Memory Model-aware Testing a Unified Complexity Analysis

#### Florian Furbach, Roland Meyer, Klaus Schneider, and Maximilian Senftleben

University of Kaiserslautern Department of Computer Science Germany

#### ACSD 2014

June 26, 2014

Motivation

Programmers expect sequential consistency.

Motivation

- Programmers expect sequential consistency.
- Modern architectures lack sequential consistency.

Motivation

- Programmers expect sequential consistency.
- Modern architectures lack sequential consistency.
- Modern architectures employ weak memory models.

Motivation

- Programmers expect sequential consistency.
- Modern architectures lack sequential consistency.
- Modern architectures employ weak memory models.
- Weak memory models may introduce undesired states.

Motivation

- Programmers expect sequential consistency.
- Modern architectures lack sequential consistency.
- Modern architectures employ weak memory models.
- Weak memory models may introduce undesired states.
- State explosion for reachability analysis.

Motivation

- Programmers expect sequential consistency.
- Modern architectures lack sequential consistency.
- Modern architectures employ weak memory models.
- Weak memory models may introduce undesired states.
- State explosion for reachability analysis.
- Complexity of Testing?

Notions

- Test: sequences of reads/writes for multiple processes.
- Reads are blocking.
- Memory variables initialized to 0.

Example: Test  $\mathcal{T}$ 





Notions

- Test: sequences of reads/writes for multiple processes.
- Reads are blocking.
- Memory variables initialized to 0.

Example: Test  $\mathcal{T}$ 





Notions

- ▶ Test: sequences of reads/writes for multiple processes.
- Reads are blocking.
- Memory variables initialized to 0.

Example: Test  $\mathcal{T}$ 



$$\begin{array}{rcl} \blacktriangleleft : & (w, x, 1) \\ x : & 1 \end{array}$$

Notions

- Test: sequences of reads/writes for multiple processes.
- Reads are blocking.
- Memory variables initialized to 0.

Example: Test  ${\mathcal T}$ 



**◄**: 
$$(w, x, 1).(r, x, 1)$$
  
x: 1

3 / 15

Notions

- Test: sequences of reads/writes for multiple processes.
- Reads are blocking.
- Memory variables initialized to 0.

Example: Test  ${\mathcal T}$ 



$$◄: (w, x, 1).(r, x, 1).(w, x, 2) x: 2$$

# Serial View

- Processes observe operations in different orders (views).
- A serial view ◀ = SerialView(O, <) is a sequence of operations from O that respects some partial order <.</p>
- Always read from last write.

### Serial View

- Processes observe operations in different orders (views).
- A serial view ◄ = SerialView(O, <) is a sequence of operations from O that respects some partial order <.</p>
- Always read from last write.

#### • A Test $\mathcal{T}$ is executable under sequential consistency if:

$$\exists \blacktriangleleft = SerialView(\mathcal{T}, <_{PO}).$$

Example 
$$\blacktriangleleft$$
 :  $(w, x, 1).(r, x, 1).(w, x, 2)$ 

#### **Testing Problem of model M:**

Given test T, is it executable under model M?

#### **Testing Problem of model M:**

Given test T, is it executable under model M?



Steinke, Nutt 2004

#### Testing Problem of model M:

Given test T, is it executable under model M?



- Testing Problem is in NP for all models
- Testing Problem is NP-hard for most models
- Testing Problem is in P for some models

# Testing is in NP

Uniform Reduction to SAT:

Formula:

 $WT(T) \land SV_1 \land .. \land SV_k$ WT: Unique Writes-To SV: SerialView properties

# Testing is in NP

Uniform Reduction to SAT:

Formula:

 $WT(T) \land SV_1 \land .. \land SV_k$ WT: Unique Writes-To SV: SerialView properties

Boolean variable:

$$sv_{i,j} \leftrightarrow (op_i \blacktriangleleft op_j)$$

 Serial view properties: Totality, Asymmetry, Transitivity, Read-Last-Write

#### Testing Problem is in NP for all models

- Uniform SAT reduction.
- Optimal solution if NP-hard.
- Testing Problem is NP-hard for most models
- Testing Problem is in P for some models

- Testing Problem is in NP for all models
- Testing Problem is NP-hard for most models
- Testing Problem is in P for some models

- Testing Problem is in NP for all models
- Testing Problem is NP-hard for most models
  - Our proofs cover multiple models
- Testing Problem is in P for some models

Range reduction

 $M_{Strong} \leq M_{Weak}$ -range reduction f of SAT to testing:



(i) φ is SAT ⇒ test f(φ) is executable under M<sub>Strong</sub>.
(ii) test f(φ) is executable under M<sub>Weak</sub> ⇒ φ is SAT.

Range reduction

 $M_{Strong} \leq M_{Weak}$ -range reduction f of SAT to testing:



(i)  $\phi$  is SAT  $\implies$  test  $f(\phi)$  is executable under  $M_{Strong}$ . (ii) test  $f(\phi)$  is executable under  $M_{Weak} \implies \phi$  is SAT.

Range reduction

 $M_{Strong} \leq M_{Weak}$ -range reduction f of SAT to testing:



(i) φ is SAT ⇒ test f(φ) is executable under M<sub>Strong</sub>.
(ii) test f(φ) is executable under M<sub>Weak</sub> ⇒ φ is SAT.

Range reduction

 $M_{Strong} \leq M_{Weak}$ -range reduction f of SAT to testing:



(i)  $\phi$  is SAT  $\implies$  test  $f(\phi)$  is executable under  $M_{Strong}$ . (ii) test  $f(\phi)$  is executable under  $M_{Weak} \implies \phi$  is SAT.

 $SC \leq SLOW\text{-}\mathsf{Range}\text{-}\mathsf{Reduction}$ 



Slow Consistency

Slow Consistency

- The program order is respected.
- For each process p and variable x: there exists a serial view on all writes to x and reads from x of p.

$$\forall x, p \exists \quad \blacktriangleleft = SerialView( \mathcal{T}|_{w,x} \cup \mathcal{T}|_{p,x} , <_{PO})$$

$$\exists \blacktriangleleft = SerialView(\mathcal{T}, \leq_{PO}) [SC]$$

Slow Consistency

- The program order is respected.
- For each process p and variable x: there exists a serial view on all writes to x and reads from x of p.

$$\forall x, p \exists \quad \blacktriangleleft = SerialView(\mathcal{T}|_{w,x} \cup \mathcal{T}|_{p,x} , <_{PO})$$

$$\exists \blacktriangleleft = SerialView(\mathcal{T}, \leq_{PO}) [SC]$$

Slow Consistency

- The program order is respected.
- For each process p and variable x: there exists a serial view on all writes to x and reads from x of p.

$$\forall x, p \exists \quad \blacktriangleleft = SerialView( \mathcal{T}|_{w,x} \cup \mathcal{T}|_{p,x} , <_{PO})$$

$$\exists \mathbf{\triangleleft} = SerialView(\mathcal{T}, \leq_{PO}) [SC]$$

 $SC \leq SLOW\text{-}\mathsf{Range}\text{-}\mathsf{Reduction}$  of SAT

Reduction Idea

- Test uses only one variable  $\xi$ .
- Test has only one process with reads.
- $\blacktriangleright$   $\Rightarrow$  Test behaves the same from Slow to SC.

$$\forall x, p \exists \mathbf{\triangleleft} = SerialView(\mathcal{T}|_{w,x} \cup \mathcal{T}|_{p,x}, <_{PO}) \qquad [Slow]$$
$$\exists \mathbf{\triangleleft} = SerialView(\mathcal{T}, <_{PO}) \qquad [SC]$$

 $SC \leq SLOW\text{-}\mathsf{Range}\text{-}\mathsf{Reduction}$  of SAT

Reduction Idea

- Test uses only one variable  $\xi$ .
- Test has only one process with reads.
- $\blacktriangleright$   $\Rightarrow$  Test behaves the same from Slow to SC.

$$\forall x, p \exists = SerialView(\mathcal{T}|_{w,x} \cup \mathcal{T}|_{p,x}, <_{PO}) \qquad [Slow]$$
$$\exists = SerialView(\mathcal{T}, <_{PO}) \qquad [SC]$$

 $\operatorname{SAT-Reduction}$ 

• We associate clauses and variables with values of  $\xi$ .

$$\underbrace{(a \lor b)}_{cl_1} \land \neg a_{cl_2} \qquad a = false$$
  
b = true

$$\underbrace{(a \lor b)}_{cl_1} \land \underbrace{\neg a}_{cl_2} \qquad \qquad a = false$$
  
 b = true

$$True_a \coloneqq (w, \xi, cl1) \cdot (w, \xi, a)$$
  
$$False_a \coloneqq (w, \xi, cl2) \cdot (w, \xi, a)$$

$$\underbrace{(a \lor b)}_{cl_1} \land \neg a_{cl_2} \qquad \qquad a = false \\ b = true$$

$$True_{a} := (w, \xi, cl1) . (w, \xi, a)$$
  

$$False_{a} := (w, \xi, cl2) . (w, \xi, a)$$
  

$$True_{b} := (w, \xi, cl1) . (w, \xi, b)$$
  

$$False_{b} := (w, \xi, b)$$

$$\underbrace{(a \lor b)}_{cl_1} \land \neg a_{cl_2} \qquad \qquad a = false$$
  
b = true

$$\begin{aligned} & True_{a} \coloneqq (w, \xi, cl1) \cdot (w, \xi, a) \\ & False_{a} \coloneqq (w, \xi, cl2) \cdot (w, \xi, a) \\ & True_{b} \coloneqq (w, \xi, cl1) \cdot (w, \xi, b) \\ & False_{b} \coloneqq (w, \xi, b) \\ & Eval \coloneqq (r, \xi, a) \cdot (r, \xi, b) \cdot (r, \xi, cl1) \cdot (r, \xi, cl2) \end{aligned}$$

**∢**∶

 $\xi: 0$ 

$$\underbrace{(a \lor b)}_{cl_1} \land \underbrace{\neg a}_{cl_2} \qquad \qquad a = false$$
  
b = true

$$True_{a} := (w, \xi, c/1) . (w, \xi, a)$$

$$False_{a} := (w, \xi, c/2) . (w, \xi, a)$$

$$True_{b} := (w, \xi, c/1) . (w, \xi, b)$$

$$False_{b} := (w, \xi, b)$$

$$Eval := (r, \xi, a) . (r, \xi, b) . (r, \xi, c/1) . (r, \xi, c/2)$$

 $\blacktriangleleft$ : (w,  $\xi$ , cl1)

#### $\xi: 1$

$$\underbrace{(a \lor b)}_{cl_1} \land \neg a_{cl_2} \qquad a = false$$
  
b = true

$$True_{a} := (w, \xi, c/1) \cdot (w, \xi, a)$$

$$False_{a} := (w, \xi, c/2) \cdot (w, \xi, a)$$

$$True_{b} := (w, \xi, c/1) \cdot (w, \xi, b)$$

$$False_{b} := (w, \xi, b)$$

$$Eval := (r, \xi, a) \cdot (r, \xi, b) \cdot (r, \xi, c/1) \cdot (r, \xi, c/2)$$

 $\blacktriangleleft: (w,\xi,c/1).(w,\xi,a)$ 

#### $\xi$ : a

$$\underbrace{(a \lor b)}_{cl_1} \land \neg a_{cl_2} \qquad a = false$$
  
b = true

$$True_{a} := (w, \xi, c/1) . (w, \xi, a)$$

$$False_{a} := (w, \xi, c/2) . (w, \xi, a)$$

$$True_{b} := (w, \xi, c/1) . (w, \xi, b)$$

$$False_{b} := (w, \xi, b)$$

$$Eval := (r, \xi, a) . (r, \xi, b) . (r, \xi, c/1) . (r, \xi, c/2)$$

$$\blacktriangleleft: (w,\xi,c/1).(w,\xi,a).(r,\xi,a)$$

#### $\xi$ : a

$$\underbrace{(a \lor b)}_{cl_1} \land \underbrace{\neg a}_{cl_2} \qquad a = false$$
  
b = true

 $True_{a} := (w, \xi, cl1) \cdot (w, \xi, a)$   $False_{a} := (w, \xi, cl2) \cdot (w, \xi, a)$   $True_{b} := (w, \xi, cl1) \cdot (w, \xi, b)$   $False_{b} := (w, \xi, b)$   $Eval := (r, \xi, a) \cdot (r, \xi, b) \cdot (r, \xi, cl1) \cdot (r, \xi, cl2)$ 

$$\blacktriangleleft: (w,\xi,c/1).(w,\xi,a).(r,\xi,a).(w,\xi,b)$$

#### $\xi$ : b

$$\underbrace{(a \lor b)}_{cl_1} \land \neg a_{cl_2} \qquad a = false$$
  
b = true

 $\begin{aligned} True_{a} &:= (w, \xi, cl1) . (w, \xi, a) \\ False_{a} &:= (w, \xi, cl2) . (w, \xi, a) \\ True_{b} &:= (w, \xi, cl1) . (w, \xi, b) \\ False_{b} &:= (w, \xi, b) \\ Eval &:= (r, \xi, a) . (r, \xi, b) . (r, \xi, cl1) . (r, \xi, cl2) \end{aligned}$ 

 $\blacktriangleleft: (w,\xi,c/1).(w,\xi,a).(r,\xi,a).(w,\xi,b).(r,\xi,b)$ 

 $\xi: b$ 

$$\underbrace{(a \lor b)}_{cl_1} \land \underbrace{\neg a}_{cl_2} \qquad \qquad a = false$$
  
b = true

 $True_{a} := (w, \xi, cl1) \cdot (w, \xi, a)$   $False_{a} := (w, \xi, cl2) \cdot (w, \xi, a)$   $True_{b} := (w, \xi, cl1) \cdot (w, \xi, b)$   $False_{b} := (w, \xi, b)$   $Eval := (r, \xi, a) \cdot (r, \xi, b) \cdot (r, \xi, cl1) \cdot (r, \xi, cl2)$ 

$$\blacktriangleleft : (w,\xi,c/1).(w,\xi,a).(r,\xi,a).(w,\xi,b).(r,\xi,b) \\ .(w,\xi,c/1)$$

 $\xi: 1$ 

$$\underbrace{(a \lor b)}_{cl_1} \land \underbrace{\neg a}_{cl_2} \qquad a = false$$
  
b = true

 $\begin{aligned} & True_{a} \coloneqq (w, \xi, cl1) \cdot (w, \xi, a) \\ & False_{a} \coloneqq (w, \xi, cl2) \cdot (w, \xi, a) \\ & True_{b} \coloneqq (w, \xi, cl1) \cdot (w, \xi, b) \\ & False_{b} \coloneqq (w, \xi, b) \\ & Eval \coloneqq (r, \xi, a) \cdot (r, \xi, b) \cdot (r, \xi, cl1) \cdot (r, \xi, cl2) \end{aligned}$ 

$$\blacktriangleleft : (w, \xi, c/1).(w, \xi, a).(r, \xi, a).(w, \xi, b).(r, \xi, b)$$
  
.(w, \xi, c/1).(r, \xi, c/1)

 $\xi: 1$ 

$$\underbrace{(a \lor b)}_{cl_1} \land \neg a_{cl_2} \qquad a = false$$
  
b = true

 $\begin{aligned} & True_{a} \coloneqq (w, \xi, cl1) . (w, \xi, a) \\ & False_{a} \coloneqq (w, \xi, cl2) . (w, \xi, a) \\ & True_{b} \coloneqq (w, \xi, cl1) . (w, \xi, b) \\ & False_{b} \coloneqq (w, \xi, b) \\ & Eval \coloneqq (r, \xi, a) . (r, \xi, b) . (r, \xi, cl1) . (r, \xi, cl2) \end{aligned}$ 

 $14 \, / \, 15$ 

$$\underbrace{(a \lor b)}_{cl_1} \land \neg a_{cl_2} \qquad a = false$$
  
b = true

 $\begin{aligned} & True_{a} \coloneqq (w, \xi, c/1) . (w, \xi, a) \\ & False_{a} \coloneqq (w, \xi, c/2) . (w, \xi, a) \\ & True_{b} \coloneqq (w, \xi, c/1) . (w, \xi, b) \\ & False_{b} \coloneqq (w, \xi, b) \\ & Eval \coloneqq (r, \xi, a) . (r, \xi, b) . (r, \xi, c/1) . (r, \xi, c/2) \end{aligned}$ 

14/15

$$\underbrace{(a \lor b)}_{cl_1} \land \neg a_{cl_2} \qquad a = false$$
  
b = true

 $True_{a} := (w, \xi, c/1) . (w, \xi, a)$   $False_{a} := (w, \xi, c/2) . (w, \xi, a)$   $True_{b} := (w, \xi, c/1) . (w, \xi, b)$   $False_{b} := (w, \xi, b)$   $Eval := (r, \xi, a) . (r, \xi, b) . (r, \xi, c/1) . (r, \xi, c/2)$ 

$$\underbrace{(a \lor b)}_{cl_1} \land \underbrace{\neg a}_{cl_2} \qquad a = false$$
  
b = true

 $\begin{aligned} & True_{a} \coloneqq (w, \xi, cl1) . (w, \xi, a) \\ & False_{a} \coloneqq (w, \xi, cl2) . (w, \xi, a) \\ & True_{b} \coloneqq (w, \xi, cl1) . (w, \xi, b) \\ & False_{b} \coloneqq (w, \xi, b) \\ & Eval \coloneqq (r, \xi, a) . (r, \xi, b) . (r, \xi, cl1) . (r, \xi, cl2) \end{aligned}$ 

14/15

$$\underbrace{(a \lor b)}_{cl_1} \land \underbrace{\neg a}_{cl_2} \qquad a = false$$
  
b = true

 $\begin{aligned} & True_a \coloneqq (w, \xi, c/1) \ . \ (w, \xi, a) \\ & False_a \coloneqq (w, \xi, c/2) \ . \ (w, \xi, a) \\ & True_b \coloneqq (w, \xi, c/1) \ . \ (w, \xi, b) \\ & False_b \coloneqq (w, \xi, b) \\ & Eval \coloneqq (r, \xi, a) \ . \ (r, \xi, b) \ . \ (r, \xi, c/1) \ . \ (r, \xi, c/2) \end{aligned}$ 

14/15

Memory Model	Complexity Class of $TEST(M)$			
	General	Process	Length	Variables
$\mathbf{SC}$	NPC(by 1)			NPC(by 1)
TSO	NPC(by 1)			NPC(by 1)
PSO	NPC(by 1)			NPC(by 1)
PC-G	NPC(by 1)			NPC(by 1)
PC-D	NPC(by 1)			NPC(by 1)
GAO	NPC(by 1)			NPC(by 1)
GPO+GDO	NPC(by 1)			NPC(by 1)
Causal	NPC(by 1)			NPC(by 1)
PRAM-M	NPC(by 1)			NPC(by 1)
GWO				
CC	NPC(by 1)			NPC(by 1)
PRAM	NPC(by 1)			NPC(by 1)
SLOW	NPC(by 1)			NPC <sub>1</sub>
LOCAL				



$\mathbf{SC}$
PC-G PC-D
GAO TSO GPO+GDOCAUSAL
PSO PRAM-M
CC PRAM GWO
SLOW NP
LOCAL P

Memory Model	Complexity Class of TEST           General         Process         Length           NPC(by 1)             NPC(by 1)		ss of Test(1	M)
	General	Process	Length	Variables
SC	NPC(by 1)			NPC(by 1)
TSO	NPC(by 1)			NPC(by 1)
PSO	NPC(by 1)			NPC(by 1)
PC-G	NPC(by 1)			NPC(by 1)
PC-D	NPC(by 1)			NPC(by 1)
GAO	NPC(by 1)			NPC(by 1)
GPO+GDO	NPC(by 1)			NPC(by 1)
Causal	NPC(by 1)			NPC(by 1)
PRAM-M	NPC(by 1)			NPC(by 1)
GWO				
CC	NPC(by 1)			NPC(by 1)
PRAM	NPC(by 1)			NPC(by 1)
SLOW	NPC(by 1)			NPC <sub>1</sub>
LOCAL	<b>P</b> <sub>2</sub>	<b>P</b> (by 2)	<b>P</b> (by 2)	<b>P</b> (by 2)

$\mathbf{SC}$	
PC-G PC-D	
GAO TSO GPO+GDOCAU	JSAL
$\downarrow \downarrow \downarrow \downarrow$	
PSO PRAM-M	
$\downarrow \downarrow \checkmark \downarrow \checkmark$	Ļ
CC PRAM GV	NO
$\sim$ /	
SLOW	NP
	 D
LOCAL	г

Memory Model	Co	mplexity Cla	ss of Test(N	A)
	General	Process	Length	Variables
SC	<b>NPC</b> (by 1)		NPC(by 3)	NPC(by 1)
TSO	NPC(by 1)			NPC(by 1)
PSO	NPC(by 1)			NPC(by 1)
PC-G	NPC(by 1)			NPC(by 1)
PC-D	NPC(by 1)			NPC(by 1)
GAO	NPC(by 1)			NPC(by 1)
GPO+GDO	NPC(by 1)			NPC(by 1)
Causal	NPC(by 1)		NPC(by 3)	NPC(by 1)
PRAM-M	NPC(by 1)			NPC(by 1)
GWO	NPC(by 3)		NPC <sub>3</sub>	
CC	<b>NPC</b> (by 1)			NPC(by 1)
PRAM	NPC(by 1)			NPC(by 1)
SLOW	NPC(by 1)			NPC <sub>1</sub>
LOCAL	<b>P</b> <sub>2</sub>	<b>P</b> (by 2)	<b>P</b> (by 2)	<b>P</b> (by 2)

$\mathbf{SC}$
PC-G PC-D
GAO TSO GPO+GDOCAUSAL
PSO PRAM-M
CC PRAM GWO
SLOW NP
LOCAL P

Memory Model	Co	process     Length     Varia       Process     Length     Varia       NPC(by 3)     NPC       NPC     NPC       NPC3     NPC		A)
	General	Process	Length	Variables
SC	NPC(by 1)		NPC(by 3)	NPC(by 1)
TSO	<b>NPC</b> (by 1)			NPC(by 1)
PSO	NPC(by 1)			NPC(by 1)
PC-G	NPC(by 1)			NPC(by 1)
PC-D	NPC(by 1)			NPC(by 1)
GAO	NPC(by 1)			NPC(by 1)
GPO+GDO	NPC(by 1)			NPC(by 1)
Causal	NPC(by 1)		NPC(by 3)	NPC(by 1)
PRAM-M	NPC(by 1)			NPC(by 1)
GWO	NPC(by 3)		NPC <sub>3</sub>	
CC	<b>NPC</b> (by 1)			NPC(by 1)
PRAM	NPC(by 1)		<b>P</b> <sub>4</sub>	NPC(by 1)
SLOW	NPC(by 1)		<b>P</b> (by 4)	NPC <sub>1</sub>
LOCAL	<b>P</b> <sub>2</sub>	<b>P</b> (by 2)	<b>P</b> (by 2)	<b>P</b> (by 2)

$\mathbf{SC}$	
PC-G PC-D	
GAO TSO GPO+GDOCAU	JSAL
PSO PRAM-M	
	↓ 
CC PRAM GV	NO
SLOW	NP
LOCAL	Р
LOONE	

Memory Model	Co	omplexity Cla	ss of Test(N	A)
	General	Process	Length	Variables
SC	NPC(by 1)		NPC(by 3)	NPC(by 1)
TSO	NPC(by 1)			NPC(by 1)
PSO	NPC(by 1)			NPC(by 1)
PC-G	NPC(by 1)			NPC(by 1)
PC-D	NPC(by 1)			NPC(by 1)
GAO	NPC(by 1)			NPC(by 1)
GPO+GDO	NPC(by 1)			NPC(by 1)
Causal	NPC(by 1)		NPC(by 3)	NPC(by 1)
PRAM-M	NPC(by 1)			NPC(by 1)
GWO	NPC(by 3)		NPC <sub>3</sub>	
CC	NPC(by 1)	<b>P</b> 5		NPC(by 1)
PRAM	NPC(by 1)		<b>P</b> <sub>4</sub>	NPC(by 1)
SLOW	<b>NPC</b> (by 1)	<b>P</b> (by 5)	<b>P</b> (by 4)	NPC <sub>1</sub>
LOCAL	<b>P</b> <sub>2</sub>	<b>P</b> (by 2)	<b>P</b> (by 2)	<b>P</b> (by 2)

					4
					r f
					GAO TSO C
Memory Model	Co	mplexity Cla	ss of TEST(N	A)	
	General	Process	Length	Variables	PSO /
$\mathbf{SC}$	NPC(by 1)		NPC(by 3)	NPC(by 1)	
TSO	NPC(by 1)		NPC(by 6)	NPC(by 1)	
PSO	NPC(by 1)		NPC(by 6)	NPC(by 1)	
PC-G	<b>NPC</b> (by 1)		<b>NPC</b> (by 6)	NPC(by 1)	
PC-D	<b>NPC</b> (by 1)		<b>NPC</b> (by 6)	NPC(by 1)	SLC
GAO	NPC(by 1)		<b>NPC</b> (by 6)	NPC(by 1)	
GPO+GDO	NPC(by 1)		NPC(by 6)	NPC(by 1)	
Causal	NPC(by 1)		NPC(by 3)	NPC(by 1)	
PRAM-M	NPC(by 1)			NPC(by 1)	
GWO	NPC(by 3)		NPC <sub>3</sub>		
CC	NPC(by 1)	<b>P</b> 5	NPC <sub>6</sub>	NPC(by 1)	
PRAM	NPC(by 1)		<b>P</b> <sub>4</sub>	NPC(by 1)	
SLOW	NPC(by 1)	<b>P</b> (by 5)	<b>P</b> (by 4)	NPC <sub>1</sub>	
LOCAL	<b>P</b> <sub>2</sub>	<b>P</b> (by 2)	<b>P</b> (by 2)	<b>P</b> (by 2)	



 $\mathbf{SC}$ 

			PC-G PC-D
~	6 77 (1		GAO TSO GPO+GDOCAUSAL
Cla	ss of TEST(N	A)	
SS	Length	Variables	PRAM-M
(7)	NPC(by 3)	NPC(by 1)	
(7)	NPC(by 6)	NPC(by 1)	$\gamma \downarrow \psi \qquad \gamma \psi \qquad \psi \psi \qquad \psi \qquad$
7	NPC(by 6)	NPC(by 1)	
	NPC(by 6)	NPC(by 1)	
	NPC(by 6)	NPC(by 1)	SLOW INF
	NPC(by 6)	NPC(by 1)	LOCAL P
	<b>NPC</b> (by 6)	NPC(by 1)	
	NPC(by 3)	NPC(by 1)	
		NPC(by 1)	
	NPC <sub>3</sub>		
	NDC		

Memory Model	Co	Complexity Class of $TEST(M)$				
	General	Process	Length	Variables		
SC	NPC(by 1)	NPC(by 7)	NPC(by 3)	NPC(by 1)		
TSO	NPC(by 1)	NPC(by 7)	NPC(by 6)	NPC(by 1)		
PSO	NPC(by 1)	NPC <sub>7</sub>	NPC(by 6)	NPC(by 1)		
PC-G	NPC(by 1)		NPC(by 6)	NPC(by 1)		
PC-D	NPC(by 1)		NPC(by 6)	NPC(by 1)		
GAO	NPC(by 1)		NPC(by 6)	NPC(by 1)		
GPO+GDO	NPC(by 1)		<b>NPC</b> (by 6)	NPC(by 1)		
Causal	NPC(by 1)		NPC(by 3)	NPC(by 1)		
PRAM-M	NPC(by 1)			NPC(by 1)		
GWO	NPC(by 3)		NPC <sub>3</sub>			
CC	NPC(by 1)	<b>P</b> 5	NPC <sub>6</sub>	NPC(by 1)		
PRAM	NPC(by 1)		<b>P</b> <sub>4</sub>	NPC(by 1)		
SLOW	NPC(by 1)	<b>P</b> (by 5)	<b>P</b> (by 4)	NPC <sub>1</sub>		
LOCAL	<b>P</b> <sub>2</sub>	<b>P</b> (by 2)	<b>P</b> (by 2)	<b>P</b> (by 2)		

	$\mathbf{SC}$	
	PC-G PC-D	
	GAO TSO GPO+GDOCAUSAL	
_	PSO PRAM-M	
_	$\downarrow \checkmark \downarrow \checkmark \downarrow \checkmark \downarrow$	
_	CC PRAM GWO	
-		
-	SLOW N	P
	LOCAL	5
-	LOONL	

Memory Model	Complexity Class of $TEST(M)$			
	General	Process	Length	Variables
SC	NPC(by 1)	NPC(by 7)	NPC(by 3)	NPC(by 1)
TSO	NPC(by 1)	NPC(by 7)	NPC(by 6)	NPC(by 1)
PSO	NPC(by 1)	NPC <sub>7</sub>	NPC(by 6)	NPC(by 1)
PC-G	NPC(by 1)		NPC(by 6)	NPC(by 1)
PC-D	NPC(by 1)		NPC(by 6)	NPC(by 1)
GAO	NPC(by 1)		NPC(by 6)	NPC(by 1)
GPO+GDO	NPC(by 1)		NPC(by 6)	NPC(by 1)
Causal	NPC(by 1)		NPC(by 3)	NPC(by 1)
PRAM-M	NPC(by 1)			NPC(by 1)
GWO	NPC(by 3)		NPC <sub>3</sub>	
CC	NPC(by 1)	<b>P</b> 5	NPC <sub>6</sub>	NPC(by 1)
PRAM	NPC(by 1)		<b>P</b> <sub>4</sub>	NPC(by 1)
SLOW	NPC(by 1)	<b>P</b> (by 5)	<b>P</b> (by 4)	NPC <sub>1</sub>
LOCAL	<b>P</b> <sub>2</sub>	<b>P</b> (by 2)	<b>P</b> (by 2)	<b>P</b> (by 2)