjoint groups, with the value of the structure being the sum of the values of each group. The **optimal coalition structure** is the the partition with the maximal value.



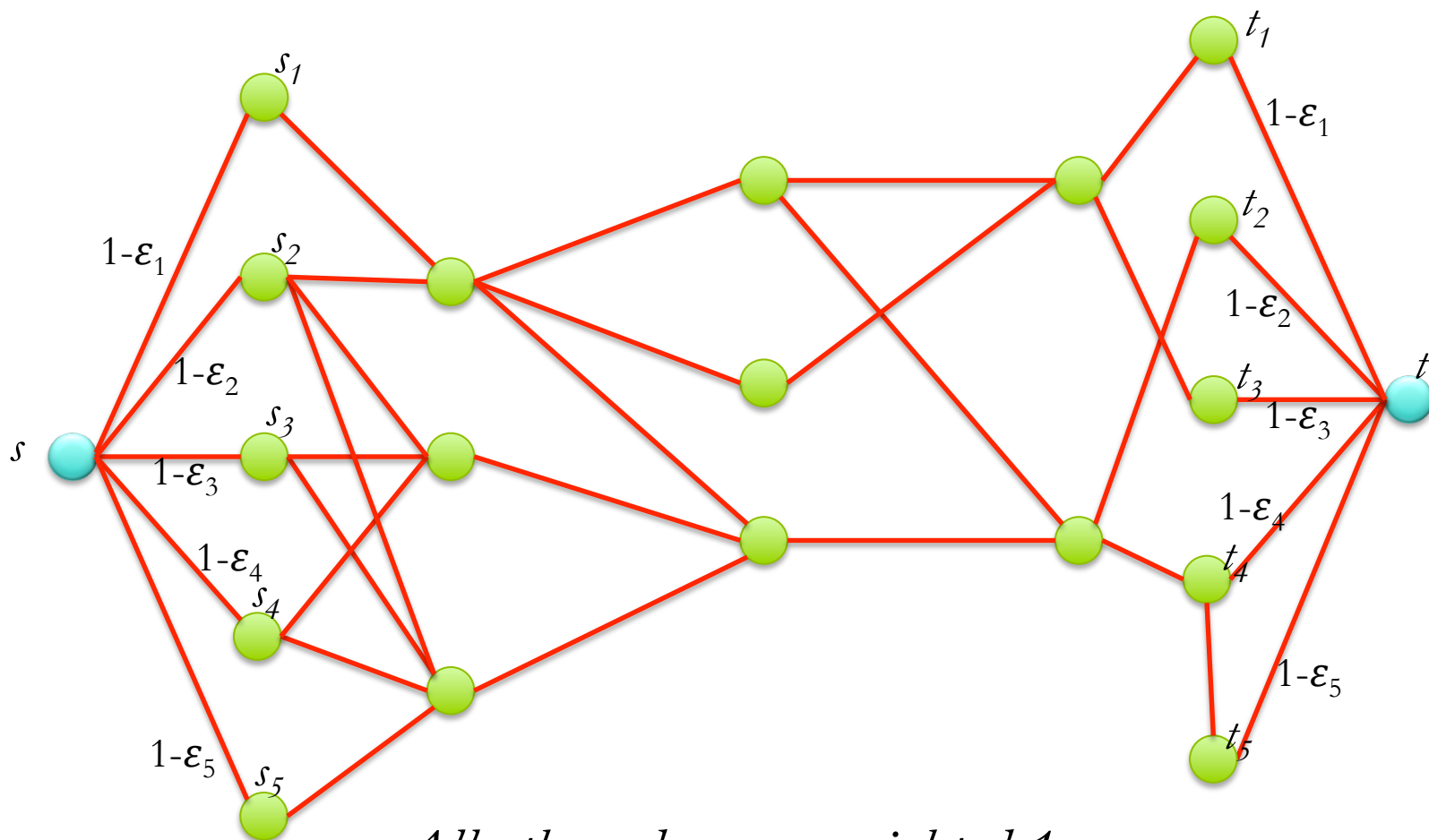
# Optimal coalition structure – theorem 1

Finding if the value of a the optimal coalition structure is above  $k$  is NP-hard

A reduction from Disjoint Paths Problem: set of  $k$  pairs of  $(s_i, t_i)$ , where we wish to know if there are  $k$  disjoint paths such that the  $i$ 'th path connects  $s_i$  to  $t_i$ .

# Optimal coalition structure

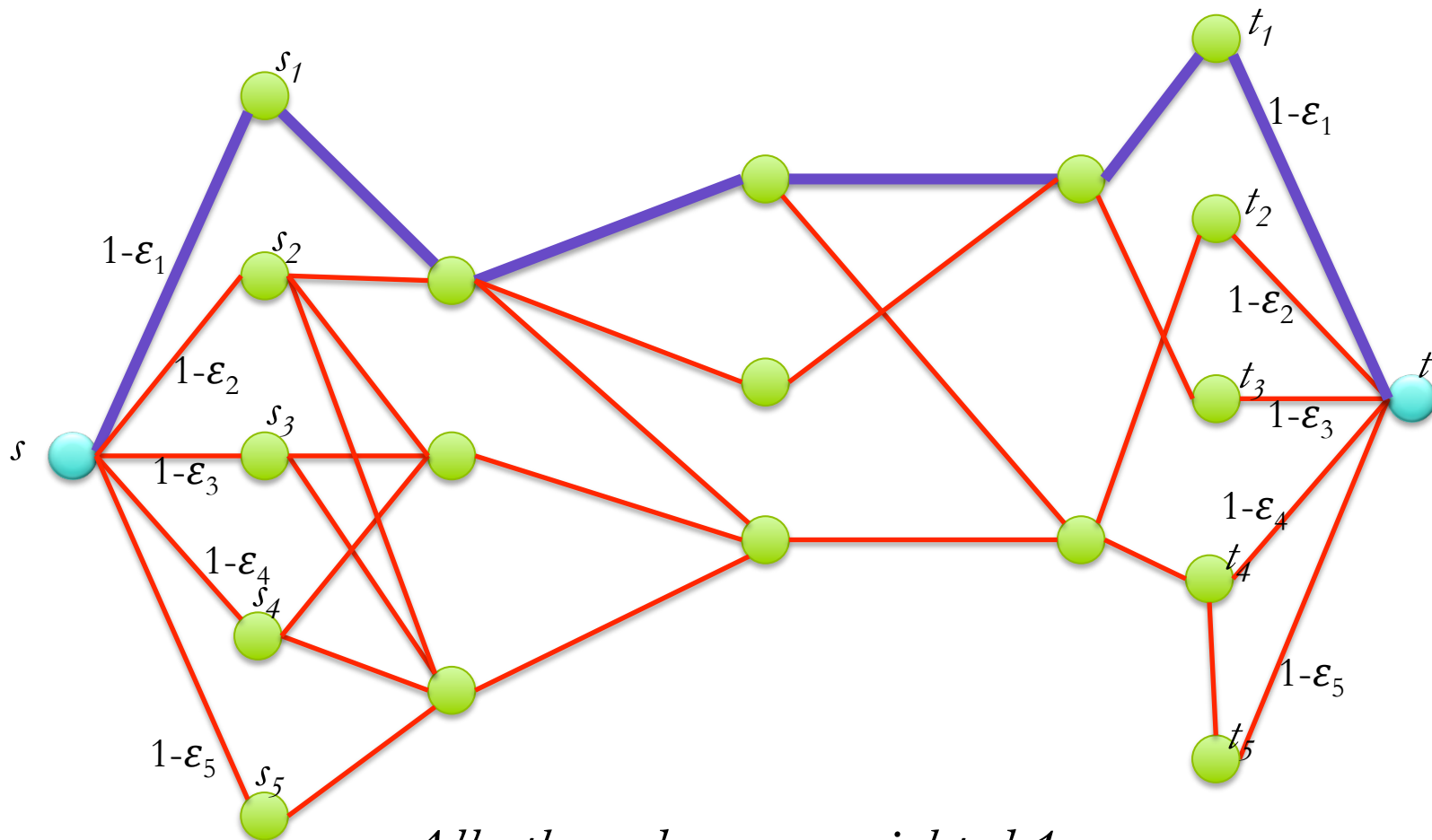
## – theorem 1 reduction



*All other edges are weighted 1*

# Optimal coalition structure

## – theorem 1 reduction

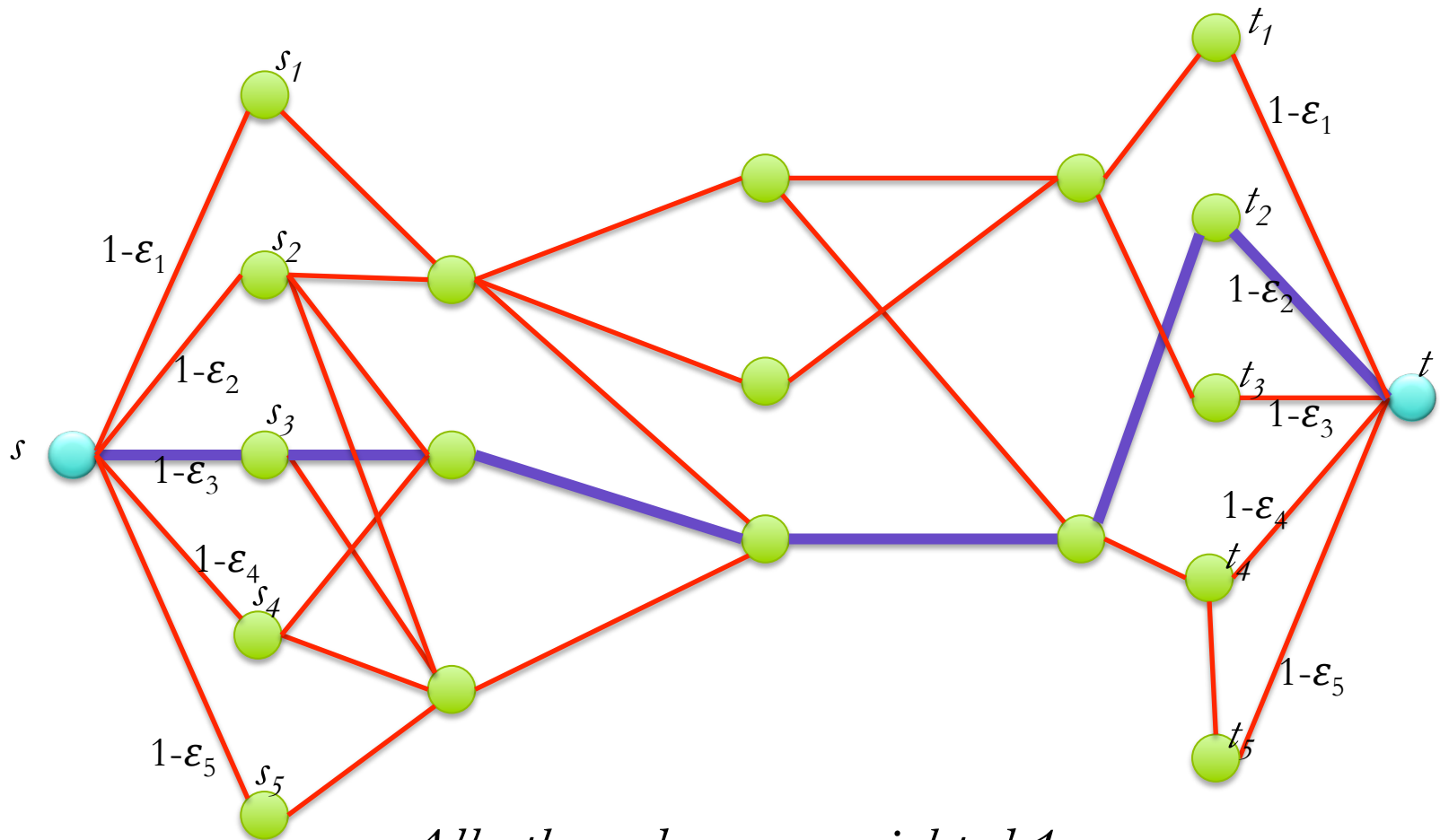


*All other edges are weighted 1*



# Optimal coalition structure

## – theorem 1 reduction



*All other edges are weighted 1*



# Optimal coalition structure – theorem II

There is an  $O(\log n)$  approximation to the optimal coalition structure problem

For each  $\tau$ , we can find (using max-flow algorithms) the number of disjoint paths with value of at least  $\tau - n_\tau$ . We maximize  $\tau n_\tau$ , and that can be shown to be an  $O(\log n)$  of the result...



# Optimal coalition structure – theorem II

Let  $w'$  be  $v(I)$ .

Hence, the optimal coalition structure is less than  $\sum_{i=1}^{\infty} n_i \frac{w'}{2^{i-1}}$ . It's easy to see that  $\sum_{i=2 \log(n)}^{\infty} n_i \frac{w'}{2^{i-1}}$  is less than  $2 \frac{w'}{n}$ , and hence, somewhere from  $1 < i < 2 \log(n)$ , there is an  $i$  which is worth  $\frac{1 - \frac{2}{n}}{2 \log(n)}$ .

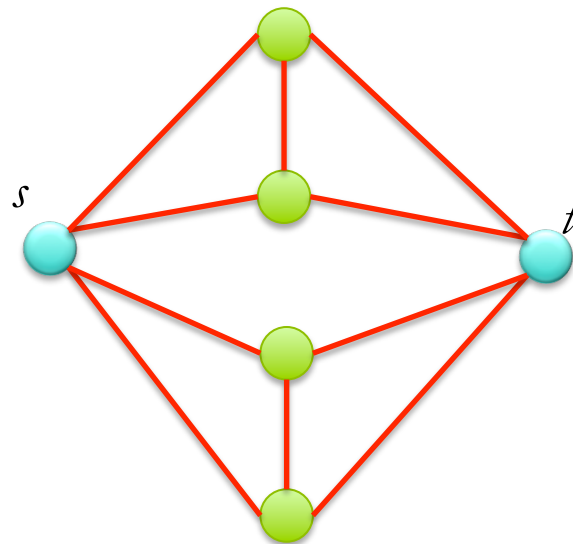
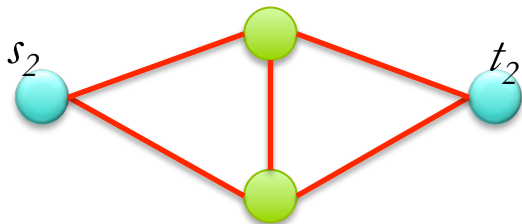
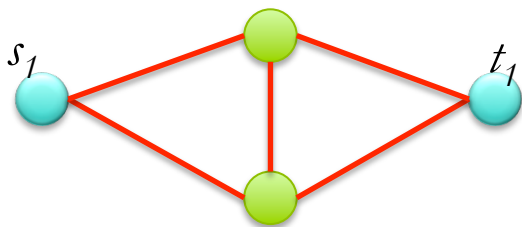
A horizontal chain of metal links is shown. The chain is mostly intact, but one link in the middle-right section is broken and highlighted in red. The broken link is split into two pieces, one above and one below the chain, symbolizing a weak link or a point of failure. The rest of the chain is silver and reflective.

# Cost of Stability definition

**Cost of Stability** is the minimal amount needed to be added to  $v(I)$  in order to make some imputation of the grand coalition be in the core.

# Cost of stability joining graphs

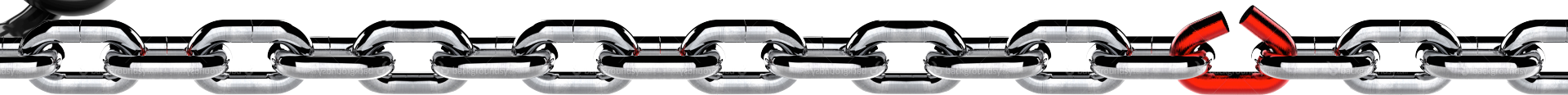
Parallel composition:



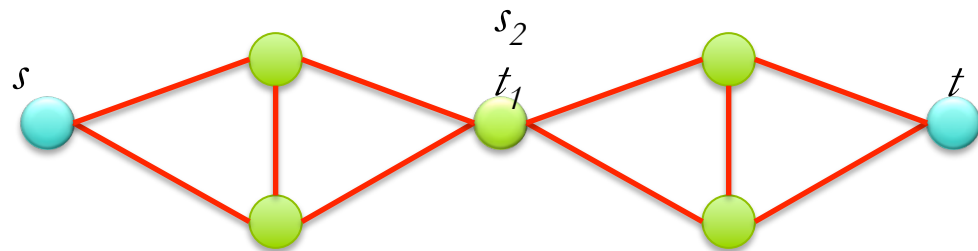
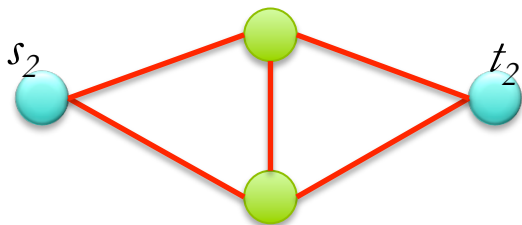
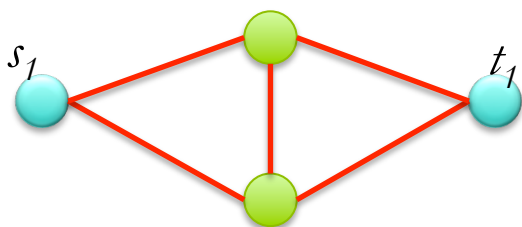
$$\sum_{G_i} (CoS(G_i) + v_i(G_i)) - \max_{G_i} (v_i(G_i))$$



# Cost of stability joining graphs



Serial composition:



$$\min_i CoS(G_i^{\min_{j \neq i} (v(G_j))})$$

Where  $G_i^j$  is  $G_i$  where all edges above  $j$  lowered to  $j$ .

A silver metal chain is shown horizontally across the top of the slide. The left end of the chain is broken, with several links flying off. The right end of the chain has a link that is broken and colored red, while the rest of the chain is silver. The title "Future directions" is written in a bold, purple, sans-serif font, partially overlapping the chain.

# Future directions

More solution concepts (nucleolus)

Power indices

A restricted class where optimal coalition structure can be solved

Uncertainty in agent behaviour

Weakest link without graphs?



*I am the weakest link, goodbye.*



**Thanks for listening!**