

# Term Indexing for the Beagle Theorem Prover

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COMP4006 Honours Research Project

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October 11, 2013

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- Beagle is a First-Order-Logic resolution theorem prover with equality.

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- Makes use of modular 'Background Theories' to make efficient use of known facts.

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- Beagle is a First-Order-Logic resolution theorem prover with equality.
- Makes use of modular 'Background Theories' to make efficient use of known facts.
- This requires the carefully constructed 'Hierarchic Superposition with Weak Abstraction Calculus' in order to ensure consistency and completeness.

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- Beagle is a First-Order-Logic resolution theorem prover with equality.
- Makes use of modular 'Background Theories' to make efficient use of known facts.
- This requires the carefully constructed 'Hierarchic Superposition with Weak Abstraction Calculus' in order to ensure consistency and completeness.
- Has been extended with term indexing to efficiently locate clauses which match the calculus resolution rules.

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- Term indexers aim to collect all FOL terms which potentially match a ‘query’ term.
- Three important relations:

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- Term indexers aim to collect all FOL terms which potentially match a 'query' term.
- Three important relations:
  - 'Unifiable':  $\sigma s = \sigma t$
  - 'Instance Of':  $s = \sigma t$
  - 'Generalises':  $\sigma s = t$



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- Term indexers aim to collect all FOL terms which potentially match a 'query' term.
- Three important relations:
  - 'Unifiable':  $\sigma s = \sigma t$
  - 'Instance Of':  $s = \sigma t$
  - 'Generalises':  $\sigma s = t$
- Top-Symbol Hashing.
- Discriminant Trees.

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- Maintain a collection of *fingerprints* for terms.

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- Maintain a collection of *fingerprints* for terms.
- A term fingerprint is an array over  $F \cup \{\mathbf{A}, \mathbf{B}, \mathbf{N}\}$ .

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- Maintain a collection of *fingerprints* for terms.
- A term fingerprint is an array over  $F \cup \{\mathbf{A}, \mathbf{B}, \mathbf{N}\}$ .

Unification					
	$f_1$	$f_2$	A	B	N
$f_1$	Y	N	Y	Y	N
$f_2$	N	Y	Y	Y	N
A	Y	Y	Y	Y	N
B	Y	Y	Y	Y	Y
N	N	N	N	Y	Y

Matching					
	$f_1$	$f_2$	A	B	N
$f_1$	Y	N	N	N	N
$f_2$	N	Y	N	N	N
A	Y	Y	Y	N	N
B	Y	Y	Y	Y	Y
N	N	N	N	N	Y

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Unification					
	$f_1$	$f_2$	<b>A</b>	<b>B</b>	<b>N</b>
$f_1$	Y	N	Y	Y	N
$f_2$	N	Y	Y	Y	N
<b>A</b>	Y	Y	Y	Y	N
<b>B</b>	Y	Y	Y	Y	Y
<b>N</b>	N	N	N	Y	Y

Matching					
	$f_1$	$f_2$	<b>A</b>	<b>B</b>	<b>N</b>
$f_1$	Y	N	N	N	N
$f_2$	N	Y	N	N	N
<b>A</b>	Y	Y	Y	N	N
<b>B</b>	Y	Y	Y	Y	Y
<b>N</b>	N	N	N	N	Y

- 
- Schulz, Stephan: Fingerprint Indexing for Paramodulation and Rewriting.  
In: Lecture Notes in Computer Science volume 7364 pp. 447–483 (2012).

# Fingerprint Indexing – Potential Performance

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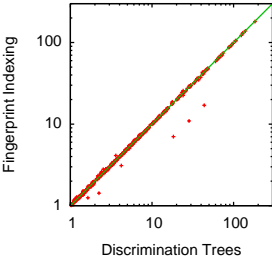
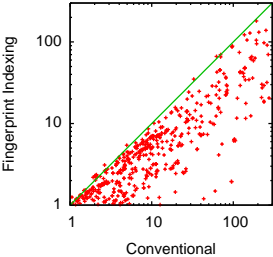
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Index	Run time	Sat time	PM time	PMI time	MGU time	BR time	BRI time
Noldx	16062.392	14078.300	8980.320	0.000	2545.080	2280.250	0.000
FP1	7006.758	6145.870	1816.100	25.710	450.760	379.570	40.150
FP6M	6000.177	5385.810	1181.710	38.240	99.110	39.010	55.660
NPDT	6082.246	5434.760	1184.750	64.910	83.110	33.200	79.910



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- Beagle has been extended with a baseline implementation of Fingerprint Indexing.

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- Beagle has been extended with a baseline implementation of Fingerprint Indexing.
- Required significant modification to current implementation (code refactoring and additional pointer structures).



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- Beagle has been extended with a baseline implementation of Fingerprint Indexing.
- Required significant modification to current implementation (code refactoring and additional pointer structures).
- Operates on Beagle's most costly inference rule, superposition:

$$\frac{l \approx r \vee C \quad s[u] \approx t \vee D}{\text{abstr}((s[r] \approx t \vee C \vee D)\sigma)}$$

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- Still some issues causing excessive generation.

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- Still some issues causing excessive generation.
- Speed results promising.

# Fingerprint Indexing for the Hierarchic Superposition with Weak Abstraction Calculus

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# Fingerprint Indexing for the Hierarchic Superposition with Weak Abstraction Calculus

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- Main improvement is to consider Beagle’s *foreground* and *background* terms.

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- Main improvement is to consider Beagle’s *foreground* and *background* terms.
- Furthermore indexing may be applied to more of HSWA’s inference rules; in particular simplification.

# Fingerprint Indexing for the Hierarchic Superposition with Weak Abstraction Calculus

- As mentioned, current implementation is somewhat ‘naïve’.
- Fingerprint indexing could be greatly improved by tailoring it specifically to Beagle’s FOL calculus.
- Main improvement is to consider Beagle’s *foreground* and *background* terms.
- Furthermore indexing may be applied to more of HSWA’s inference rules; in particular simplification.
- These extensions will not require so much modification; as the fingerprint indexing framework is already built.

# Other Potential Indexing Improvements

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- An additional goal of the project is to consider how Fingerprint Indexing could be improved upon more generally.



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- An additional goal of the project is to consider how Fingerprint Indexing could be improved upon more generally.
- The main area to consider here is the sampling positions. Sampling many positions reduces the returned sets, but increases indexing overhead.

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- An additional goal of the project is to consider how Fingerprint Indexing could be improved upon more generally.
- The main area to consider here is the sampling positions. Sampling many positions reduces the returned sets, but increases indexing overhead.
- Large problems better suit indexing; but it is difficult to know ahead of time what a 'large' problem is.

# Metrics for Analysing Indexing Performance

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- Speed - Not necessarily relevant

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- Speed - Not necessarily relevant
- False Positives - Relevant, but can be misleading depending on number of positions being sampled.

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- Speed - Not necessarily relevant
- False Positives - Relevant, but can be misleading depending on number of positions being sampled.
- Time Spent *per Inference* - Booyah

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- Un-indexed beagle.

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- Un-indexed beagle.
- Minimal Indexing.

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- Un-indexed beagle.
- Minimal Indexing.
- Full Indexing.



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- Un-indexed beagle.
- Minimal Indexing.
- Full Indexing.
- Indexing with Optimisations.

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- Reasoning. Cite shulz and FP/Speed balance

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- Different position samples

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