



## A Short Tutorial on s(CASP), a Goal-directed Execution of Constraint Answer Set Programs

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## Introduction

## A short tutorial on s(CASP)

- Highlighting novel aspects and its design.
- s(CASP) is a goal-directed top-down solver for Constraints Answer Set Programs.
- It avoids the grounding phase:
  - It can constraint variables that, as in CLP, are kept during execution and in answer sets.
- Additionally, it generates human-understandable justifications.
- s(CASP) is implemented in Prolog (Ciao<sup>1</sup> and SWI Prolog<sup>2</sup>)
- It has been used in several applications:
  - Including medical advisors, avionic, legal reasoner, XAI, and natural language processing.

<sup>2</sup>Available at https://www.swi-prolog.org/.

<sup>&</sup>lt;sup>1</sup>Available at http://ciao-lang.org/.

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## Applications

## Applications (mainly on commonsense reasoning):

- Event Calculus Reasoner.
  - Model real-word avionics systems.
- Explainable Artificial Intelligence (XAI).
  - Medical advice system.
  - Inductive Logic Programming.
  - Generation of concurrent imperatives programs.
- Natural language understanding systems.
  - CASPR: chatbot for the "Alexa Grand Challenge 4".
- Coding rule 34 of the Singapore Bar.
- Administrative and judicial discretion reasoner.
- ... and others (visit GDE'21 Workshop).

[Arias et al. 2019] [Hall et al. 2021] [Arias et al. 2020] [Chen et al. 2016] [Shakerin and Gupta 2019] [Varanasi et al. 2019] [Basu et al. 2021a] [Basu et al. 2021b] [Morris 2021] [Arias et al. 2021]

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## Installation under Ciao and SWI-Prolog

- The source code of s(CASP) is available at:
  - https://gitlab.software.imdea.org/ciao-lang/sCASP for Ciao.
  - https://github.com/JanWielemaker/sCASP for SWI-Prolog.
- Installation:
  - As a standalone application: the installation creates an executable called scasp:

scasp --help\_all

• Online: visit SWISH (https://swish.swi-prolog.org/) to run s(CASP) in your browser.







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- s(CASP) can return models with the bindings for negated calls:
  - Using the disequality constraint solver...

## Example 1 $(p.pl^3)$

1 **p(a)**.

```
For the query ?- not p(X), s(CASP) returns
```

 $\{not \ p(X \mid \{X \mid a\})\}$  $X \mid a$ 

• and a solver for linear constraints on rationals (and reals).



<sup>3</sup>Examples available at http://platon.etsii.urjc.es/~jarias/papers/scasp-gde21/

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A :

# Getting Started: Uninterpreted Functions

• Under conventional ASP, lists, such as [f(a)|Rest], the grounded program can be infinite.

## Example 3 (member.pl)

## member(X, [X|Xs]).

- <sup>2</sup> member(X, [-|Xs]):- member(X, Xs).
- 3 list([1,2,3,4,5]).
- 4 ?- list(A), not member(B, A).

## The query is part of the program (line 4) and returns:

## { list([1,2,3,4,5]),

not member(B   $\{B \neq 1, B \neq 2, B \neq 3, B \neq 4, B \neq 4\}$	5},	[1,2,3,4,5])
not member(B   $\{B \neq 1, B \neq 2, B \neq 3, B \neq 4, B \neq 4\}$	5},	[2,3,4,5]),
not member(B   $\{B \neq 1, B \neq 2, B \neq 3, B \neq 4, B \neq 4\}$	5},	[3,4,5]),
not member(B   $\{B \neq 1, B \neq 2, B \neq 3, B \neq 4, B \neq 4\}$	5},	[4,5]),
not member(B   $\{B \neq 1, B \neq 2, B \neq 3, B \neq 4, B \neq 4\}$	5},	[5]),
not member(B   $\{B \neq 1, B \neq 2, B \neq 3, B \neq 4, B \neq 4\}$	5},	[]) }
$= [1,2,3,4,5], B \neq 1, B \neq 2, B \neq 3, B \neq 4, B$	s ≠ 5	

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## Getting Started: Stable Models

• s(CASP) is based on stable model semantics [Gelfond and Lifschitz 1988] and supports non-stratified negation.

## Example 4 (weekend.pl)

1 opera(saturday)	:- not	home <mark>(s</mark>	saturday)
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- 2 home(saturday) :- not opera(saturday).
- 3 dinner(sunday).

```
For the query ?- opera(saturday) it returns
```

For the query ?- home (saturday) it returns

For the query ?- dinner(sunday) it returns

{opera(saturday),not home(saturday)}

{home(saturday),not opera(saturday)}

```
{dinner(sunday)}
```

For the query ?- opera(saturday), home(saturday) it returns

no models.

- Additionally, s(CASP) supports **default** and **classical** negation:
  - not opera(saturday): no evidence that Bob goes to the opera (we cannot prove it).
  - -opera(saturday): explicit evidence that Bob does not go to the opera (there is a *proof*).

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## Tuning the Output of Partial Answer Sets

• s(CASP) provides a directive to select which atoms should appear in the partial model:

## Example 5 (weekend\_show.pl)

Including the following directive in weekend.pl

#show opera/1, home/1, dinner/1.

For the query ?- opera(saturday) it returns

{**opera**(saturday)}

Negated atoms can also be selected, e.g., #show not home/1, -opera/1 is also valid.

- Denials: :- p,q means that  $p \land q$  cannot be true in any model.
  - Olon rules: r :- q,not r forces that every model to satisfy  $\neg q \lor r$ .

Example 6 (olon.pl)

p := not q. 2 q := not p. 3 r := not r.

The compiler introduces the denial :- not r and therefore, there are no models.

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## Tuning the Output of Partial Answer Sets (cont.)

## Example 7 (opera.pl)

- opera(D) :- not home(D).
- 2 home(D) :- not opera(D).
- <sup>3</sup> home(monday).
- 4 5 6
  - 5 :- baby(D), opera(D).
  - 7 baby(tuesday).
  - <sup>8</sup> 9 ?- opera(D).

```
% A day D, Bob either goes to the opera...
% ... or stays home.
% On Monday, Bob stays at home.
```

% When Bob's best friend comes with her baby, it is % not a good idea to take the baby to the opera. % They come on Tuesday.

% QUERY: When might Bob go to the opera?

The denial in line 5 expresses that  $baby(D) \land opera(D)$  cannot be simultaneously true for any<br/>value of D, so it returnsD \= monday, D \= tuesday

- For debugging purposes, s(CASP) provides flags to disable consistency checks:
  - --no\_olon disables the consistency checking due to olon rules.
  - --no\_nmr disables consistency checking for all non-monotonic rules.

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## Tuning the Output of Partial Answer Sets (cont.)

• A Partial Answer Set is a partial model with a specific binding of the query variables.

## Example 8 (member.pl in Example 3)

For the query ?- list(A), member(B, A), it returns 5 answers sets, one for each binding of B:

- For B=1 { list([1,2,3,4,5]),member(1,[1,2,3,4,5]) }
- For B=2 { list([1,2,3,4,5]),member(2,[1,2,3,4,5]),member(2,[2,3,4,5]) }
- For B=3 { list([1,2,3,4,5]),member(3,[1,2,3,4,5]),member(3,[2,3,4,5]),... }
- For B=4 { list([1,2,3,4,5]),member(4,[1,2,3,4,5]),member(4,[2,3,4,5]),... }
- For B=5 { list([1,2,3,4,5]),member(5,[1,2,3,4,5]),member(5,[2,3,4,5]),... }
- s(CASP) provides flags to control the number of partial answer sets to be generated:
  - -sN or -nN return the first *N* answers sets.
  - -s0 or -n0 return all the possible answers sets.

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## Tuning the Output of Partial Answer Sets (cont.)

- s(CASP) includes CLP(Q) [Holzbaur 1995], a solver for linear constraints on the rationals (for soundness reasons), and provides a flag:
  - -r [=d] to output rationals as floating-point numbers with d decimal places.

# Image: second second

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## **Justifications**

- The top-down strategy of s(CASP) generates minimal justification trees.
  - s(CASP) provides flags to control which literals should appear in them:
    - --mid only displays the user-defined predicates.
    - --long displays all predicates, including forall/2 used to check denials.
    - --short only displays the annotated literals.
  - Also, --neg includes the default-negated atoms, while --pos does not.

#### Example 10 (opera.pl in Example 7)

```
The invocation scasp --tree opera.pl generates:
```

```
JUSTIFICATION_TREE:
assume(opera(D) | {D \= monday,D \= tuesday})):-
not home(D) | {D \= monday,D \= tuesday}).
denial :-
not o_chk_1 :-
not baby(Var1 | {Var1 \= tuesday}),
baby(tuesday),
assume(not opera(tuesday)) :-
home(tuesday).
```

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# Justifications in Natural Language (NL)

Example 11 (opera.pl and opera.pred cont. Example 10)

- #pred opera(D) :: 'Bob goes to the opera on (D:day)'.
- #pred not home(D) :: 'Bob does not stay at home on (D)'.

The call scasp --tree --human opera.pl opera.pred generates

#### JUSTIFICATION\_TREE:

we assume that Bob goes to the opera on a day D not equal monday, nor tuesday, because Bob does not stay at home on D not equal monday, nor tuesday.

#### The global constraints hold, because

the global constraint number 1 holds, because

there is no evidence that 'baby' holds (for Var1), with Var1 not equal tuesday, and 'baby' holds (for tuesday). and

we assume that there is no evidence that Bob goes to the opera on the day tuesday, because 'home' holds (for tuesday).

- Additionally, s(CASP) provides a flag to generate expandable justification tree in HTML:
  - By adding --html=bob, it generates bob.html.

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# Dual Program (also in NL)

- The dual program expresses the constructive negation of each predicate.
  - For each i<sup>th</sup> literal in the body of a clause, it generates a clause with its "dual" literal.
  - To avoid redundant answers, every  $i^{th}$  clause includes calls to any  $j^{th}$  literal with j < i.

## Example 12

The dual of the clause h(X, Y) := r(X), not s(X, Y), q(Y) is:

- 1 not h(X, Y) := not r(X).
- 2 not h(X,Y) := r(X), s(X,Y).
- 3 not h(X,Y) :- r(X), not s(X,Y), not q(Y).
  - s(CASP) provides flags to modify the generation of the dual program and to inspect it:
    - -d or --plaindual generate duals with single-goal clauses.
    - --code output the dual program compiled by s(CASP) (which can be modified and loaded using -c or --compiled.)

Example 13 (opera.pl and opera.pred cont. Example 11)

Invoking scasp --code --human opera.pl opera.pred it provides the natural language code.

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## Dynamic Consistency Check (DCC) – work in progress

- s(CASP) checks that a tentative partial model is consistent after the query.
- When the check fails, it backtracks to search other alternatives.
- The goal of DCC [Marple and Gupta 2014] is to check the denials as soon as the atoms involved are added to the tentative partial model.

### Example 14 (hamiltonian.pl)

- 1 #show chosen/2.
- 2 reachable(V) :- chosen(V, a).
- <sup>3</sup> reachable(V) :- chosen(V,U), reachable(U).
  - % Choose or not an edge of the graph.
- <sup>5</sup> chosen(U,V) :- edge(U,V), not other(U,V). <sup>11</sup>
- other(U, V) :- edge(U, V), not chosen(U, V).

- % Every vertex must be reachable.
- <sup>8</sup> :- vertex(U), not reachable(U).
- 9 % Do not choose edges to/from the same vertex
- $10 :- chosen(U,W), U \mid = V, chosen(V,W).$ 
  - :- chosen(W, U), U = V, chosen(W, V).
  - 12 ?- reachable(a).

For this program using the graph with 4 vertices and 3 Hamiltonian cycles in graph.pl:

- Without DCC: the evaluation takes 8.266s.
- With DCC: the evaluation takes only 1.215s.

A speed up of 6.8

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## Future Work

- Complete DCC implementation, use program analysis to optimize compilation of DCC rules.
- Improve the generation of dual programs using dependency analysis.
- Reduce interpreting overhead applying partial evaluation and better compilation techniques.
- Optimize the implementation of the c-forall algorithm using Mod TCLP [Arias and Carro 2019a]. ... there are four alternatives: default, all\_c\_forall, prev\_forall, and sasp\_forall.
- Explore the use of Mod TCLP, and ATCLP [Arias and Carro 2019b] to:
  - Collect minimal partial models, increasing performance and readability.
  - Handle positive variant loops. Currently they are halted; solutions can be missed.
    - This behavior can be disabled by adding --variant but, it can lead to loops.
- Improve the constraint solver disequality to handle some pending cases.
  - Flags -w or --warning detect and warn in case of unsupported constraint or variant loops.
- Enhance its integration with Ciao and SWI-Prolog debuggers.
  - Flags v, v0, v1, and v2 trace program evaluation.

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