

# Reusing the Assignment Trail in CDCL Solvers

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# Overview

- CDCL Solver & VSIDS
- Motivation
- ReusedTrail
- Results & Observations
- Conclusion

# CDCL Solver

<b>trail</b>												
<b>level</b>												
<b>score</b>												
RSL												

VSIDS order:

*x5, x2, x13, x9, x3, x14, x1, x7, x12, x4, x10, x6, x8, x11*

decided, implied, *unassigned*

# CDCL Solver

<b>trail</b>	<u>x5</u>													
<b>level</b>	1													
<b>score</b>	93.5													
RSL														

VSIDS order:

x5, x2, x13, x9, x3, x14, x1, x7, x12, x4, x10, x6, x8, x11

decided, implied, *unassigned*

# CDCL Solver

<b>trail</b>	<u>x5</u>	<u>x2</u>	x11								
<b>level</b>	1	2									
<b>score</b>	93.5	88.2	15.9								
RSL											

VSIDS order:

x5, x2, *x13*, *x9*, *x3*, *x14*, *x1*, *x7*, *x12*, *x4*, *x10*, *x6*, *x8*, *x11*

decided, *implied*, *unassigned*

# CDCL Solver

<b>trail</b>	<u>x5</u>	<u>x2</u>	x11	<u>x13</u>	<u>x9</u>	x4	<u>x3</u>	x14	x8	<u>x1</u>	x12
<b>level</b>	1	2		3	4		5			6	
<b>score</b>	93.5	88.2	15.9	81.2	75.4	44.0	63.9	62.8	27.7	38.1	44.1
RSL									BJL		

conflict

VSIDS order:

x5, x2, x13, x9, x3, x14, x1, x7, x12, x4, x10, x6, x8, x11

decided, implied, *unassigned*

# VSIDS

When a conflict occurs:

- The solver analyses the conflicting clause and reason clauses
- Learns a conflict clause
- Increments scores of all variables in the conflict clause
- Multiplies (decays) variables by  $\delta$  (VSIDS decay factor)
- Jumps to the highest level at which the conflict clause is unit backjump level (BJL)

# CDCL Solver

<b>trail</b>	<u>x5</u>	<u>x2</u>	x11	<u>x13</u>	<u>x9</u>	x4	<u>x3</u>	x14	x8	<u>x1</u>	x12
<b>level</b>	1	2		3	4		5			6	
<b>score</b>	93.5	88.2	15.9	81.2	75.4	44.0	63.9	62.8	27.7	38.1	44.1
RSL											

conflict

VSIDS order:

x5, x2, x13, x9, x3, x14, x1, x7, x12, x4, x10, x6, x8, x11

decided, implied, *unassigned*

# CDCL Solver

<b>trail</b>												
<b>level</b>												
<b>score</b>												
RSL												

VSIDS order:

*x5, x2, x13, x9, x3, x14, x1, x7, x12, x4, x10, x8, x6, x11*

decided, implied, *unassigned*

# Motivation

- Frequent restarts lead to fewer conflicts
- But restarts are costly, solving time may increase
- VSIDS remains similar between frequent restarts
- Phase saving ensures that assignments will have equal values

# Example

<b>trail</b>	<u>x5</u>	<u>x2</u>	x11	<u>x9</u>	<u>x13</u>	x4	<u>x14</u>	x8	<u>x1</u>	<u>x6</u>	x3
<b>level</b>	1	2		3	4		5		6	7	
<b>score</b>	93.5	88.2	15.9	75.4	81.2	44.0	62.8	27.7	53.6	38.1	63.9
RSL											BJL

VSIDS order:

x5, x2, x13, x9, x3, x14, x1, x7, x12, x4, x10, x6, x8, x11

decided, implied, *unassigned*

# Example (MatchingTrail)

<b>trail</b>	<u>x5</u>	<u>x2</u>	x11	<u>x9</u>	<u>x13</u>	x4	<u>x14</u>	x8	<u>x1</u>	<u>x6</u>	x3
<b>level</b>	1	2		3	4		5		6	7	
<b>score</b>	93.5	88.2	15.9	75.4	81.2	44.0	62.8	27.7	53.6	38.1	63.9
RSL	/		MTL								BJL

VSIDS order:

x5, x2, x13, x9, x3, x14, x1, x7, x12, x4, x10, x6, x8, x11

decided, implied, *unassigned*

# Example (PermutedTrail)

<b>trail</b>	<u>x5</u>	<u>x2</u>	x11	<u>x9</u>	<u>x13</u>	x4	<u>x14</u>	x8	<u>x1</u>	<u>x6</u>	x3
<b>level</b>	1	2		3	4		5		6	7	
<b>score</b>	93.5	88.2	15.9	75.4	81.2	44.0	62.8	27.7	53.6	38.1	63.9
RSL			MTL			PTL					BJL

VSIDS order:

x5, x2, x13, x9, x3, x14, x1, x7, x12, x4, x10, x6, x8, x11

decided, implied, *unassigned*

# Example (ReusedTrail)

<b>trail</b>	<u>x5</u>	<u>x2</u>	x11	<u>x9</u>	<u>x13</u>	x4	<u>x14</u>	x8	<u>x1</u>	<u>x6</u>	<u>x3</u>
<b>level</b>	1	2		3	4		5		6	7	
<b>score</b>	93.5	88.2	15.9	75.4	81.2	44.0	62.8	27.7	53.6	38.1	63.9
RSL			MTL			PTI			RTI		BJL

VSIDS order:

x5, x2, x13, x9, x3, x14, x1, x7, x12, x4, x10, x6, x8, x11

decided, implied, *unassigned*

# Algorithm

**forever do**

**if** OrderHeap.empty() **then return** BackjumpLevel

$x_{\text{next}} := \text{OrderHeap.remove}()$

**if** AssignmentType[ $x_{\text{next}}$ ] = Unassigned **then break**

    OrderHeap.insert( $x_{\text{next}}$ )

**for**  $i := 1$  **to** BackjumpLevel **do**

**if** Activity[DecisionVar[ $i$ ]] < Activity[ $x_{\text{next}}$ ] **then return**  $i - 1$

**return** BackjumpLevel

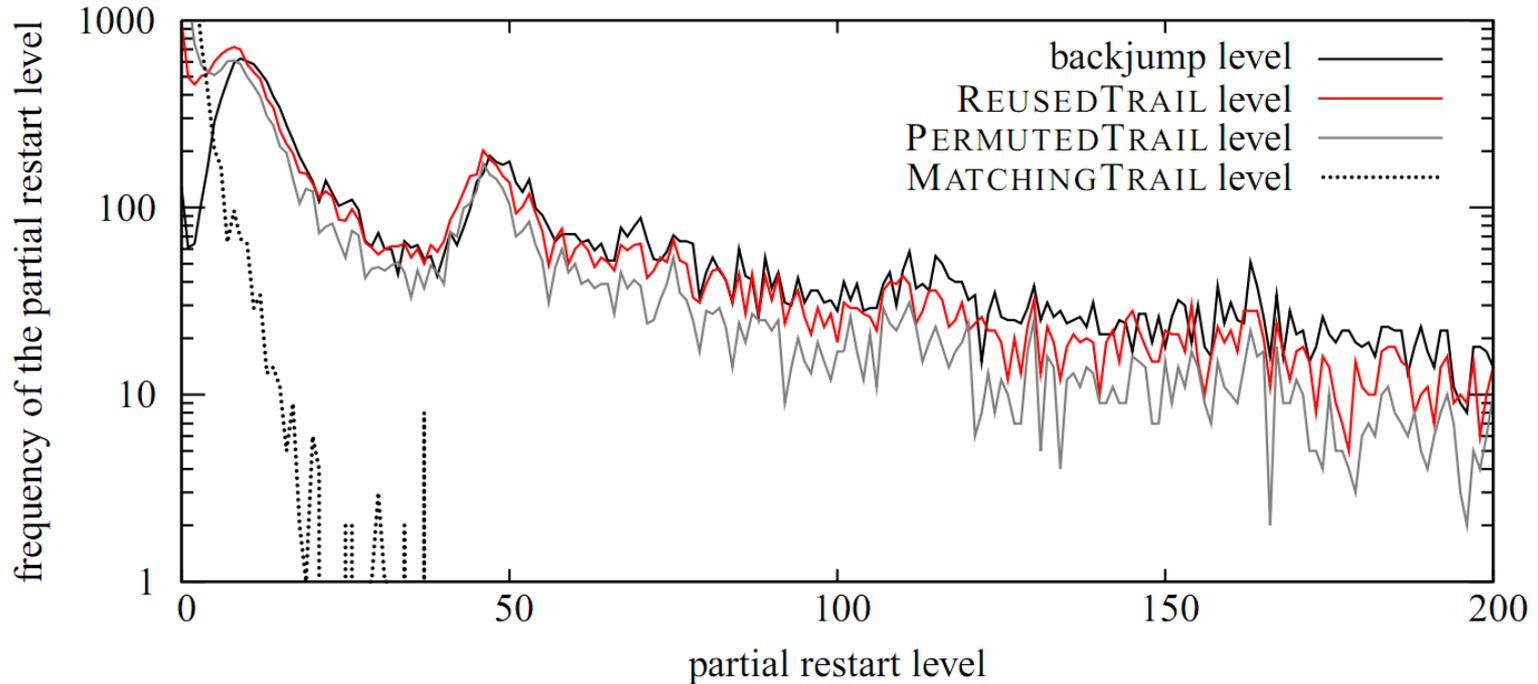
# Approach

- Exploiting similarity before and after a restart
- Backtrack to RTL instead of RSL
- This retains the effect of a restart

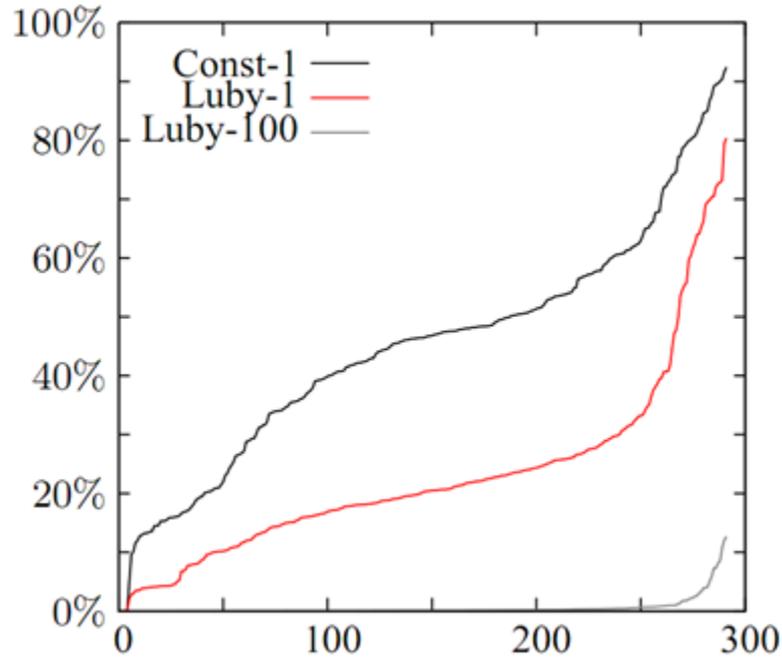
# Results

- Implemented in MiniSAT 2.2
- Consider Const-1, Luby-1, and Luby-100
- Determine the amount of work saved by ReusedTrail
- Count the number of extra instances solved

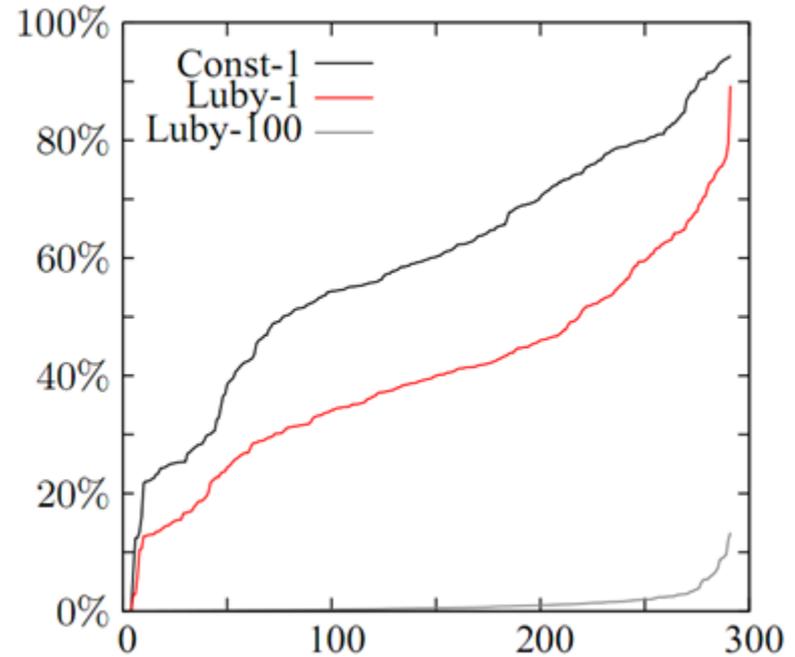
# Results (Frequencies)



# Results (Savings)



Propagations



Decisions

# Results (Solved instances)

Number of instances solved within 1200 seconds  
(out of all 292 application instances of the SAT 2009 competition)

	No RT	RT	RT
	$\delta = 0.95$	$\delta = 0.95$	$\delta = 0.75$
Const-1	147	163	169
Luby-1	168	174	185
Luby-100	170	172	176

$\delta =$  VSIDS decay factor

# Observations

- More radical restarts become more efficient
- The optimal VSIDS decay value becomes smaller
- Reason clauses may become different

# Conclusion

- ReusedTrail significantly reduces restart costs
- This allows more radical restart strategies to perform better
- Easy to implement in most CDCL solvers

Thank you!

# Reusing the Assignment Trail in CDCL Solvers

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Code available from: <http://www.st.ewi.tudelft.nl/sat/download.php>