

## AUTOMATED REASONING

### SLIDES Appendix A2 for Slides 9 to 11 (Not examinable):

#### CASE STUDY 1 - KE tableau

#### CASE STUDY 2 - Intermediate Lemma Extension

#### RELATIONS between RESOLUTION and TABLEAU

##### Completeness of Resolution via tableaux

##### A very useful notation (chain notation)

##### Relation of ME with linear resolution

#### The UNIFY - AT - END tableau development

#### Parallel Model Elimination

KB-AR - 12

## Appendix A2

A2ai

These slides cover various topics that relate tableau and resolution, for which there isn't time in the lectures. They're included for interest and are not examinable. They discuss:

- Case Study 1: The KE tableau prover; this alternative has just one splitting rule - either  $P$  or  $\neg P$  - and has some theoretical interest. It has not been investigated as much as ME tableau, especially at first order level. It has similarities with the DP method and could be viewed as a first order version of the Davis Putnam Procedure.
- Case Study 2: A variant of ME is the Intermediate Lemma Extension. This has some similarities with Neg-HR, and is a tableau version.
- an alternative proof of the completeness of resolution using tableau;
- a discussion of the relation between linear resolution and ME tableaux. Linear resolution is a refinement in which each new resolvent is formed by resolving the previous resolvent with either a given clause or another resolvent. The first step resolves two given clauses. This is related to the extension step of Model elimination.
- The constrained development of model elimination tableaux allows for a concise notation to represent an ME tableau as a list of literals, which in turn allows a whole search space to be depicted in the plane.
- Also included are some slides on Unify-at-end and parallel development of tableaux.

### Case Study 1: The KE Tableau Method

A2bi

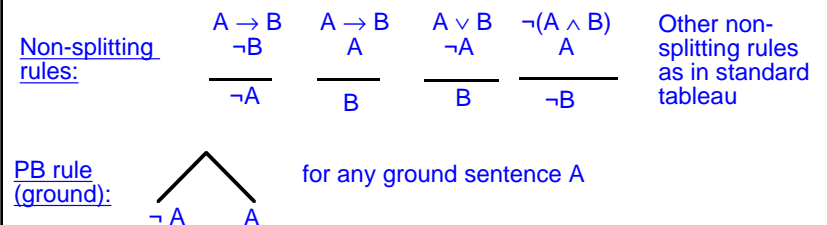
The KE tableau method is more recent than other techniques, having been introduced only in the last 15 years or so. (See "The Taming of the Cut", D'Agostino and Mondadori, and also Endriss: A Time Efficient KE Based Theorem prover.) In the first order case there has been very little work on practical theorem provers, so the example here is illustrative only. The KE rules can be viewed either as generalisations of the Davis Putnam steps or as variations of ordinary tableau rules, trying to retain much of the ME method, but for arbitrary sentences. There is just one splitting rule, but it is not restricted to atoms. The non-splitting rules are similar to the DP steps which prune atoms, and for clauses they are exactly the same. KE is more efficient than standard tableau, unless Re-use (see Slide 10civ) is included in tableaux development, in which case (for clausal form) KE-tableaux can be simulated by ordinary ME-tableau + Re-use. Alternatively, one can soundly (and redundantly) add the splitting rule to the ordinary tableau method.

In the example on Slide A2bv it is appropriate to draw the universal quantifiers into a prefix, but more generally, this may not be so. Similar benefits to those provided by universal variables might be obtained if universal quantifiers are distributed as much as possible, but this remains to be investigated, as does the possibility of eliminating non-essential backtracking. In the example on A2bv the first step uses the  $(\neg\wedge)$  rule, together with the free variable  $\forall$  elimination rule to derive  $\neg pr(n)$  from (4) and  $div(x2, x2)$ . The next step anticipates the use of the  $(\rightarrow)$  rule and sets this up by a PB application using  $\neg(div(g(x1), x1) \dots)$ . In the second branch of the PB the  $(\rightarrow)$  rule is used several times, in combination with free variables.

The KE method is quite human oriented in the ground case. But it is quite hard in the first order case because of the various ways that the  $(\forall)$  rule can be combined with other rules. It tends to give rise to less branching than ME tableau.

### Case Study 1: KE-TABLEAUX (D'Agostino, Mondadori, Pitt)

- KE generalises Davis Putnam to first order sentences
- There is only one splitting rule - called PB (Principle of Bivalence)



- Although quite a lot of theory for KE-tableaux has been developed, there is rather less on theorem proving techniques for it.
- KE is similar to Davis-Putnam, but with a more general splitting rule.
- KE can be simulated by standard tableau if the PB rule is added to the standard ruleset. This can easily be shown to be sound by extending the SATISFY property.
- For clauses, Re-use rule in ME also allows to simulate KE
- KE can simulate standard tableau (for Skolemised sentences, at least).

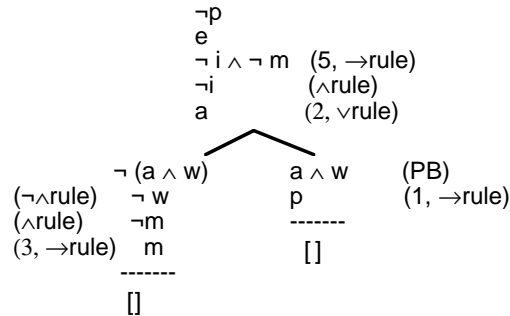
A2bii

## Example of KE

A2biii

Given data:

1.  $a \wedge w \rightarrow p$  2.  $i \vee a$  3.  $\neg w \rightarrow m$ , 4.  $\neg p$  5.  $e \rightarrow \neg i \wedge \neg m$  6.  $e$



KE seems to be good for propositional tableaux.

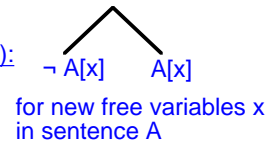
The amount of branching is generally lower than for standard tableaux

The PB rule is often used to introduce the second premise for the non-splitting rules. e.g. see the use of PB on  $a \wedge w$  above.

## First Order KE rules

A2biv

PB rule  
(non-ground):



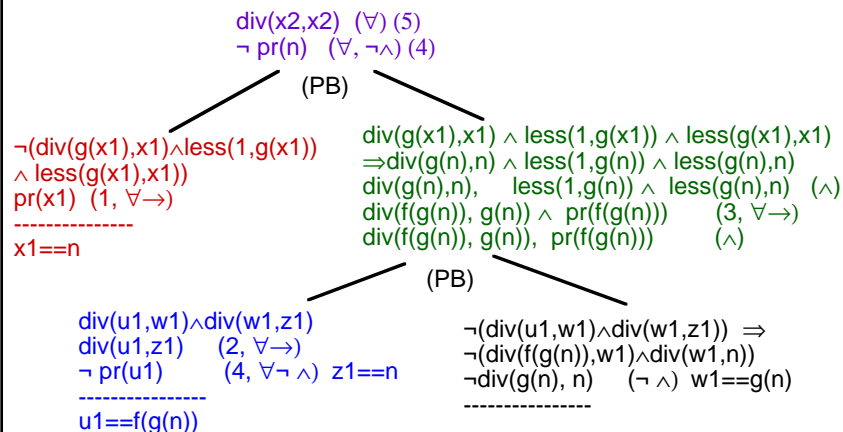
A is any first order formula or literal

eg  $\exists x(Px \vee Qx)$ ,  $R(x1,y1)$ , etc.

- The  $\exists$ -rule and  $\forall$ -rule are the same as for ordinary free-variable tableau;
- One method to deal with quantifiers is to draw them into a prefix and use free variable tableaux rules. These are often combined with one of the two-premise rules. See example on next slide.
- Little investigation of heuristic techniques for first order KE have been made to date, so far as I'm aware.
- Soundness and Completeness have been shown for the ground case.
- The KE-approach has proved useful for modal logics as well.
- Clausal KE is quite similar to Davis Putnam, effectively providing a first order version of it.

**Given:** (1)  $\neg(\text{div}(g(x),x) \wedge \text{less}(1,g(x)) \wedge \text{less}(g(x),x)) \rightarrow \text{pr}(x)$   
 (2)  $\text{div}(u,w) \wedge \text{div}(w,z) \rightarrow \text{div}(u,z)$  (3)  $\text{less}(1,x) \wedge \text{less}(x,n) \rightarrow \text{div}(f(x),x) \wedge \text{pr}(f(x))$   
 (4)  $\neg(\text{pr}(y) \wedge \text{div}(y,n))$  (5)  $\text{div}(x,x)$  (6)  $\text{less}(1,n)$

(u,w,x,y,z are universally quantified)



First Order KE example

A2bv

## Soundness and Completeness for Ground KE (Outline)

A2bvi

The *soundness* of ground KE is simple to show; it is sufficient to show the property SATISFY for the non-splitting rules and the PB rule. SATISFY is obviously true for an application of the PB rule (say for the sentence A), since the model of the branch before the rule must assign either T or F to A; if it assigns T then the branch below A will still be satisfiable and if it assigns F then the branch below  $\neg A$  will still be satisfiable. For the other rules, consider the exemplar  $A, \neg(A \wedge B) \Rightarrow \neg B$ . If a model M satisfies a branch containing the formulas A,  $\neg(A \wedge B)$ , then M will clearly satisfy  $\neg B$ , the conclusion of the rule.

It is also quite easy to show correctness (soundness and completeness) in a manner similar to that used for DP on Slides 1. This is not a coincidence, since KE is very similar to DP, especially if all sentences are clauses. (The extension mentioned in Slides 1 for non-clauses is very similar to KE.)

We define the  $\alpha$ -rules to be those rules which are  $\alpha$ -rules of ordinary tableau, and the  $\beta$ -rules to be the remaining non-splitting rules (e.g. A and  $\neg(A \wedge B) \Rightarrow \neg B$ ). The minor sentence in a non-branching KE rule application of the  $\beta$ -kind is the smaller sentence (e.g. A in the above example rule). There are then basically 5 cases: a contradiction between a sentence and its negation, no sentences left to develop in a branch, an application of an  $\alpha$ -rule, a sentence S used as the minor sentence in a  $\beta$ -rule application, and a PB application.

However, the proof similar to that used for DP requires the KE derivation to make all applications of a  $\beta$ -rule using the chosen minor sentence at once. Since this is not the normal way to make a KE derivation we'll give a different proof for completeness for ground KE. See A2bvii.

## Completeness for Ground KE (Continued)

A2bvii

Each sentence that occurs as a (sub)formula in the given data is a potential candidate for a  $\beta$ -rule application and is called a *given sub-formula*. (Note that atoms occurring in a given sentence are counted as given sub-formulas.)

An open branch of a ground KE tableau is called *fully developed* if every given sub-formula in the branch, or its negation, occurs at a node in the branch and no further rule applications are possible. Clearly, there is no need to use PB for any given sub-formula that already appears in a branch.

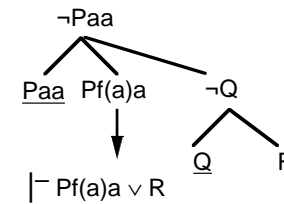
Let  $S$  be a given set of sentences and suppose a KE tableau is found with a fully developed open branch  $B$ . From this branch a model for  $S$  can be found in a similar way to that described for standard tableau and shown to satisfy the sentences in the branch. The proof for satisfiability is by contradiction from the assumption that some smallest sentence in  $B$  is false. For example, suppose such a smallest false sentence was of the form  $X \vee Y$ . Then both  $X$  is false and  $Y$  is false. Since  $B$  is fully developed either  $X$  or  $\neg X$  is in  $B$ . If it is  $X$  then this contradicts the assumption that  $X \vee Y$  is a smallest false sentence. If it is  $\neg X$  then the ( $\vee$ ) rule would have derived  $Y$ , again a contradiction. The other cases are similar and full details are left as an exercise.

Therefore, if  $S$  is an unsatisfiable set of sentences, then no fully developed open branch can exist and the KE tableau must close. For the first order case the method is essentially similar.

A reasonable way to develop a KE tableau is thus to use the  $\alpha$ -rules and  $\beta$ -rules as much as possible, only using PB to introduce the minor sentence for a  $\beta$ -rule application. The amount of splitting is then kept to a minimum.

## Case Study 2: Generalising Prolog to arbitrary clauses

Given  $\neg Paa, \neg Pf(a)a \vee \neg Paf(a), Pf(a)a \vee \neg Q \vee Paa, Paf(a) \vee Paa, Q \vee R, \neg R$



If positive literals  $Pf(a)a$  and  $R$  are ignored then tree is complete

Can derive  $Pf(a)a \vee R$  from above tableau: add  $\neg(Pf(a)a \vee R)$  and derive a closed tableau.

In a similar way can derive  $Paf(a)$  by using  $Paf(a) \vee Paa$  instead of  $Pf(a)a \vee \neg Q \vee Paa$  (Called *Intermediate Lemmas*)

### Intermediate Lemma Extension:

1. Select a positive literal from each non-Horn clause as the *conclusion literal* of that clause. Other positive literals are called *lemma literals*.
2. Proceed as in Prolog - begin from an *all-negative* clause, match with "conclusion" literals and ignore other positive literals that arise unless they match the immediate parent.

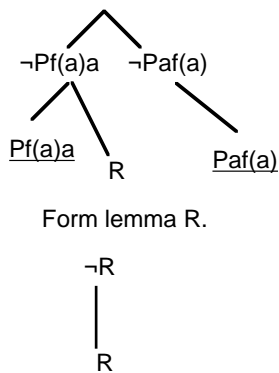
- Step 1:** choose (and underline) conclusion literals  
**Step 2:** derive lemmas.

**Ground clause example**

A2ci

## Intermediate Lemma Extension (contd.):

A2cii



3. Either - find a refutation - no lemma literals left as leaves;  
Or - derive a lemma - only lemma literals left as leaves; form a lemma from the disjunction of all leaf literals.
4. Deal with the lemma as in 1, then can try an alternative path in 2, using new lemma.

**Step 3:** Find lemmas  $Pf(a)a \vee R$  and  $Paf(a)$ .

**Step 4:** Use these lemmas to form lemma  $R$

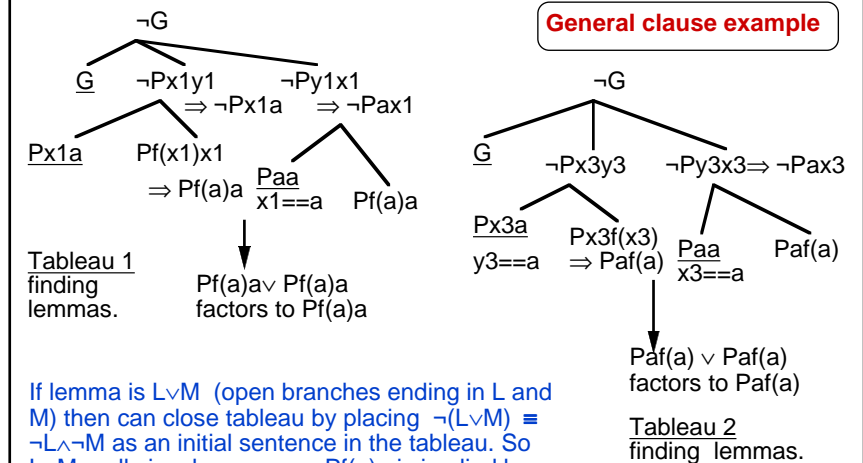
**Step 2/3:** Find a refutation.

Can piece together the various tableaux used to obtain lemmas to form a closed tableau - it will not be a regular nor a ME tableau. In the example, in the final refutation, replace use of lemma  $R$  by tableau used to derive  $R$ , then replace use of other lemmas by tableaux used to derive them. (See A2ciii.)

Given:  $\neg G, G \vee \neg Pxy \vee \neg Pyx, Pf(u)u \vee Pua, Pvf(v) \vee Pva$

A2ciii

### General clause example



If lemma is  $L \vee M$  (open branches ending in  $L$  and  $M$ ) then can close tableau by placing  $\neg(L \vee M) \equiv \neg L \wedge \neg M$  as an initial sentence in the tableau. So  $L \vee M$  really is a lemma. e.g.  $Pf(a)a$  is implied by tableau 1 and  $Paf(a)$  is implied by tableau 2.

Given:  $\neg G, \quad G \vee \neg Pxy \vee \neg Pyx, \quad Pf(u)u \vee Pua, \quad Pvf(v) \vee Pva,$  A2civ

Lemmas:  $Pf(a)a, Paf(a)$  (found as on 11diii)

The method seems to be fairly efficient:

In effect, many sub-tableau of small depth are joined together to form a large tableau. (When a lemma is used the tableau which derived it could be used instead.)

Because the individual search spaces are small the total search is reduced.

Tableau 3 using lemmas

Example of a more general lemma: open branches ending in  $P(x)$  and  $Q(y,x)$  lead to a lemma  $\forall xy [P(x) \vee Q(y,x)]$ . Adding  $\neg \forall xy [P(x) \vee Q(y,x)]$  to the initial set of sentences, which Skolemises to the two facts  $\neg P(a), \neg Q(b,a)$  for new  $a$  and  $b$ , will enable the tableau to close.

**Intermediate Lemma Extension (1):** A2cv

The Intermediate lemma extension on slides A2c is a hyper-resolution (or Prolog)-like extension for tableaux. (Don't confuse with other ME-extensions called *hyper-tableaux* - see TABLEAUX conferences.) In any clause with at least one positive literal, *exactly* one positive literal is marked as the *conclusion literal*. Other positive literals (if any) are called *lemma literals*. (If a clause has exactly one positive literal it is the conclusion.) Each clause with no positive literals is called a goal clause and can be used as a top clause. For uniformity, a new literal "G" can be appended to each goal clause (then all given clauses will have at least one positive literal). The top clause is then a new clause,  $\neg G$ . A ME-tableau is constructed from the top clause, in which the lemma literals are initially ignored – branches in which they occur as leaf literals are not pursued. (An extension allows the lemma literals to close a branch (if possible) by matching some earlier negative literal in the branch. This reduces the length of the eventual lemma.)

If a tableau closes and there are no ignored lemma literals then this indicates that a refutation has been found. Otherwise, if a tableau closes and there are ignored lemma literals, the lemma literals are put into a new clause (i.e. the new clause is the disjunction of the lemma leaf literals), which is added to the data and called an *intermediate lemma*. This clause will have only positive literals, and one is chosen as the conclusion literal. Only intermediate lemmas that are not subsumed need be added. Clauses that are subsumed by the new intermediate lemma can also be removed. In case an intermediate lemma is retained, a new attempt at a refutation from  $\neg G$  (or a top clause) can be made using all given clauses and all non-subsumed intermediate lemmas.

*Factoring* can be incorporated in two different ways. Either: (i) clauses can be (safe-factored) before being accepted (either as a given clause or as an intermediate lemma), or (ii), a positive literal that would otherwise be ignored may be matched with its parent (if possible). I prefer the first method, since it allows for all safe-factors to be found regardless of which positive literal might be selected as a conclusion literal. The second method is more dependent on the selection of conclusion literals to detect safe-factors. However, it is simpler to implement.

**Intermediate lemma Extension (2):** A2cvi

The process of forming lemmas and refutations needs to be controlled in some way, analogous to setting depth limits in the standard ME procedure. The simplest is the following: All possible ways of closing a tableau descended from  $\neg G$  are formed and all intermediate lemmas formed, both upto some initial fixed depth. Then the process is repeated, but making use of the new clauses as well. If no further tableaux can be formed at the given depth and no refutation has been found then the process is repeated but to a greater depth.

Unfortunately, the depth may need to be increased even though new intermediate lemmas can be found at the current depth. e.g. initial clauses include  $\neg Q, P(a), Q \vee \neg P(x) \vee P(f(x))$ . Together, if  $Q$  is the conclusion literal in the third clause, these allow for the lemmas  $P(f(a)), P(f(f(a)))$ , etc. to be formed, all at depth 2, even though none of these lemmas may be the ones required for a refutation. To overcome this problem make a lemma contribute more than 1 to the depth-count when it is used in a refutation. e.g. make a lemma count exactly  $1 + \text{number of lemmas used in its derivation}$ . This is consistent with giving an initial clause a count of 1, since it uses no lemmas in its derivation. Hence, at a given depth there is a maximum number of lemmas that can be used and a finite number of possible refutations that could be made.

Once a refutation has been found, a complete tableau can be constructed from the various tableaux used to form the lemmas. Beginning with the last used lemma, the use of each lemma is replaced by the tableau that derived it. All its leaves will match in the same way that the lemma did. This substitution of tableaux can be repeated until all lemmas have been replaced.

In the tableau on A2ci/ii, first the tableau for  $R$  is used beneath  $\neg R$ . This tableau uses the clauses  $Pf(a)a \vee R$  and  $Paf(a)$ , which are also lemmas. They are replaced by the tableaux which derived them, the leaf literals that formed the lemmas now matching where those of  $Pf(a)a \vee R$  or  $Paf(a)$  did. See diagram on A2cvii.

**Intermediate Lemma Extension: Reconstructing a closed tableau from lemmas** A2cvii

In closed tableau from 11dii with top clause  $\neg R$  and closure with lemma  $R$  replace  $R$  with the tableau on 11dii that derived it

**Soundness and Completeness of the Intermediate lemma Extension:**

Next we show that the method of the Intermediate Lemma Extension is both sound and complete (at the ground level). The ground level tableau can then be lifted to give completeness and soundness at the general level in a similar way to that used for free variable tableau on slides 9.

To show soundness, note that each generated lemma is associated with a sub-tableau. These various sub-tableaux can be used in place of the corresponding lemma, as described on A2cvi. Each closure that was possible using the conclusion literal of the lemma is still possible using the tableau. For the example on A2ci/ii the final closed tableau is shown above.

### Completeness of the Intermediate Lemma Extension:

The proof is by induction on the number of lemma literals in the given clauses. Let  $S$  be a minimally unsatisfiable set of clauses with a total of  $k$  lemma literals. (i.e. if any clause is removed from  $S$  then  $S$  would become satisfiable.)

If  $k=0$  then the clauses are Horn clauses and since  $S$  is unsatisfiable there will be at least one all-negative clause in the set-of-support. Then there is a standard ME tableau starting from this all-negative top clause that will close (by completeness of ME). It is not hard to show the structure of the closed tableau is of the right form (and simulates a Prolog derivation from  $S$ ).

If  $k>0$ , suppose as induction hypothesis (IH) that, for  $0 \leq m < k$  lemma literals, there is always a set of sub-tableaux formed using the method, which can be pasted together to give a closed and soundly formed tableau. Let  $C$  be a clause with a lemma literal  $L$  and let  $C' = C - \{L\}$ . Form  $S' = S - \{C\} + \{C'\}$  and  $S'' = S - \{C\} + \{L\}$ . Each may be made minimally unsatisfiable such that, for the case of  $S'$ ,  $C'$  is needed to show unsatisfiability, and in the case of  $S''$   $\{L\}$  is needed. (Show this by using the assumption that  $S$  is minimally unsatisfiable). Since in both  $S'$  and  $S''$  the number of lemma literals  $< k$ , by IH there is constructable a well-formed Intermediate Lemma tableau from an all-negative clause for  $S'$  and for  $S''$ .

Now take the constructed tableau for  $S'$  and put back  $L$  into  $C'$ , forming  $C$  again. The tableau for  $S'$  was closed but will now give rise to the lemma  $L$ : in the derivation of the tableau for  $S'$ , use of  $C$  (where before  $C'$  was used) will include using  $L$ , multiple occurrences all being factored to give the lemma  $L$ . In the well-formed tableau for  $S''$ , this tableau deriving lemma  $L$  can now be used wherever originally the clause  $L$  was used.

A2cviii

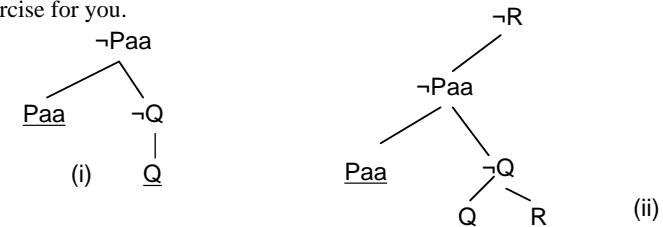
For the example on A2ci/ii the choices made for  $L$  are:

$R$  from  $Q \vee R$ ,  $Pf(a)a$  from  $Paa \vee Pf(a)a \vee \neg Q$  and  $Paf(a)$  from  $Paa \vee Paf(a)$ ; lemma atoms are non-conclusion atoms. There are 3. (Conclusion atoms are underlined.)

Assume  $C1$  is  $Paa \vee Paf(a)$ , giving  $C1' = Paa$ .  $S1' = \{Q \vee R, \neg R, Paa \vee Pf(a)a \vee \neg Q, Paa, \neg Paa, \neg Pf(a)a \vee \neg Paf(a)\}$ , which reduces to minimally unsatisfiable  $\{Paa, \neg Paa\}$ , and  $S1'' = \{Q \vee R, \neg R, Paa \vee Pf(a)a \vee \neg Q, Paf(a), \neg Paa, \neg Pf(a)a \vee \neg Paf(a)\}$ .

In  $S1''$  choose as  $C2$  the clause  $Paa \vee Pf(a)a \vee \neg Q$ , and use the IH to form tableaux from  $S2' = \{Q \vee R, \neg R, Paa \vee \neg Q, Paf(a), \neg Paa, \neg Pf(a)a \vee \neg Paf(a)\}$  and  $S2'' = \{Q \vee R, \neg R, Pf(a)a, Paf(a), \neg Paa, \neg Pf(a)a \vee \neg Paf(a)\}$ .

For  $S2'$  choose  $C3 = Q \vee R$  and  $S3' = \{Q, \neg R, Paa \vee \neg Q, Paf(a), \neg Paa, \neg Pf(a)a \vee \neg Paf(a)\}$  and  $S3'' = \{R, \neg R\}$ . The tableaux for  $S3'$ ,  $S2''$ ,  $S1'$  are fairly obvious. Tableau (i) below is for  $S3'$ . After re-inserting  $L3 = R$  into  $S3'$  can use it in closure for  $S3''$ , as shown in (ii). Two more constructions are needed to complete the full tableau according to the proof. These are left as an exercise for you.



A2cix

### An Assessment of the Intermediate Lemma Extension:

A2cx

In 2010 MSc student Rosa Gutierrez Escudero implemented various refinements for the ILE and performed a thorough set of benchmarking tests using the TPTP (Thousands of problems for theorem provers) Database. It turned out that the method generally performs no better than Model Elimination as implemented in the best standard version of LeanCop (with Re-Use but no backtracking restrictions). The method was tested on problems including equality, and using various ways to reason with equality. (However, recently she has made the code more efficient, so there may be an update.)

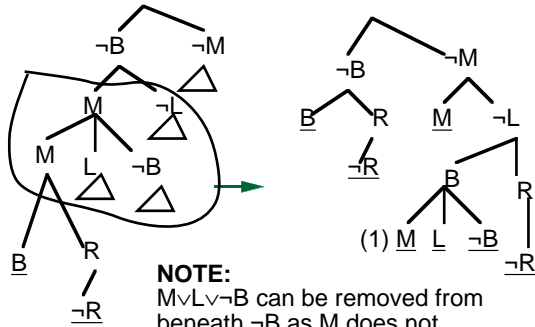
In one variant the lemma literals were not restricted to be positive atoms. Instead, it was allowed for a uniform translation to be applied to literals in the initial clauses. That is, certain literals could be transformed into their complements. (This is similar to the transformation described for generalising hyper-resolution.) For some problems this proved to be a good improvement. Whereas the normal ILE method restricts lemma literals to be atoms, transforming (say) all  $P$  literals into their complements will not affect unsatisfiability, but may affect the syntactic structure of the clauses and lead to a simpler derivation.

The ILE method might be expected to perform well – in order to construct a derivation it searches many small search spaces for the lemmas. However, many lemmas are derived more than once and therefore subsumed and hence redundant; this appears to be one reason that ILE is not as good as might be expected. e.g. suppose the lemma  $A \vee B$  is found at depth 3. Then when additional lemmas are sought using any newly found lemmas,  $A \vee B$  will be found for a second time. Subsumption is important though, as if  $A$  in  $A \vee B$  is marked as conclusion, the next lemma may well be  $B$ , subsuming the previous lemma. Secondly, non-essential backtracking was less helpful – the restrictions on forming a tableau are quite strict in ILE, so alternative derivations were often not allowed.

## Completeness of Resolution using Tableaux A2di

**Example.** Given:  $\neg B \vee \neg M$ ,  $M \vee \neg L$ ,  $M \vee L \vee \neg B$ ,  $B \vee R$ ,  $\neg R$

**A:** Form a tableau such that no literal occurs twice in a branch, and every internal node is matched by a leaf node.

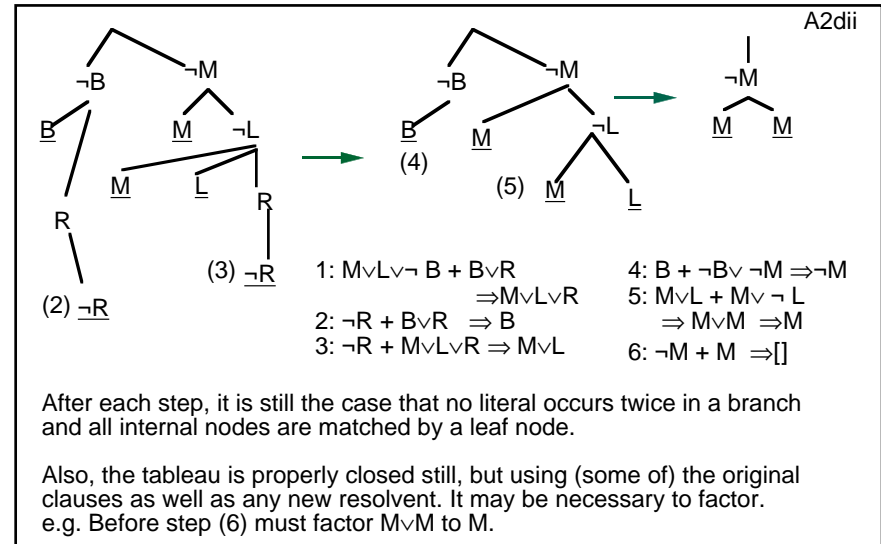


**NOTE:**  
 $M \vee L \vee \neg B$  can be removed from beneath  $\neg B$  as  $M$  does not match below. Then  $M \vee \neg L$  can be removed similarly.

**B:** Each clause with leaf nodes only can be resolved with the literal just above, e.g. clause labelled (1).

**C:** The tableau is adjusted by removing the resolved literals from the two clauses involved, e.g.  $\neg B$  from (1) and  $B$  from  $B \vee R$ .

The remaining literals still match above and the tableau still closes, e.g. Simulates formation of resolvent  $M \vee L \vee R$ .



## Another Proof of Completeness for Resolution: A2diii

The slides A2d give a constructive proof that refutation by ground resolution (and factoring) is complete, but this time based on the completeness of tableau systems. The idea is to build a closed (ground) tableau from the given clauses and then to transform it in small steps, each step corresponding to a resolution step. In *Stage A* a closed ground regular tableau is formed with the properties that (i) every non-leaf node is complemented by a leaf node and (ii) no branch contains a literal more than once. (Note that a ME tableau would satisfy (i) and (ii) initially, but so do some other tableau as well.) In order to achieve this, if  $n$  is a non-leaf node in clause  $C$  that is not complemented, then  $C$  is removed from the tableau and the sub-tableau beneath  $n$  can descend directly from its parent since no closures use  $n$ . (See example.) If  $n$  is a node occurring twice in a branch, then the clause containing the occurrence at greater depth can be removed and the sub-tableau beneath  $n$  can descend directly from its parent as any closures can use the remaining occurrence.

In *Stage B* clauses are removed from the tableau starting from all-leaf clauses. The parent of such a clause  $C$  must match with at least one literal in  $C$ , given that property (i) of Stage A is true. Thus  $C$  can be resolved (possibly with factoring of the matching literal) with the clause  $D$  containing its parent. The resolvent replaces  $D$  in the tableau. The properties (i) and (ii) of Stage A are maintained and the tableau still closes. If there were an exception, it would contradict that the property held before the resolution step.

**Exercise:** show these 3 things.

After none or more resolvents have been formed, a tree occurs of the form  $X(\neg X)$  at a node  $m$ , with one or more occurrences of  $\neg X(X)$  at child nodes of  $m$ . The corresponding resolution step (including factoring) results in the empty clause. Since every step removes at least 1 closure, the process will terminate.



### Relation between ME tableau and Linear resolution refinements (1)

A2ei

ME-tableaux are closely related to the *linear refinement* of resolution. This refinement is outlined below. It was introduced long before free-variable ME-tableaux, as were the various restrictions of the refinement. However, there is one particular restriction, called SL-resolution, which corresponds *exactly* to free-variable ME-tableau. When the generalised closure rule is included, then more general linear resolution proofs can be simulated by tableaux. The relationship between the two systems is detailed further in the chapter notes on clausal tableaux on my website, if you're interested.

#### Strategy of Linear resolution

First select an initial clause called **top** in the set of support of set of clauses S:

The set of support of  $S = \{C \mid C \in S \text{ and } S - \{C\} \text{ is satisfiable}\}$ ; i.e. each C in the set of support is necessary to derive  $\perp$ .

Next resolve C with an input clause from S (possibly a second copy of top). Then, at each subsequent step resolve the latest resolvent with either an input clause, or a previous resolvent (called *ancestor resolution*). e.g. If the refutation is  $R_0, R_1, R_2, \dots, \perp$ , where  $R_0$  is the top clause, then  $R_2$  is formed by resolving  $R_1$  with an input clause, or with  $R_0$ , or with  $R_1$ .

Linear resolution appears to be quite natural as it generalises top-down/goal-directed reasoning. The search space is a tree, each branch being one possible linear derivation, so efficient search methods and Prolog technology can be employed.

The top clause and subsequent resolvents in the example shown on the right in A2bv are:  $Px \vee Q, Rx \vee Q, \neg Rb \vee Q, Q \vee Q$  (i.e. Q),  $\perp$ . The ancestor resolution step is between  $\neg Rb \vee Q$  and  $Rx \vee Q$ , deriving  $Q \vee Q$ , which factors to Q.

### Relation between ME tableau and Linear resolution refinements (2)

A2eii

Next we explain how a ME-tableau relates to a linear resolution derivation. The idea is that at each ME-step the disjunction of the leaf literals in open branches is the latest resolvent of the corresponding linear refutation. In the example on A2bv, after the first closure the leaf literals of the open branches are Rx and Q, which are exactly the literals in the second resolvent in the derivation, as given in A2bi. Similarly, after the second closure the leaf literals are  $\neg Rb$  and Q, exactly the third clause in the derivation.

The various tableau steps correspond as follows:

i) Extension corresponds to resolution of an input clause with the latest resolvent, ie one that has been extended in the branch before, choosing to resolve on a literal most recently introduced into the resolvent.

ii) Closure corresponds to resolution of the latest resolvent with an ancestor resolvent, but in a quite restricted way. If the previous resolvent used was  $R = L \vee C$ , where L was the literal resolved upon in R before, then R can only be used again by resolving on L. Moreover, the same "instance" of R must be used. That means that *both copies of R must use the same instantiation*, i.e. it is R used twice, not R and a copy of R. This is sufficient to ensure that *the 2 occurrences of clause C in the resolvent that arise from the two steps using R will factor*. In fact, as long as this latter property holds, the other restriction can be relaxed; this would correspond to using the generalised closure rule.

In a normal ME tableau, the restriction on closure is automatically ensured by the structure of the tableau, since only one instance of each literal occurrence is allowed. On A2ev, notice that in order to use Rx a second time with substitution b, it is necessary to use a second occurrence, which brings with it a second occurrence of Q. The same effect can be obtained by allowing a second instance of Rx (namely when  $x=b$ ), as in the generalised closure rule of ME. As an example, A2ev shows the linear refutation corresponding to the LH tableau of 11bi.

### Model Elimination Tableau Simulation of Linear Resolution

A2eiii

Consider the tableau shown on A2eiv and the corresponding linear resolution derivation, which is also shown. The *top clause* of the linear derivation is  $Fx1 \vee Hx1$ , which is the first clause in the ME tableau. The first two steps resolve with input clauses and the resolvents of each step correspond to the leaf literals of the open branches of the tableau. Notice that the third step, which resolves with  $Fx1$  for a second time and which derives  $Hb \vee Hb$ , is an ancestor matching step in the tableau and that there is only one instance of  $Fx1$ , which is the one enforced by the unifier of this step. The two occurrences of  $Hb$  appear just once in the tableau. In the resolution proof the resolution is between the clause  $\neg Fb \vee Hx1$  and a copy of the ancestor  $Fx1 \vee Hx1$ , say  $Fx3 \vee Hx3$ , which yield  $Hb \vee Hx1$ . This factors to  $Hb$  and corresponds with the tableau version.

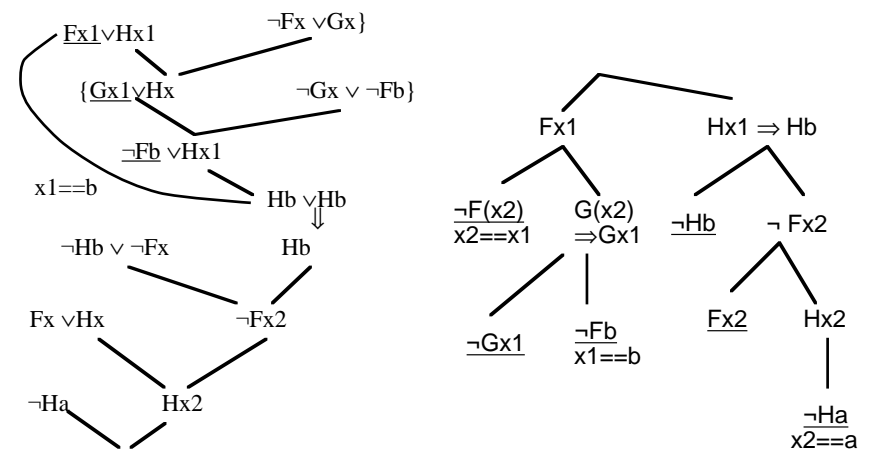
The restricted linear resolution strategy, which simulates ME, only allows resolution with the *ancestor instance*  $Fx1 \vee Hx1$ , *not a fresh copy* of  $Fx \vee Hx$ . It also restricts to using  $Fx1$ , the literal previously resolved upon. If that instance were to be used later in the derivation, it is only the instance  $Fb \vee Hb$  that may be used. The unrestricted linear resolution strategy will also allow  $\neg Fx2$  to resolve with a fresh copy of the ancestor  $Fx \vee Hx$ . In the tableau, the ancestor matching step (corresponding to using the copy) is made explicitly because  $Fx1$  from  $Fx1 \vee Hx1$  is not part of the "history" leading to  $\neg Fx2$ .

The generalised closure rule corresponds to using the copy to resolve with the current resolvent R, as long as the copy of the remaining literals safely factors with the literals in R. In general linear resolution the step of ancestor resolution is even more flexible - any literal in the ancestor can be used, not just the literal that was used the first time the ancestor was involved in a resolution step. More on this is in the 'Chapter' notes if you're interested.

### Comparison of Linear resolution and ME for the clauses:

A2eiv

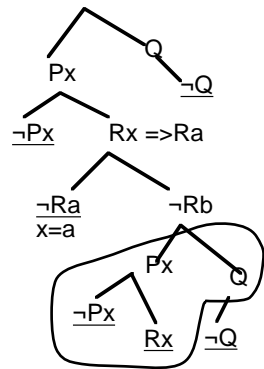
$\neg Ha, \neg Gx \vee \neg Fb, \neg Fx \vee \neg Hb, Gx \vee \neg Fx, Fx \vee Hx$



## Generalised closure rule of ME can simulate Linear Resolution

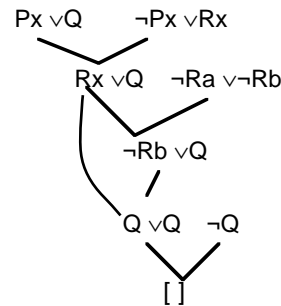
A2ev

$Rx \vee \neg Px, Px \vee Q, \neg Ra \vee \neg Rb, \neg Q$



A ME tableau can be seen as simulating a special kind of linear resolution strategy. In the derivation on the right the two copies of Q derived from the same parent literal will factor.

This will always be the case in the tableau if variables in the branch closing by the generalised closure rule do not occur in any remaining leaf literals.



**A linear resolution strategy.**

## Chain Notation for ME Tableaux:

A2fi

For interest, slide A2fii shows a convenient representation for ME-tableaux, called the *chain notation*, which is possible because such tableaux are developed from left to right. This notation enables a complete search space to be represented in 2 dimensions.

A ME-tableau is maintained as a *chain* of literals. There are two types of entry, *boxed* and *unboxed* literals. The top clause forms the first chain with the leftmost literal the next to be selected and all literals unboxed. A chain may

- (i) be extended by a new clause,
  - (ii) be extended by ancestor matching or
  - (iii) be truncated,
- corresponding, respectively, to tableau extension, ancestor closure or moving to the next branch to develop.

(i) results in the matched literal becoming boxed and literals in the (added) matching clause (not including the complementary literal) being appended to the left of the chain. (ii) results in the leftmost literal being boxed if it unifies with a boxed literal to its right. (iii) removes leftmost boxed literals.

A chain represents the remaining open branches of the ME tableau formed so far, which can be re-constructed from the chain. Each unboxed literal is a leaf literal L of the tableau. Its ancestors, forming the rest of the branch, are all the boxed literals to its right (the first boxed literal to the right being the parent of L). Alternatively, all literals to the left of a boxed literal are its descendants. The example on A2fii illustrates. *Regular* tableaux can be enforced by not allowing a step that would result in an unboxed literal being duplicated by another boxed literal to its right. Also, if an unboxed literal is duplicated by an unboxed literal to its right, then the leftmost literal can be boxed, corresponding to the "merge" operation.

## CHAIN NOTATION - A handy shorthand

A2fii

top clause  $\neg B \neg M$

extension  $R \boxed{\neg B} \neg M$

extension  $\boxed{R} \boxed{\neg B} \neg M$

truncation  $\neg M$

extension  $L \neg B \boxed{M}$

extension  $M \boxed{L} \neg B \neg M$

ancestor matching  $\boxed{M} \boxed{L} \neg B \neg M$

truncation  $\neg B \neg M$

extension  $R \boxed{\neg B} \neg M$

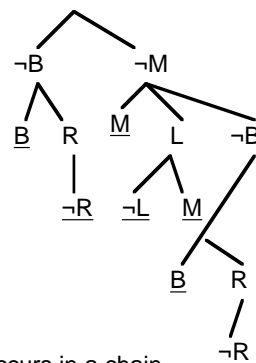
extension  $\boxed{R} \boxed{\neg B} \neg M$

truncation  $[\ ]$

$\neg B \vee \neg M, M \vee \neg L,$   
 $M \vee L \vee \neg B, B \vee R, \neg R$

Merging: If a literal occurs in a chain twice, both times unboxed, the leftmost can be merged with the right copy.

Regularity: If a literal occurs in a chain twice, the leftmost unboxed, the right occurrence boxed, the leftmost indicates a duplication.





## Comparison between Unify-at-the-end and Unify-as-you-go in ME tableaux

How else could the free variable method be systematic?

The ME approach is "unify as you go"

What about "unify at the end"? How could tableau development be controlled?

### Possibilities for controlling Unify-at-the-end:

- Restrict total no. of clause instances over all branches / over each branch, or number of instances of each clause over all branches / over each branch.
- Likely to get many literals in a branch that cannot possibly unify; the branches of which they are a part can be pruned.

e.g.

- If only one occurrence of  $Hx$  in a branch then no need for two instances of a clause containing  $\neg H(y)$ , as they would have to be the same.
- If no copies of  $Hx$  in a branch then no use for  $\neg H(y)$ .

An example of this approach is shown on Slide A2 div

### Good/bad points of Unify-at-the-end:

- If not many quantifiers "unify at end" may be better.
- May only be one binding for a particular branch. Selecting it can restrict unifiers in other branches.
- May be able to close branches without unifying. No backtracking (over those branches).
- May have many unifiers in a branch; all have to be tried.

A2gi

A2gii

## Constructing Free Variable Tableaux

When constructing a free variable tableau, you may do it in one of two ways, which could be called "unify-as-you-go", or "unify-at-the-end". Slides 9-11 used the unify-as-you-go method and the alternative approach to closure is shown on Slides A2g: instead of closing each branch "as you go" and propagating the bindings across the whole tableau, it is noted when a branch can close and what the corresponding binding is, but no propagation takes place.

The tableau on Slide A2giii is constructed using "unify-at-the-end". In the construction, if a branch can be closed by unifying two complementary literals, then it is marked as *possibly closed*. All possible unifiers that may lead to closure can be recorded as a label of the branch. When every branch has such a potential closure, a single unifier must be constructed using one unifier from the label of each branch in the tableau. For the example on A2diii it results in the combined unifier (ie unify the individual unifiers)  $\{x2==w1==g(n), x1==y1==x3==z1==n, u1==f(g(n)), y2==f(g(n))\}$ . If it is not possible to construct a single unifier, then a different set of closures must be found (which may involve further extending the tableau) and another combined unifier sought.

This is in contrast to the "unify-as-you-go" kind of construction, illustrated on Slide 9ciii, where whenever a closure is made that requires a binding to be made to one or more free variables, the substitution is applied to *all occurrences in the tableau* of those newly bound variables. This guarantees consistency of the bindings as the tableau is constructed. Only one binding may be made to any free variable.

The unify-as-you-go approach is useful for most applications, especially those using data structures, when it may be necessary for a piece of data to be used many times. If it is known (or quite possible that) each sub-sentence of each sentence is to be used only once or a very few times, the unify-at-the-end approach can be a reasonable one.

(1)  $\text{div}(x,x)$ , (2)  $\text{less}(1,n)$ , (3)  $\text{div}(u,w) \wedge \text{div}(w,z) \rightarrow \text{div}(u,z)$   
 (4)  $\neg(\text{div}(g(x),x) \wedge \text{less}(1,g(x)) \wedge \text{less}(g(x),x)) \rightarrow \text{pr}(x)$   
 (5)  $\text{less}(1,x) \wedge \text{less}(x,n) \rightarrow \text{div}(f(x),x) \wedge \text{pr}(f(x))$  **Show  $\exists y (\text{pr}(y) \wedge \text{div}(y,n))$**

**Free variable rules Unify at the end**

$\neg \exists y (\text{pr}(y) \wedge \text{div}(y,n))$   
 $\neg (\text{pr}(y1) \wedge \text{div}(y1,n))$

$\text{div}(g(x1),x1) \wedge \text{less}(1,g(x1)) \wedge \text{less}(g(x1),x1)$

$\neg \text{less}(1,x2)$   
 $x2==g(x1)$

$\neg \text{less}(x2,n)$   
 $x2==g(x1)$   
 $x1==n$   
 (or  $x2==1$  is possible)

$\text{div}(f(x2),x2)$   
 $\text{pr}(f(x2))$   
 $\neg (\text{pr}(y2) \wedge \text{div}(y2,n))$

$\neg \text{div}(u1,w1)$   
 $u1==f(x2)$   
 $w1==x2$

$\neg \text{div}(w1,z1)$   
 $z1==x1$   
 $w1=g(x1)$

$\text{div}(u1,z1)$   
 $\neg \text{pr}(y2)$   
 $y2==f(x2)$

$\neg \text{pr}(y1)$   
 $y1==x1$

$\neg \text{div}(y1,n)$   
 $\text{div}(x3,x3)$   
 $y1==n$   
 $x3==n$

$\text{pr}(x1)$

$\neg \text{div}(y2,n)$   
 $y2==u1$   
 $z1==n$

Gives:  $\{x2==w1==g(n), x1==y1==x3==z1==n, u1==y2==f(g(n))\}$

A2giii

E.g. Given:  $\text{Fxa} \vee \text{Fg}(x)x$ ,  $\text{Fxa} \vee \text{Fgx}(x)$ ,  $\neg \text{Fxa} \vee \neg \text{Fzx} \vee \neg \text{Fzx}$

Assume *at most one* instance of each clause will be used in each branch.

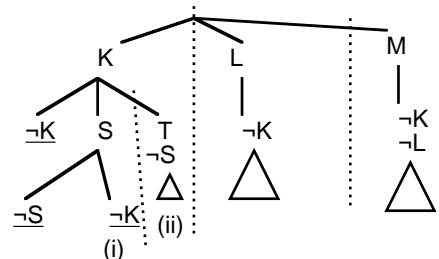
A successful unification is  $x4, z1, x1$  all bound to  $a$ ; i.e. didn't need  $\text{Fx2a} \vee \text{Fx2g}(x2)$  in LH branch - it can be removed - so only need one of the copies of  $\neg \text{Fxa} \vee \neg \text{Fzx} \vee \neg \text{Fzx}$

$x6$  bound to  $x3$  and  $z3$  and  $x3$  bound to  $a$ ;  
 $x7$  bound to  $g(a)$ ,  $z4$  bound to  $a$ .

A2giv

## Parallel ME : Propositional case

A2hi



- Sections of the tableau (indicated by dotted lines) can be developed in parallel.
- If the tableau is ME style then possibilities for re-use can be anticipated: eg if S occurs in closure below branch (ii) it can be closed in the same way as the closure below S in branch (i). Anticipate this by adding  $\neg S$  to branch (ii).

- Each branch of a clausal tableau can be distributed to a separate thread, or process. This is called **and-parallelism** as every branch must close for a refutation.

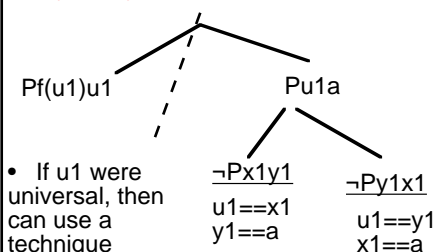
- This is different from **or-parallelism** in which each process is instead given a branch of the search space. eg in the tree on the left, if KLM (ie  $K \vee L \vee M$ ) matched with more than one clause (as it does here: KLM matches with given clauses  $\neg KST$  and  $\neg K \neg S$ ), then there would be two branches of the search space. Process1 is given the search space using  $\neg KST$  and process2 the search space using  $\neg K \neg S$ . If process2 finished before process1 then process1 can be terminated.

## Parallel ME: First Order case

A2hii

- To cope with potentially infinite tableau in the and-parallel development, each section is developed to a fixed depth. Failure to find a proof causes the depth to be increased for a second attempt.
- Shared (ie non-universal) variables pose a problem:

e.g. Given:  
 $\neg Pxy \vee \neg Pyx, Pf(u)u \vee Pua, \{Pvf(v) \vee Pva$



- If  $u1$  were universal, then can use a technique similar to the generalised closure rule.

**Reconcile: obtain**  
 $u1==x1==y1==a;$   
 Retain  $u1==a.$

- Values of  $u1$  must be **reconciled** between two processes.
- $Pu1a$  can close with  $u1==a$ . It can also close with  $u1==f(a)$ .
- **Q: Are there any more values?**
- Within a finite depth the number of values will be finite.
- $Pf(u1)u1$  can also close (eventually) with  $u1==a$ .
- Each solution is passed up to the parent process to be **reconciled**.
- Only bindings mentioned in ancestor nodes are retained.

## Parallel Clausal Tableau Development:

Slides A2h illustrate some possibilities for *and-parallel* execution within a clausal tableau. Each branch, called a *section* on A2hi, can be given to a separate processor. It's possible to anticipate some possible cases for re-use as shown on the slide.

The first order case is more complex as bindings must be preserved across branches for the shared (ie non-universal) free variables. One method is for each branch below a node  $n$  to be evaluated independently, finding as many bindings as possible for the variables occurring in the literal at  $n$  (to some max. depth to guarantee termination). The bindings are then reconciled (i.e. combined) at the node  $n$  with those from other sibling branches of  $n$  (i.e. only bindings which belong to the solution set of every sibling branch are retained, possibly further instantiated). Finally, only bindings to variables occurring in an ancestor of  $n$  need be kept for further propagation.

E.g. let ground  $P$  occur at  $n$ 's parent, where  $n$  matches with  $P$  and let  $n$ 's siblings be  $Q(x1)$  and  $R(x1)$ . Although  $x1$  must be reconciled with some binding, the particular binding is not relevant to the parent of  $n$ , unless  $x1$  occurs elsewhere in the tableau. As this is not the case, the empty binding would be retained to pass back up the tableau. However, notice that the following circumstance could occur:  $x1$  is bound in another branch to some non-universal variable  $z$  in some ancestor of  $n$ , say  $x1==z$ , and also to  $x1==a$ , then the reconciled binding  $z==a$  is relevant, since  $z$  occurs in an ancestor of  $n$ . If all reconciliations fail, then no bindings are retained.

A2hiii

## Summary of Slides 9 - 11 (Appendix 2)

1. The KE prover is an alternative to ME with one splitting rule only.
2. The Intermediate Lemma Extension imposes restrictions to reduce the search space, but this is offset by requirement for more subsumption tests.
3. Different unification regimes can be employed in ME tableau, such as "unify-as-you-go", or "unify-at-the-end".
4. The completeness of resolution can be shown using tableaux. No doubt, by controlling the style of tableau formed - e.g. ordering use of clauses in any branch - specific sorts of resolution proofs can be derived.
5. ME tableau are related to linear resolution. The correspondence imposes restrictions on the linear resolution, which is partially relaxed if the generalised closure rule is used.
6. A useful chain notation exists to represent tableau as a list of boxed and unboxed literals.
7. With care ME tableaux can be evaluated in parallel.

A2hiv