

---

# Combining Parallel and Distributed Search in Automated Equational Deduction

Carsten Sinz, Jörg Denzinger,  
Jürgen Avenhaus and Wolfgang Küchlin

PPAM 2001

---

## Outline of Talk

- Unfailing completion procedure
- Parallelization and distribution schemes
- Fine-grained parallelization: PaReDuX
- Distributed cooperating agents: TEAMWORK
- Combination of both approaches: TEAMWORK-PaReDuX
- Experimental results
- Conclusions

---

## Unfailing Completion

- Calculus for equational reasoning by Bachmair, Dershowitz and Plaisted (1989)
- Basic objects: *equations*  $s \leftrightarrow t$  and *rewrite rules*  $l \rightarrow r$
- Basic inference rule: *replace equals by equals*

Example:  $\mathcal{E} = \{f(x, y) \leftrightarrow f(y, x)\}$

$\mathcal{R} = \{f(x, n) \rightarrow x, f(x, i(x)) \rightarrow n\}$

$f(f(i(x), n), x) \rightarrow_{\mathcal{R}} f(i(x), x) \leftrightarrow_{\mathcal{E}} f(x, i(x)) \rightarrow_{\mathcal{R}} n$

- Proof of  $\mathcal{T} \models a \leftrightarrow b$  by converting  $\mathcal{T}$  into two sets  $\mathcal{E}, \mathcal{R}$  by which  $a$  and  $b$  can be reduced to a common term  $c$ , i.e.

$$a \longrightarrow_{\mathcal{R} \cup \mathcal{E}}^* c \longleftarrow_{\mathcal{R} \cup \mathcal{E}}^* b$$

## Unfailing Completion: Deduction Rules

Orient	$\frac{(\mathcal{P} \cup \{s \leftrightarrow t\}; \mathcal{E}; \mathcal{R})}{(\mathcal{P}; \mathcal{E}; \mathcal{R} \cup \{s \rightarrow t\})}$	if $s \succ t$
Unfail	$\frac{(\mathcal{P} \cup \{s \leftrightarrow t\}; \mathcal{E}; \mathcal{R})}{(\mathcal{P}; \mathcal{E} \cup \{s \leftrightarrow t\}; \mathcal{R})}$	if $s \not\prec t, t \not\prec s$
Collapse $_{\mathcal{E}}$	$\frac{(\mathcal{P}; \mathcal{E} \cup \{s \leftrightarrow t\}; \mathcal{R})}{(\mathcal{P} \cup \{u \leftrightarrow t\}; \mathcal{E}; \mathcal{R})}$	if $s \rightarrow_{\{l \rightarrow r\}}^{\triangleright} u, l \rightarrow r \in \mathcal{R} \cup \mathcal{E}_{\succ}$
Collapse $_{\mathcal{R}}$	$\frac{(\mathcal{P}; \mathcal{E}; \mathcal{R} \cup \{s \rightarrow t\})}{(\mathcal{P} \cup \{u \leftrightarrow t\}; \mathcal{E}; \mathcal{R})}$	if $s \rightarrow_{\{l \rightarrow r\}}^{\triangleright} u, l \rightarrow r \in \mathcal{R} \cup \mathcal{E}_{\succ}$
Compose	$\frac{(\mathcal{P}; \mathcal{E}; \mathcal{R} \cup \{s \rightarrow t\})}{(\mathcal{P}; \mathcal{E}; \mathcal{R} \cup \{s \rightarrow u\})}$	if $t \rightarrow_{\mathcal{R} \cup \mathcal{E}_{\succ}} u$
Simplify	$\frac{(\mathcal{P} \cup \{s \leftrightarrow t\}; \mathcal{E}; \mathcal{R})}{(\mathcal{P} \cup \{s \leftrightarrow u\}; \mathcal{E}; \mathcal{R})}$	if $t \rightarrow_{\mathcal{R} \cup \mathcal{E}_{\succ}} u$
Delete	$\frac{(\mathcal{P} \cup \{s \leftrightarrow s\}; \mathcal{E}; \mathcal{R})}{(\mathcal{P}; \mathcal{E}; \mathcal{R})}$	
Deduce	$\frac{(\mathcal{P}; \mathcal{E}; \mathcal{R})}{(\mathcal{P} \cup \{s \leftrightarrow t\}; \mathcal{E}; \mathcal{R})}$	if $s \leftrightarrow t \in \text{CP}_{\succ}(\mathcal{R} \cup \mathcal{E})$

---

## Parallelization and Distribution Schemes

- High degree of non-determinism in deduction rules, complexity of problem → Heuristics
- Parallelization applicable on different levels:
  1. Individual deduction steps in parallel (fine-grained)
  2. (Large) groups of deduction steps in parallel (medium-grained)
  3. Independent or communicating calculi with different heuristics (coarse-grained)
- Parallelization scheme has to match hardware architecture:
  - (Symmetric) multi-processor computers (SMPs)
  - Clusters of workstations

---

## Sequential Algorithm and PaReDuX

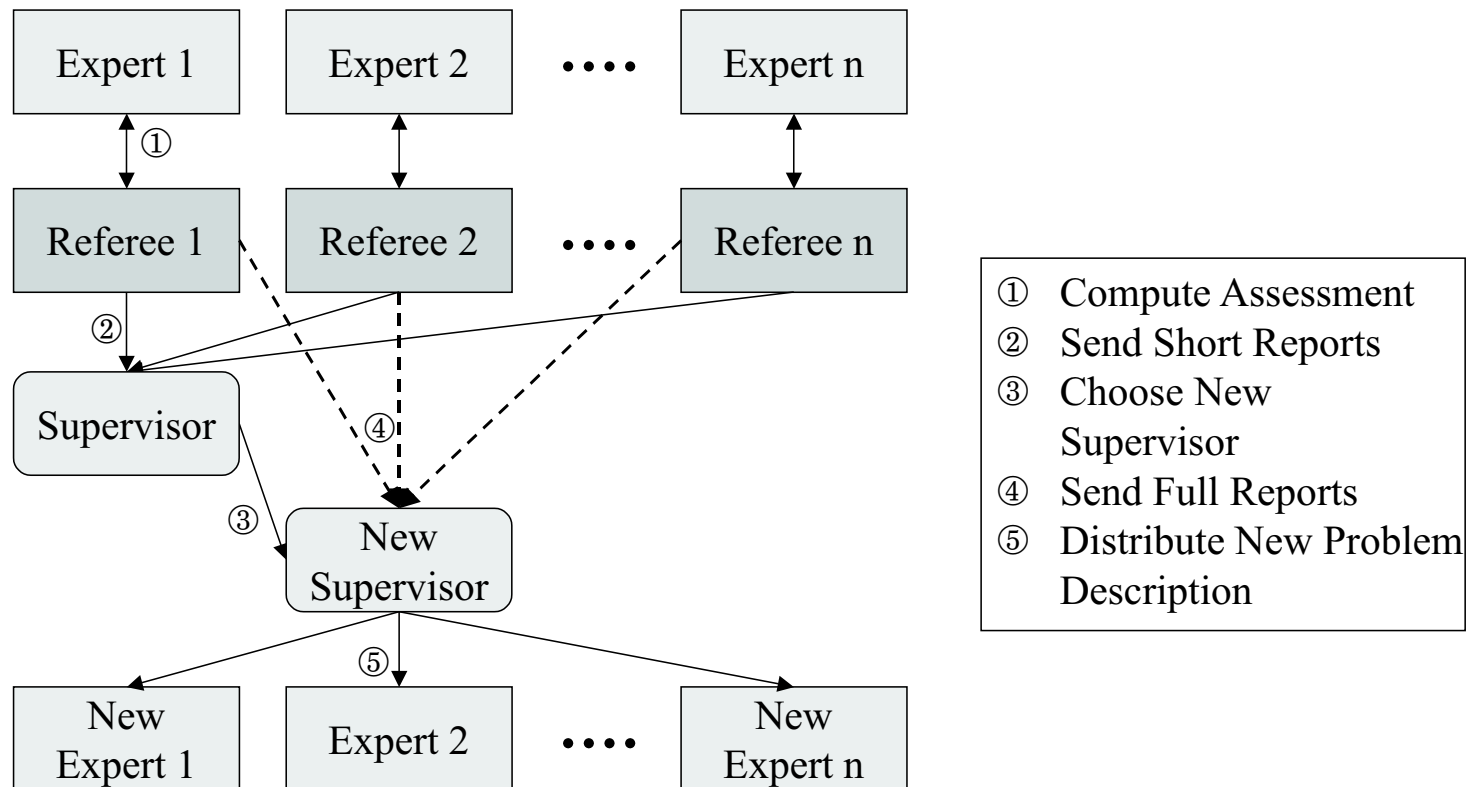
- Sequential algorithm (Huet, 1981):
  1. Select next equation, add it to  $\mathcal{R}$  or  $\mathcal{E}$  (Orient, Unfail).
  2. Perform simplifications (Collapse, Compose, Simplify, Delete).
  3. Derive new consequences (Deduce).
  4. Simplify goal and goto 1. until proof is found.
- PaReDuX: Parallel execution of deduction rules in steps 2 and 3:
  - Concurrently: Collapse&Compose, Simplify&Delete&Deduce
  - Instances of Simplify&Deduce executed in parallel for each equation resp. equation pair

---

## Cooperating Agents: TEAMWORK

- Equation selection heuristic determines performance, but no universally best one → Use multiple competing heuristics
- *Experts* run instances of sequential algorithm with different heuristics.
- *Team meetings* allow exchange of positive/negative information.
- *Referees* evaluate success of each expert.

# Cooperation in TEAMWORK





---

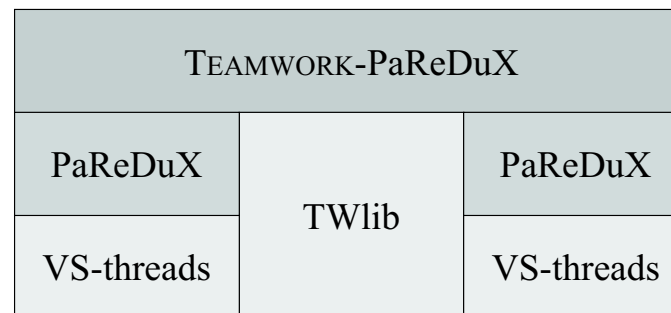
## Comparison PaReDuX vs. TEAMWORK

	PaReDuX	TEAMWORK
Parallelization	fine-grained	coarse-grained
Equation selection heuristics	single, fixed	multiple, dynamic
Information exchange	all equations	“best” equations
Strategy-compliant?	yes	no
Timing dependencies	none	considerable
Max. (theoretical) speed-ups	linear	super-linear
Communication	shared memory	network
Suitable HW platform	SMPs	clusters

---

## Integration: TEAMWORK-PaReDuX

- TEAMWORK method with each expert running adapted PaReDuX algorithm
- Software architecture:



- PaReDuX and TEAMWORK approaches counteractive or complementary? → Empirical judgement

## Experimental Results

Problem	Runtimes				Speed-up			
	Seq.	Par.	Dist.	P.&D.	Par.	Dist.	P.×D.	P.&D.
BOO002-2	411.95	154.02	194.80	76.19	2.67	2.11	5.63	5.41
BOO007-4	-	-	554.31	163.68	-	-	-	-
BOO022-1	148.50	56.34	226.44	57.08	2.64	0.66	1.74	2.60
COL003-12	364.89	111.21	262.08	86.56	3.28	1.39	4.60	4.21
GRP002-4	205.93	83.36	14.00	6.22	2.47	14.71	36.33	33.11
GRP119-1	867.70	258.45	423.86	99.81	3.36	2.07	6.96	8.69
GRP122-1	752.73	218.73	155.31	49.23	3.32	4.85	16.10	15.29
GRP175-3	1422.15	555.19	63.70	29.04	2.56	22.33	57.17	48.97
GRP175-4	464.33	163.02	243.50	87.61	2.85	1.91	5.44	5.30
LUKA3	-	-	135.73	33.17	-	-	-	-
RA007	-	-	67.22	25.58	-	-	-	-
ROB004-1	1683.82	670.16	40.73	14.60	2.51	41.34	103.76	115.33

2 Sun ES450, each with 4 UltraSparcII processors @400MHz, 1GB

---

## Conclusions

1. TEAMWORK-PaReDuX integrates two different parallelization/distribution schemes.
2. TEAMWORK-PaReDuX reflects two-tiered HW architecture of clusters of SMP computers.
3. Speed-up factors almost multiply compared to individual approaches.
4. Proposed combination presumably applicable to other search problems (e.g. Gröbner bases, resolution-based theorem provers).