

# MULTI-ML: PROGRAMMING MULTI-BSP ALGORITHMS IN ML

VICTOR ALLOMBERT, FRÉDÉRIC GAVA AND JULIEN TESSON

Laboratory of Algorithmic Complexity and Logic  
Université Paris-Est

HLPP July 2015



# Table of Contents

① Introduction

② Multi-ML

③ Results

④ Conclusion

# Table of Contents

## ① Introduction

BSP

BSML

MULTI-BSP

## ② Multi-ML

## ③ Results

## ④ Conclusion

# Bulk Synchronous Parallelism

## The BSP computer

Defined by:

# Bulk Synchronous Parallelism

## The BSP computer

Defined by:

- $p$  pairs CPU/memory

# Bulk Synchronous Parallelism

## The BSP computer

Defined by:

- $p$  pairs CPU/memory
- Communication network

# Bulk Synchronous Parallelism

## The BSP computer

Defined by:

- $p$  pairs CPU/memory
- Communication network
- Synchronization unit

# Bulk Synchronous Parallelism

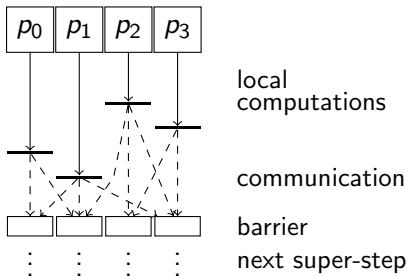
## The BSP computer

Defined by:

- $p$  pairs CPU/memory
- Communication network
- Synchronization unit

## Properties:

- Super-steps execution





# Bulk Synchronous Parallelism

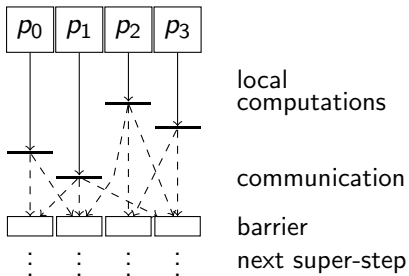
## The BSP computer

Defined by:

- $p$  pairs CPU/memory
- Communication network
- Synchronization unit

## Properties:

- Super-steps execution
- Confluent



# Bulk Synchronous Parallelism

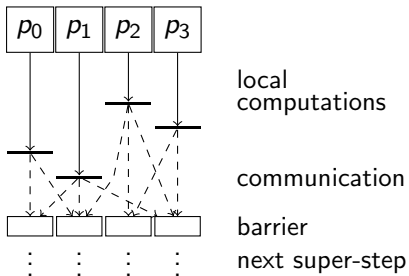
## The BSP computer

Defined by:

- $p$  pairs CPU/memory
- Communication network
- Synchronization unit

## Properties:

- Super-steps execution
- Confluent
- Deadlock-free



# Bulk Synchronous Parallelism

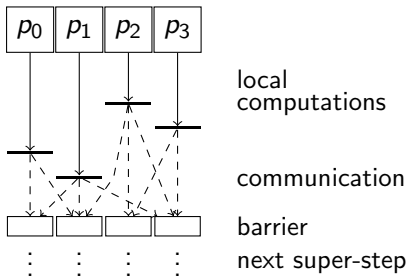
## The BSP computer

Defined by:

- $p$  pairs CPU/memory
- Communication network
- Synchronization unit

## Properties:

- Super-steps execution
- Confluent
- Deadlock-free
- Predictable performances



# Bulk Synchronous ML

What is BSML?



# Bulk Synchronous ML

## What is BSML?

- Explicit BSP programming with a functional approach



# Bulk Synchronous ML

## What is BSML?

- Explicit BSP programming with a functional approach
- Based upon ML an implemented over OCAML



# Bulk Synchronous ML

## What is BSML?

- Explicit BSP programming with a functional approach
- Based upon ML an implemented over OCAML
- Formal semantics  $\rightarrow$  computer-assisted proofs (COQ)



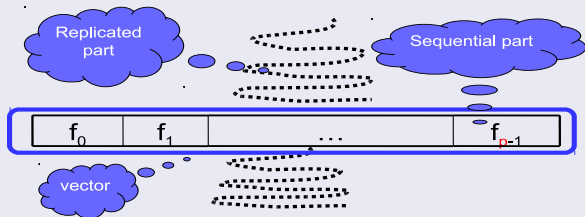
# Bulk Synchronous ML

## What is BSML?

- Explicit BSP programming with a functional approach
- Based upon ML an implemented over OCAML
- Formal semantics  $\rightarrow$  computer-assisted proofs (COQ)

## Main idea

Parallel data structure  $\Rightarrow$  vectors:





### Asynchronous primitives

### Asynchronous primitives

- $\ll e \gg$  :  $\langle e, \dots, e \rangle$

### Asynchronous primitives

- $\langle\langle e \rangle\rangle$  :  $\langle e, \dots, e \rangle$
- $\$v\$$  :  $v_i$  on processor  $i$ , assumes  $v \equiv \langle v_0, \dots, v_{p-1} \rangle$

### Asynchronous primitives

- $\ll e \gg$  :  $\langle e, \dots, e \rangle$
- $\$v\$$  :  $v_i$  on processor  $i$ , assumes  $v \equiv \langle v_0, \dots, v_{p-1} \rangle$
- $\$pid\$$  : A predefined vector:  $i$  on processor  $i$

### Asynchronous primitives

- $\ll e \gg$  :  $\langle e, \dots, e \rangle$
- $\$v\$$  :  $v_i$  on processor  $i$ , assumes  $v \equiv \langle v_0, \dots, v_{p-1} \rangle$
- $\$pid\$$  : A predefined vector:  $i$  on processor  $i$

### Synchronous primitives

- **proj** :  $\langle x_0, \dots, x_{p-1} \rangle \mapsto (\text{fun } i \rightarrow x_i)$

### Asynchronous primitives

- $\ll e \gg$  :  $\langle e, \dots, e \rangle$
- $\$v\$$  :  $v_i$  on processor  $i$ , assumes  $v \equiv \langle v_0, \dots, v_{p-1} \rangle$
- $\$pid\$$  : A predefined vector:  $i$  on processor  $i$

### Synchronous primitives

- **proj** :  $\langle x_0, \dots, x_{p-1} \rangle \mapsto (\text{fun } i \rightarrow x_i)$
- **put** :  $\langle f_0, \dots, f_{p-1} \rangle \mapsto \langle (\text{fun } i \rightarrow f_i \ 0), \dots, (\text{fun } i \rightarrow f_i \ (p-1)) \rangle$

## Code example

For a BSP machine with 3 processors:

```
# let vec = << "HLPP_" >> ;;  
val vec : string par = <"HLPP_", "HLPP_", "HLPP_">  
  
# let vec2 = << $vec$^(string_of_int $pid$) >> ;;  
val vec2 : string par = <"HLPP_0", "HLPP_1", "HLPP_2">  
  
# let totex v = List.map (proj v) procs;;  
val totex : 'a Bsm1.par → 'a list = <fun>  
  
# totex vec2;;  
— : string list = ["HLPP0"; "HLPP1"; "HLPP2"]
```

# The MULTI-BSP model

What is MULTI-BSP?



# The MULTI-BSP model

## What is MULTI-BSP?

- 1 A tree structure with nested components

# The MULTI-BSP model

## What is MULTI-BSP?

- ① A tree structure with nested components
- ② Where nodes have a storage capacity

# The MULTI-BSP model

## What is MULTI-BSP?

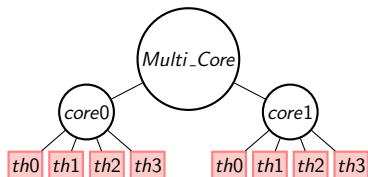
- ① A tree structure with nested components
- ② Where nodes have a storage capacity
- ③ And leaves are processors

# The MULTI-BSP model

## What is MULTI-BSP?

- 1 A tree structure with nested components
- 2 Where nodes have a storage capacity
- 3 And leaves are processors

MULTI-BSP

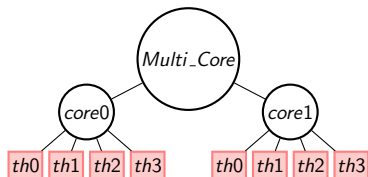


# The MULTI-BSP model

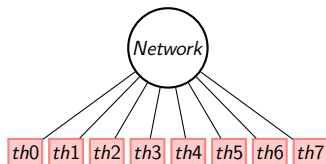
## What is MULTI-BSP?

- 1 A tree structure with nested components
- 2 Where nodes have a storage capacity
- 3 And leaves are processors

MULTI-BSP



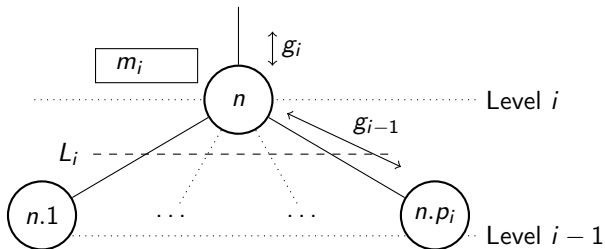
BSP



# The MULTI-BSP model

## Execution model

A level  $i$  superstep is:

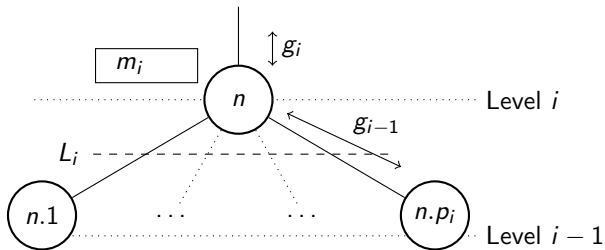


# The MULTI-BSP model

## Execution model

A level  $i$  superstep is:

- Level  $i - 1$  executes code independantly

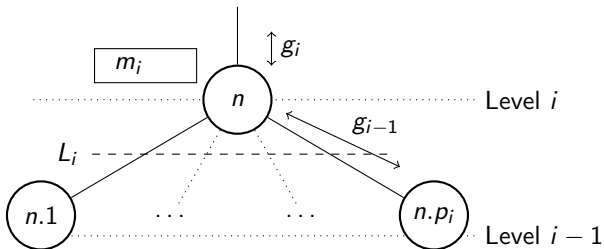


# The MULTI-BSP model

## Execution model

A level  $i$  superstep is:

- Level  $i - 1$  executes code independantly
- Exchanges informations with the  $m_i$  memory



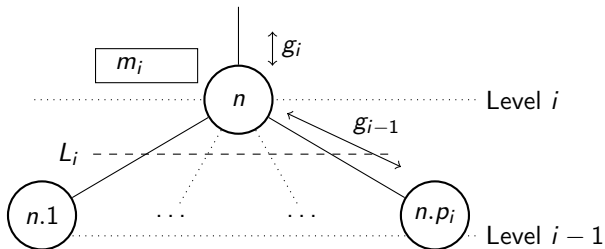


# The MULTI-BSP model

## Execution model

A level  $i$  superstep is:

- Level  $i - 1$  executes code independently
- Exchanges informations with the  $m_i$  memory
- Synchronises



# Table of Contents

## 1 Introduction

## 2 Multi-ML

Overview

Primitives

Semantics

Implementation

## 3 Results

## 4 Conclusion

## Basic ideas:

### Basic ideas:

- BSML-like code on every stage of the MULTI-BSP architecture

### Basic ideas:

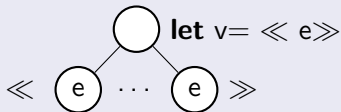
- BSML-like code on every stage of the MULTI-BSP architecture
- Specific syntax over ML: eases programming

### Basic ideas:

- BSML-like code on every stage of the MULTI-BSP architecture
- Specific syntax over ML: eases programming
- *Multi-functions* that recursively go through the tree.

## Basic ideas:

- BSML-like code on every stage of the MULTI-BSP architecture
- Specific syntax over ML: eases programming
- *Multi-functions* that recursively go through the tree.



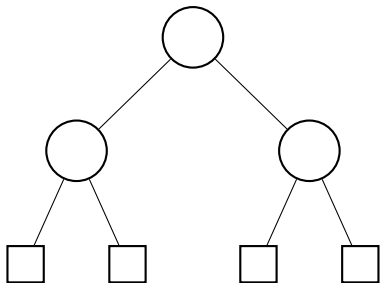
## Recursion structure

```
let multi f [args] =  
  where node =  
    (* BSML code *)  
    ...  
    << f [args] >>  
    ...  
  where leaf =  
    (* OCAML code *)  
    ...
```



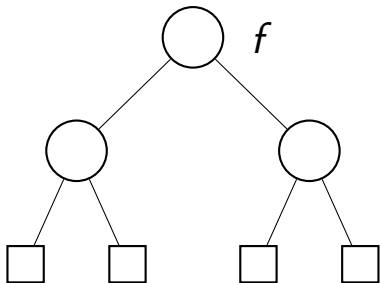
## Recursion structure

```
let multi f [args] =  
  where node =  
    (* BSML code *)  
    ...  
    << f [args] >>  
    ...  
  where leaf =  
    (* OCAML code *)  
    ...
```



## Recursion structure

```
let multi f [args] =  
  where node =  
    (* BSML code *)  
    ...  
    << f [args] >>  
    ...  
  where leaf =  
    (* OCAML code *)  
    ...
```

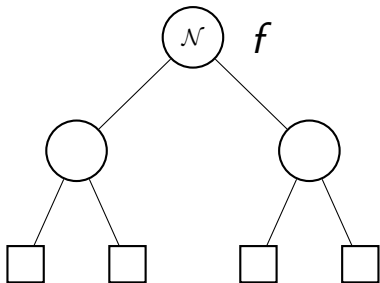


## Recursion structure

```

let multi f [args] =
  where node =
    (* BSML code *)
    ...
    << f [args] >>
    ...
  where leaf =
    (* OCAML code *)
    ...

```

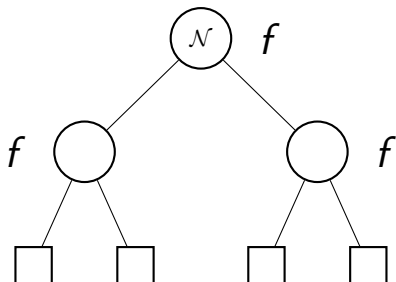


## Recursion structure

```

let multi f [args] =
  where node =
    (* BSML code *)
    ...
    << f [args] >>
    ...
  where leaf =
    (* OCAML code *)
    ...

```

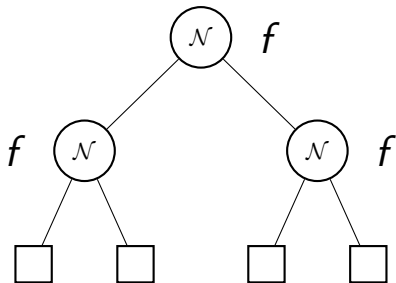


## Recursion structure

```

let multi f [args] =
  where node =
    (* BSML code *)
    ...
    << f [args] >>
    ...
  where leaf =
    (* OCAML code *)
    ...

```

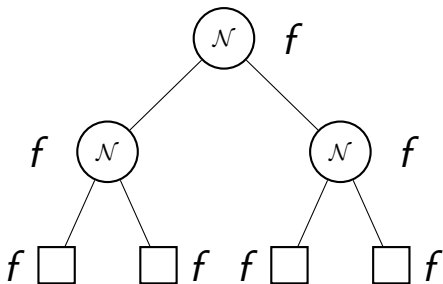


## Recursion structure

```

let multi f [args] =
  where node =
    (* BSML code *)
    ...
    << f [args] >>
    ...
  where leaf =
    (* OCAML code *)
    ...

```

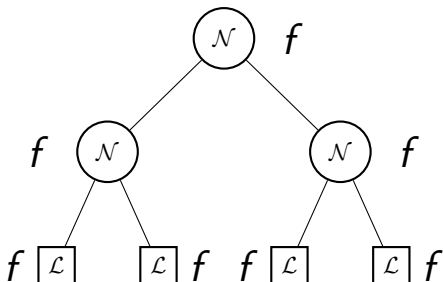


## Recursion structure

```

let multi f [args] =
  where node =
    (* BSML code *)
    ...
    << f [args] >>
    ...
  where leaf =
    (* OCAML code *)
    ...

```

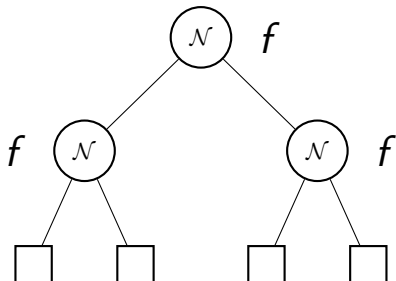


## Recursion structure

```

let multi f [args] =
  where node =
    (* BSML code *)
    ...
    << f [args] >>
    ...
  where leaf =
    (* OCAML code *)
    ...

```



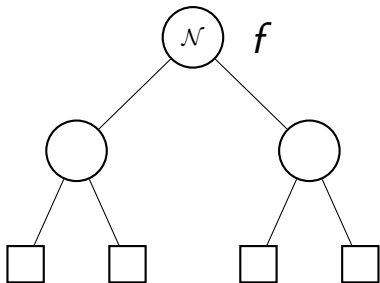


## Recursion structure

```

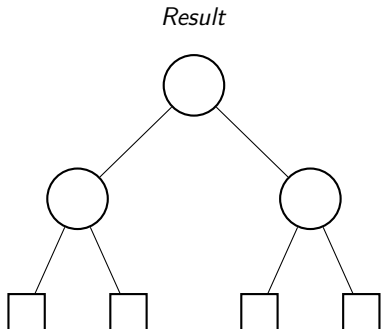
let multi f [args] =
  where node =
    (* BSML code *)
    ...
    << f [args] >>
    ...
  where leaf =
    (* OCAML code *)
    ...

```



## Recursion structure

```
let multi f [args] =  
  where node =  
    (* BSML code *)  
    ...  
    << f [args] >>  
    ...  
  where leaf =  
    (* OCAML code *)  
    ...
```



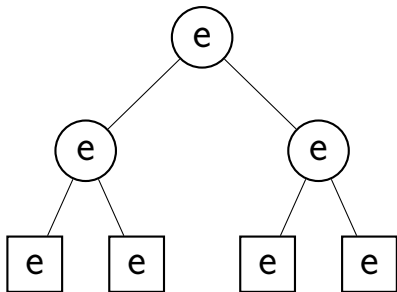
# Primitives

Summary:

# Primitives

## Summary:

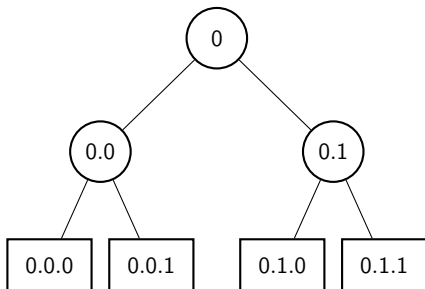
- $\xi e \xi$



# Primitives

## Summary:

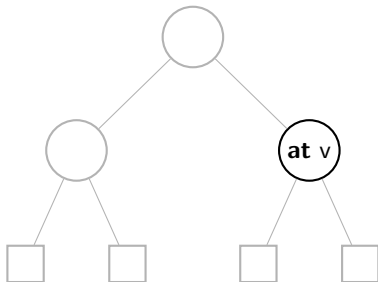
- $\xi e \xi$
- **gid**



# Primitives

## Summary:

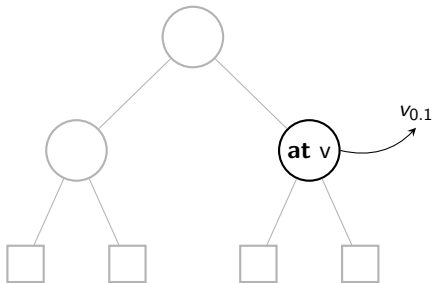
- $\xi e \xi$
- **gid**
- **at**



# Primitives

## Summary:

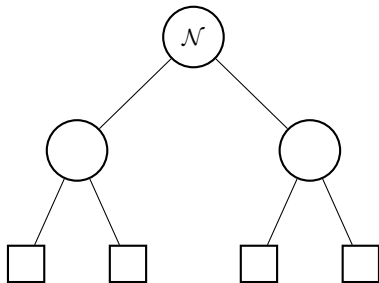
- $\xi e \xi$
- **gid**
- **at**



# Primitives

## Summary:

- $\xi e \xi$
- **gid**
- **at**
- $\langle\langle \dots f \dots \rangle\rangle$

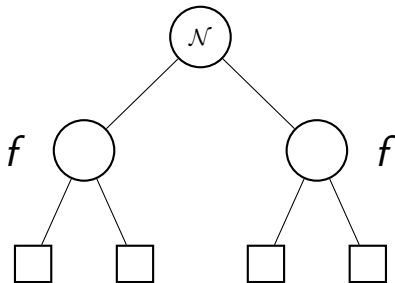




# Primitives

## Summary:

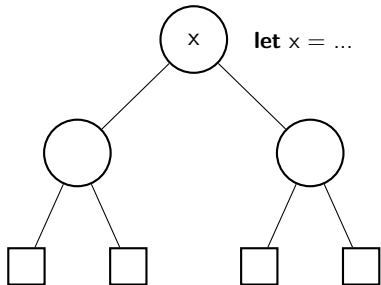
- $\xi e \xi$
- **gid**
- **at**
- $\langle\langle \dots f \dots \rangle\rangle$



# Primitives

## Summary:

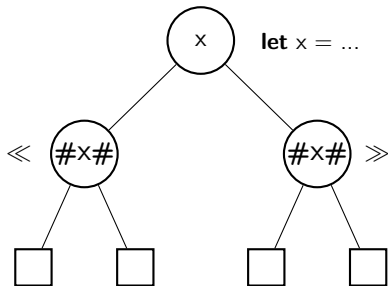
- $\xi e \xi$
- **gid**
- **at**
- $\langle\langle \dots f \dots \rangle\rangle$
- $\#x\#$



# Primitives

## Summary:

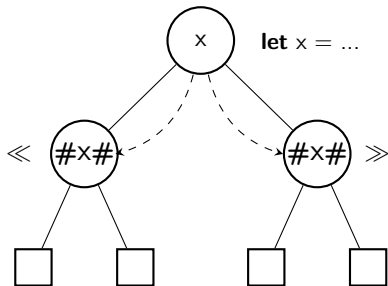
- $\xi e \xi$
- **gid**
- **at**
- $\ll \dots f \dots \gg$
- $\#x\#$



# Primitives

## Summary:

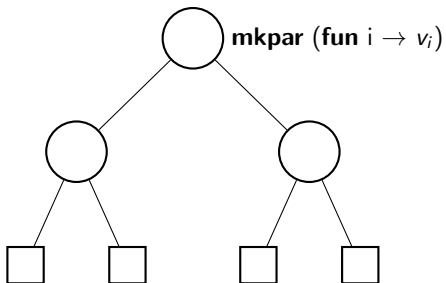
- $\xi e \xi$
- **gid**
- **at**
- $\langle\langle \dots f \dots \rangle\rangle$
- $\#x\#$



# Primitives

## Summary:

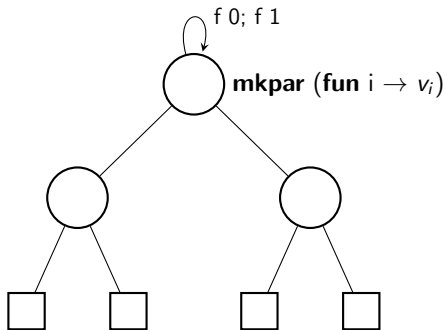
- $\xi e \xi$
- **gid**
- **at**
- $\langle\langle \dots f \dots \rangle\rangle$
- $\#x\#$
- **mkpar f**



# Primitives

## Summary:

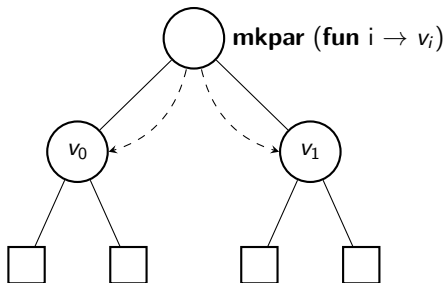
- $\xi e \xi$
- **gid**
- **at**
- $\langle\langle \dots f \dots \rangle\rangle$
- $\#x\#$
- **mkpar f**



# Primitives

## Summary:

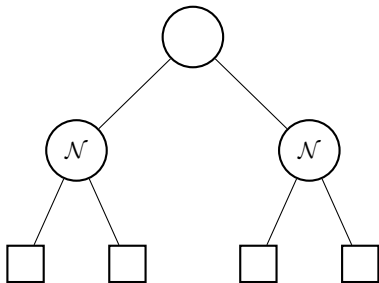
- $\xi e \xi$
- **gid**
- **at**
- $\langle\langle \dots f \dots \rangle\rangle$
- $\#x\#$
- **mkpar f**



# Primitives

## Summary:

- $\xi e \xi$
- **gid**
- **at**
- $\langle\langle \dots f \dots \rangle\rangle$
- $\#x\#$
- **mkpar**  $f$
- **finally**  $v_1 v_2$

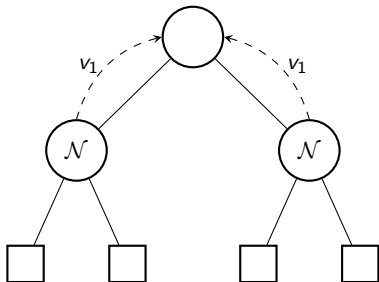




# Primitives

## Summary:

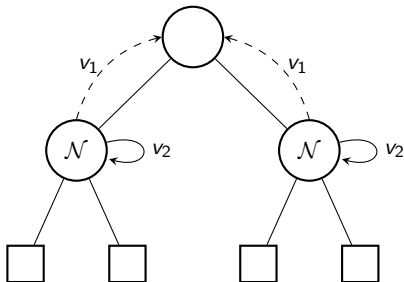
- $\xi e \xi$
- **gid**
- **at**
- $\langle\langle \dots f \dots \rangle\rangle$
- $\#x\#$
- **mkpar**  $f$
- **finally**  $v_1 v_2$



# Primitives

## Summary:

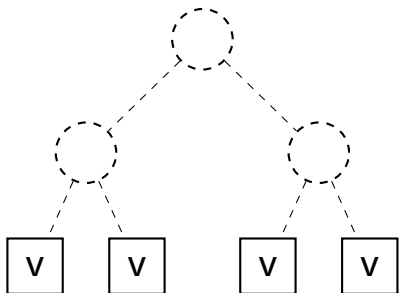
- $\xi e \xi$
- **gid**
- **at**
- $\langle\langle \dots f \dots \rangle\rangle$
- $\#x\#$
- **mkpar**  $f$
- **finally**  $v_1 v_2$



# Primitives

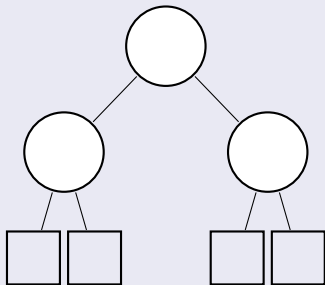
## Summary:

- `§e§`
- `gid`
- `at`
- `<<...f...>>`
- `#x#`
- `mkpar f`
- `finally v1 v2`
- `this`



## Code example

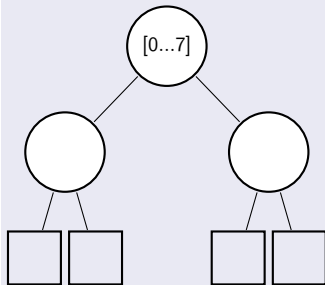
Keep the intermediate results of the sum:



```
let multi tree sum_list l =  
  where node =  
    let v = mkpar (fun i → split i l) in  
    let s = sumSeq (flatten << sum_list $v$ >> ) in  
    finally ~up:s ~keep:s  
  where leaf =  
    let s = sumSeq l in  
    finally ~up:s ~keep:s
```

## Code example

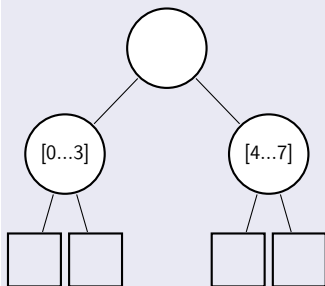
Keep the intermediate results of the sum:



```
let multi tree sum_list l =  
  where node =  
    let v = mkpar (fun i → split i l) in  
    let s = sumSeq (flatten << sum_list $v$>> ) in  
    finally ~up:s ~keep:s  
  where leaf =  
    let s = sumSeq l in  
    finally ~up:s ~keep:s
```

## Code example

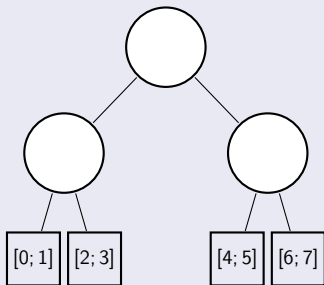
Keep the intermediate results of the sum:



```
let multi tree sum_list l =  
  where node =  
    let v = mkpar (fun i → split i l) in  
    let s = sumSeq (flatten << sum_list $v$>> ) in  
    finally ~up:s ~keep:s  
  where leaf =  
    let s = sumSeq l in  
    finally ~up:s ~keep:s
```

## Code example

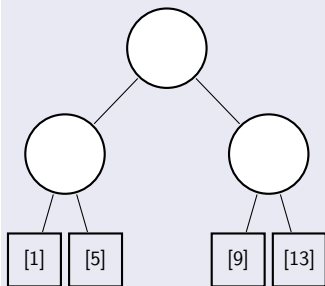
Keep the intermediate results of the sum:



```
let multi tree sum_list l =  
  where node =  
    let v = mkpar (fun i → split i l) in  
    let s = sumSeq (flatten << sum_list $v$>> ) in  
    finally ~up:s ~keep:s  
  where leaf =  
    let s = sumSeq l in  
    finally ~up:s ~keep:s
```

## Code example

Keep the intermediate results of the sum:

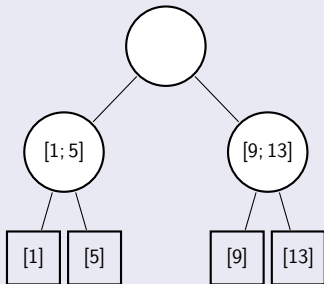


```
let multi tree sum_list l =  
  where node =  
    let v = mkpar (fun i → split i l) in  
    let s = sumSeq (flatten << sum_list $v$ >>) in  
    finally ~up:s ~keep:s  
  where leaf =  
    let s = sumSeq l in  
    finally ~up:s ~keep:s
```



## Code example

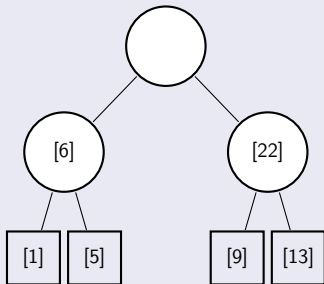
Keep the intermediate results of the sum:



```
let multi tree sum_list l =  
  where node =  
    let v = mkpar (fun i → split i l) in  
    let s = sumSeq (flatten << sum_list $v$ >> ) in  
    finally ~up:s ~keep:s  
  where leaf =  
    let s = sumSeq l in  
    finally ~up:s ~keep:s
```

## Code example

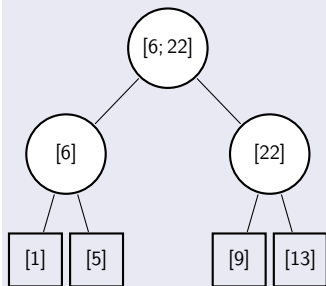
Keep the intermediate results of the sum:



```
let multi tree sum_list l =  
  where node =  
    let v = mkpar (fun i → split i l) in  
    let s = sumSeq (flatten << sum_list $v$ >> ) in  
    finally ~up:s ~keep:s  
  where leaf =  
    let s = sumSeq l in  
    finally ~up:s ~keep:s
```

## Code example

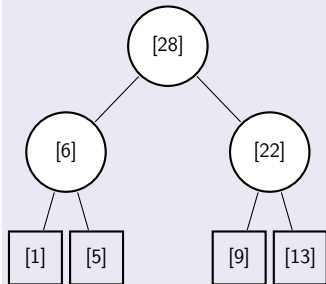
Keep the intermediate results of the sum:



```
let multi tree sum_list l =  
  where node =  
    let v = mkpar (fun i → split i l) in  
    let s = sumSeq (flatten << sum_list $v$>> ) in  
    finally ~up:s ~keep:s  
  where leaf =  
    let s = sumSeq l in  
    finally ~up:s ~keep:s
```

## Code example

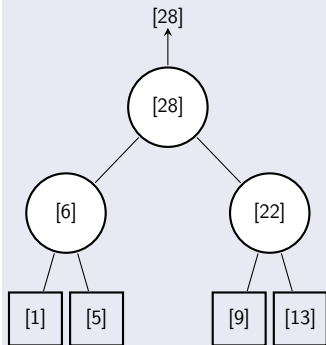
Keep the intermediate results of the sum:



```
let multi tree sum_list l =  
  where node =  
    let v = mkpar (fun i → split i l) in  
    let s = sumSeq (flatten << sum_list $v$>> ) in  
    finally ~up:s ~keep:s  
  where leaf =  
    let s = sumSeq l in  
    finally ~up:s ~keep:s
```

## Code example

Keep the intermediate results of the sum:



```
let multi tree sum_list l =  
  where node =  
    let v = mkpar (fun i → split i l) in  
    let s = sumSeq (flatten << sum_list $v$>> ) in  
    finally ~up:s ~keep:s  
  where leaf =  
    let s = sumSeq l in  
    finally ~up:s ~keep:s
```

## Formal definition of a core-language

Useful for:

## Formal definition of a core-language

Useful for:

- Study of properties

## Formal definition of a core-language

Useful for:

- Study of properties
- Proof of programs/compiler/typing rules



## Formal definition of a core-language

Useful for:

- Study of properties
- Proof of programs/compiler/typing rules

## Currently

- Inductive big-step: confluent
- Co-inductive: mutually exclusive

# Implementation

## Sequential simulator

- OCAML-like toplevel
- Test and debug
- Tree structure
- Hash tables to represent memories

```
#let multi f n =  
  where node =  
    let _=<<f ($pid$ + #n# + 1) >> in  
    finally ~up:() ~keep:(gid^"=>"^n)  
  where leaf=finally ~up:() ~keep:(gid^"=>"^n);;
```

```
— : val f : int→string tree = <multi-fun>
```

```
#(f 0)
```

```
o "0→ 0"
```

```
|
```

```
—o "0.0→ 1"
```

```
| | → "0.0.0→ 2"
```

```
| | → "0.0.1→ 3"
```

```
—o "0.1→ 2"
```

```
| | → "0.1.0→ 3"
```

```
| | → "0.1.1→ 4"
```

# Distributed implementation

## Our approach

# Distributed implementation

## Our approach

- Modular

# Distributed implementation

## Our approach

- Modular
- Generic functors

# Distributed implementation

## Our approach

- Modular
- Generic functors
- Communication routines

# Distributed implementation

## Our approach

- Modular
- Generic functors
- Communication routines
- Portable on shared and distributed memories

# Distributed implementation

## Our approach

- Modular
- Generic functors
- Communication routines
- Portable on shared and distributed memories

## Current version

- Based on MPI



# Distributed implementation

## Our approach

- Modular
- Generic functors
- Communication routines
- Portable on shared and distributed memories

## Current version

- Based on MPI
- SPMD

# Distributed implementation

## Our approach

- Modular
- Generic functors
- Communication routines
- Portable on shared and distributed memories

## Current version

- Based on MPI
- SPMD
- One process for each nodes/leaves

# Distributed implementation

## Our approach

- Modular
- Generic functors
- Communication routines
- Portable on shared and distributed memories

## Current version

- Based on MPI
- SPMD
- One process for each nodes/leaves
- Distributed over physical cores

# Distributed implementation

## Our approach

- Modular
- Generic functors
- Communication routines
- Portable on shared and distributed memories

## Current version

- Based on MPI
- SPMD
- One process for each nodes/leaves
- Distributed over physical cores
- Shared/Distributed memory optimisations

# Table of Contents

① Introduction

② Multi-ML

③ Results

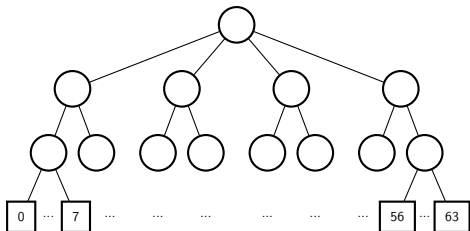
④ Conclusion

### Naive Eratosthenes sieve

- $\sqrt{(n)}$ th first prime numbers
- Based on scan
- Unbalanced

## Benchmarks

Mirev 3



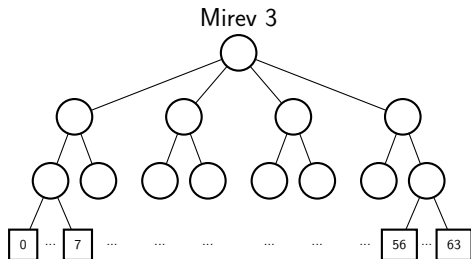
### Naive Eratosthenes sieve

- $\sqrt{(n)}$ th first prime numbers
- Based on scan
- Unbalanced

## Benchmarks

### Naive Eratosthenes sieve

- $\sqrt{(n)}$ th first prime numbers
- Based on scan
- Unbalanced



### Results

	100_000		500_000		1_000_000	
	MULTI-ML	BSML	MULTI-ML	BSML	MULTI-ML	BSML
8	0.7	1.8	22.4	105.0	125.3	430.7
64	0.3	0.3	1.3	8.7	4.1	56.1
128	0.5	0.45	2.1	5.2	4.7	24.3



# Table of Contents

- ① Introduction
- ② Multi-ML
- ③ Results
- ④ Conclusion**

# Conclusion

MULTI-ML

## MULTI-ML

- Recursive multi-functions

## MULTI-ML

- Recursive multi-functions
- Structured nesting of BSML codes

## MULTI-ML

- Recursive multi-functions
- Structured nesting of BSML codes
- Big-steps formal semantics (confuent)

### MULTI-ML

- Recursive multi-functions
- Structured nesting of BSML codes
- Big-steps formal semantics (confluent)
- Small number of primitives and little syntax extension

## MULTI-ML

- Recursive multi-functions
- Structured nesting of BSML codes
- Big-steps formal semantics (confluent)
- Small number of primitives and little syntax extension

## Future work

- Optimise MPI implementation

## MULTI-ML

- Recursive multi-functions
- Structured nesting of BSML codes
- Big-steps formal semantics (confluent)
- Small number of primitives and little syntax extension

## Future work

- Optimise MPI implementation
- Type system for MULTI-ML



## MULTI-ML

- Recursive multi-functions
- Structured nesting of BSML codes
- Big-steps formal semantics (confluent)
- Small number of primitives and little syntax extension

## Future work

- Optimise MPI implementation
- Type system for MULTI-ML
- Real life benchmarks

Thank you for your attention !

Any questions ?