#### **R**-CML : A Prescription for Safely Relaxing Synchrony

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(5<sup>3</sup>) MultiMLton

#### Introduction

Two often competing goals when *designing* and *implementing* concurrency abstractions





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Simplicity Safety *Performance Functionality* 





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Simplicity Safety *Performance Functionality* 



Always desirable to marry the two whenever possible









- Functional language + Synchronous message passing
  - ★ Communication = Data transfer + Synchronization



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Can we discharge synchronous communications **asynchronously** while ensuring **observable equivalence**?









(<sup>3</sup>) MultiMLton

### Goal

1. Formalize the conditions under which the following equivalence holds:

 $[\![\operatorname{\mathtt{send}}\,(c,v)]\!]k \ \equiv \ [\![\operatorname{\mathtt{asend}}\,(c,v)]\!]k$ 

**T**3 ecv(c2)

**T1** send(c1,v1)
f() send(c2,v2)

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2. A cloud infrastructure + speculative execution framework

- a. discharges synchronous sends asynchronously
- b. detects when the equivalence fails, and
- c. repairs failed executions

T1 send(c1,v1) f() send(c2,v2)





• A distributed extension of MultiMLton - MLton for scalable architectures



- A distributed extension of MultiMLton MLton for scalable architectures
- Parallel extension of *Concurrent ML* 
  - ★ Dynamic lightweight threads
  - ★ *Synchronous* message passing
  - ★ First-class events
    - Composable synchronous protocols



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    - ♦ Composable synchronous protocols

val	channel	:	unit -> 'a chan	۲	val never : 'a event
val	spawn	•	<pre>(unit -&gt; unit) -&gt; thread_id</pre>	, ,	val alwaysEvt : 'a -> 'a event
val	send	•	<pre>'a chan * 'a -&gt; unit</pre>	,	val wrap : 'a event -> ('a -> 'b) ->
val	recv	•	'a chan -> 'a		'b event
val	sendEvt	•	'a chan * 'a -> unit event	١	val guard : (unit -> 'a event) -> 'a event
val	recvEvt	•	'a chan -> 'a event	١	val choose : 'a event list -> 'a event
val	sync	:	'a event -> 'a		• • •



MultiMLton

Synchronous Execution





Synchronous Execution







Synchronous Execution







Synchronous Execution







Asynchronous Execution









Asynchronous Execution









Asynchronous Execution





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**MultiMLton** 



• Synchronous evaluation *never* results in cyclic dependence

★ Cyclic dependence => divergent behavior w.r.t synchronous evaluation



MultiMLton



• No central server + Preserve causal dependence





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```
fun bsend (BCHAN (vcList, acList), v: 'a, id: int) : unit =
let
val _ = map (fn vc => if (vc = nth (vcList, id)) then () else send (vc, v))
val _ = nap (fn ac => if (ac = nth (acList, id)) then () else recv ac)
acList (* phase 2 -- Acknowledgments *)
in ()
end
synchronously send values
prevent receivers from proceeding until
all members have received the value
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- Simple but likely to be inefficient phase 2 is a global barrier!
  - ★ Discharging asynchronously breaks causal ordering
  - ★ Our idea: program synchronously, discharge asynchronously, detect and remediate causal ordering violations



- A distributed group chat program = {Node}
- Node = MultiMLton process = {CML threads}





### Distributed Group Chat - Run 1










(<sup>3</sup>) MultiMLton





















(<sup>3</sup>) MultiMLton

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- Observations
  - ★ X and Y independently generated => No causal dependence between bcast (X) and bcast (Y)
- No Cycles => Correct execution!















































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#### sults

ties over

Execution	Avg.time (ms)	Errors
Sync	1540	0
Unsafe Async	520	7
Safe Async (R <sup>CML</sup> )	533	0



(<sup>3</sup>) MultiMLton



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- Actions + happens-before relation
  - ★ Captures visibility and dependence properties
- Happens-before is intentionally *relaxed*: may define more behaviors than possible in CML
  - ★ Strengthen the relation with *well-formedness* conditions



#### Actions and Execution

• Actions:



po  $p_{t_1}1$  po

 $s_{t_1}c_2, v_2$ 

 $\downarrow po$ 

 $e_{t_1}$ 

 $c \in \mathbb{C}$   $t, t' \in \mathbb{T}$   $v \in \mathbb{V}$   $m, n \in \mathbb{N}$ 

• Execution:



#### Communication and Thread Dependence

• Synchronous communication → communication order is symmetric:

$$a \to_{co} b \implies b \to_{co} a$$

• Thread dependence order:

$$\alpha \rightarrow_{td} \beta$$
 if:  
(1)  $\alpha = f_t^m t'$  and  $\beta = b_{t'}$  or  
(2)  $\alpha = e_t$  and  $\beta = j_{t'}^m t$ 



$$\begin{array}{ll} \rightarrow_{hb} &= & (\rightarrow_{po} \cup \rightarrow_{td} \cup \\ & & \{(\alpha, \beta) \mid \alpha \rightarrow_{co} \alpha' \wedge \alpha' \rightarrow_{po} \beta\} \cup \\ & & \{(\beta, \alpha) \mid \beta \rightarrow_{po} \alpha' \wedge \alpha' \rightarrow_{co} \alpha\})^+ \end{array}$$



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- Assume T1 spawns T2 and T3
- Let f, g, h = print 1, print 2, print 3









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#### Well-formed Executions

#### Obs (Well-formed Execution of P) $\in$ {Obs (CML Execution of P)}







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Track executions to see if they become ill-formed (rollback) or turn into CML executions (commit)





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A CML execution



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A well-formed execution that *can lead* to a CML execution



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  - ★ MultiMLton with distribution support
  - ★ Rx-CML application = {Instances}
  - ★ Supports full CML
  - ★ Built-in serialization (immutable values and function closures)
  - ★ Transport layer is ZeroMQ

R <sup>CML</sup> Instance			
User-level threads	Communication Manager	Cycle Detector	
Serialization Support			
ZeroMQ Pub/Sub			
Cloud			



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  - ★ Roll-back ill-formed executions, re-execute non-speculatively



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{c1:[],c2:[]}



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#### Instance 1

send(c2,1);

Instance 2 recv(c2);



recv(c2);



(<sup>3</sup>) MultiMLton





























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  - ★ 1 continuation per thread
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- Remediation
  - ★ *Uncoordinated!* Transitively inform each mis-speculated thread to rollback
  - ★ *Check-point (Continuation)* + *Log-based (Dependence graph)* recovery
  - ★ Rollback to last checkpoint, replay correct speculative actions
  - ★ Continues non-speculatively until next observable action = Progress



#### Results





### Results

- Optimistic OLTP
  - ★ Distributed version of STAMP Vacation benchmark
  - ★ Database split into 64 shards, with concurrent transaction requests from geo-distributed clients
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MultiMLton

- Rx-CML was 5.8X to 7.6X faster than the synchronous version
- ★ 9-17% of communications were mis-speculated.







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- Distributed implementation of MultiMLton
  - ★ Case studies demonstrate effectiveness of the approach
- Future Work Fault tolerance
  - ★ Make checkpoints and dependence graph resilient
  - ★ Treat failures as mis-speculations -> rollback to last saved checkpoint





#### (<sup>3</sup>) MultiMLton

#### http://multimlton.cs.purdue.edu

