

# Modeling Stable Matching Problems with Answer Set Programming

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# The Stable Marriage Problem (SMP)

I prefer Batgirl to Supergirl

I prefer Batgirl to Supergirl

I prefer Spock to Kirk

I prefer Kirk and find Spock unacceptable



Kirk



Spock



Batgirl



Supergirl

# Stability

$\{(Spock, Supergirl), (Kirk, Batgirl)\}$



I found Spock unacceptable  
but got paired to him after all!



Supergirl blocks this  
set of marriages

# Stability

$\{(Spock, Supergirl), (Kirk, Batgirl)\}$



I strictly prefer  
Batgirl to this  
woman

Batgirl and Spock block  
the set of marriages

I strictly  
prefer Spock  
to this guy



# Stable set of marriages



- ✿ no blocking individuals
- ✿ no blocking pairs

But... the notion of stability is too weak  
to **distinguish good sets of marriages**  
from **great sets of marriages**

# Optimality

I prefer  
Spock  
to Kirk

I am indifferent  
between Spock  
and Kirk

I prefer  
Batgirl to  
Supergirl

I prefer  
Supergirl to  
Batgirl



Batgirl



Supergirl

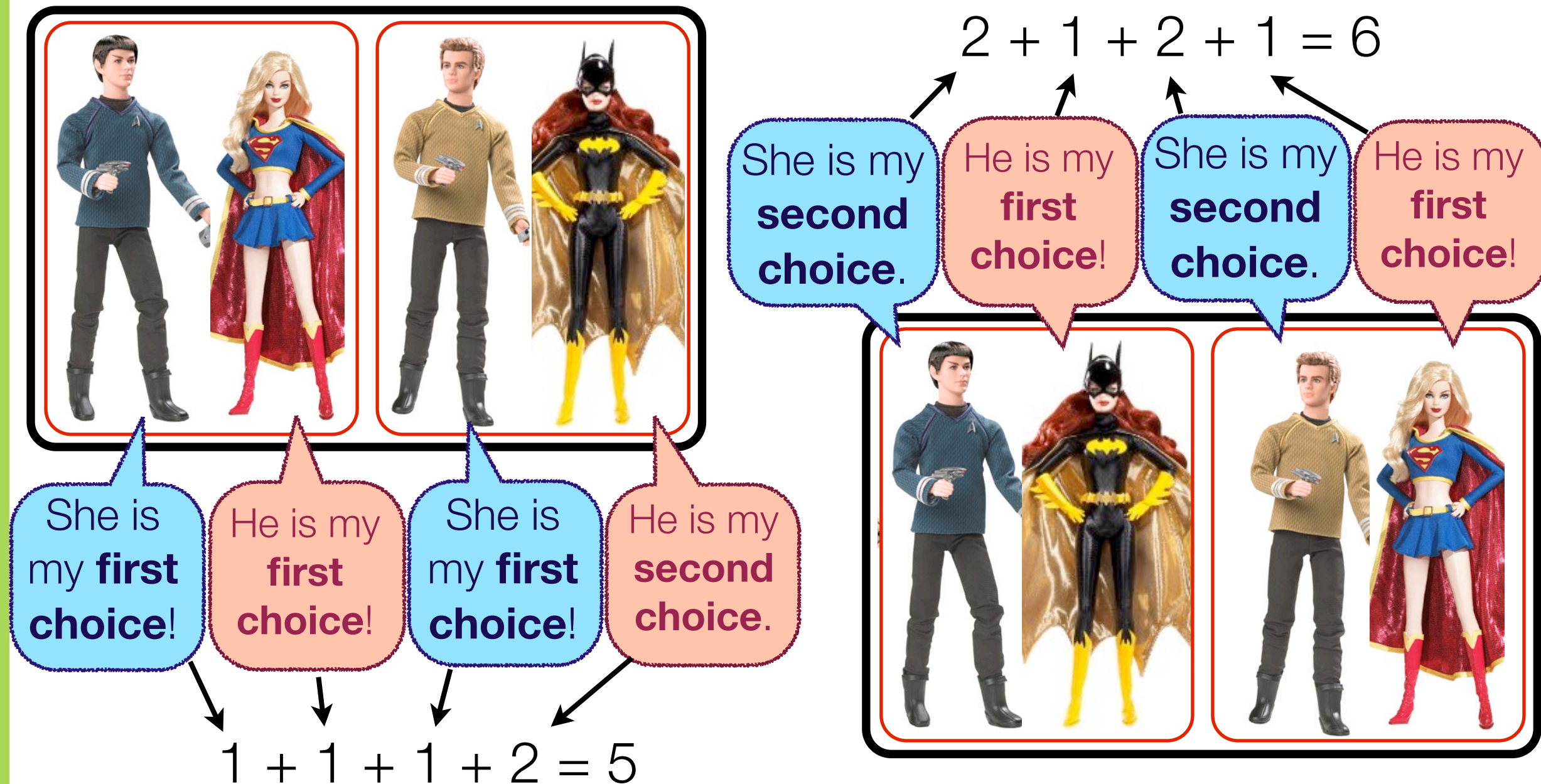


Kirk



Spock

# Optimality



$5 < 6 \longrightarrow$  The first stable set is optimal based on egalitarianity

# The SMP in practice

Countless variants on the SMP have been investigated, e.g.:


- ✿ kidney-exchange,
- ✿ hospital-resident problem.

2012: Roth & Shapley win the Nobel Prize for Economics for their theory of stable allocations and the practice of market design.



# Answer Set Programming

**Answer Set Programming** (ASP) uses **logical rules** to **describe** a **problem** and off-the-shelf solvers to compute its solutions, i.e. answer sets.

negation-as-failure (naf) 

*light\_red*  $\vee$  *light\_orange*  $\leftarrow$  *cars\_stopped*, *not* *light\_broken*

head body

Intuition: if we know that the cars have stopped and there is no evidence that the traffic light is broken, then the traffic light is either red or orange.

An answer set is a (kind of) minimal model of the program, satisfying every rule.

# Obtaining stable sets of marriages with ASP

$\text{manpropose}(\text{Spock}, \text{Supergirl}) \leftarrow$   
 $\text{manpropose}(\text{Spock}, \text{Batgirl}) \leftarrow \text{not accept}(\text{Spock}, \text{Supergirl})$   
 $\text{womanpropose}(\text{Spock}, \text{Supergirl}) \leftarrow \text{not accept}(\text{Kirk}, \text{Supergirl})$   
 $\text{womanpropose}(\text{Kirk}, \text{Supergirl}) \leftarrow \text{not accept}(\text{Spock}, \text{Supergirl})$   
 $\text{accept}(\text{Spock}, \text{Supergirl}) \leftarrow \text{manpropose}(\text{Spock}, \text{Supergirl}),$   
 $\text{womanpropose}(\text{Spock}, \text{Supergirl})$

I am indifferent  
between Spock  
and Kirk



I prefer  
Supergirl to  
Batgirl

1-1 correspondence between  
answer sets and stable sets

# Obtaining optimal stable sets of marriages with ASP

Our ASP program will consist of 3 parts:

- ✿ a 1<sup>st</sup> part describing a stable set,
- ✿ a 2<sup>nd</sup> part describing a stable set with another set of literals, denoted with accents,
- ✿ a 3<sup>rd</sup> part comparing the two previous and selecting optimal stable sets by saturation.

Saturation

⇒ 2<sup>nd</sup> program part, containing the literals to be saturated, should not contain naf

⇒ we compute the completion of the 1<sup>st</sup> program part and use a SAT translation to derive a disjunctive naf-free 2<sup>nd</sup> program part

# Obtaining optimal stable sets of marriages with ASP

$\text{mancost}(2, 1) \leftarrow \text{accept}(\text{Spock}, \text{Supergirl})$

$\text{mancost}(2, 2) \leftarrow \text{accept}(\text{Spock}, \text{Batgirl})$

$\text{womancost}(2, 1) \leftarrow \text{accept}(\text{Spock}, \text{Supergirl})$

$\text{womancost}(2, 1) \leftarrow \text{accept}(\text{Kirk}, \text{Supergirl})$

$\text{manweight}(Z) \leftarrow \#sum\{B, A : \text{mancost}(A, B)\} = Z, \#int(Z)$

$\text{womanweight}(Z) \leftarrow \#sum\{B, A : \text{womancost}(A, B)\} = Z, \#int(Z)$

$\text{weight}(Z) \leftarrow \text{manweight}(X), \text{womanweight}(Y), Z = X + Y$

I am indifferent  
between Spock  
and Kirk



I prefer  
Supergirl to  
Batgirl



$\text{mansum}'(n, X) \leftarrow \text{mancost}'(n, X)$

$\text{mansum}'(J, Z) \leftarrow \text{mansum}'(I, X), \text{mancost}'(J, Y),$   
 $Z = X + Y, \#succ(J, I)$

$\text{manweight}'(Z) \leftarrow \text{mansum}'(1, Z)$



# Obtaining optimal stable sets of marriages with ASP

$sat \leftarrow weight(X), weight'(Y), X \leq Y$

$\leftarrow not\ sat$

$literal' \leftarrow sat$

every literal occurring in the 2<sup>nd</sup> program part

if an interpretation of the program does not correspond to an optimal stable set of the SMP instance, there will exist a model of the reduct w.r.t. that interpretation which does not contain  $sat$

every answer set should contain  $sat$

1-1 correspondence between  
answer sets and optimal stable sets

# Proposition

For every answer set  $I$  of the ASP program  $\mathcal{P}$  induced by an SMP instance with unacceptability and ties:

- ✿  $\{(x, y) \mid \text{accept}(x, y) \in I\}$  forms an egalitarian stable set of marriages,
- ✿ the optimal criterion value is the unique value  $v: \text{weight}(v) \in I$ .

Conversely for every egalitarian stable set  $\{(x_1, y_1), \dots, (x_k, y_k)\}$  with optimal criterion value  $v$  there exists an answer set  $I$  of  $\mathcal{P}$  s.t.:

- ✿  $\{(x, y) \mid \text{accept}(x, y) \in I\} = \{(x_1, y_1), \dots, (x_k, y_k)\}$ ,
- ✿  $v$  is the unique value for which  $\text{weight}(v) \in I$ .

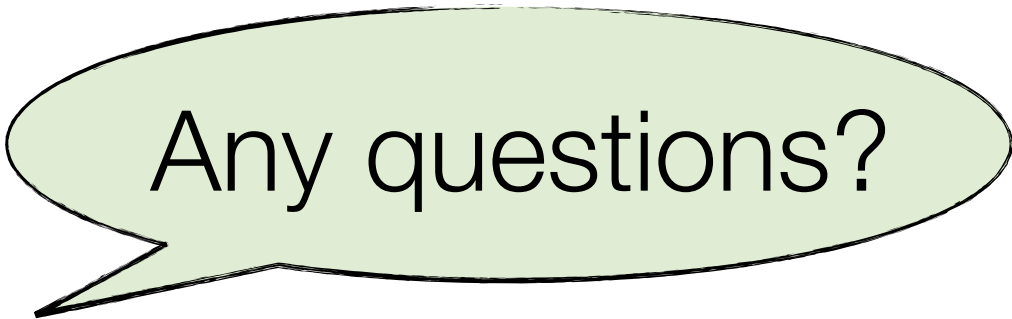
An analogous result holds for different optimality criteria, such as:

- ✿ minimal regret,
- ✿ sex-equality,
- ✿ minimal or maximal cardinality.

# Conclusion

Advantages of our approach:

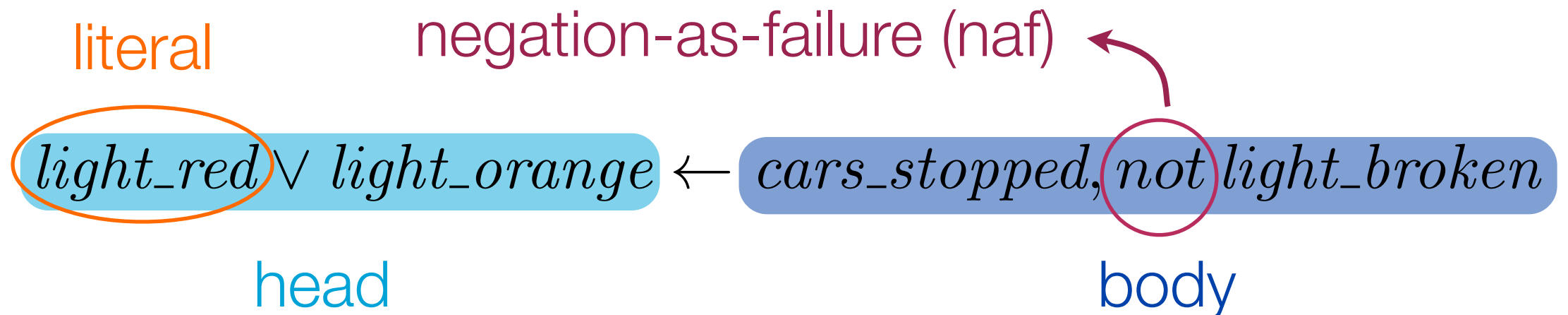
- ✿ first exact method for general SMP instances with ties, regardless of the presence of unacceptability,
- ✿ easily adaptable (e.g. change optimality criterion, add constraints, switch to other SMP variant),
- ✿ can use generic, off-the-shelve solvers.



Any questions?

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# Answer Set Programming: technical details



**Simple ASP program:** only simple rules, i.e. without naf.

**Answer set of simple ASP program:** minimal set of literals satisfying all rules, i.e. true head if true body.

**Reduct** of ASP program w.r.t. interpretation: 'not literal' is deleted from rule if 'literal' is not in the interpretation, otherwise the entire rule is deleted.

**Answer set of ASP program:** interpretation which is answer set of the reduct w.r.t. that interpretation.



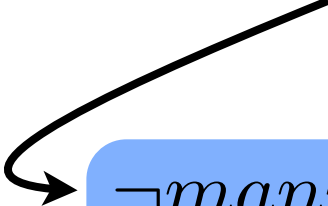
# Technical details normal ASP to disjunctive naf-free ASP

The completion of  $\mathcal{P}$  contains:

- ✿  $a \equiv \bigvee_i body'_i$  with  $a \leftarrow body_i$  all rules in  $\mathcal{P}$  with head  $a$ ,
  - ✿  $\perp \equiv \bigvee_i body'_i$  with  $\leftarrow body_i$  all the constraints of  $\mathcal{P}$ ,
  - ✿  $a \equiv \perp$  for every  $a$  not occurring in any rule head,
- with  $body'_i$  equal to  $body_i$  in which *not* is replaced with  $\neg$ .

E.g.  $manpropose(Spock, Batgirl) \leftarrow not\ accept(Spock, Supergirl)$

  $manpropose(Spock, Batgirl) \equiv \neg accept(Spock, Supergirl)$   
completion

  $\neg manpropose(Spock, Batgirl) \vee \neg accept(Spock, Supergirl) \leftarrow$   
 $manpropose(Spock, Batgirl) \vee accept(Spock, Supergirl) \leftarrow$

disjunctive naf-free ASP program

# Literature results

	sex-equal	egalitarian	min. regret	max. card.
SMP	NP-hard	$P(O(n^2))$	$P(O(n^2))$	$P(O(n^2))$
SMP + unacc.	NP-hard			$P$
SMP + ties		NP-hard	NP-hard	
SMP + unacc. + ties				NP-hard

The only exact algorithm tackling an NP-hard problem from this table finds a sex-equal stable set for an SMP instance in which the strict preference lists of men and/or women are bounded in length by a constant.

# Optimality in practice

Egalitarian stable sets to optimally match virtual machines (VM) to servers in order to improve cloud computing by equalizing the importance of migration overhead in the data center network and VM migration performance.

Maximum cardinality in kidney-exchange.