# First-Order Interpolation 

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CHALMERS

- Interpolation: Craig Interpolation


## - Use of interpolation in software verification thanks to K. McMillan

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## Interpolation in Software Verification

while $(c<N)$ do

$$
C[c]:=D[d] ;
$$

$$
c:=c+1
$$

$$
d:=d+1
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od

## Interpolation in Software Verification

$\{c=d=0 \wedge N>0 \wedge(\forall k)(0 \leq k<N \rightarrow D[k]=0)\} \quad$ precondition $R(c, d)$
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Loop Invariant?
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Reachability of $B$ in ONE iteration: $R(c, d) \wedge T\left(c, d, c^{\prime}, d^{\prime}\right) \wedge c^{\prime} \geq N \rightarrow B\left(c^{\prime}, d^{\prime}\right)$
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Refutation: $R(c, d) \wedge T\left(c, d, c^{\prime}, d^{\prime}\right) \wedge c^{\prime} \geq N \wedge \neg B\left(c^{\prime}, d^{\prime}\right)$

- The formula is of 2 states $\left(c, d, c^{\prime}, d^{\prime}\right)$.


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- The formula is of 2 states ( $c, d, c^{\prime}, d^{\prime}$ ).
- Need a state formula I( $\left.c^{\prime}, d^{\prime}\right)$ such that: (Jhala and McMillan)
$R(c, d) \wedge T\left(c, d, c^{\prime}, d^{\prime}\right) \wedge c^{\prime} \geq N \rightarrow I\left(c^{\prime}, d^{\prime}\right) \quad$ and $\quad I\left(c^{\prime}, d^{\prime}\right) \wedge \neg B\left(c^{\prime}, d^{\prime}\right) \rightarrow \perp$


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Task: Compute interpolant $I\left(c^{\prime}, d^{\prime}\right)$ from refutation by eliminating symbols $c, d$.


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$$
I\left(c^{\prime}, d^{\prime}\right) \equiv 0<c^{\prime}=1 \wedge C[0]=D[0]
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Task: Compute interpolant $I\left(c^{\prime}, d^{\prime}\right)$ from refutation by eliminating symbols $c, d$.

## Interpolation in Software Verification

Reachability of $B$ in TWO iterations
$\{c=d=0 \wedge N>0 \wedge(\forall k)(0 \leq k<N \rightarrow D[k]=0)\} \quad$ precondition $R(c, d)$
while $(c<N)$ do
$C[c]:=D[d] ;$
$c:=c+1$;
$d:=d+1$
od
$\{(\forall k)(0 \leq k<N \rightarrow C[k]=0)\} \quad$ postcondition $B\left(c^{\prime}, d^{\prime}\right)$

$$
\begin{aligned}
& I\left(c^{\prime}, d^{\prime}\right) \equiv 0<c^{\prime}=1 \wedge C[0]=D[0] \\
& I\left(c^{\prime \prime}, d^{\prime \prime}\right) \equiv 0<c^{\prime \prime}=2 \wedge C[0]=D[0] \wedge C[1]=D[1]
\end{aligned}
$$

Task: Compute interpolant $/\left(c^{\prime \prime}, d^{\prime \prime}\right)$ from refutation by eliminating $c, d, c^{\prime}, d^{\prime}$.

## Interpolation in Software Verification

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$\{(\forall k)(0 \leq k<N \rightarrow C[k]=0)\} \quad$ postcondition $B\left(c^{\prime}, d^{\prime}\right)$

$$
\begin{aligned}
& I\left(c^{\prime}, d^{\prime}\right) \equiv(\forall k) 0 \leq k<c^{\prime} \rightarrow C[k]=D[k] \\
& I\left(c^{\prime \prime}, d^{\prime \prime}\right) \equiv(\forall k) 0 \leq k<c^{\prime \prime} \rightarrow C[k]=D[k]
\end{aligned}
$$

Task: Compute interpolant $/\left(c^{\prime \prime}, d^{\prime \prime}\right)$ implying invariant in any state.

## Interpolation in Software Verification

## Tasks:

- Proving: Refute reachability properties
- Extracting: Compute interpolants from proofs


## Outline

Interpolation and Local Proofs

## Localizing Proofs

## Minimizing Interpolants

## Quantifier Complexity of Interpolants

## Interpolation

## Theorem

Let $R, B$ be closed formulas and let $R \vdash B$.
Then there exists a formula I such that

1. $R \vdash I$ and $I \vdash B$;
2. every symbol of I occurs both in $R$ and $B$;

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Any formula / with this property is called an interpolant of $R$ and $B$.
Essentially, an interpolant is a formula that is

1. intermediate in power between $R$ and $B$;
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1. intermediate in power between $R$ and $B$;
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When we deal with refutations rather than proofs and have an unsatisfiable set $\{R, B\}$, it is convenient to use reverse interpolants of
$R$ and $B$, that is, a formula / such that

1. $R \vdash I$ and $\{I, B\}$ is unsatisfiable;
2. every symbol of $/$ occurs both in $R$ and $B$;

## Interpolation Through Colors

- There are three colors: red, blue and grey.


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- Each symbol (function or predicate) is colored in exactly one of these colors.
- We have two formulas: $R$ and $B$.
- Each symbol in $R$ is either red or grey.
- Each symbol in $B$ is either blue or grey.
- We know that $\vdash R \rightarrow B$.
- Our goal is to find a grey formula / such that:

1. $\vdash R \rightarrow /$;
2. $\vdash I \rightarrow B$.

## Interpolation with Theories

- Theory $T$ : any set of closed green formulas.
- $C_{1}, \ldots, C_{n} \vdash_{T} C$ denotes that the formula $C_{1} \wedge \ldots \wedge C_{1} \rightarrow C$ holds in all models of $T$.
- Interpreted symbols: symbols occurring in $T$.
- Uninterpreted symbols: all other symbols.


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- Interpreted symbols: symbols occurring in $T$.
- Uninterpreted symbols: all other symbols.


## Theorem

Let $R, B$ be formulas and let $R \vdash_{T} B$.
Then there exists a formula I such that

1. $R \vdash_{T} I$ and $I \vdash B$;
2. every uninterpreted symbol of I occurs both in $R$ and $B$;
3. every interpreted symbol of I occurs in B.

Likewise, there exists a formula I such that

1. $R \vdash I$ and $I \vdash_{T} B$;
2. every uninterpreted symbol of I occurs both in $R$ and $B$;
3. every interpreted symbol of I occurs in R.

## Local Derivations

A derivation is called local (well-colored) if each inference in it

either has no blue symbols or has no red symbols.
That is, one cannot mix blue and red in the same inference.

## Local Derivations: Example

- $R:=\forall x(x=a)$
- $B:=c=b$
- Interpolant: $\forall x \forall y(x=y)$ (note: universally quantified!)


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Non-local proof

$$
\frac{\frac{x=a}{c=a} \quad \frac{x=a}{b=a}}{\frac{c=b}{\perp}} \quad c \neq b
$$

## Local Derivations: Example

- $R:=\forall x(x=a)$
- $B:=c=b$
- Interpolant: $\forall x \forall y(x=y)$ (note: universally quantified!)

| Non-local proof |  |
| :--- | :--- | :--- |
| $\frac{x=a}{c=a}$ <br> $\frac{c=b}{b=a}$ <br> $\perp$ | $c \neq b$ |$\quad$| Local Proof |
| :--- |
| $\frac{x=a \quad y=a}{\frac{x=y}{b=b}} \quad c \neq b$ |
| $\frac{y \neq b}{\perp}$ |

## Shape of a local derivation



## Symbol Eliminating Inference

- At least one of the premises is not grey.
- The conclusion is grey.

$$
\frac{\frac{x=a \quad y=\boldsymbol{a}}{x=y} \quad c \neq b}{\frac{y \neq b}{\perp}}
$$

## Extracting Interpolants from Local Proofs



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[McMillan05, KV09]

## Extracting Interpolants from Local Proofs



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## Theorem

Let $\Pi$ be a local refutation. Then one can extract from $\Pi$ in linear time a reverse interpolant I of $R$ and $B$. This interpolant is ground if all formulas in $\Pi$ are ground.

## Extracting Interpolants from Local Proofs

## Theorem

Let $\Pi$ be a local refutation. Then one can extract from $\Pi$ in linear time a reverse interpolant I of $R$ and $B$. This interpolant is ground if all formulas in $\Pi$ are ground. This reverse interpolant is a boolean combination of conclusions of symbol-eliminating inferences of $\Pi$.

## Extracting Interpolants from Local Proofs

## Theorem

Let $\Pi$ be a local refutation. Then one can extract from $\square$ in linear time a reverse interpolant I of $R$ and $B$. This interpolant is ground if all formulas in $\Pi$ are ground. This reverse interpolant is a boolean combination of conclusions of symbol-eliminating inferences of $\Pi$.
What is remarkable in this theorem:

- No restriction on the calculus (only soundness required) - can be used with theories.
- Can generate interpolants in theories where no good interpolation algorithms exist.


## Interpolation: Examples in Vampire

Our running example:

Local proof and interpolant: vampire interpoli.p

Non-local proof: vampire interpol2.p

## What is Vampire?

An automated theorem prover for first-order logic and theories.
https://vprover.github.io/download.html

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- Completely automatic: once you started a proof attempt, it can only be interrupted by terminating the process.


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> https://vprover.github.io/download.html

- Completely automatic: once you started a proof attempt, it can only be interrupted by terminating the process.
- Champion of the CASC world-cup in first-order theorem proving: won CASC $>45$ times.



## Vampire:

$\triangleright$ It produces detailed proofs but also supports finding finite models
$\triangleright$ In normal operation it is saturation-based - it saturates a clausal form with respect to an inference system
$\triangleright$ It is portfolio-based - it works best when you allow it to try lots of strategies
$\triangleright$ It supports lots of extra features and options

## Vampire:

$\triangleright$ It produces detailed proofs but also supports finding finite models
$\triangleright$ It competes with SMT solvers on their problems (thanks to our FOOL logic and AVATAR)
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$\triangleright$ It is portfolio-based - it works best when you allow it to try lots of strategies
$\triangleright$ It supports lots of extra features and options helpful for program analysis by symbol elimination

## Interpolation: Examples in Vampire

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Local proof and interpolant: vampire interpoli.p

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## Interpolation: Examples in Vampire

```
fof(fA, axiom, q(f(a)) & ~q(f(b)) ).
fof(fB,conjecture, ?[V]: V != c).
```

Non-local proof: vampire interpol4.p

## Interpolation: Examples in Vampire

```
% request to generate an interpolant
vampire(option,show_interpolant,on).
% symbol coloring
vampire(symbol,predicate,q,1,left).
vampire(symbol,function,f,1,left).
vampire(symbol,function,a,0,left).
vampire(symbol,function,b,0,left).
vampire(symbol,function, c,0,right).
% formula R
vampire(left_formula).
    fof(fA,axiom, q(f(a)) & ~q(f(b)) ).
vampire(end_formula).
% formula B
vampire(right_formula).
    fof(fB,conjecture, ?[V]: V != c).
vampire(end_formula).
```

Local proof and interpolant: vampire interpol3.p

## Outline

# Interpolation and Local Proofs 

Localizing Proofs

## Minimizing Interpolants

## Quantifier Complexity of Interpolants

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Task: eliminate non-local inferences

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Idea: quantify away colored symbols
colored symbols replaced by logical variables.

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Given $R(a) \vdash B$ where $a$ is an uninterpreted constant not occurring in $B$.
Then, $R(a) \vdash(\exists x) R(x)$ and $(\exists x) R(x) \vdash B$.

## Localizing Proofs

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$$
\frac{\frac{R_{1}(a)}{R_{2}(a)}}{A} \quad B \quad \frac{\frac{R_{1}(a)}{(\exists x) R_{2}(x)} B}{A}
$$

## Localizing Proofs

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Idea: quantify away colored symbols
colored symbols replaced by logical variables.
Cons: Comes at the cost of using extra quantifiers.

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## Localizing Proofs

Task: eliminate non-local inferences
Idea: quantify away colored symbols
colored symbols replaced by logical variables.
Cons: Comes at the cost of using extra quantifiers.
But we can minimise the number of quantifiers in the interpolant.

Given $R(a) \vdash B$ where $a$ is an uninterpreted constant not occurring in $B$.
Then, $R(a) \vdash(\exists x) R(x)$ and $(\exists x) R(x) \vdash B$.

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\frac{\frac{R_{1}(a)}{R_{2}(a)}}{A} \quad B \quad \frac{\frac{R_{1}(a)}{(\exists x) R_{2}(x)} B}{A}
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## Outline

Interpolation and Local Proofs<br>Localizing Proofs

Minimizing Interpolants

## Quantifier Complexity of Interpolants

## Minimizing Interpolants

## Our Interest: Small Interpolants

- in size;
- in weight;
- in the number of quantifiers;
- ...


## Minimizing Interpolants

## Our Interest: Small Interpolants

- in size;
- in weight;
- in the number of quantifiers;
- ...

$$
\begin{aligned}
\text { Given } & \vdash R \rightarrow B \text {, find a grey formula } /: \\
& . \vdash R \rightarrow I ; \\
& . \vdash I \rightarrow B ; \\
& . / \text { is small. }
\end{aligned}
$$

## Minimizing Interpolant

Task: minimise interpolants = minimise digest

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Hercule Poirot:
It is the little GREY CELLS, mon ami, on which one must rely.
Mon Dieu, mon ami, but use your little GREY CEL-Ls!

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If $A$ is grey: Grey slicing

## Minimizing Interpolant

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Idea: Change the grey areas of the local proof
Slicing off formulas

$$
\frac{B_{0} \frac{R_{0}}{G_{1}}}{G_{0}}
$$

slicing off $G_{1}$

$$
\frac{B_{0} \quad R_{0}}{G_{0}}
$$

## Minimizing Interpolant

Task: minimise interpolants = minimise digest
Idea: Change the grey areas of the local proof, but preserve locality!
Slicing off formulas

$$
\frac{B_{0} \frac{R_{0}}{G_{1}}}{G_{0}}
$$

slicing off $G_{1}$

$$
\frac{B_{0} \quad R_{0}}{G_{0}}
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## Minimizing Interpolant



## Minimizing Interpolant



Digest: $\left\{G_{4}, G_{7}\right\}$
Reverse interpolant: $G_{4} \rightarrow G_{7}$

## Minimizing Interpolant



## Minimizing Interpolant



Digest: $\left\{G_{5}, G_{7}\right\}$
Reverse interpolant: $G_{5} \rightarrow G_{7}$

## Minimizing Interpolant

$$
\frac{R_{1} G_{1}}{G_{3}} \quad B_{1} G_{2}
$$

$$
\frac{R_{3} \quad \overline{G_{6}}}{\frac{R_{4}}{\frac{G_{7}}{\perp}}}
$$

## Minimizing Interpolant

$$
\frac{R_{1} \quad G_{1}}{G_{3}} \quad B_{1} G_{2}
$$

$$
\frac{R_{3} \quad \overline{G_{6}}}{\frac{R_{4}}{\frac{G_{7}}{\perp}}}
$$

Digest: $\left\{G_{6}, G_{7}\right\}$
Reverse interpolant: $G_{6} \rightarrow G_{7}$

## Minimizing Interpolant

$$
\frac{R_{1} \quad G_{1}}{\underline{G_{3}}} \quad \underline{B_{1} \quad G_{2}}
$$

$$
\frac{R_{3}}{} \begin{array}{ll}
\underline{G_{6}} \\
& \underline{R_{4}} \\
\hline
\end{array}
$$

## Minimizing Interpolant

$$
\frac{R_{1} \quad G_{1}}{G_{3}} \quad B_{1} G_{2}
$$

$$
\frac{R_{3} \quad \overline{G_{6}}}{\underline{R}_{4}}
$$

$$
\bar{\perp}
$$

Digest: $\left\{G_{6}\right\}$
Reverse interpolant: $\neg G_{6}$

## Minimizing Interpolant



Note that the interpolant has changed from $G_{4} \rightarrow G_{7}$ to $\neg G_{6}$.

## Minimizing Interpolant



Note that the interpolant has changed from $G_{4} \rightarrow G_{7}$ to $\neg G_{6}$.

- There is no obvious logical relation between $G_{4} \rightarrow G_{7}$ and $\neg G_{6}$, for example none of these formulas implies the other one;
- These formulas may even have no common atoms or no common symbols.


## Minimizing Interpolant

If grey slicing gives us very different interpolants, we can use it for finding small interpolants.

Problem: if the proof contains $n$ grey formulas, the number of possible different slicing off transformations is $2^{n}$.

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Solution:

- encode all sequences of transformations as an instance of SAT


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\frac{\frac{R}{G_{1}} \frac{B}{G_{2}}}{G_{3}}
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## Minimizing Interpolant

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$G_{3}$, and at most one of $G_{1}, G_{2}$ can be sliced off.

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Some predicates on grey formulas:

- sliced( $G$ ): $G$ was sliced off;
- $\operatorname{red}(G)$ : the trace of $G$ contains a red formula;
- blue( $G$ ): the trace of $G$ contains a blue formula;
- grey $(G)$ : the trace of $G$ contains only grey formulas;
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$\mathrm{rc}(G) / \mathrm{bc}(G)$
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- Implemented in Vampire;
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## Outline

## Interpolation and Local Proofs

## Localizing Proofs

## Minimizing Interpolants

Quantifier Complexity of Interpolants

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## Local Proofs Do Not Always Exist

- R: $(\forall x) p(r, x)$
- B: $(\forall y) \neg p(y, b)$
- Reverse interpolant $I$ of $R$ and $B:(\exists y)(\forall x) p(y, x)$.
$\rightarrow$ Note: $R$ and $B$ contain no quantifier alternations, yet $/$ contains ouantifier alternations. One can orove that everv interoolant of this formula must have at least one quantifier alternation.
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$$
\frac{p(r, x) \quad \neg p(y, b)}{\perp}
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## Quantifier Complexity of Interpolants

Theorem There is no lower bound on the number of quantifier alternations in interpolants of universal sentences.

That is, for every positive integer $n$ there exist universal sentences $R, B$ such that $\{R, B\}$ is unsatisfiable and every reverse interpolant of $R$ and $B$ has at least $n$ quantifier alternations.

## Quantifier Complexity of Interpolants

## Example

Take the formula $A$ : $\forall x_{1} \exists y_{1} \forall x_{1} \exists y_{2} \ldots p\left(x_{1}, y_{1}, x_{2}, y_{2}, \ldots\right)$ and let $R$ be obtained by skolemizing $A$ and $B$ be obtained by skolemizing $\neg A$ :

$$
\begin{aligned}
R & =\forall x_{1} \forall x_{2} \ldots p\left(x_{1}, r_{1}\left(x_{1}\right), x_{2}, r_{2}\left(x_{1}, x_{2}\right), \ldots\right) \\
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The resolution refutation consists of a single step deriving the empty clause from $R$ and $B$.

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## Quantifier Complexity of Interpolants

## Bad News for Local Proof Systems

Let $S$ be an inference system with the following property: for every red formula $R$ and blue formula $B$, if $\{R, B\}$ is unsatisfiable, then there is a local refutation of $R, B$ in $S$.

Then the number of quantifier alternations in refutations of universal formulas of $S$ is not bound by any positive integer.

## Quantifier Complexity of Interpolants

- There is no bound on the number of quantifier alternations in reverse interpolants of universal formulas.


There is no simple modification of the superposition calculus for Iogic with/without equality in which everv unsatisfiable formula has a local refutation.

## Quantifier Complexity of Interpolants

- There is no bound on the number of quantifier alternations in reverse interpolants of universal formulas.
- Any complete local proof system for first-order predicate logic must have inferences dealing with formulas of an arbitrary quantifier complexity, even if the input formulas have no quantifier alternations.
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