

# AI4FM — how to say “why” — in proofs

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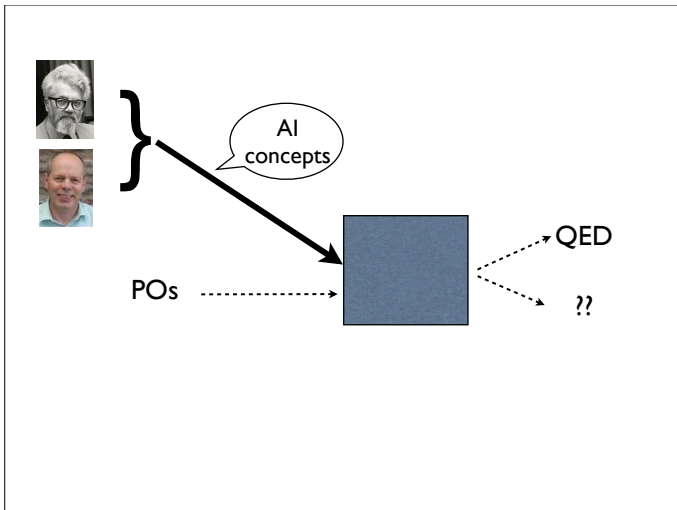
## Observations

- (mine): “formal methods” pay off *during* development
  - *post facto* proof — not a smart way to debug
- (my belated) acceptance that tools are essential
- sadly, full formal reification rarely used in industry
  - (possibly imaginary) data:
  - a development step generates 500 proof obligations
  - of which, 400 discharged automatically
  - ... search, clever heuristics, theories — courtesy of AI
  - discharging 100 POs by engineering staff is not acceptable
  - *but* 5 mini ideas cover the remaining proof tasks!
  - typically, these ideas are specific to the data structures etc.
  - (actually) non-automatic variation: 5%–40%
- idea:
  - **learn the “5 ideas” from an expert; apply to other 95 POs**
  - **accept that this will/may not help with “next 100”**



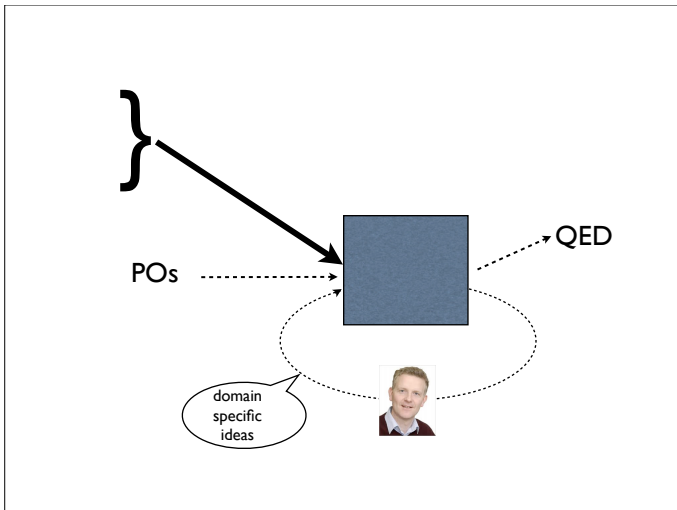
# Approach

Show where “smarts” come in: traditional



# Approach

Show where “smarts” come in: AI4FM



# AI4FM project

## Background

- Alan Bundy
  - noted AI expert — especially on proof
  - e.g. “Rippling” — [BBHI05]
  - J. Moore regularly in Edinburgh: “extracting toy problems”
- Andrew Ireland — Platform Grant with Alan
  - together with: Michael Butler
  - “revise models” proposal (one approach) — unfunded
  - Event-B; Rodin tools
  - complementary to “proof takes the strain” (AI4FM)
- CBJ
  - long-term “pusher” of FMs — posit&prove (e.g. VDM)
  - such methods themselves split the proof process!
  - FDSS; *mural* — [JJLM91]; Rodin tools



# AI4FM project

- EPSRC funded
- research hypothesis:  
*enough information can be learned from one proof within a family to discharge automatically the other POs of that family*
- note: mine proof “process” (rather than finished proofs)
- Newcastle team: CBJ
  - Leo Freitas RA
  - Andrius Velykis PhD student
- Edinburgh team: Alan Bundy
  - Gudmund Grov RA
  - Yuhui Lin PhD student
- kindly supported by:
  - Andrew Ireland
  - Michael Butler
  - recall nice use of background proving in Rodin Tools



# AI4FM project

## Approach

- tactics/tacticals too “brittle”
  - anecdote (J-RA)
  - **one major shortcoming: fail after minor changes**
- striving for abstract *strategies*
  - must be re-usable over (related) tasks
  - we doubt they will be “sequential”
  - “forwards/backwards” dichotomy less of an issue
  - “splitting” is made difficult w/o a metric for “proof difficulty”
  - essence: cut down search space (cf. parallel activity)





# AI4FM project

## Report to date

- archaeology on proofs
- new proofs (with introspection)
- agreed to look at “How to say why”
  - record “intent” rather than details
  - more transferable than steps
  - capture “process”
- examples (next slides)
- theme taken up:
  - nice (internal) notes on this from Alan, Leo, . . .
  - these have certainly influenced what follows
- Leo reads!
  - Lenat’s AM, . . . , Argunet
  - supports what follows



## examples

- typically, want higher level than “case split”
  - “set up induction”
  - operator order mismatch (e.g. distribution needed)
  - try for a normal form
- choice of lemmas — some pro-actively generated
  - “shape” of lemmas — copied twixt theories
- J’s “extract toy problem” as cutting down the search space
- Alan has a whole set from equation solving



## examples of pro-activity (i)

(merging functions/operators)

1) spot similar operators in different theories

$$\text{subp} : \mathbb{Z} \rightarrow \mathbb{Z} \rightarrow \mathbb{Z}$$

$$\text{subp}(i, j) \triangleq \text{if } i = j \text{ then } 0 \text{ else } \text{subp}(i, j + 1) + 1 \text{ fi}$$

2) generate induction rules

$$\boxed{\text{subp-b}} \frac{}{\text{subp}(i, i) = 0}$$

$$\boxed{\text{subp-i}} \frac{\text{subp}(i, j + 1) = k}{\text{subp}(i, j) = k + 1}$$



## examples of pro-activity (ii)

Textbook 1: showing  $rev(rev(s)) = s$  can get “stuck”

but the definition

$$rev : X^* \rightarrow X^*$$

$$rev(s) \triangleq \text{if } s = [] \text{ then } [] \text{ else } rev(\text{tl } s) \overset{\curvearrowright}{\text{hd } s} \text{ fi}$$

3) suggests that there is a need to relate  $rev$  to  $\overset{\curvearrowright}{}$

Textbook 2: recursive functions that use accumulators

4) for these (and others) being pro-active might be better



## My “ $\Sigma$ approach”

- new name — been doing it for decades!
- sketch a state ( $\Sigma$  from habit)
  - quickly pinpoints questions
  - basis for discussion
- *mural* started life as a VDM model
  - ... as have many more studies
- what follows is pretty much a first attempt
  - (although Leo has endured some even rougher versions)
  - it will evolve!
- **what I'm searching for is a *framework* for ideas**
- at this stage:
  - question is how to record these higher level proof views
  - come later to how to learn them



# A basic model

Assume state contains various *Theory*s

$\Sigma :: Id \xrightarrow{m} Theory$

$Theory :: Operator \xrightarrow{m} OpDefn$   
 $Id \xrightarrow{m} Conjecture$

$OpDefn :: Type$   
*Rest?*

$Conjecture :: from: Expr^*$   
 $to: Expr$   
 $justification: Tag \xrightarrow{m} \text{AXIOM} \mid \text{TRUSTED} \mid Attempt$

$Attempt ::$  this is big – contains whole proofs – *mural* like



## Some predicates

$linked : Attempt \times \Sigma \rightarrow \mathbb{B}$

$linked(a, \sigma) \triangleq$

are there links to all required hypotheses?

$complete : Attempt \times \Sigma \rightarrow \mathbb{B}$

$complete(a, \sigma) \triangleq$

do all of the required hypotheses have *justifications*?



# Notes

## Random decisions:

- *Conjecture* was (could be) called *Lemma*
- we might separate AXIOMS from *Conjecture* but there are situations (in revising theories) where “axioms” can also have proofs
- I’ve merged “operators”/“functions” (and use former name)
- the final model should relate *Theorys* in a hierarchy; this could include Larch-like theories such as “collectors”
- *Attempt* could be derived from *mural* book as could predicates that check whether a proof is *linked* and *complete*
- it might be worth changing *linked* to yield the gaps?





# With Why

## Overview of additions

*Theory* :: ...

*Id*  $\xrightarrow{m}$  *Strategy*

*Conjecture* :: ...

*shape*: *MetaType*

*uses*: *Clue-set*

*Clue* :: *why*: *Why*

*evidence*: *Test-set*

*Why* = ...

*Test* :: ...

*Strategy* :: ...



## Combining the above for *Theory/Conjecture*:

*Theory* :: *Operator*  $\xrightarrow{m}$  *OpDefn*

*Id*  $\xrightarrow{m}$  *Conjecture*

*Id*  $\xrightarrow{m}$  *Strategy*

*OpDefn* :: *Type*

*Rest?*

*Conjecture* :: *from*: *Expr*\*

*to*: *Expr*

*justification*: *Tag*  $\xrightarrow{m}$  **AXIOM** | **TRUSTED** | *Attempt*

*shape*: *MetaType*

*uses*: **Clue-set**



## Some detail

*Clue* :: *why*: *Why*  
*evidence*: *Test-set*

*Why* = **NORMALFORM**, CASESPLIT, INDUCTION, REORDEROPERANDS,  
DISTRIBUTEOPERATORS, **MAPTOANOTHERDATATYPE**,  
EQUATIONTRANSFORMS, LRREWR, ...

*Test* :: *predicate*: *Expr*\* × *Expr* × *Conjecture-set* →  $\mathbb{B}$   
*weight*:  $\mathbb{Z}$

*Strategy* :: *needs*: *Why-set*  
*weight*:  $\mathbb{N}$   
*split*: *Conjecture* → *Conjecture-set*  
*combine*: *Conjecture-set* → *Attempt*  
*recovery*: *FailureRecovery-set*



## Some more functions

*analyse*: *Conjecture*  $\rightarrow$  *Diffn*-set

*Diffn* = OPERATORORDER, OPERATORCOMBINATION,  
DIFFERENTOPERATORS, GENERALISE, ...

*is-covered*: *Diffn*  $\times$  *Why*  $\rightarrow$   $\mathbb{B}$

*is-simpler*: *Conjecture*  $\times$  *Conjecture*  $\rightarrow$   $\mathbb{B}$



## Possible scenarios (i)

for any new *OpDefn* (pro-actively):

- combinations of operators will suggest lemmas
- if definition recursive:
  - generate induction rules
  - (simple structural and “course of values”?)
  - spot need for “accumulator” arguments for induction
- sibling *Theorys* could suggest lemmas by analogy
  - cf. *MetaType*
- decide whether to try automatic proof immediately
  - another role for learning
- even if proof fails, keep statement of the putative lemma
- using parallelism/concurrency



## Possible scenarios (ii)

for any *Conjecture*, say  $c$ , (w/o a *complete proof Attempt*):

- check if a *complete* (say  $c'$ ) *Conjecture* matches  $c$
- check if any other (not yet proved) *Conjecture* ( $c''$ ) would discharge  $c$ 
  - weigh up whether to try  $c''$
- use *analyse* to get a *Diffn* set twixt *from/to*
- some *Diffns* readily prompt searching for a *Conjecture* (in the appropriate *Theory*) with a matching *Clue*
  - e.g. OPERATORORDER points to REORDEROPERANDS
- in cases such as GENERALISE, likely that a *Strategy* from the appropriate *Theory* will be of use
- compute *evidence* to decide which avenue to try first
- generate a new *Attempt* — split off new *Conjectures*
  - ... keeping track of where each needed



## Possible scenarios (iii)

All of the above will be steered by the *weights*; which, in turn, will be modified by experience

Notice that search is neither “forwards” nor “backwards”

when an *Attempt* is *complete*:

- both trace back; and
- see if the result is of any use to any other *Attempt*

(of course) POs manifest themselves as (unproven)  
*Conjectures*



## Notes on “why”

- an example of a strategy would be SIMPLEINDUCTION:
  - it might generate three sub-conjectures whose uses are preparation, apply appropriate induction rule, clean up
- the *Clue* set in a *Conjecture* (say  $c$ ) is about how  $c$  might be deployed
  - the *evidence* fields in *Clue* is a pros/cons list
  - we want to “learn” the weightings (which can be negative)
- the *Conjecture*-set (in the domain of *predicate* in *Test*) is there because a strategy might rely on lemmas of a specific *shape* (that might not be present for all *Theory*s)
- the list in *Why* is only indicative to show broad idea
  - it is certainly not a thought through list
  - furthermore, we almost certainly want to allow it to be extended dynamically





## To be done

- the specific examples like RE-ORDER-OPERANDS could all be wrong and at least might be getting too concrete too early — they are there just to hint at what I’m trying to achieve
- *I think* that *Diffn* is not identical to *Why* which is the reason we need *is-covered*
- “operator order”
  - can be expressed in a Lambda calculus style
  - Leo has a nice example that requires side conditions
  - would these fit better in *Conjecture*?
- **we should find a place to put “counter example generators”**
- figure out how to include “extract Toy problem”
  - J. Moore ACL2
  - also show way with (very) large records



## What we are doing *now*

- “how to say why” + “models of why”
- remember — at this stage of AI4FM:
  - think about how to record high-level proof strategies
  - the issue of how to learn them comes next
  - *weights* above are but a small nod to learning!
- *not* aiming at general maths proofs
  - precisely: FM POs
- understand role of “failure” in proof
  - I love the “proof critic” idea (Edinburgh)
  - ... but do wonder if tracking failure is too sequential?
- inclusion of (parallel) “disproving”
- there are many other things that inhibit adoption of FMs:
  - tools themselves (mono-lingual)
  - no one universal method
  - “concept overload”



## More information

- [www.ai4fm.org](http://www.ai4fm.org)
- open mailing list: [ai4fm-info@jiscmail.ac.uk](mailto:ai4fm-info@jiscmail.ac.uk)
- open meetings (next in Edinburgh 2010-04-28/29)
- Rippling — see [BBHI05]
- *mural* — see [JJLM91]
- AI4FM itself — see [JGB10, FJ10]





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