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*Abductive Reasoning in Intuitionistic Propositional Logic via Theorem Synthesis**

PAUL TARAU
University of North Texas, Denton, TX 76203, USA
(*e-mail:* paul.tarau@unt.edu)

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Abstract

With help of a compact Prolog-based theorem prover for Intuitionistic Propositional Logic, we synthesize minimal assumptions under which a given formula formula becomes a theorem. After applying our synthesis algorithm to cover basic abductive reasoning mechanisms, we synthesize conjunctions of literals that mimic rows of truth tables in classical or intermediate logics and we abduce conditional hypotheses that turn the theorems of classical or intermediate logics into theorems in intuitionistic logic. One step further, we generalize our abductive reasoning mechanism to synthesize more expressive sequent premises using a minimal set of canonical formulas, to which arbitrary formulas in the calculus can be reduced while preserving their provability. Organized as a self-contained literate Prolog program, the paper supports interactive exploration of its content and ensures full replicability of our results.

KEYWORDS: abductive reasoning in intuitionistic logic, theorem synthesis, logic programming and automated reasoning, theorem provers for intuitionistic propositional logic, implementing sequent calculi in Prolog.

1 Introduction

Given a formula F in Classical Propositional Logic (CL), each row in a formula's truth table describes a conjunction of literals C. Reading the truth table as a disjunctive normal form, it immediately follows that $C \rightarrow F$ is a tautology. As an example, let us consider the CL formula `F = (A v B) & (B v C) & (C v A)`. Then its truth table (with 1 for True and 0 for False) is the one on the left. Let us select any row, say [1,0,1] and interpret it as `G = A & ~B & C`. Then the truth table of the resulting tautology `G -> F` is shown on the right.

```
 A B C :  F                                  A B C:  G->F
[0,0,0]-->0                                 [0,0,0]-->1
[0,0,1]-->0                                 [0,0,1]-->1
[0,1,0]-->0                                 [0,1,0]-->1
[0,1,1]-->1                                 [0,1,1]-->1
[1,0,0]-->0                                 [1,0,0]-->1
[1,0,1]-->1  <= selected row                [1,0,1]-->1
[1,1,0]-->1                                 [1,1,0]-->1
```

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```
[1,1,1]-->1                                    [1,1,1]-->1
```

Thus, it is easy to extract from the truth-table of a formula F in CL assumptions that would make it a theorem in CL.

This *model-theoretic* approach extends also to intermediate logics[1] and in particular, it applies to the 5-valued truth-tables of the equilibrium logic (Pearce *et al.* 2000), underlying Answer Set Programming (ASP).

With *no finite truth-tables*, no inter-definability of logical connectives, no rule of excluded middle and only a concept of *tautology* and *contradiction* defined for Intuitionistic Propositional Logic (IL), we need to be a bit more creative when trying to find *salient* assumptions that would make the formula a theorem in IL. Such salient assumptions include conjunctions of literals, mimicking the truth tables of CL but it also makes sense to extend them to more expressive subsets of formulas. First, given a formula in IL, we will need a search process for finding assumptions that would make it a theorem. Next, we would like our assumptions to be minimal with respect to the partial order relation governing the logic (or its equivalent Heyting algebra) , *intuitionistic implication*.

This brings us to *Abductive Logic Programming* (Eshghi and Kowalski 1989; Denecker and Kakas 2002), where facts designated as *abducibles* are filtered with integrity constraints to provide relevant assumptions needed for the success of a goal G w.r.t. a given program P. In the context of IL, our abductive reasoning will rely on finding *minimal assumptions under which a formula becomes a theorem*.

And finally, in the absence of a convenient automated semantic method like truth tables or SAT solvers in CL, we will need a theorem prover, ideally derived directly from the rules of a *terminating* sequent calculus, that interoperates smoothly with the search process synthesizing our assumptions.

These requirements make Prolog a natural meta-language for an actionable description of these concepts. We will materialize our approach as a literate Prolog program, from which, as a convenience to the reader, we will extract our code and make it available online as a Prolog file.[2]

The rest of the paper is organized as follows. Section 2 overviews our Prolog-based theorem prover and the sequent calculus it is derived from. Section 3 introduces our *protasis synthesizer* and its uses for abductive reasoning. Section 4 generalizes our approach to the synthesis of minimal canonical assumptions. Section 5 discusses significance of our results, its possible extensions as well as some of its limitations. Section 6 overviews related work and Section 7 concludes the paper.

We assume the reader is fluent in Prolog, propositional intuitionistic and classical logic and familiar with abductive reasoning and key concepts behind sequent calculi and automated theorem proving.

2 Background: The intuitionistic propositional logic theorem prover

We will derive our Prolog prover from a set of compact and elegant sequent calculus rules formally describing provability in IL.

[1] logics weaker than classical but stronger than intuitionistic.
[2] at https://github.com/ptarau/TypesAndProofs/blob/master/isynt.pro.

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2.1 Roy Dyckhoff's G4ip calculus

Motivated by problems related to loop avoidance in implementing Gentzen's LJ calculus, Roy Dyckhoff designed and proved sound and complete a sequent calculus-based axiomatization of IL (Dyckhoff 1992). He has proved that the calculus is terminating, by identifying a multiset ordering-based formula size definition that decreases after each step (Dyckhoff 1992).

The sequents of the G4ip calculus follow:

$$\Gamma, p \Rightarrow p \quad Ax \quad (p \text{ an atom}) \qquad \Gamma, \bot \Rightarrow \Delta \quad L\bot$$

$$\frac{\Gamma \Rightarrow \varphi \quad \Gamma \Rightarrow \psi}{\Gamma \Rightarrow \varphi \wedge \psi}\ R\wedge \qquad \frac{\Gamma, \varphi, \psi \Rightarrow \Delta}{\Gamma, \varphi \wedge \psi \Rightarrow \Delta}\ L\wedge$$

$$\frac{\Gamma \Rightarrow \varphi_i}{\Gamma \Rightarrow \varphi_0 \vee \varphi_1}\ R\vee \ (i = 0, 1) \qquad \frac{\Gamma, \varphi \Rightarrow \Delta \quad \Gamma, \psi \Rightarrow \Delta}{\Gamma, \varphi \vee \psi \Rightarrow \Delta}\ L\vee$$

$$\frac{\Gamma, \varphi \Rightarrow \psi}{\Gamma \Rightarrow \varphi \to \psi}\ R\to \qquad \frac{\Gamma, p, \varphi \Rightarrow \Delta}{\Gamma, p, p \to \varphi \Rightarrow \Delta}\ Lp\to \ (p \text{ an atom})$$

$$\frac{\Gamma, \varphi \to (\psi \to \gamma) \Rightarrow \Delta}{\Gamma, \varphi \wedge \psi \to \gamma \Rightarrow \Delta}\ L\wedge\to \qquad \frac{\Gamma, \varphi \to \gamma, \psi \to \gamma \Rightarrow \Delta}{\Gamma, \varphi \vee \psi \to \gamma \Rightarrow \Delta}\ L\vee\to$$

$$\frac{\Gamma, \psi \to \gamma \Rightarrow \varphi \to \psi \quad \gamma, \Gamma \Rightarrow \Delta}{\Gamma, (\varphi \to \psi) \to \gamma \Rightarrow \Delta}\ L\to\to$$

Key to the termination proof in Dyckhoff (1992) is the rule $L \to\to$ that breaks down nested implications into "smaller" ones, each containing fewer connectives. The rules work with the context Γ being a multiset, but it has been shown later (Dyckhoff 2016) that Γ can be a set, with duplication in contexts eliminated.

Note that the same calculus has been discovered independently in the 1950s by Vorob'ev and in the 1980s-1990s by Hudelmaier (1988).

2.2 Implementing the theorem prover

In the tradition of "lean theorem provers", we can build one directly from the G4ip calculus, in a goal oriented style, by reading the rules *from conclusions to premises*.

Thus, we start with a simple, almost literal translation of sequent rules to Prolog with values in the environment Γ denoted by the variable `Vs`. Besides implication (denoted `->`), conjunction (denoted `&`) and disjunction (denoted `v`), we implement rules for inverse implication (denoted `<-`), negation (denoted `~`) and equivalence (denoted `<->`). We also add rules for a top element (denoted `true`) and a bottom element (denoted `false`).

Correctness of our additions follows from the definitions of:

- intuitionistic inverse implication: $\varphi \leftarrow \psi \ \equiv \ \psi \to \varphi$
- intuitionistic equivalence: $\varphi \leftrightarrow \psi \equiv \varphi \to \psi$ `&` $\psi \to \varphi$
- intuitionistic negation: `~`$\varphi \ \equiv \ \varphi \to$ `false`.
- top element: `true` $\equiv$ `false` $\to$ `false`.

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Note that the added connectives are meant to enhance the expressiveness of the logic. For instance, "`<->`" allows expressing the fact that two formulas are equivalent and thus equiprovable, "`head <- body`" mimics Prolog's familiar Horn clause syntax "`head :- body`" and finally the negation symbol makes formulas more compact and human-readable.

We define operators for all our connectives, except `->`, that we will use with its standard right associativity.

```
:- op(525,  fy,  ~ ).
:- op(550, xfy,  & ).    % right associative
:- op(575, xfy,  v ).    % right associative
:- op(600, xfx,  <-> ).  % non associative
:- op(800, yfx,  <- ).   % left associative
```

A formula `T` is a theorem if it is provable from an empty set of assumptions:

```
iprover(T) :- iprover(T,[]).
```

We follow here Dyckhoff's calculus but delegate details to helper predicates `iprover_reduce/4` and `iprover_impl/4`.

```
iprover(true,_):-!.
iprover(A,Vs):-memberchk(A,Vs),!.
iprover(_,Vs):-memberchk(false,Vs),!.
iprover(~A,Vs):-!,iprover(false,[A|Vs]).
iprover(A<->B,Vs):-!,iprover(B,[A|Vs]),iprover(A,[B|Vs]).
iprover((A->B),Vs):-!,iprover(B,[A|Vs]).
iprover((B<-A),Vs):-!,iprover(B,[A|Vs]).
iprover(A & B,Vs):-!,iprover(A,Vs),iprover(B,Vs).
iprover(G,Vs1):- % atomic or disj or false
  select(Red,Vs1,Vs2),
  iprover_reduce(Red,G,Vs2,Vs3),
  !,
  iprover(G,Vs3).
iprover(A v B, Vs):-(iprover(A,Vs) ; iprover(B,Vs)),!.
```

`iprover_reduce/4` is the first step in breaking down formulas in the premise into their components.

```
iprover_reduce(true,_,Vs1,Vs2):-!,iprover_impl(false,false,Vs1,Vs2).
iprover_reduce(~A,_,Vs1,Vs2):-!,iprover_impl(A,false,Vs1,Vs2).
iprover_reduce((A->B),_,Vs1,Vs2):-!,iprover_impl(A,B,Vs1,Vs2).
iprover_reduce((B<-A),_,Vs1,Vs2):-!,iprover_impl(A,B,Vs1,Vs2).
iprover_reduce((A & B),_,Vs,[A,B|Vs]):-!.
iprover_reduce((A<->B),_,Vs,[(A->B),(B->A)|Vs]):-!.
iprover_reduce((A v B),G,Vs,[B|Vs]):-iprover(G,[A|Vs]).
```

`iprover_impl/4` details the case analysis of the handling of implication (and its instances) prescribed by rule $L\rightarrow\rightarrow$.

```
iprover_impl(true,B,Vs,[B|Vs]):-!.
iprover_impl(~C,B,Vs,[B|Vs]):-!,iprover((C->false),Vs).
iprover_impl((C->D),B,Vs,[B|Vs]):-!,iprover((C->D),[(D->B)|Vs]).
iprover_impl((D<-C),B,Vs,[B|Vs]):-!,iprover((C->D),[(D->B)|Vs]).
```

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```
iprover_impl((C & D),B,Vs,[(C->(D->B))|Vs]):-!.
iprover_impl((C v D),B,Vs,[(C->B),(D->B)|Vs]):-!.
iprover_impl((C<->D),B,Vs,[((C->D)->((D->C)->B))|Vs]):-!.
iprover_impl(A,B,Vs,[B|Vs]):-memberchk(A,Vs).
```

Example 1
After defining:

```
iprover_test:-
   Taut = ((p & q) <-> (((p v q)<->q)<->p)), iprover(Taut),
   Contr=(a & ~a), \+ (iprover(Contr)).
```

we observe success on proving a tautology and failing to prove a contradiction, but we refer to Tarau (2019) for an extensive combinatorial testing of a variant of this prover as well as its testing against the ILTP benchmark[3] and several other provers.

2.3 Classical logic for free

Glivenko's theorem states that *a propositional formula F is a classical tautology if and only if ~ ~F is an intuitionistic tautology.* This gives us a classical prover for free, that we will use as an alternative to `iprove` when defining several concepts parameterized by a prover.

```
% classical prover - via Glivenko's theorem
cprover(T):-iprover( ~ ~T).
```

Example 2
The two provers, as it is well known, will disagree on `p v ~p`

```
?- iprover(p v ~p).
false.
?- cprover(p v ~p).
true.
```

but agree on `p & ~p`:

```
?-iprover(p & ~p).
false.
?-cprover(p & ~p).
false.
```

3 Abductive reasoning mechanisms

We are now ready to introduce our search for assumptions that make a given formula an intuitionistic tautology.

[3] http://www.iltp.de/.

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3.1 Generating the abducibles

Defining some of the atoms occurring in a formula F as the only ones to be used in the search process brings us to declare them as *abducibles* (Eshghi and Kowalski 1989), but we will also enable the option to make abducible all the atoms occurring in F. Thus, when the variable `Abducibles` is free, all atomic symbols will be considered abducibles.

```
abducibles_of(Formula,Abducibles):-var(Abducibles),!,
atoms_of(Formula,Abducibles).
abducibles_of(_,_).
```

The predicate `atoms_of/2` finds the set of all the atoms occurring in a formula. It backtracks over all arguments, recursively and it collects atomic elements to a list, with `setof/3` which also eliminates possible duplicates.

```
atom_of(A,R):-atomic(A),!,R=A.
atom_of(T,A):-arg(_,T,X),atom_of(X,A).

atoms_of(T,As):-setof(A,atom_of(T,A),As).
```

3.2 Protasis generation

If F is a formula, we can think of a premise C such that $C \rightarrow F$ is a theorem[4] as a counterfactual assumption making F conditionally true. We call such a formula C a *protasis*. Thus, given a formula and a set of assumptions (our abducibles), we will need to search among them for assumptions that would make the formula a theorem.

The predicate `any_protasis/6` implements this idea, subject to a set of parameters:

- `Prover` allows a choice of the underlying logic (e.g., intuitionistic or classical)
- `AggregatorOp` fixes one of the connectives of the logic, from which the protasis is built[5]
- The `yes/no` flag `WithNeg` decides if negations of the abducibles can be part of the protasis
- `Abducibles` is a set of atoms or a free variable, meaning that all atoms will be included
- `Assumption` will be any protasis, that given the previously specified parameters, ensures that `Assumption->Formula` is a theorem in the logic specified by `Prover`.

```
any_protasis(Prover,AggregatorOp,WithNeg,Abducibles,Formula,Assumption):-
  abducibles_of(Formula,Abducibles),
  mark_hypos(WithNeg,Abducibles,Literals),
  subset_of(Literals,Hypos),
  join_with(AggregatorOp,Hypos,Assumption),
  \+ (call(Prover,Assumption->false)), % we do not assume contradictions !
  call(Prover,Assumption->Formula).    % we ensure this is a theorem
```

The predicate `mark_hypos/3` will mark with their negations the abducibles if we want to allow them to occur in the protasis positively or prefixed by their negations.

[4] or, equivalently, when C is the *premise* and F is the *conclusion* of a provable sequent.
[5] the restriction to on operator will be lifted later in Section 4, when we generalize this mechanism to a set of canonical formulas.

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```
mark_hypos(_,[],[]).
mark_hypos(yes,[P|Ps],[P,~P|Ns]):-mark_hypos(yes,Ps,Ns).
mark_hypos(no,[P|Ps],[P|Ns]):-mark_hypos(no,Ps,Ns).
```

Our subset generator `subset_of`, used to iterate over all subsets of the abducibles, first enumerates templates of increasing length as we want smaller subsets to be tried first.

```
subset_of(Xs,Ts):-template_from(Xs,Ts),tsubset(Xs,Ts).

template_from(_,[]).
template_from([_|Xs],[_|Zs]):-template_from(Xs,Zs).
```

Then, for each template of length K, it fills it with a subset of length K of the N abducibles, one at a time, on backtracking.

```
tsubset([],[]).
tsubset([X|Xs],[X|Rs]):-tsubset(Xs,Rs).
tsubset([_|Xs],Rs):-tsubset(Xs,Rs).
```

The predicate `join_with_op` builds an expression from a sequence of abducible literals (atoms, possibly negated) with a given operator.

```
join_with_op(_,[],true).
join_with_op(_,[X],X).
join_with_op(Op,[X,Y|Xs],R):-join_with_op(Op,[Y|Xs],R0),R=..[Op,X,R0].
```

How we join the abducible literals with help of a given operator, is different for associative and commutative operators like `&` and `v` (the default 3-rd clause of `join_with`) and `->`, `<-`, `<->`, that we treat as special cases.

Thus, once the head was picked with `select/3`, the order of the remaining literals is immaterial.

```
join_with(Op,Xs,R):-
  memberchk(Op,[(->),(<-)]),!,
  select(Head,Xs,Ys), append(Ys,[Head],Zs),
  join_with_op((->),Zs,R).
```

For non-associative `<->` we will use all permutations of the abducibles.

```
join_with(Op,Xs,R):-Op=(<->),!,permutation(Xs,Ys),join_with_op(Op,Ys,R).
```

Finally, as `v` and `&` are permutation invariant, we just call `join_with_op`.

```
join_with(Op,Xs,R):- join_with_op(Op,Xs,R).
```

Implication and reverse implications are handled in `join_with`, knowing that their components, except the head, are permutation invariant, with the following equivalences in mind:

$$\varphi_0 \leftarrow \varphi_1 \cdots \leftarrow \varphi_n \equiv \varphi_0 \leftarrow \varphi_1 \ \& \ \ldots \ \& \ \varphi_n$$

and

$$\varphi_n \rightarrow \varphi_{n-1} \cdots \rightarrow \varphi_1 \rightarrow \varphi_0 \ \equiv \ \varphi_n \ \& \ \varphi_{n-1} \ \& \ \ldots \ \& \ \varphi_1 \ \rightarrow \varphi_0$$

Note that these hold both intuitionistically and classically, as it can be quickly verified with `iprover` and `cprover`.

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3.3 The weakest protasis

The next step is defining a *weakest protasis*, keeping in mind that a *partial order*[6] among them is defined by the intuitionistic implication (`->`). First, we will collect with `setof/3` all the candidate assumptions to ensure that the prover is called on each only once.

```
weakest_protasis(Prover,AggregatorOp,WithNeg,Abducibles,Formula,Assumption):-
  setof(Assumption,
    any_protasis(Prover,AggregatorOp,WithNeg,Abducibles,Formula,Assumption),
    Assumptions),
  weakest_with(Prover,Assumptions,Assumption).
```

Next, we ensure that a *weakest protasis* is such that it does not imply any other protasis, thus that it is a minimal element w.r.t. our partial order. We rely for that on the predicate `weakest_with/3`:

```
weakest_with(_,Gs,G):-memberchk(true,Gs),!,G=true.
weakest_with(Prover,Gs,G):-
   select(G,Gs,Others),
   \+ (member(Other,Others),
       weaker_with(Prover,Other,G)).
```

The partial order relation is exposed as the predicate `weaker_with/3` which ensures that a weakest protasis does not imply any other protasis, including ones that might imply it.

```
weaker_with(Prover,P,Q):- \+ call(Prover,(P->Q)), call(Prover,(Q->P)).
```

Note that the predicate `weakest_protasis/6` depends on the same parameters as `any_protasis`, in particular on the `Prover` implementing a given provability relation.

Example 3

Peirce's law is known to hold in CL and not hold in IL. In fact, it can turn IL into CL if added as an axiom. The predicate `peirce/2` will try to synthesize an assumption that would make it hold.

```
peirce(Prover,WhatIf):-
    Formula=(((p->q)->p)->p),
    WithNeg=yes, AggregatorOp=(v), Abducibles=[p],
    weakest_protasis(Prover,AggregatorOp,WithNeg,Abducibles,Formula,WhatIf).
```

When running it we get:

```
?- peirce(iprover,Protasis).
Protasis = p v ~p.
?- peirce(cprover,Protasis).
Protasis = true.
```

This reveals an interesting fact. It tells us that if `p v ~p` were assumed, Peirce's law would hold in IL, as `iprove` would succeed. As it is well known, `p v ~p` would turn IL into CL and `cprove` tells us that indeed, Peirce's law holds unconditionally in CL.

[6] in contrast to classical logic, where `(p->q) v (q->p)` is a theorem.

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Example 4

We can also synthesize conditional assumptions when using implication or inverse implication as our aggregator connective. After defining:

```
impl_aggr(H):-
   T=(a<-((a<-(b<-d))&(b<-c))),
   Prover=iprover, WithNeg=yes, AggregatorOp=(->), As=[c,d],
   weakest_protasis(Prover,AggregatorOp,WithNeg,As,T,H).
```

we obtain:

```
?- impl_aggr(H).
H = ( d->c).
```

showing that the implication `d->c` (equivalent of the Horn Clause `c:-d`) should hold for the formula to be a theorem. This illustrates a mechanism to synthesize Horn Clauses playing the role of conditional assumptions.

Another interesting case is that of a contradiction. After defining `contra_test/1` as:

```
contra_test(H):-
   T = (p & ~p),
   Prover=iprover, WithNeg=yes, AggregatorOp=(&),
   weakest_protasis(Prover,AggregatorOp,WithNeg,_Abducibles,T,H).
```

and running it with:

```
?- contra_test(Protasis).
false.
```

we can see that no assumption would make the contradiction a tautology, and this will also be the case for `Prover=cprover`. Note that to ensure this, we have enforced in the definition of `any_protasis` that such assumptions should themselves not be contradictions.

Example 5

In the case of the logic of here-and-there (Pearce 1997), derived from IL by adding the axiom

```
f v (f->g) v ~g
```

as shown in Lifschitz *et al.* (2001), we will get with `cprover` the protasis `true`. This indicates, as expected, that it is already a theorem in CL and thus also a theorem in the logic of here-and-there.

```
?- weakest_protasis(cprover,(v),yes,_,(f v (f->g) v ~g),P).
P = true.
```

On the other hand, the less obvious weakest protasis obtained for `iprove` indicates that the excluded middle rule would be needed for both `f` and `g`.

```
?- weakest_protasis(iprover,(v),yes,_,(f v (f->g) v ~g),P).
P = f v ~f v g v ~g.
```

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3.4 An example of intuitionistic abductive reasoning

With the logic of synthesizing meaningful minimal assumptions that make a formula a theorem clarified, we are now ready to revisit abductive reasoning along the lines of Eshghi and Kowalski (1989).

The predicate `explain_with/5` finds, given a `Prover`, the abductive inference problem parameterized by:

- a formula `Prog` seen here as representing a knowledge base
- a set of `Abducibles` occurring in `Prog`
- a goal formula `G` such that `Prog -> G` should always hold
- a formula `IC` playing the role of integrity constraints meant to filter out unwanted assumptions

```
explain_with(Prover,Abducibles,Prog,IC,G,Expl):-
    any_protasis(Prover,(&),yes,Abducibles,(Prog->G), Expl),
    call(Prover, Expl & Prog->G),
    call(Prover,(Expl & Prog->IC)),
    \+ (call(Prover,(Expl & Prog -> false))).
```

Note also that `any_protasis` replaces `weakest_protasis` in this definition, given that minimality might want to be stated as part of the integrity constraints `IC`.

Example 6

To revisit a simple example of abductive explanation generation, we define:

```
why_wet(Prover):-
    IC = ~(rained & sunny),
    P = sunny & (rained v sprinkler -> wet), As=[sprinkler,rained], G = wet,
    writeln(prog=P), writeln(ic=IC),
    explain_with(Prover,As,P,IC,G,Explanation),
    writeln('Explanation:' --> Explanation).
```

Then, when running it, it will display, as expected:

```
?- why_wet(iprover).
prog=sunny&(rained v sprinkler->wet)
ic= ~ (rained&sunny)
Explanation: --> sprinkler& ~rained
```

4 Synthesis of minimal canonical assumptions

We will now generalize our abductive reasoning mechanism by lifting the constraint on the premise of our sequent from literals connected by a single operation to a canonical form that has been shown to be able to represent arbitrary IL formulas.

4.1 The Mints transformation

Grigori Mints has proven, in his seminal paper studying complexity classes for intuitionistic propositional logic (Mints 1992), that any formula f is equiprovable to a formula of

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the form $X_f \rightarrow g$, where X_f is a conjunction of formulas of one of the forms:

$$p, \tilde{}p,\ p \rightarrow q,\ (p \rightarrow q) \rightarrow r,\ p \rightarrow (q \rightarrow r),\ p \rightarrow (q\ v\ r),\ p \rightarrow \tilde{}q,\ \tilde{}q \rightarrow p.$$

With introduction of new variables (like with the Tseitin transform for SAT or ASP solvers), the transformation runs in linear space and time. Note that as a premise to a sequent can be seen as a conjunction implying its conclusion, the conjunction of the formulas described by Mints can be seen as serving the same purpose as the conjunctive normal form (CNF) in classical logic.

Thus, by generating this set of bounded size formulas as premises of a sequent, we can express equivalent formulas of unbounded size, otherwise subject to a much larger search space in the formula synthesis process.

We will now generate, using a given set of abducibles, premises built of these formulas, with their propositional variables selected from the set of abducibles.

Conceptually, while we will keep calling the propositional variables involved in our premise *abducibles*, we shall see them from now on simply as a set of *independent variables* on which the derivation of the sequent's conclusion from its premise depends.

We define a generator for the set of *Mints formulas* with help of a DCG grammar[7] that collects its propositional variables from a list of abducibles.

```
mints_formula(P)-->[P].                    mints_formula(~P)-->[P].
mints_formula((P->Q))-->[P,Q].             mints_formula((P->Q)->R)-->[P,Q,R].
mints_formula((P->(Q->R)))-->[P,Q,R].      mints_formula((P->(Q v R))) -->[P,Q,R].
mints_formula((P-> ~Q))-->[P,Q].           mints_formula((~P->Q))-->[P,Q].
```

We extend our DCG, subject to the same limitation on available abducibles, to generate a list of formulas meant to be part of the premise. We will later aggregate this list into a conjunction.

```
mints_conjuncts([])-->[].
mints_conjuncts([F|Fs])-->mints_formula(F),mints_conjuncts(Fs).
```

Next, we eliminate duplicates with Prolog's `sort/2`.

```
mints_conjuncts(Atoms,Conjuncts):-mints_conjuncts(Ps,Atoms,[]),sort(Ps,Conjuncts).
```

We derive `any_mints_premise/4` in a way similar to `any_protasis/6`, except that the arguments `WithNeg` and `AggregatorOp` become unnecessary and multiple occurrences of any abducible need to be supported. For brevity, we explain our steps as comments in the code.

```
any_mints_premise(Prover,Abducibles,Formula,Premise):-
  abducibles_of(Formula,Abducibles),
  subset_of(Abducibles,Chosen),      % select a subset of Abducibles
  template_from(Abducibles,Atoms),   % Atoms is a list of free variables
  part_as_equiv(Atoms,Chosen),       % Chosen provides unique occurrences of Atoms
  mints_conjuncts(Atoms,Conjuncts), % builds the Mints formulas
  join_with_op((&),Conjuncts,Premise), % joins Conjuncts into a conjunction
```

[7] As a note to the reader unfamiliar with Prolog's Definite Clause Grammars (DCG) preprocessor, it transforms a DCG clause like `a --> b,c,d` into an ordinary Prolog clause `a(S0,Sn) :- b(S0,S1),c(S1,S2),d(S2,Sn)`, to conveniently keep track of state changes in the "chained" variables `S0,S1,...,Sn`.

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```
  \+ (call(Prover,Premise->false)),    % ensures Premise is not a contradiction
  call(Prover,Premise->Formula).       % ensure that Premise implies Formula
```

Note that we have limited the length of the premise in the case of the Mints-formulas, arbitrarily, to the number of abducible atoms, that the selection of atoms has as an upper bound. For more flexibility, this can be lifted to be based on a length parameter passed to `any_mints_premise`.

4.2 Labeling the variables in the Mints formulas

We will describe here the implementation of `part_as_equiv/2` that will be used to to generate variables bound to possibly repeated occurrences of each atom. Note that equalities of logic variables define equivalence classes that correspond to partitions of the set of variables. We implement this simply by selectively unifying them.

The predicate `part_as_equiv/2` takes a list of distinct logic variables and generates partitions-as-equivalence-relations by unifying them "nondeterministically". It also collects the unique variables defining the equivalence classes, as a list given by its second argument. It works reversibly, when unique values are given as its second argument and a bound list of free variables as its first.

```
part_as_equiv([],[]).
part_as_equiv([U|Xs],[U|Us]):-complement_of(U,Xs,Rs),part_as_equiv(Rs,Us).
```

To implement it, we split a set repeatedly in subset+complement pairs with help from the predicate `complement_of/2`.

```
complement_of(_,[],[]).
complement_of(U,[X|Xs],NewZs):-complement_of(U,Xs,Zs),place_element(U,X,Zs,NewZs).

place_element(U,U,Zs,Zs).
place_element(_,X,Zs,[X|Zs]).
```

Example 7

Here, we are interested in the reverse use of `part_as_equiv`, with the list of unique variables as input and a sequence of variables of fixed length but possibly repeated occurrences as output.

```
?- length(Vs,4),part_as_equiv(Vs,[a,b]).
Vs = [a, b, a, a] ; Vs = [a, a, b, a] ; Vs = [a, b, b, a] ;
Vs = [a, a, a, b] ; Vs = [a, b, a, b] ; Vs = [a, a, b, b] ; Vs = [a, b, b, b] .
```

We derive `weakest_mints_premise/4` in a way similar to `weakest_protasis/6` except for passing only the relevant arguments to `any_mints_premise/4`.

```
weakest_mints_premise(Prover,Abducibles,Formula,Premise):-
  setof(Premise,
    any_mints_premise(Prover,Abducibles,Formula,Premise),
    Premises),
  weakest_with(Prover,Premises,Premise).
```

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Example 8

When using the axiom that conservatively extends IL to the logic of here-and-there Lifschitz *et al.* (2001) we observe again that no premise is needed for `cprover` and that `iprover` suggests as premises either one of the disjuncts in the axiom, or, more interestingly, `g-> ~g`.

```
?- weakest_mints_premise(cprover,_,(f v (f->g) v ~g),P).
P = true.
?- weakest_mints_premise(iprover,_,(f v (f->g) v ~g),P).
P = f ; P = ~g ; P = ( f->g) ; P = ( g-> ~g).
```

In fact, we observe:

```
?- iprover((g -> ~g) <-> ~g).
true.
```

suggesting that extending IL with:
`f v (f->g) v (g -> ~g)`
would result in an alternative axiomatization of the logic of here-and-there.

5 Discussion

We hope that the astute reader is aware at this point that the paper is an exploration of the theory behind some fundamental concepts relating abductive reasoning, program synthesis and theorem proving in a concise and easily replicable form, facilitated by the choice of Prolog as our meta-language, but with the possibility of a fairly routine transliteration to a traditional "formulas-on-paper" presentation in mind. As such, the paper can be seen as an executable specification of these concepts. While not neglecting minimal efforts for efficient execution, and some elegance in the coding style, our main priority was to ensure that the paper conveys its message as a fully self-contained literate program.

We have designed our abductive reasoning logic entirely in a proof-theoretical framework, in contrast to the usual model-theoretical semantics, arguably in the original spirit of intuitionistic logic.

Both our weakest protasis-based and weakest Mints formulas-based synthetic assumptions are attempts to recover in IL an analogue of the CNF available for a formula in CL. At the same time, finding the weakest assumptions shares the focus on minimal models encountered in various logic calculi. Our interest in finding weakest assumptions under which the formula becomes a theorem is driven by the transitivity of the partial order induced by `->`, given that for a given formula `f`, becoming a theorem under the assumption `w`, ensures also that if `(s->w)`, then `(s->f)` is also a theorem, where `w` denotes a weakest assumption and `s` denotes a (stronger) assumption that implies it.

We have restricted ourselves to propositional logic but we foresee extensions to stronger logics among which Monadic First Order Logic (known as decidable for CL and undecidable for IL), enhanced with Prolog's constraint solving mechanisms is a promising option.

While we have forced a clear separation between our meta-language (Prolog) and object-language (IL), it would be quite easy to extend our theorem prover to reflect

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Prolog's negation as failure in the object-language as an addition to IL. This would result in a logic with two flavors of negation, similar in the context of IL to the underlying equilibrium logic of ASP.

6 Related work

We refer to Denecker and Kakas (2002) as still the most lucid and comprehensive overview (also citing 124 papers) on abductive reasoning in Logic Programming and to Eshghi and Kowalski (1989) as one of the most influential initiators for the interest in the field, with connections explored in depth to negation as failure and non-monotonic reasoning. Some of our examples related to the logic of here-and-there and equilibrium logic (Pearce 1996; Pearce *et al*. 2000) originate in Lifschitz et al. (2001), where intermediate logics relevant for the foundation of ASP systems are overviewed. For abductive reasoning in the context of several logics including non-monotonic ones, we mention Gabbay and Olivetti (2002) and Gabbay (2000).

By contrast, the novelty of our approach is the generalized view of abductive reasoning as an instance of program synthesis controlled by a theorem prover. Our theorem prover is derived directly from the G4ip sequent calculus Dyckhoff (1992; 2016). In Tarau (2019) details of this derivation process as well as a combinatorial testing framework used to insure correctness are given. The idea of using a theorem prover for the synthesis of modal formulas is also present in Tarau (2020), having as an outcome an embedding of the epistemic logic IEL in IL and a derived theorem prover for that logic. In Tarau and de Paiva (2020) a theorem prover, restricted to the implicational fragment of IL is used to derive a theorem prover for implicational linear logic, with help from the Curry-Howard correspondence and the use of linearity of the resulting lambda terms as a filtering mechanism. In this context, the distinct focus of the current paper is on a very general formula synthesis mechanism within IL itself, covering abductive reasoning and emulating in IL key semantic concepts available in CL and intermediate logics.

7 Conclusions

We have presented a fully executable specification of a generalized abductive reasoning framework, that can be relatively easily ported to any logic for which a decision mechanism exists (e.g., as provided by a theorem prover). In particular, this applies to several interesting intermediate logics among which the equilibrium-logic (relevant as a foundation of ASP systems) as well as modal logics and their instantiations as alethic, temporal, deontic or epistemic systems. Besides providing (in the form of the concept of weakest protasis) an analogue of the unavailable truth-table models for intuitionistic formulas, we have also generalized our abduced sequent premises to use minimal canonical formulas to which arbitrary IL formulas can be broken down, with the potential of synthesizing salient assumptions that would make a given formula a theorem. When the underlying logic is used to model a set of safety constraints that should always hold, this generalized abduction synthesis could reveal critical missing assumptions, not just as literals but also as a conjunction of interdependencies among them.

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