



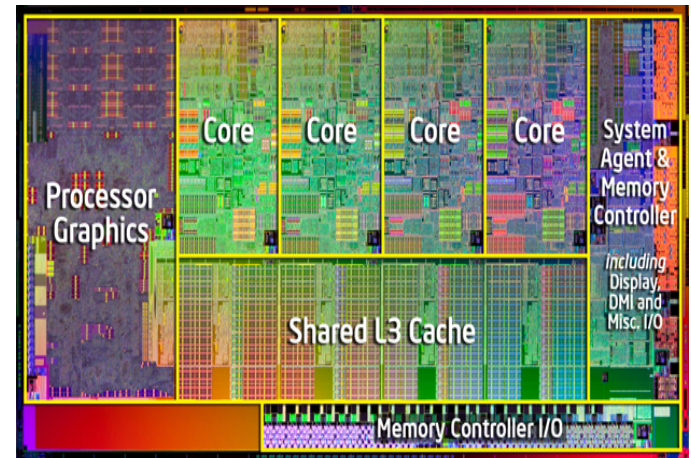
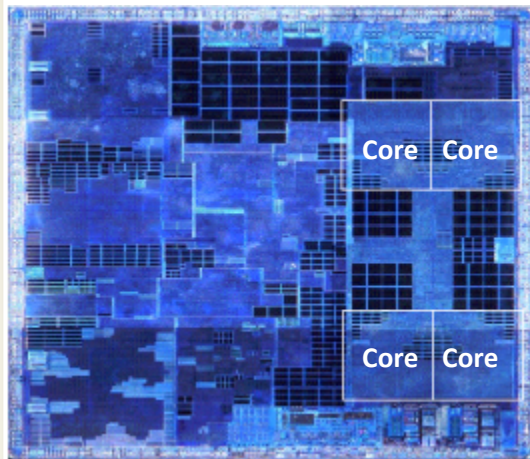
WISCONSIN
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Dataflow Execution of Sequential Imperative Programs on Multicore Architectures

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Gurindar S. Sohi



Multicores in General Purpose Systems



Programming Multicores



- Statically-parallel programs
- Explicit parallel execution
- Correctness of parallel execution?



Programming Multicores



Solving Challenges: Current Approach

- Fix the shortcomings
- User Driven
 - Prune nondeterminism
 - Recreate original sequence
- Research Proposals
 - Reintroduce repeatability



Modern Programming Practices

- Object-oriented programming
- Reusable modular design
- Data encapsulation
- Imperative languages



Execution Models

- Dataflow execution
 - Expose innate parallelism
- Superscalar processors
 - Dynamic parallelism
 - Statically-sequential programs



Executive Summary



Executive Summary

Statically-Sequential Programs

Dataflow Parallel Execution



Outline

- Proposed Model
- Prototype
- Evaluation



Outline

- Proposed Model
- Prototype
- Evaluation



Developing the Model for Multicores

- Sequential imperative programming language
 - Leverage modern programming principles
 - Provision for worst-case scenarios
- Achieving dataflow parallel execution



Program Decomposition

Static Program

object A

..

```
while (cond) {  
    function F ( )  
}
```

```
function F' ( )
```



Dynamic Sequence

..

evaluate cond (PS1)

F1 ()

evaluate cond (PS2)

F2 ()

evaluate cond (PS3)

F3 ()

..



Program Decomposition

Static Program

object A

..

```
while (cond) {  
  function F ( )  
}
```

```
function F' ( )
```

Functions

..

evaluate cond (PS1)

F1 ()

evaluate cond (PS2)

F2 ()

evaluate cond (PS3)

F3 ()

..



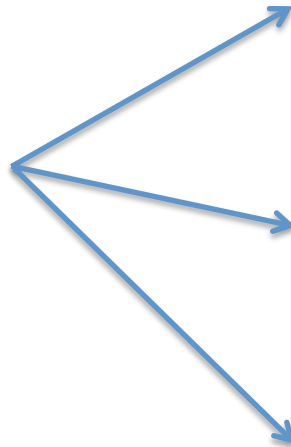
Program Decomposition

Static Program

```
object A
..  
while (cond) {  
    function F ( )  
}  
function F' ( )
```

Program Segments

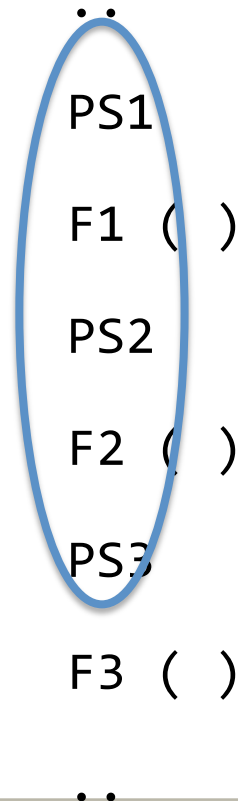
```
..  
evaluate cond (PS1)  
F1 ( )  
evaluate cond (PS2)  
F2 ( )  
evaluate cond (PS3)  
F3 ( )  
..
```



Program Decomposition

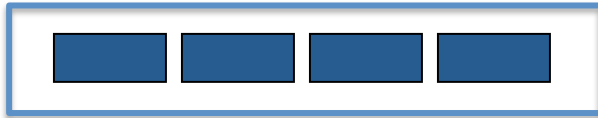
- Collection of computations
- Implicit order

Dynamic Sequence



Program Execution

Multicore Processor



Time
↓

Dynamic Sequence

..

PS1

F1 ()

PS2

F2 ()

PS3

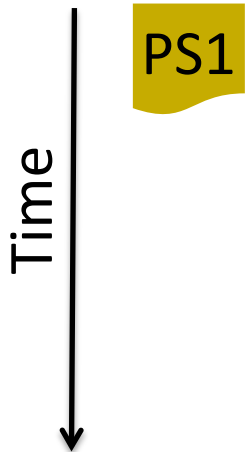
F3 ()

..



Program Execution

Multicore Processor



Dynamic Sequence

..

PS1

F1 ()

PS2

F2 ()

PS3

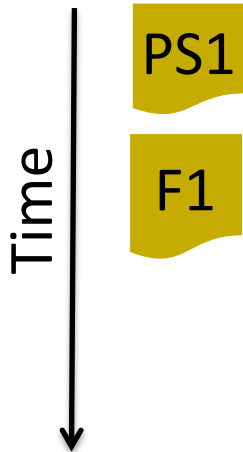
F3 ()

..



Program Execution

Multicore Processor



Dynamic Sequence

..

PS1

F1 ()

PS2

F2 ()

PS3

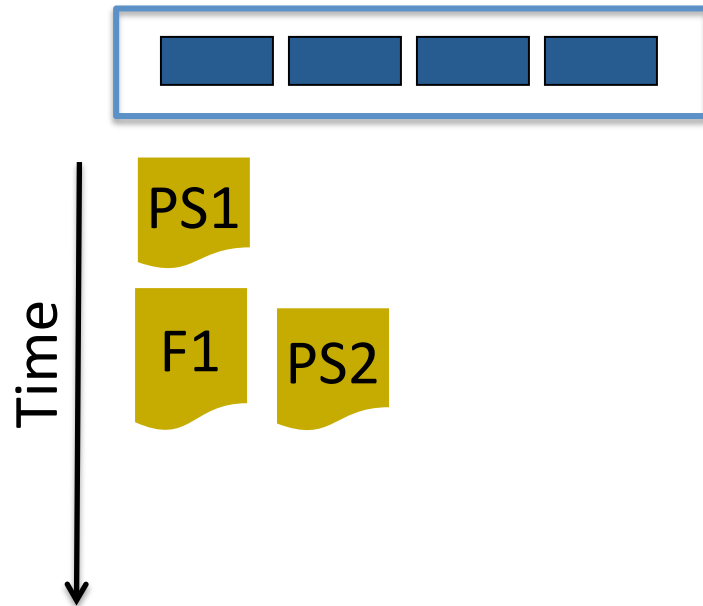
F3 ()

..



Program Execution

Multicore Processor



Dynamic Sequence

..

PS1

F1 ()

PS2

F2 ()

PS3

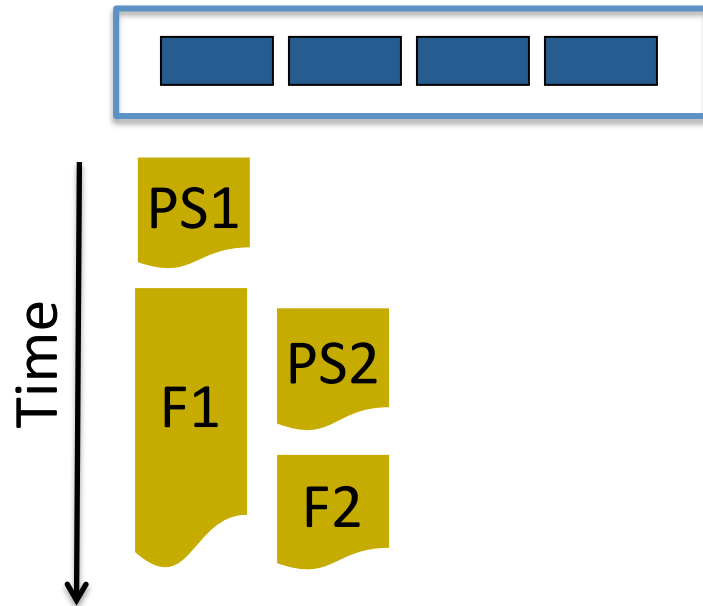
F3 ()

..



Program Execution

Multicore Processor



Dynamic Sequence

..

PS1

F1 ()

PS2

F2 ()

PS3

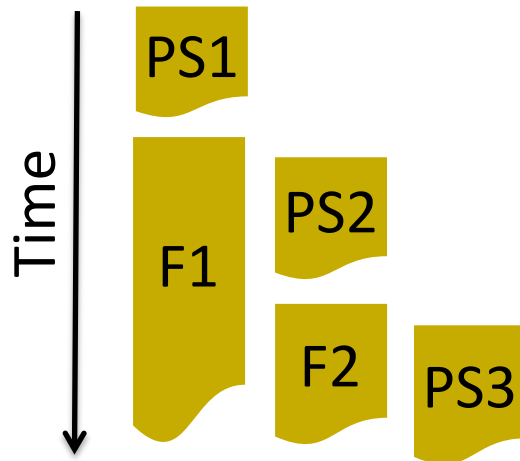
F3 ()

..



Program Execution

Multicore Processor



Dynamic Sequence

..

PS1

F1 ()

PS2

F2 ()

PS3

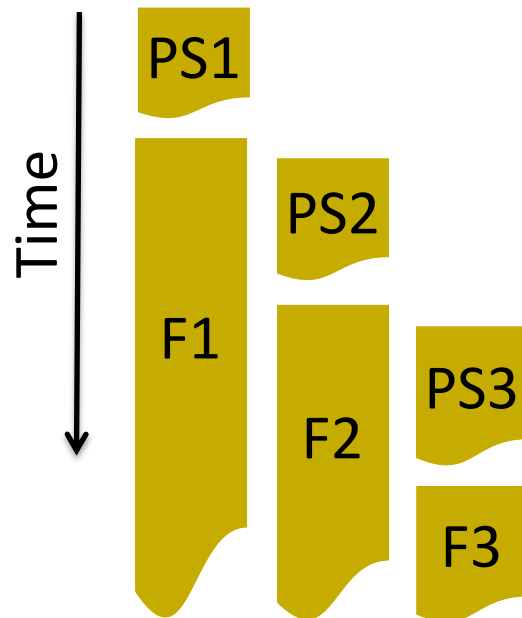
F3 ()

..



Program Execution

Multicore Processor



Dynamic Sequence

..

PS1

F1 ()

PS2

F2 ()

PS3

F3 ()

..



Program Execution

- Implicit order
 - Hindrance
 - + Exploitable

Dynamic Sequence

..

F1 ()

PS1

F2 ()

PS2

F3 ()

PS3

..



Level of Abstraction

object A

..

```
while (cond) {  
    function F ( )  
}
```

```
function F' ( )
```

 “Instruction”



Level of Abstraction

object A

..

while (cond) {

function F (**..interface..**)

}

function F' ()

 “Operands”



Level of Abstraction

object A

..

```
while (cond) {
```

```
    function F ({wr_set} {rd_set})
```

```
}
```

```
function F' ( )
```



“Operands”



Level of Abstraction

object A



“Unit of Data”

..

```
while (cond) {  
    function F ({wr_set} {rd_set})  
}  
function F' ( )
```



Achieving Dataflow Parallel Execution

- Our view of a program
 - Computations
 - Level of abstraction
- Classical dataflow machines
 - Tokens: data dependence
 - Resource management



Achieving Dataflow Parallel Execution

- Proposed Model
 - Level of abstraction
 - Imperative programs can mutate data
- Token protocol
 - Data dependence
- Program order



Data Dependence

object A

..

```
while (cond) {  
    function F ({wr_set} {rd_set})  
}  
function F' ( )
```



Data Dependence: Identifying Objects

object A

..

```
while (cond) {  
    function F ({wr_set} {rd_set})  
}
```

```
function F' ( )
```

F1 {B, C} {A}

F2 {D} {A}

F3 {A, E} {I}

F4 {B} {D}

F5 {B} {D}

F6 {G} {H}



Data Dependence: Unknown Data Set

object A

..

```
while (cond) {  
  function F ({wr_set} {rd_set})  
}
```

function F' ({?} {?})

F1 {B, C} {A}

F2 {D} {A}

F3 {A, E} {I}

F4 {B} {D}

F5 {B} {D}

F6 {G} {H}

F' {?} {?}



Data Dependence

F1 {B, C} {A}

F2 {D} {A}

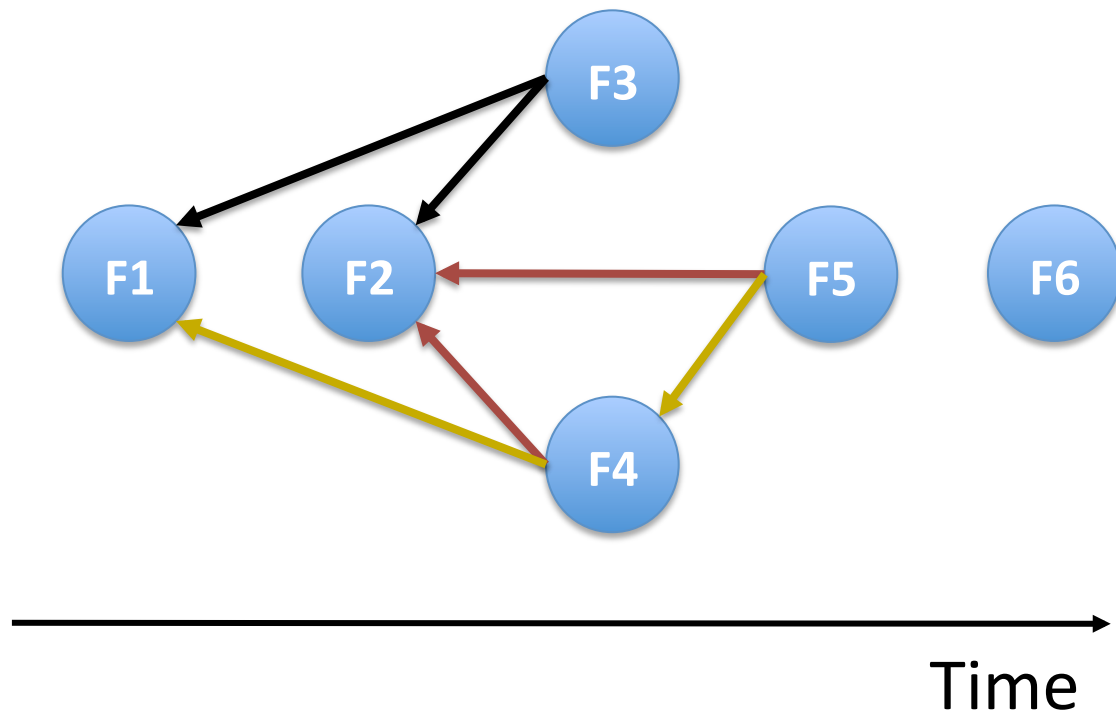
F3 {A, E} {I}

F4 {B} {D}

F5 {B} {D}

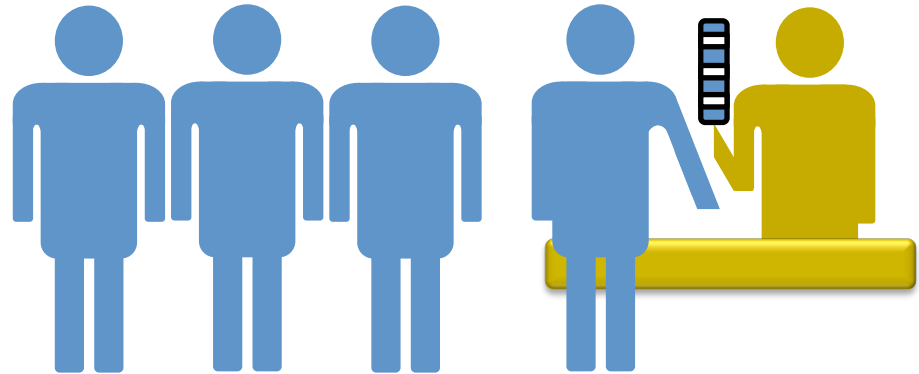
F6 {G} {H}

F' {?} {?}

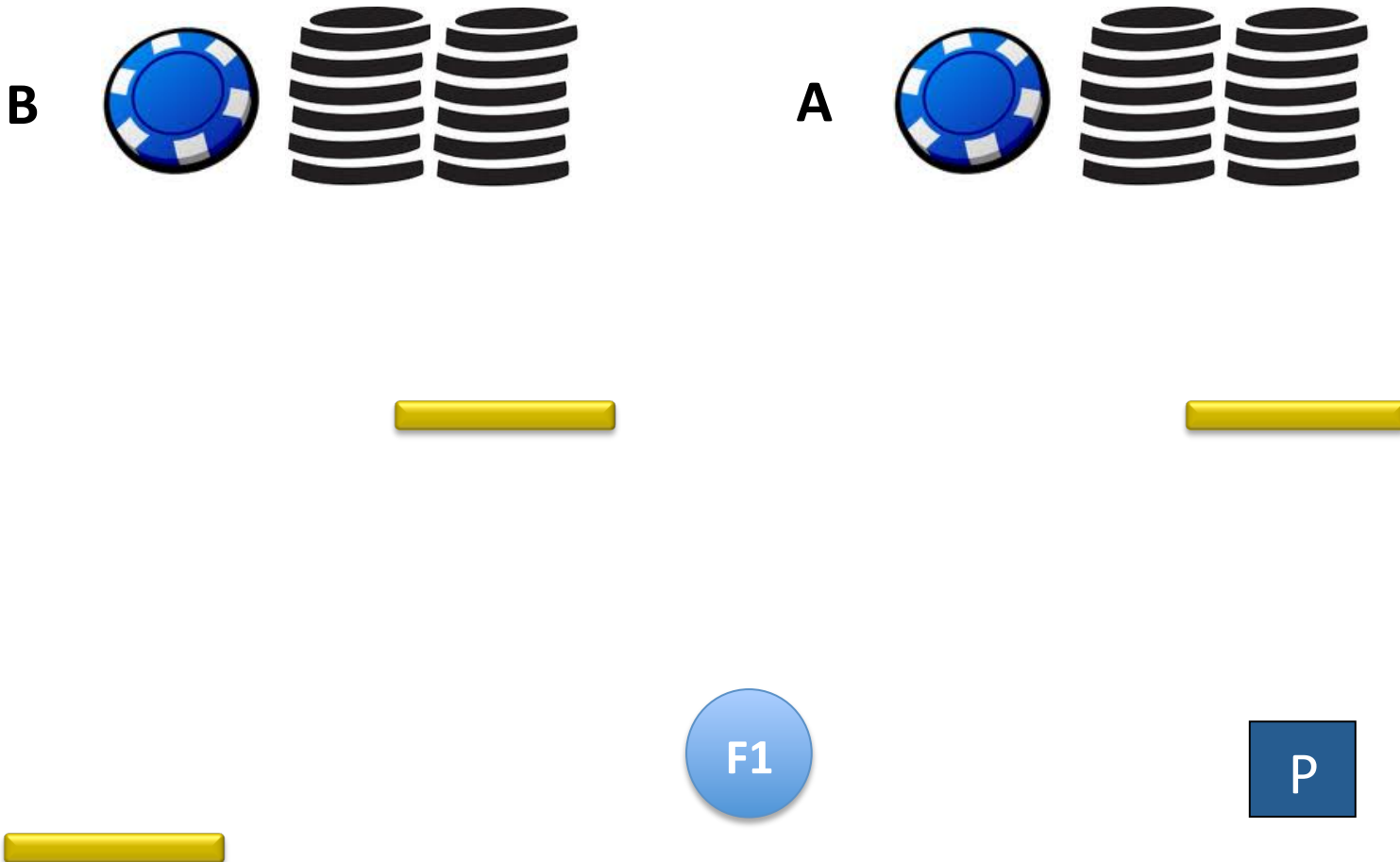


Token Protocol

object A



Token Protocol: Acquire



Token Protocol: Acquire

B



A



Token Protocol: Submit

B



A



Token Protocol: Shelf

B



A



Token Protocol: Shelf

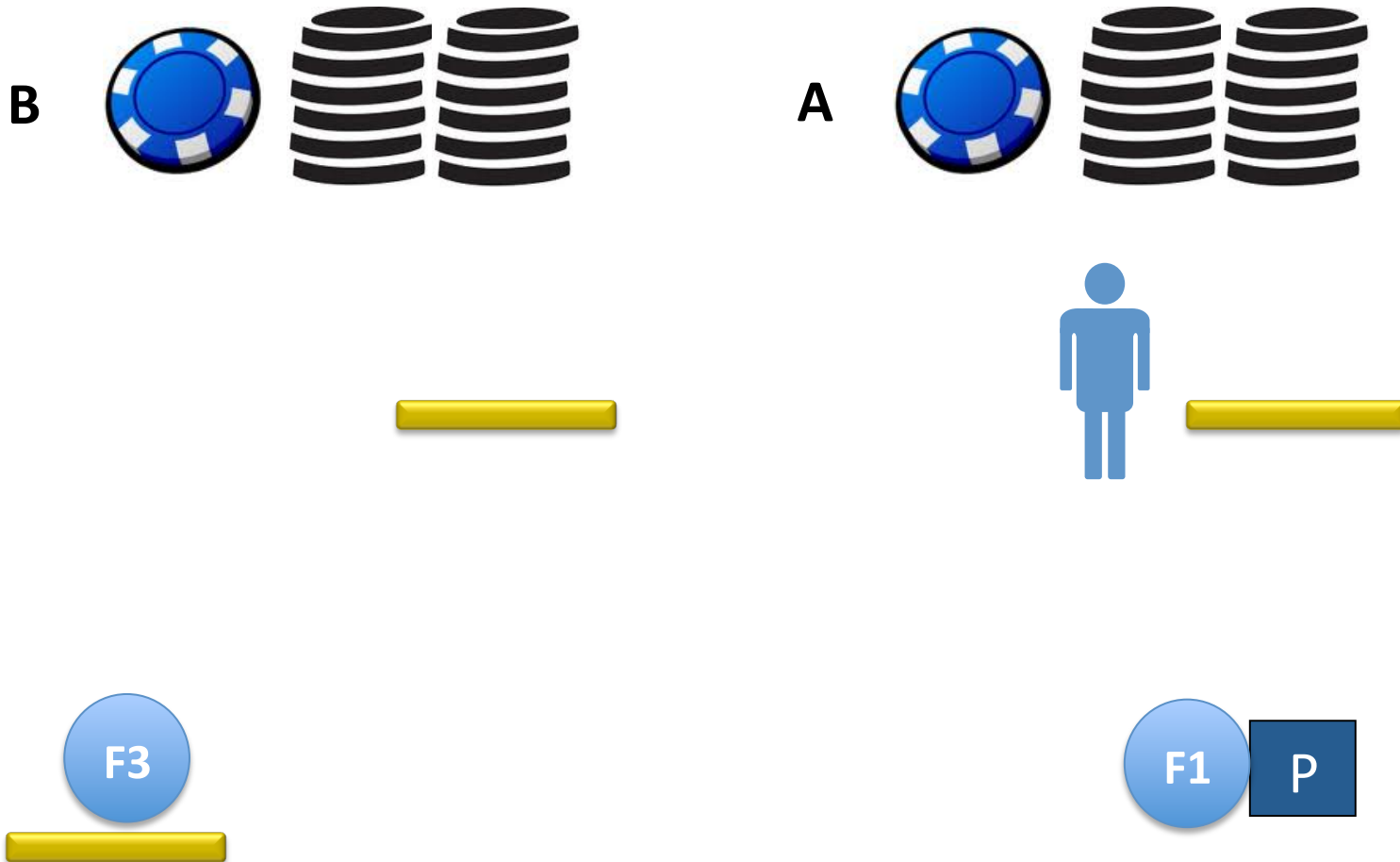
B



A



Token Protocol: Release

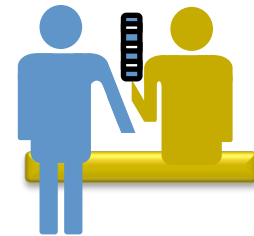
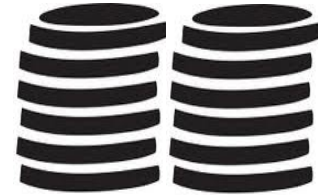


Token Protocol: Pass

B



A



F3



F1

P

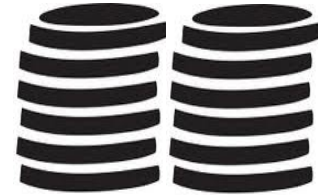


Token Protocol: Schedule

B



A



F3



P

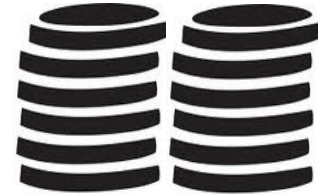


Token Protocol: Schedule

B



A

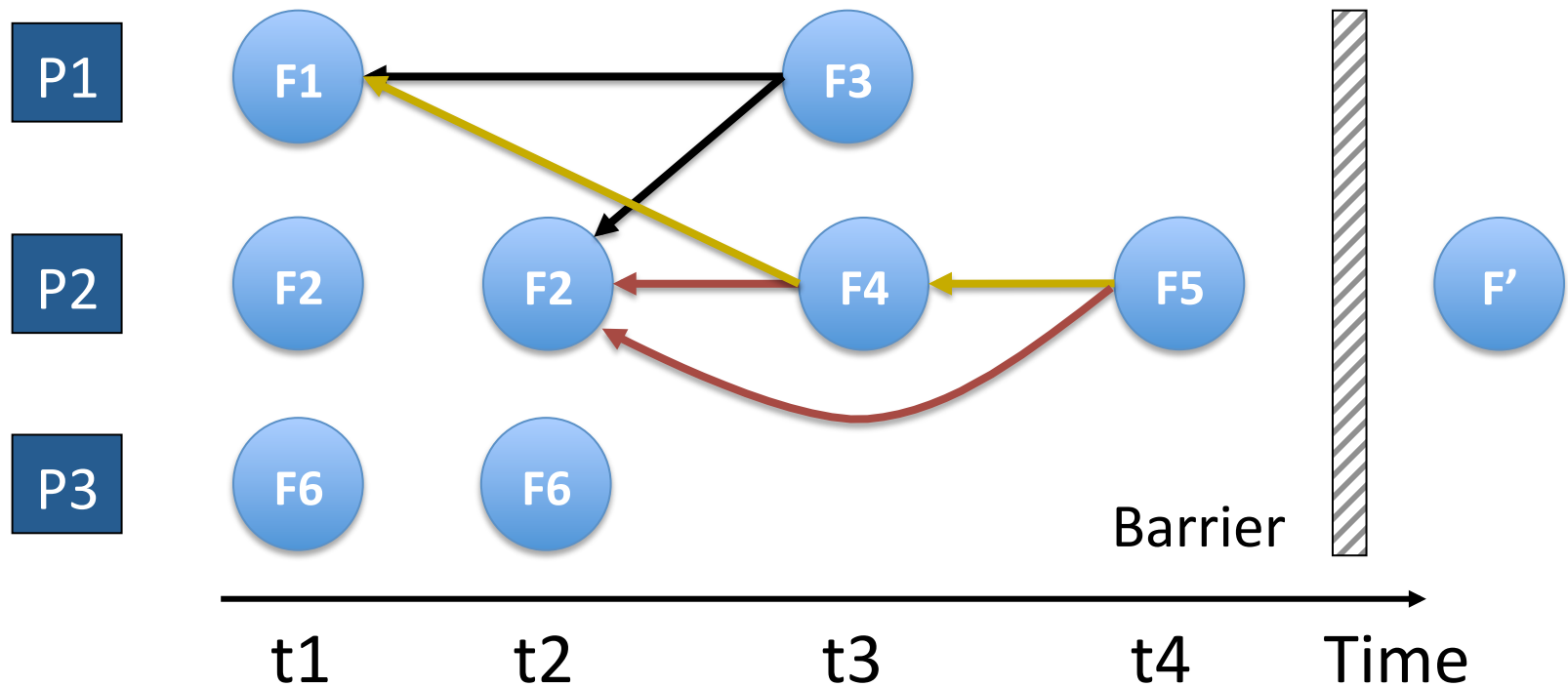


Exploiting Program Order

- Deadlock avoidance in token protocol
 - Process functions in program order
 - Grant tokens in request order
- Resource management
 - Unravel as much as resources allow
 - Guarantee forward progress



Dataflow Execution on Multicores



Proposed Model: Summary

- Sequentially determinate, race-free
 - Repeatable
 - Predictable
- Dataflow execution
 - No explicit parallelization
- ~~Correctness of parallel execution?~~



Outline

- Proposed Model
- Prototype
- Evaluation



Prototype

- Runtime library (C++ currently)
- Implements token protocol
- Achieves parallel execution



Composing Programs

Sequential Program

Object A

..

```
while (cond) {  
  function F: ( .. )  
}
```

Function F': {?} {?}

Program in Proposed Model

Object A

..

```
while (cond) {  
  
}
```

F'(..);



Composing Programs

Sequential Program

Object A

..

```
while (cond) {  
  function F: ( .. )  
}
```

Function F': {?} {?}

Program in Proposed Model

Object A : **Token**

..

```
while (cond) {  
  
}
```

F' (..);



Composing Programs

Sequential Program

Object A

..

```
while (cond) {  
    function F: ( .. )  
}
```

Function F': {?} {?}

Program in Proposed Model

Object A : Token

..

```
while (cond) {  
    df_execute (                &F);  
}
```

F' (..);



Composing Programs

Sequential Program

Object A

..

```
while (cond) {  
    function F: ( .. )  
}
```

Function F': {?} {?}

Program in Proposed Model

Object A : Token

..

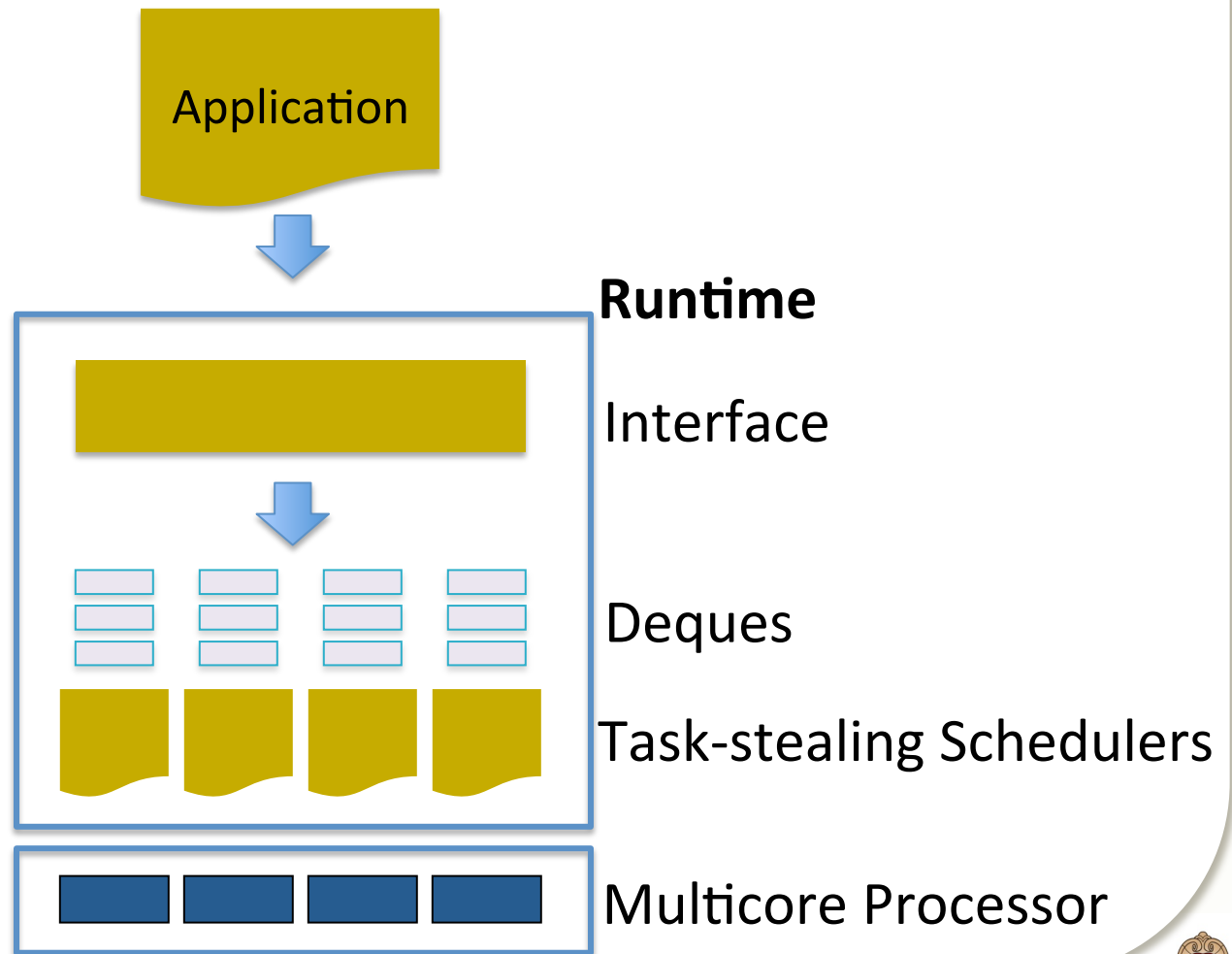
```
while (cond) {  
    df_execute (wr_set, rd_set, &F);  
}
```

df_end ();

F' (..);



Parallel Execution Mechanics



Outline

- Proposed Model
- Prototype
- Evaluation



Evaluation

- Ease of programming (qualitative)
- Performance & overheads
- Setup
 - Microbenchmarks & benchmarks
 - 3 stock multicore machines



bzip2

Sequential

..

..

```
while (!EOF) {
```

```
    block = new block_t (InFile, size);
```

```
    compress (block)
```

```
    file_write (OpFile, block);
```

```
}
```

..



bzip2: Pthread

```
for (;;) {
    pthread_mutex_lock(fifo->mut);
    while (fifo->empty) {
        if (allDone == 1) {
            pthread_mutex_unlock(fifo->mut);
            return (NULL);
        }
        GetSystemTime(&systemtime);
        SystemTimeToFileTime(&systemtime, (FILETIME
*)&filetime);
        waitTimer.tv_sec = filetime.QuadPart / 10000000;
        waitTimer.tv_nsec = filetime.QuadPart -
((LONGLONG)waitTimer.tv_sec * 10000000) * 10;
        waitTimer.tv_sec++;
        pret = pthread_cond_timedwait(fifo->notEmpty,
fifo->mut, &waitTimer);
        FileData = queueDel(fifo, &inSize, &blockNum);
        pthread_mutex_unlock(fifo->mut);
        pret = pthread_cond_signal(fifo->notFull);
        outSize = (int) ((inSize*1.01)+600);
        pthread_mutex_lock(MemMutex);
        CompressedData = new char[outSize];
        pthread_mutex_unlock(MemMutex)
        if (CompressedData == NULL) {
```

```
while ((currBlock < NumBlocks) || (allDone == 0)) {
    pthread_mutex_lock(OutMutex);
    if ((OutputBuffer.size() == 0) || (OutputBuffer
[currBlock].bufSize < 1) || (OutputBuffer[currBlock].buf
== NULL)) {
        pthread_mutex_unlock(OutMutex);
        usleep(50000);
        continue;
    } else
        pthread_mutex_unlock(OutMutex);

    ret = write(hOutfile, OutputBuffer[currBlock].buf,
OutputBuffer[currBlock].bufSize);
    CompressedSize += ret;
    pthread_mutex_lock(OutMutex);

    pthread_mutex_lock(MemMutex);
    if (OutputBuffer[currBlock].buf != NULL) {
        delete [] OutputBuffer[currBlock].buf;
        NumBufferedBlocks--;
    }
    pthread_mutex_unlock(MemMutex);
    pthread_mutex_unlock(OutMutex);
    currBlock++;
```





bzip2: Proposed Model

Sequential

```
..  
..  
while (!EOF) {  
  
    block = new block_t (InFile, size);  
  
    compress (block)  
    file_write (OpFile, block);  
}  
..
```

Proposed Model

```
..  
  
while (!EOF) {  
  
    block = new block_t (InFile, size);  
  
  
  
}  
..
```



bzip2: Proposed Model

Sequential

```
..  
..  
while (!EOF) {  
  
    block = new block_t (InFile, size);  
  
    compress (block)  
    file_write (OpFile, block);  
}  
..
```

Proposed Model

```
..  
  
opset.insert (OpFile);  
while (!EOF) {  
  
    block = new block_t (InFile, size);  
    blset.insert (block);  
    df_execute (blset, &compress);  
    df_execute (opset, blset, &file_write);  
}  
..
```



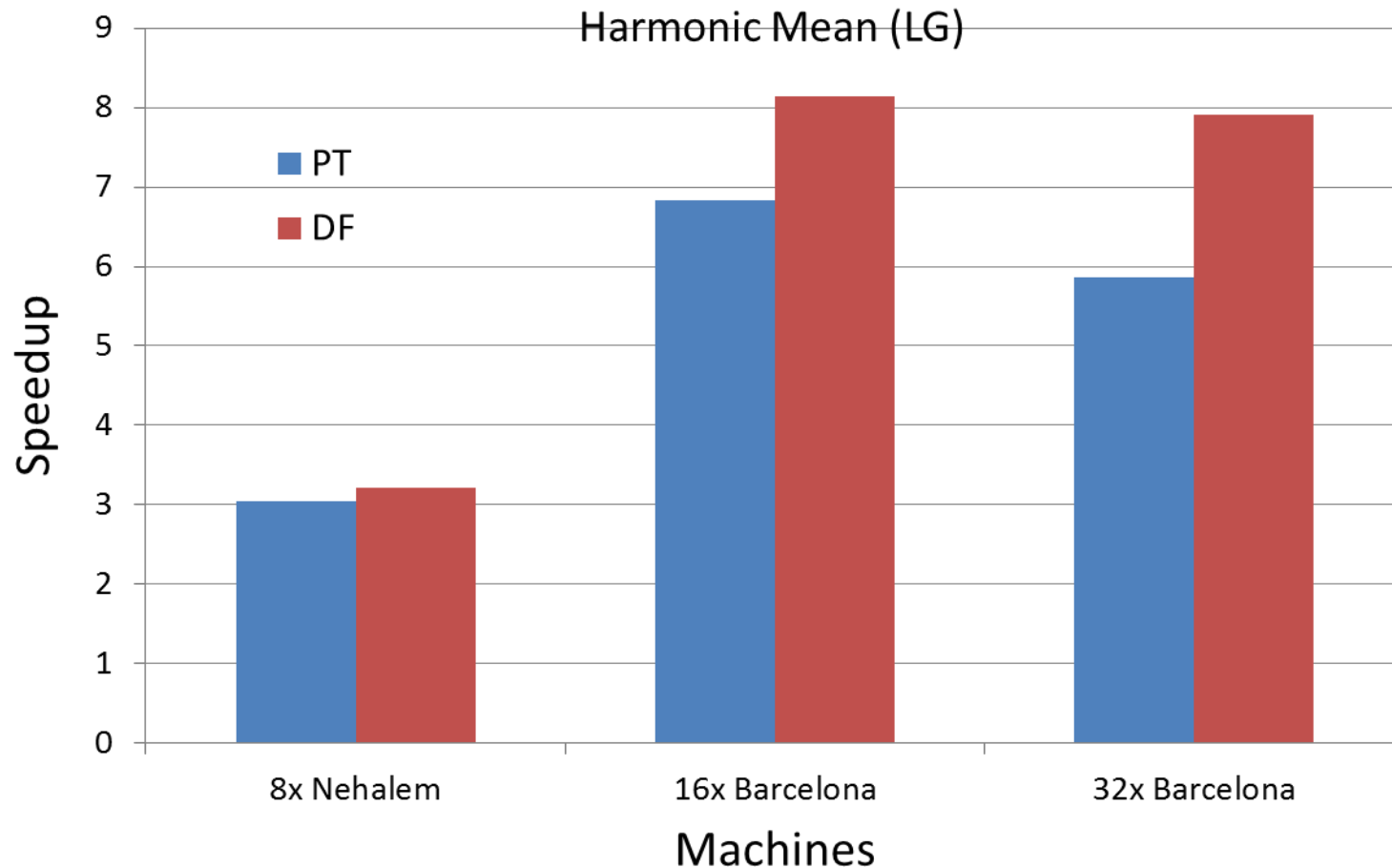
Results

Benchmark
barneshut
barneshut-LG
blackscholes
blackscholes-LG
bzip2
bzip2-LG
dedup
histogram
reverse_index
microbenchmarks

- Machines
 - 4-core/8-thread Nehalem Core i7
 - 16-core AMD Opteron 8350
 - 32-core AMD Opteron 8356
- Input sizes
 - Small, Medium, Large



Results: Competitive Performance



Other Results

- Performance (benchmarks)
 - Different task granularities
 - Scalability
- Overheads (benchmarks & microbenchmarks)
 - Token protocol
 - Granularity requirements
- Resource usage (benchmarks & microbenchmarks)



Related Work

- Determinate models
 - Jade, Serialization Sets, DPJ
 - SMPSs, Task Superscalar
- Nondeterministic models
 - Cilk, TBB



Summary

- Novel execution model for multicores
 - Statically-Sequential Imperative Programs
 - Dataflow Parallel Execution
- Benefits
 - Sequentially Determinate Execution
 - Competitive Performance



Related Work: Determinate Models

- SMPs (StarSs)
 - Task-flow graph based on memory locations
 - Data renaming
 - Centralized scheduler
- Task Superscalar
 - Emulates superscalar processors
- DPJ
 - Static, type-and-effect system



Related Work: Nondeterministic Models

- Task-based
 - Cilk, TBB
- Multithreaded
 - Pthread



Overheads

Overhead	Core i7 (cycles)	AMD 8350 (cycles)	AMD 8356 (cycles)
Token Processing (Base)	Few 100 to Few 1000		
Additional object	Few 100 to Few 1000		
Granularity (Base)	4000	12000	18000
Additional object	2000	2000	4000

