

Computational Foundations of Social Choice

A Complexity-Theoretic Perspective



My **sincere
apologies** if you
heard some of this
already at my
**COMSOC-08
tutorial.**

Jörg Rothe & Felix Brandt



ESF LogI CCC Launch Conference, Prague, Czech Republic, 2008

**„Computer Science is not about computers,
any more than astronomy is about telescopes.“**

Edsger Dijkstra

Outline

- **Impossibility Theorems in CS and SCT**
- **Complexity of Voting Problems:**
 - Winner Determination
 - Manipulation
- **Power-Index Comparison and Weighted Voting Games**
- **Multiagent Resource Allocation**

Impossibility Theorems in Computer Science and Social Choice Theory

Computability Theory



Alan Turing:

- Broke the Enigma-Code
- Invented the Turing machine
- Proved that some problems are **undecidable**

Complexity Theory

- Computational complexity of problems
- Lower bounds
- **Intractability** (NP-hardness)

Social Choice Theory



Ken Arrow: **No voting system** satisfying a certain small set of „fairness“ conditions can be **nondictatorial**.

Gibbard-Satterthwaite Theorem: Manipulation is **unavoidable** in principle.

Computational Social Choice

- Computational complexity of social choice problems
- Manipulation can be **computationally hard**

Voting Problems: How to Recruit a new Faculty Member

Candidates: A, B, C, **D**, E, F, G, H, I, **J**, **K**

Preferences of the Recruiting Committee:

J < A < B < E < **D** < F < G < H < **K** < I < C

I < **J** < A < **D** < E < F < G < B < C < **K** < H

A < B < F < G < H < **K** < I < C < **J** < E < **D**

E < G < F < B < **J** < I < H < C < A < **D** < **K**

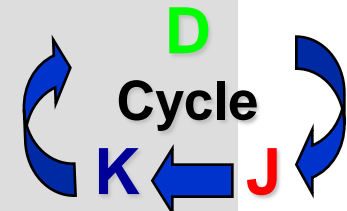
C < A < F < E < B < **K** < H < G < I < **D** < **J**

C < A < F < E < B < **K** < H < G < I < **D** < **J**

H < G < **K** < I < C < B < A < F < **J** < E < **D**

D < I < E < A < B < H < F < G < C < **J** < **K**

F < G < **D** < I < E < B < H < A < C < **K** < **J**



Make the List ... by the Majority Rule:

Rank 1: **D** and **J** and **K** (aequo loco)

Since: **D** defeats **J** by 5:4 votes,
J defeats **K** by 5:4 votes,
K defeats **D** by 5:4 votes.

Condorcet's Paradox

Voting Problems:

Winner Determination, Manipulation, Control, Bribery

Winner Determination:

- How hard is it to determine the winners of a given election?
- For most election systems, it is easy to determine the winners, but for some it is hard (Carroll, Kemeny, and Young elections).

Manipulation:

- How hard is it, computationally, to manipulate the result of an election by strategic voting?
- The Gibbard-Satterthwaite Theorem says: Manipulation is unavoidable in principle.

Control:

- How hard is it, computationally, for an evil chair to influence the outcome of an election via procedural changes?

Bribery:

- How hard is it, computationally, for an external agent to bribe certain voters in order to change an election's outcome?

Voting Problems:

Winner Determination, Manipulation, Control, Bribery

Winner Determination: Hardness is undesirable!

- How hard is it to determine the winners of a given election?
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Manipulation: Hardness provides protection!

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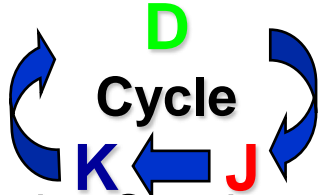
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Bribery: Hardness provides protection!

- How hard is it, computationally, for an external agent to bribe certain voters in order to change an election's outcome?

Winner Determination for Condorcet SCFs

- **Majority Rule:** A defeats B if A gets more votes than B.
- **Condorcet Candidate:** defeats each other candidate by majority.
- **Condorcet Paradox:**

The diagram illustrates a Condorcet cycle with three candidates: D (top), K (left), and J (right). Blue arrows show a cycle: D beats K, K beats J, and J beats D.
- **Condorcet SCFs:** choose the Condorcet candidate (if one exists).

Lewis Carroll's Voting System (1876):

The winner is whoever becomes a Condorcet candidate by a **minimum** number of sequential swaps of adjacent candidates.

H. P. Young's Voting System (1977):

The winner is whoever becomes a Condorcet candidate by removing a **minimum** number of voters.

J. G. Kemeny's Voting System (1959):

The winner is the candidate ranked first in a *consensus ranking*, which **minimizes** the sum of the distances to the voters.

Carroll Elections

- The **Carroll score** of a candidate \mathbf{c} is the smallest number of sequential switches of adjacent candidates in the preference profile of the voters that make \mathbf{c} a Condorcet candidate.
- **Carroll winner** is whoever has the lowest Carroll score.

Carroll Winner

Instance: A Carroll triple $(\mathbf{C}, \mathbf{c}, \mathbf{V})$, where

\mathbf{C} set of Candidates,

\mathbf{V} preference profile of voters over \mathbf{C} ,

\mathbf{c} a designated candidate in \mathbf{C} .

Question: Is \mathbf{c} a Carroll winner? That is, is it true that for all $\mathbf{d} \in \mathbf{C}$,

$$\text{Score}(\mathbf{c}) \leq \text{Score}(\mathbf{d}) ?$$

Carroll Score

Instance: A Carroll triple $(\mathbf{C}, \mathbf{c}, \mathbf{V})$ and a positive integer k .

Question: Is it true that $\text{Score}(\mathbf{c}) \leq k$?

Results for Carroll Election Problems

J. Bartholdi, C. Tovey & M. Trick (SCW 1989):

- Carroll Score **and** Kemeny Score **are NP-complete.**
- Carroll Winner and Kemeny Winner **are NP-hard.**

E. Hemaspaandra

Yes, We Can!

he (J.ACM 1997):

Carroll Winner is

el access to NP."

J. Rothe,

CS 2003):

Yo

e.

E. Hemaspaandra

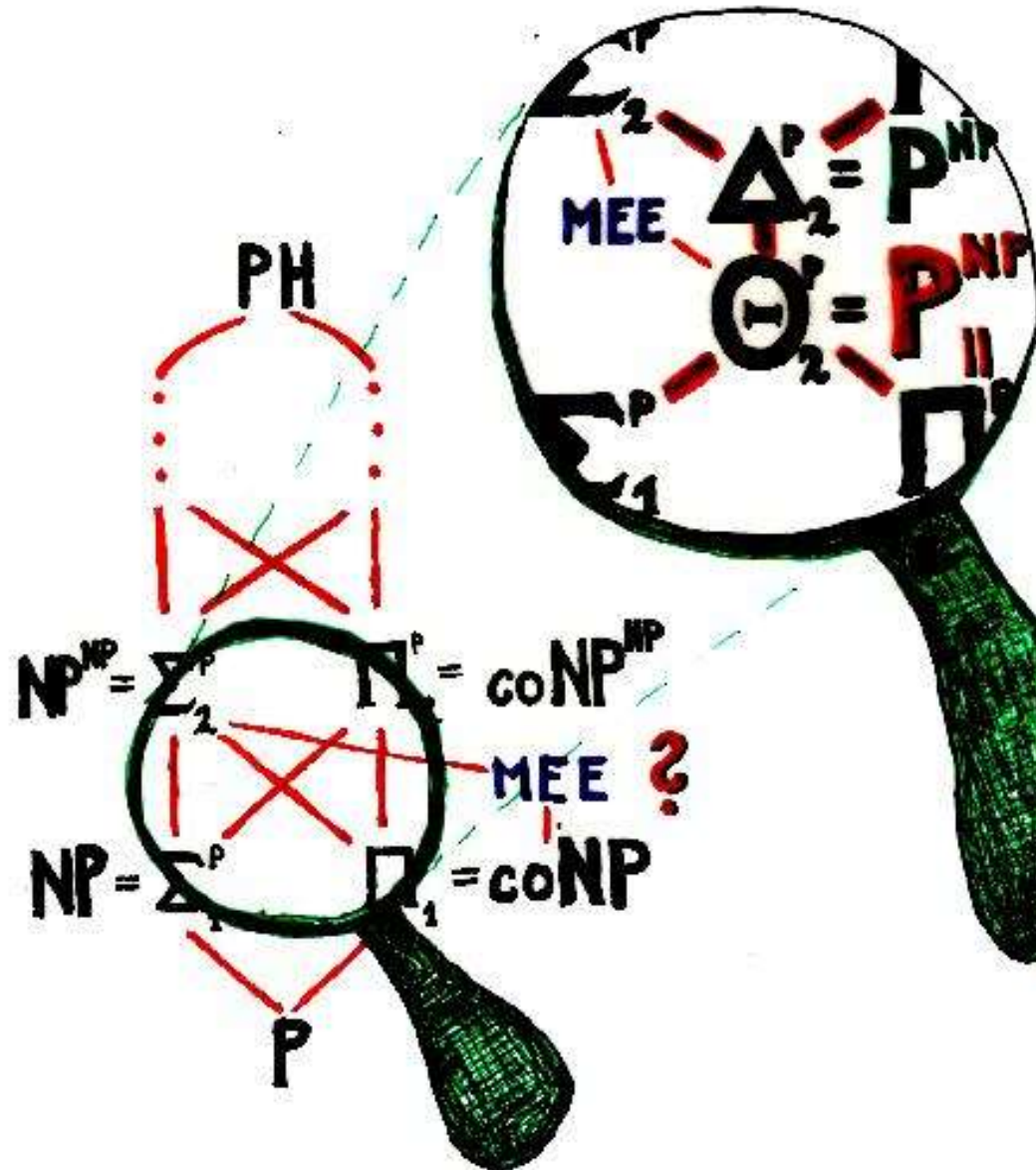
l (TCS 2005):

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te.



The Polynomial Hierarchy



Complexity of Solution Concepts/Choice Sets

F. Brandt & F. Fischer (MSS 2007):
Complexity of Minimal Covering Sets.

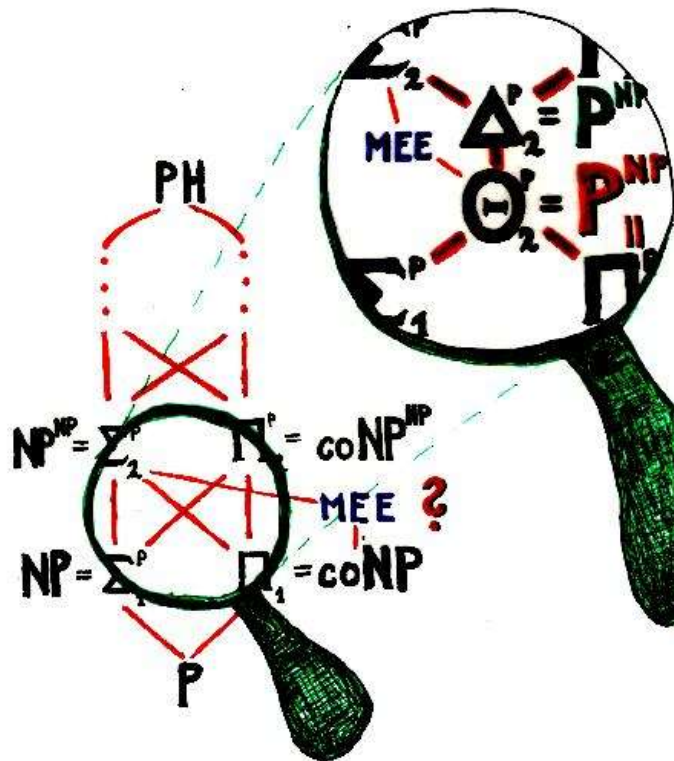
F. Brandt, F. Fischer & P. Harrenstein
(TARK 2007):

Complexity of Choice Sets:

- Copeland Set
- Smith Set
- Schwartz Set
- von Neumann-Morgenstern stable sets
- Banks set
- Slater set

F. Brandt, F. Fischer, P. Harrenstein & M.
Mair (AAAI 2008):

Computational Analysis of the Tournament
Equilibrium Set.



Election Systems that are NP-hard to Manipulate

Gibbard-Satterthwaite: Manipulation is unavoidable *in principle*.

Manipulation Problem

Instance: $(\mathbf{C}, \mathbf{c}, \mathbf{V})$, where \mathbf{C} is a set of candidates,

\mathbf{V} is the voters' preference profile over \mathbf{C} ,
 \mathbf{c} a designated candidate in \mathbf{C} .

Question: **Does there exist a preference order making \mathbf{c} a winner?**

J. Bartholdi, C. Tovey & M. Trick (SCW 1989):

For Second-Order Copeland, the winner problem is efficiently solvable, but the manipulation problem is NP-complete.

V. Conitzer, T. Sandholm & J. Lang (J.ACM 2007):

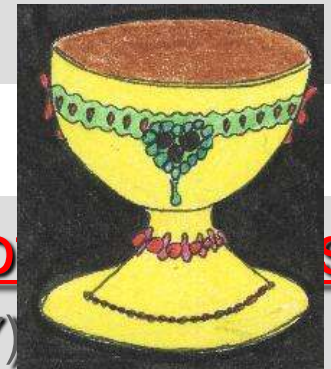
- Studied *coalitional* manipulation by *weighted* voters
- Characterized the exact number of candidates for which manipulation becomes NP-hard for plurality, Borda, STV, Copeland, maximin, veto, and other protocols
- Considered both **constructive** and **destructive** manipulation

Election Systems that are NP-hard to Manipulate

E. Hemaspaandra & L. Hemaspaandra (JCSS 2007):

Provided the first **dichotomy result** for voting systems:
an easy-to-check condition („diversity of dislike“) that separates

- **Scoring protocols that are NP-hard to manipulate** from
- **Scoring protocols that are easy to manipulate.**



Worst-Case vs. Average-Case/Frequency of Manipulation

A. Procaccia & J. Rosenschein (JAIR 2007)

Junta distributions and Average-Case Complexity of Manipulation **Holy Grail**

G. Erdélyi, L. Hemaspaandra, J. Rothe, H. Spakowski (FCT 2007):

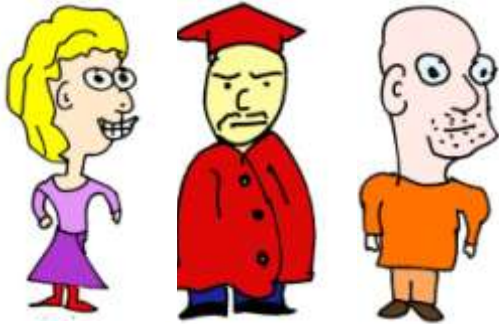
Frequency of Correctness vs. Average Polynomial Time.

M. Zuckerman, A. Procaccia & J. Rosenschein (SODA 2008):

Algorithms for the Coalitional Manipulation Problem.

Power-Index Comparison and Weighted Voting Games

Harvard University



20 papers 20 papers 50 papers



4 papers
\$10M

Money University

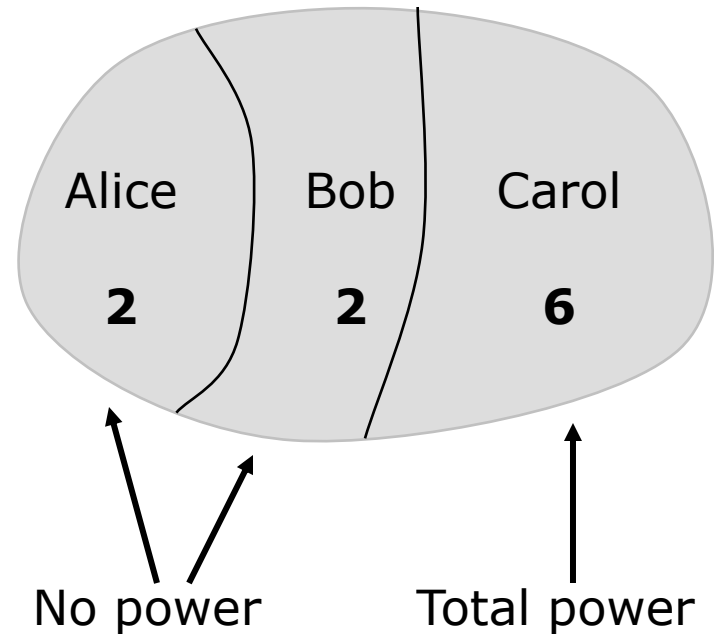
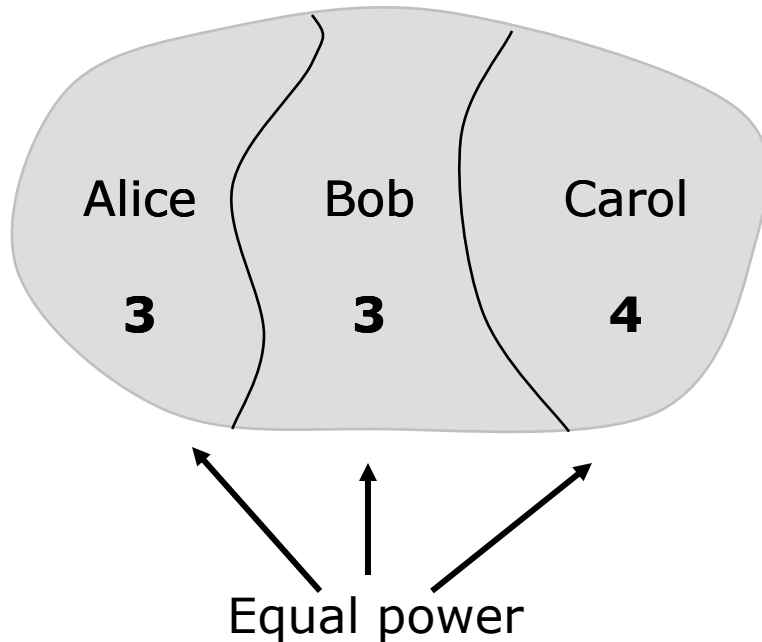


\$2M \$5M \$2M

Aha! Clearly, I will have more (local) power at Money University!
But how else can I justify this choice?

Power-Index Comparison and Weighted Voting Games

Weighted Voting Games:



Power Index idea:

How "often" is the given player critical to the winning side?

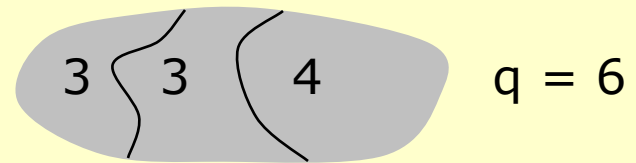
Power indices (e.g., **Shapley-Shubik** and **Banzhaf**) formally capture this idea. How hard is it to

- compute a power index for a given weighted voting game?
- compare the power index of two given weighted voting games?

Power Indices – Banzhaf [1965] and Shapley-Shubik [1954]

Voting game: $G = (w_1, \dots, w_n; q)$. Our notation:

- $N = \{1, \dots, n\}$: set of players
- w_1, \dots, w_n : weights of players
- q : quota value.



Banzhaf*(G,i) = how many of the 2^{n-1} subsets of $N - \{i\}$ have total weight $< q$ but $\geq q - w_i$?

Banzhaf(G,i) =
 $\text{Banzhaf}^*(G,i)/2^{n-1}$

(Probability that a randomly chosen coalition of players in $N - \{i\}$ is not successful but player i will put them over the top.)

SS*(G,i) = in how many of the $n!$ permutations of N is i pivotal, i.e., the players before it sum to less than q but player i puts them over the top.

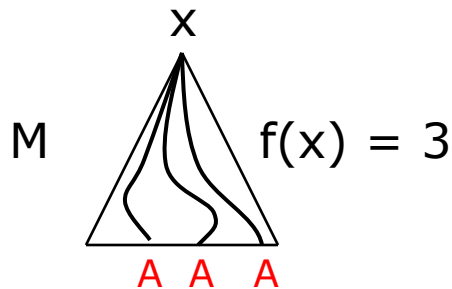
SS(G,i) = $\text{SS}^*(G,i)/n!$

Complexity Classes: PP [Simon/Gill, 1970s] and #P [Valiant, 1979]

#P (Counting NP):

$f \in \#P$ if there is an NPTM such that

$(\forall x \in \Sigma^*) [f(x) = \text{number of accepting paths of } M \text{ on input } x].$



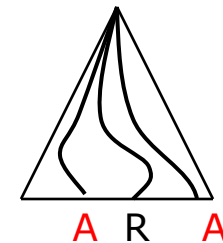
PP (Probabilistic Polynomial Time):

$L \in \mathbf{PP}$ if there is a probabilistic polynomial-time Turing machine that has acceptance probability greater than 50% precisely on the strings in L .

$x \notin L$



$x \in L$



PP-completeness:

- Polynomial-Time Many-One Reducibility:

$$A \leq_m^P B \Leftrightarrow (\exists f \in FP)(\forall x \in \Sigma^*) [x \in A \Leftrightarrow f(x) \in B].$$

- B is **hard for PP** if $(\forall A \in \mathbf{PP}) [A \leq_m^P B]$.

- B is **PP-complete** if B is in **PP** and is **PP-hard**.

#P-completeness:
 #P-metric-complete
 #P-many-one-complete
 #P-complete? Multiple notions!
 #P-parsimonious-complete

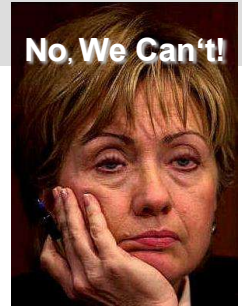
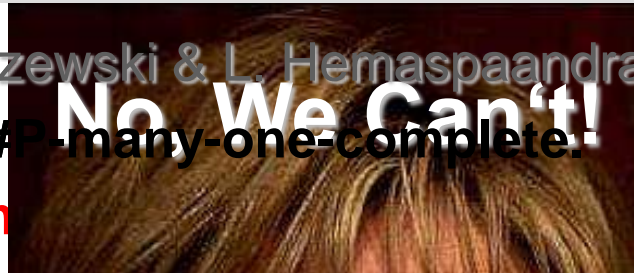
Results for Computing Power Indices

Prasad & Kelly (1990)+Hunt, Marathe, Radhakrishnan & Stearns (1998):
Banzhaf* is #P-parsimonious-complete.

X. Deng & C. Papadimitriou (1994):
SS* is #P-metric-complete.



- P. Faliszewski & L. Hemaspaandra (2008):
- **SS*** is #P-many-one-complete.
 - **SS*** is **n** complete.



PowerCompare-PI

(where **PI** is either **Banzhaf*** or **SS***)

Instance: Two weighted voting games, G and G' , and a player i .

Question: Is it true that $PI(G, i) > PI(G', i)$?

~~(Can we improve this to #P/Parsimonious-completeness?)~~

- P. Faliszewski & L. Hemaspaandra (2008):
- **PowerCompare-Banzhaf*** is PP-complete.
 - **PowerCompare-SS*** is PP-complete.

Multiagent Resource Allocation after World War II

- Set of Agents: the Allies of World War II
- Set of Resources: Germany's Federal States

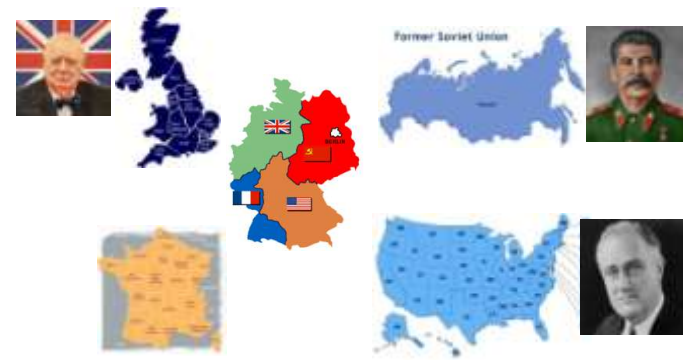


Multiagent Resource Allocation

- Set of Agents: $A = \{1, 2, \dots, n\}$
 - Set of Resources: $R = \{r_1, r_2, \dots, r_m\}$
 - Each agent a has
 - a **preference** \leq_a over allocations
 - a **utility function** that assigns values to bundles of resources.
 - Each resource is indivisible and nonsharable.
 - An **allocation** is a mapping P from A to bundles of resources.
- Useful properties:
- Envy-freeness
 - Pareto optimality

Chevalerey, Dunne, Endriss, Lang, Lemaitre,
Maudet, Padget, Phelps, Rodriguez-
Aguilar & Sousa (2005):
MARA Survey.

- to determine if a given allocation is envy-free?



Thank you!



I hope they won't
ask any questions!

“Hardest” Problems for #P

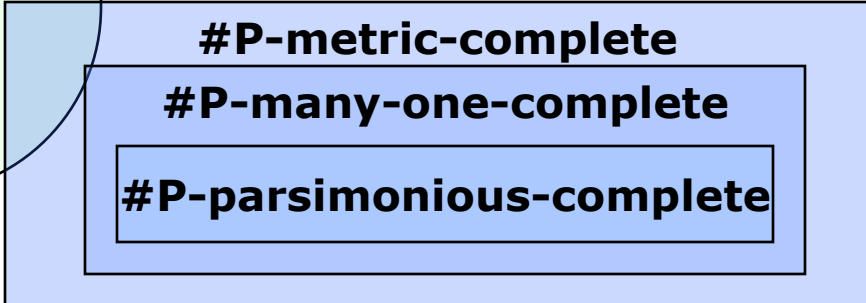
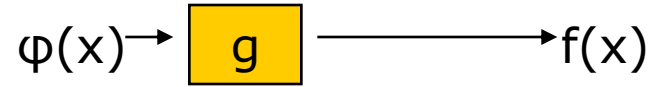
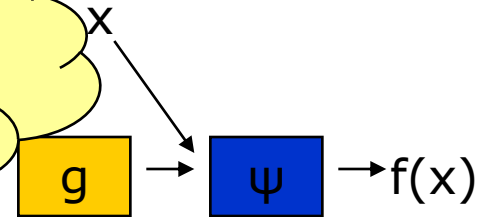
Definition:

- [Krentel, 1988] A function $f: \Sigma^* \rightarrow \mathbb{N}$ *reduces* to a function $g: \Sigma^* \rightarrow \mathbb{N}$ if there exist two FP functions, φ and ψ , such that
 $(\forall x \in \Sigma^*) [f(x) = \psi(x, g(\varphi(x)))]$.
- [Zankó, 1991] A function $f: \Sigma^* \rightarrow \mathbb{N}$ *reduces* to a function $g: \Sigma^* \rightarrow \mathbb{N}$ if there exist two FP functions, φ and ψ , such that
 $(\forall x \in \Sigma^*) [f(x) = \psi(g(\varphi(x)))]$.
- [Simon, 1975] A function $f: \Sigma^* \rightarrow \mathbb{N}$ *parsimoniously reduces* to a function $g: \Sigma^* \rightarrow \mathbb{N}$ if there exists an FP function φ such that
 $(\forall x \in \Sigma^*) [f(x) = g(\varphi(x))]$.



Complete, yes. But **how** complete?

one
ist



Multiagent Resource Allocation

- Set of Agents: $A = \{1, 2, \dots, n\}$
- Set of Resources: $R = \{r_1, r_2, \dots, r_m\}$
- Each agent a has
 - a **preference** \leq_a over allocations
 - a **utility function** that assigns values to bundles of resources.
- Each resource is indivisible and nonsharable.
- An **allocation** is a mapping P from A to bundles of resources.

Useful properties:

- **Envy-freeness**
- **Pareto optimality**
- An allocation P is **envy-free** if every agent is at least as happy with its share as with any of the other agents' shares.

Formally: $\forall a, b \in A \quad P(b) \leq_a P(a)$

- An allocation P is **Pareto optimal** if it is not Pareto-dominated by any other allocation. That is, for no allocation Q does it hold that

$$\forall a \in A \quad P \leq_a Q \quad \wedge \quad \exists b \in A \quad P <_b Q$$