Freeing Programmers from the Shackles of Sequentiality

Thesis Proposal Talk

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Committee

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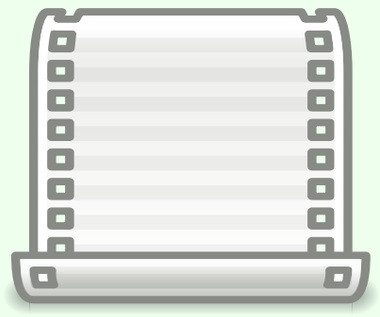
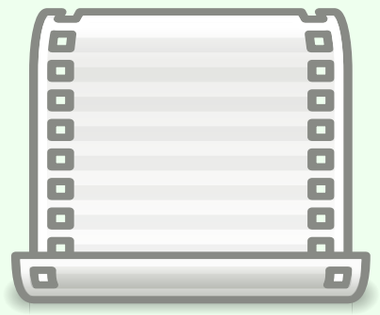
Marco Viera (UC)





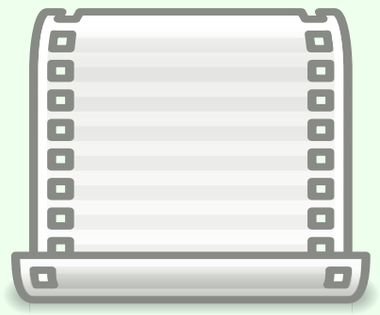

spring


RAILS


boost
C++ LIBRARIES


Java


LLVM
COMPILER INFRASTRUCTURE

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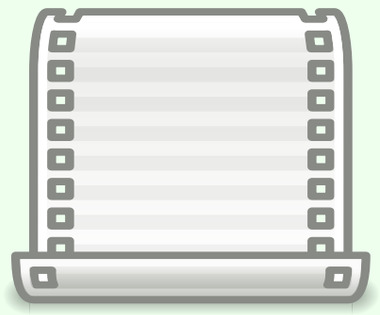


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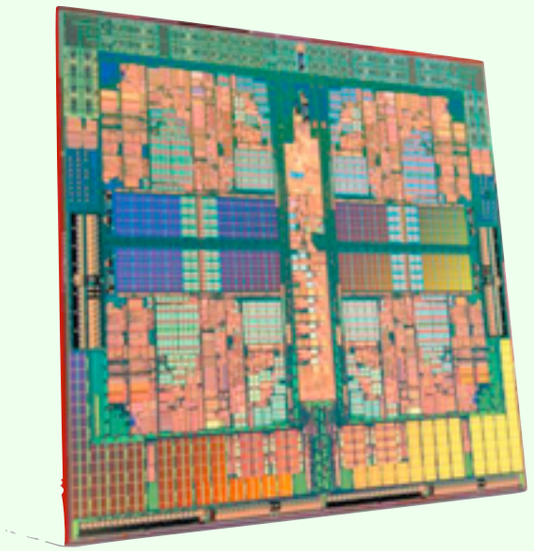
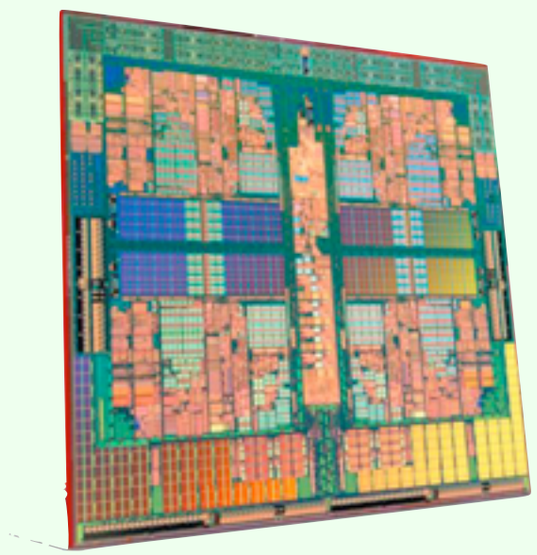


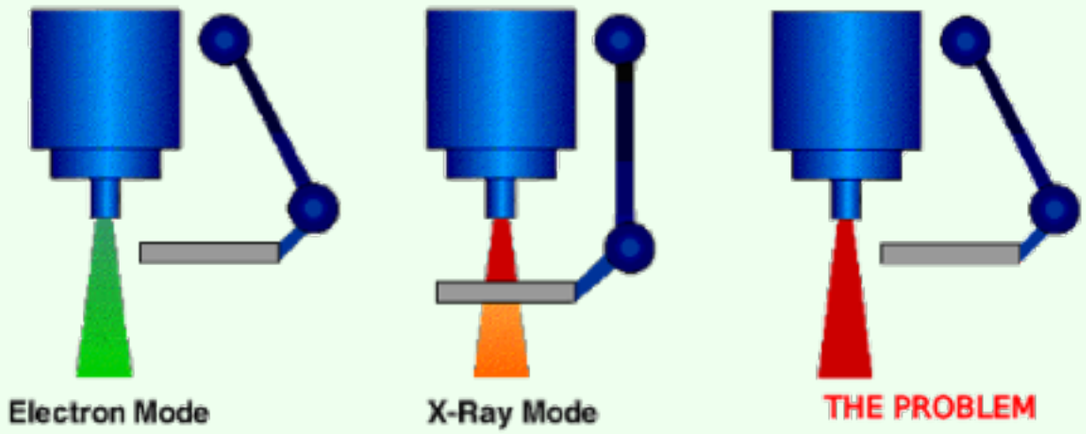
How to write and use frameworks and libraries correctly?



How to write correct parallel/concurrent code?

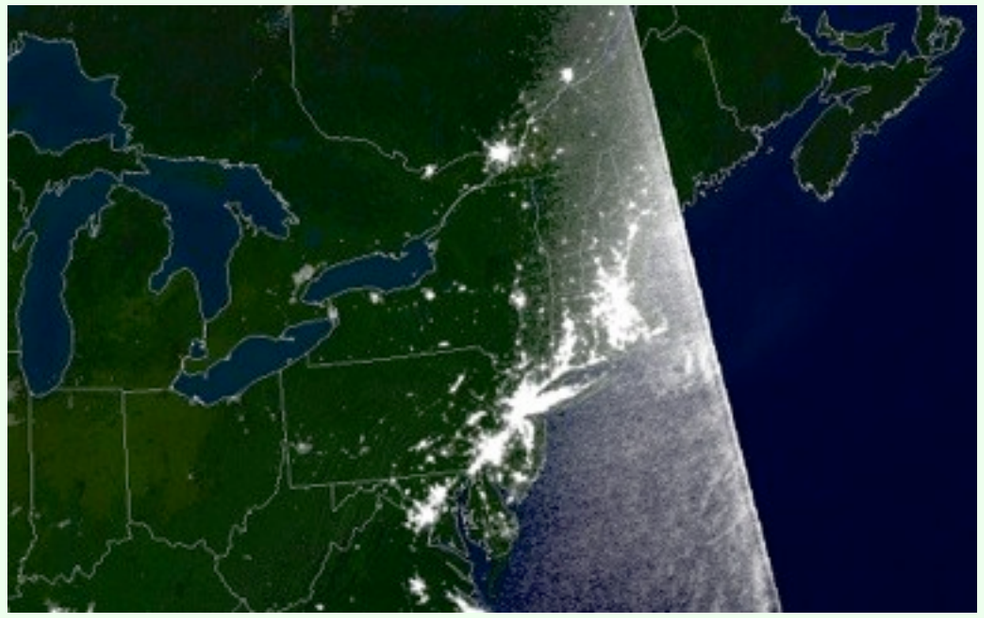
Why correctness matters?

- Therac-25
- race condition
- 3 deaths
- 3 heavy injuries



Why correctness matters?

- Blackout (2003)
- race condition
- 55,000,000 people affected



How to solve these problems?

Step by step

- Kevin Bierhoff check correct object usage:
  - **type state** to check **object protocols**
  - **access permissions** to tackle **aliasing**
- Plural [sequential protocols]

Step by step

- Nels Beckman extend Bierhoff's work to verify object protocols in concurrent settings
  - **access permission** to check correct **synchronization**
  - **access permissions** to **optimize** STM
- NIMBY/Sync' or Swim [concurrent protocols]

Step by step

- So far we can check that programs
  - obey object protocols
  - are properly synchronized
- How to write concurrent programs in first place?

How to write concurrent programs?

- Experiment
  - Implemented a few programs in various parallel programming abstractions
- Observation
  - no silver bullet
  - implicit parallelism appeared better
  - no solutions for future

Pushing the Envelope

- How should we write parallel code in 20-30 years?

Pushing the Envelope

- How should we write parallel code in 20-30 years?

Don’t do it!

-- Doug Lea

Pushing the Envelope

- make experiment
- ÆMINIUM ↔ parallelism
  garbage collector ↔ memory management
- automatically parallelization of code
  - composable
  - modular

Thesis Statement

The flow of access- and group-permissions provides a powerful abstraction to capture common programming idioms while simultaneous enabling the safe extraction of efficient concurrency.

In other words ...

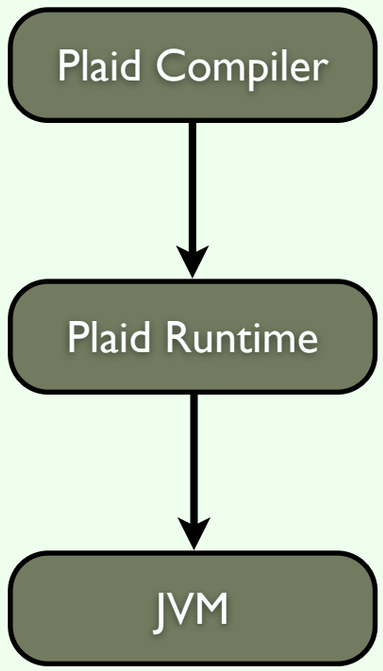
- propose abstract concept (ÆMINIUM)
- use permission information for automatic parallelization of programs
- permissions are suitable abstraction
  - can express common concurrent programming patters
  - allow us to achieve better performance

Hypotheses

- The ÆMINIUM approach is
  - **save** (i.e., no data races)
  - **efficient** (i.e., achieve speedup)
  - **practical** (i.e., express common programming paradigms)

Approach

- **formalizing** and **implementation** of the ÆMINIUM approach



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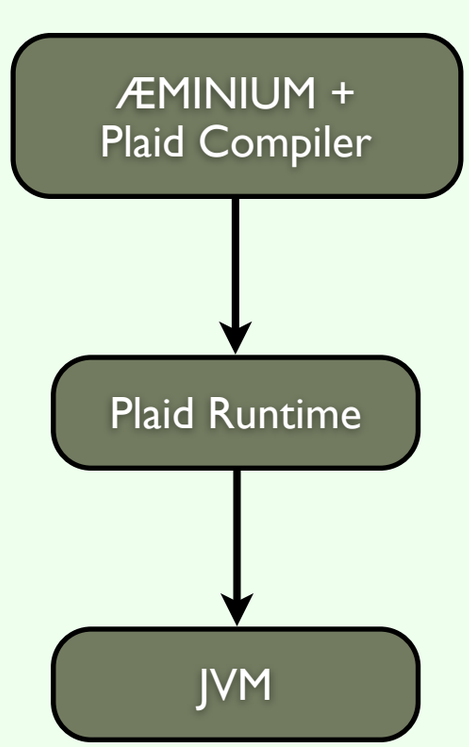

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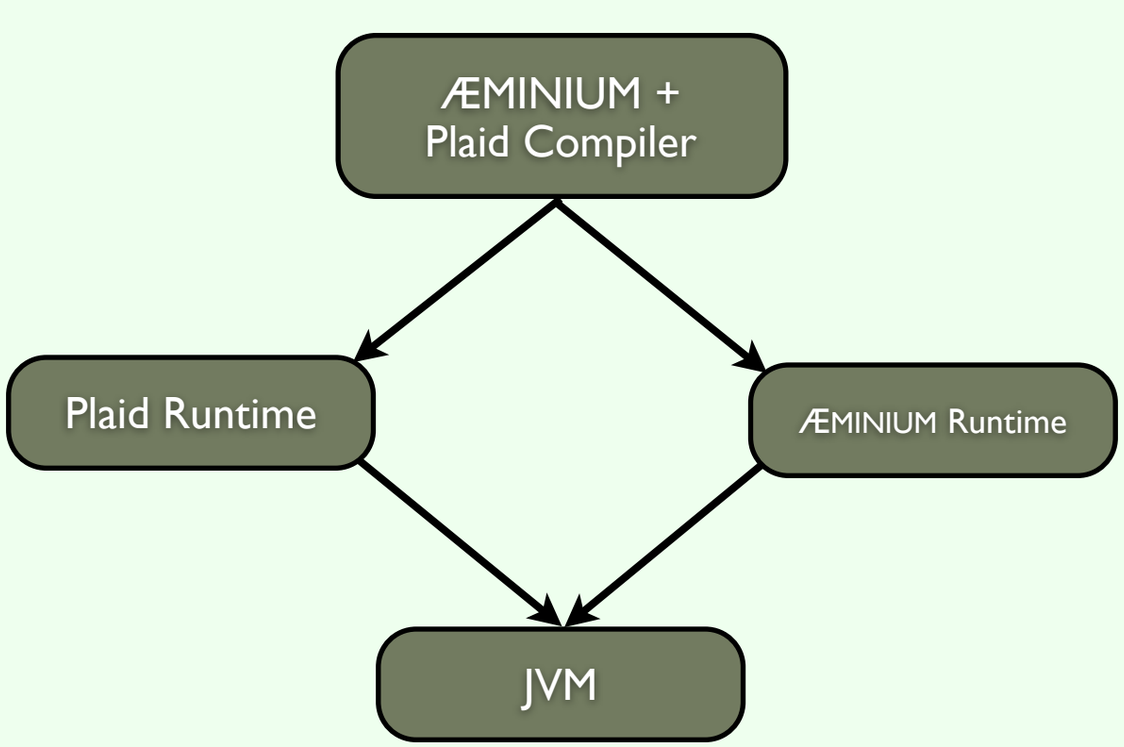
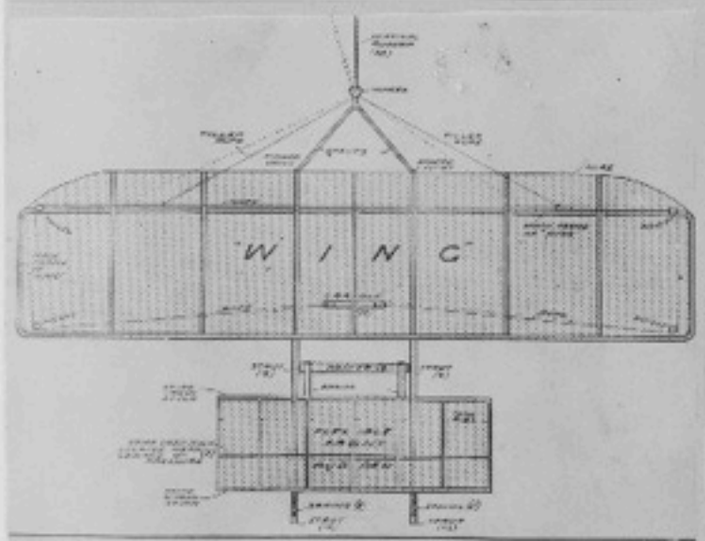


Contributions

- formal system of ÆMINIUM
- proof of concept implementation
- evaluation of feasibility

Wright brothers aeroplane - patented plans, 1908. Main collection.



THE TOP PLAN OF THE WRIGHT AEROPLANE.

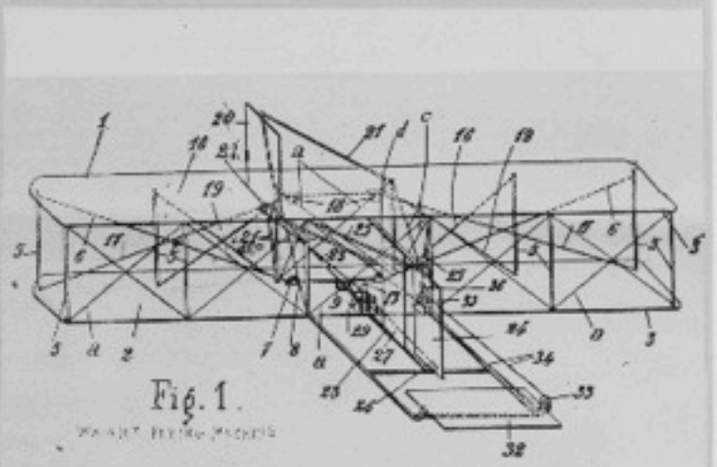


Fig. 1.

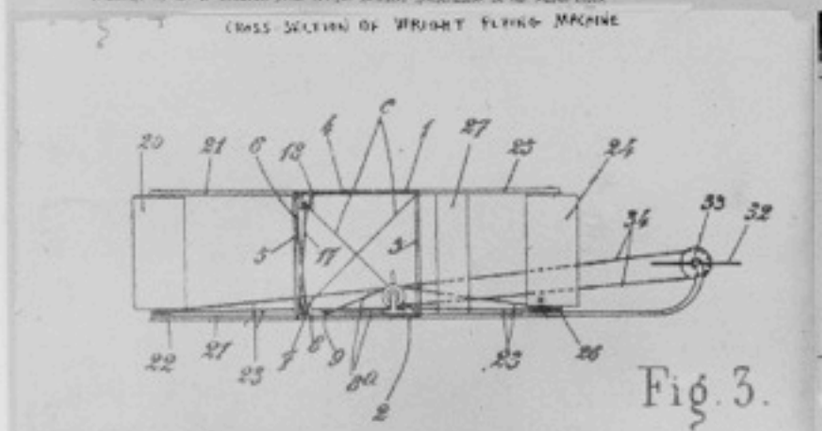
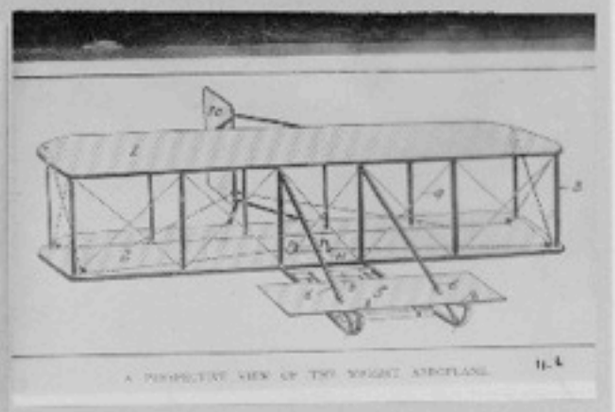


Fig. 3.

Figures descriptives du brevet français Wright et Wright



A PERSPECTIVE VIEW OF THE WRIGHT AEROPLANE.

The Approach Explained

Access Permissions

- abstract capabilities associated with object references that encode
  - **access rights** (e.g., read/write)
  - **aliasing** information
- extensively used for verification (e.g. concurrency, protocols)

Access Permissions

Access \ Aliasing	1	N
RW	unique	shared
R	immutable	immutable

Access Permissions

- **linear logic** (resource logic)

- **split** and **join**

Access Permissions

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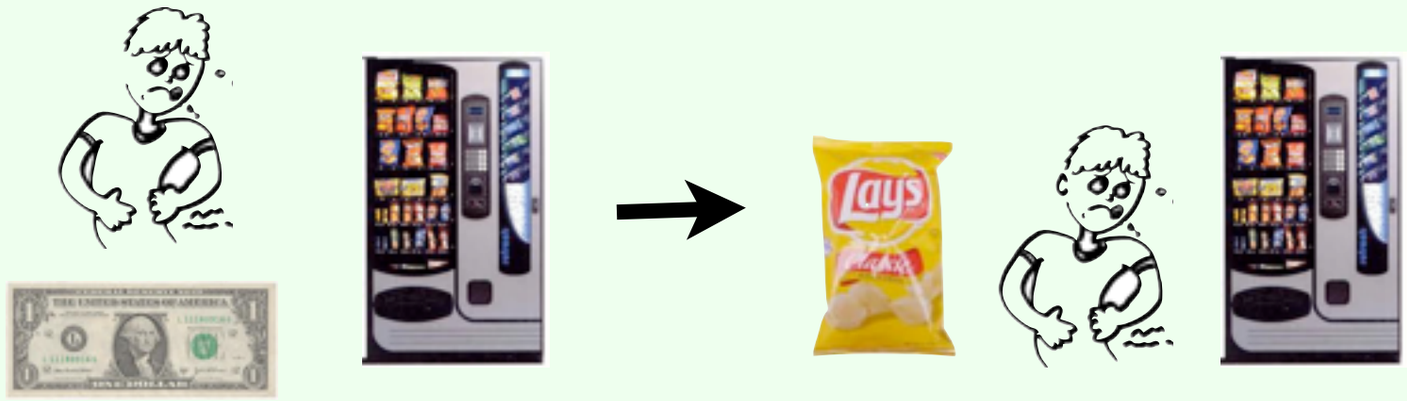
Access Permissions

- **linear logic** (resource logic)



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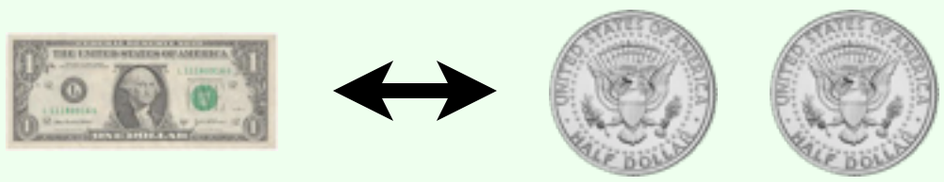

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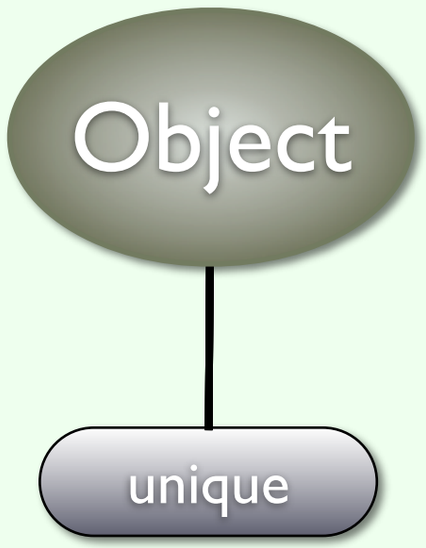
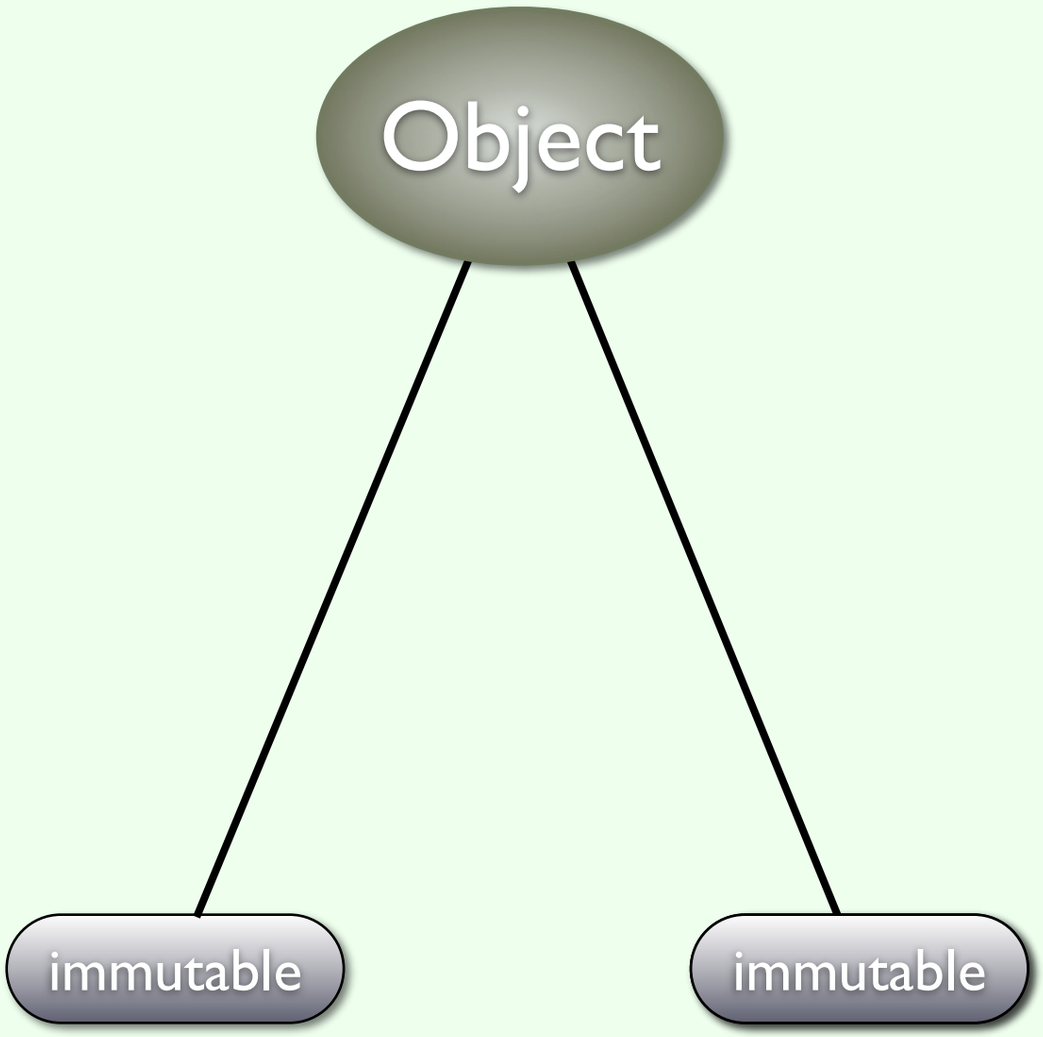


Unique Permission

- aliases = 1
- access= RW
- “thread local”
- no synchronization

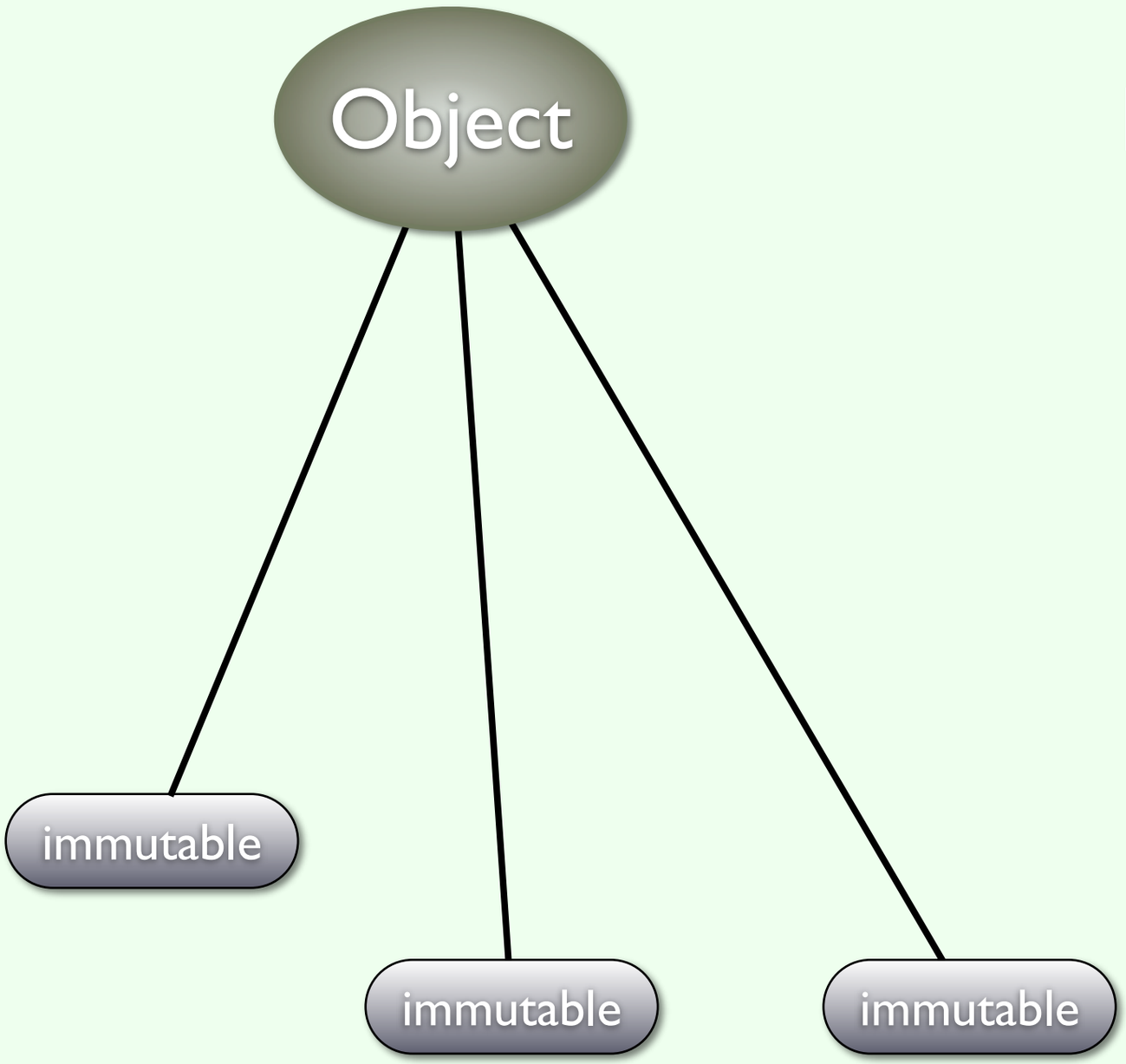
Access Permissions



Immutable Permission

- aliases = N
- access= R
- “constant”
- no synchronization

Access Permissions



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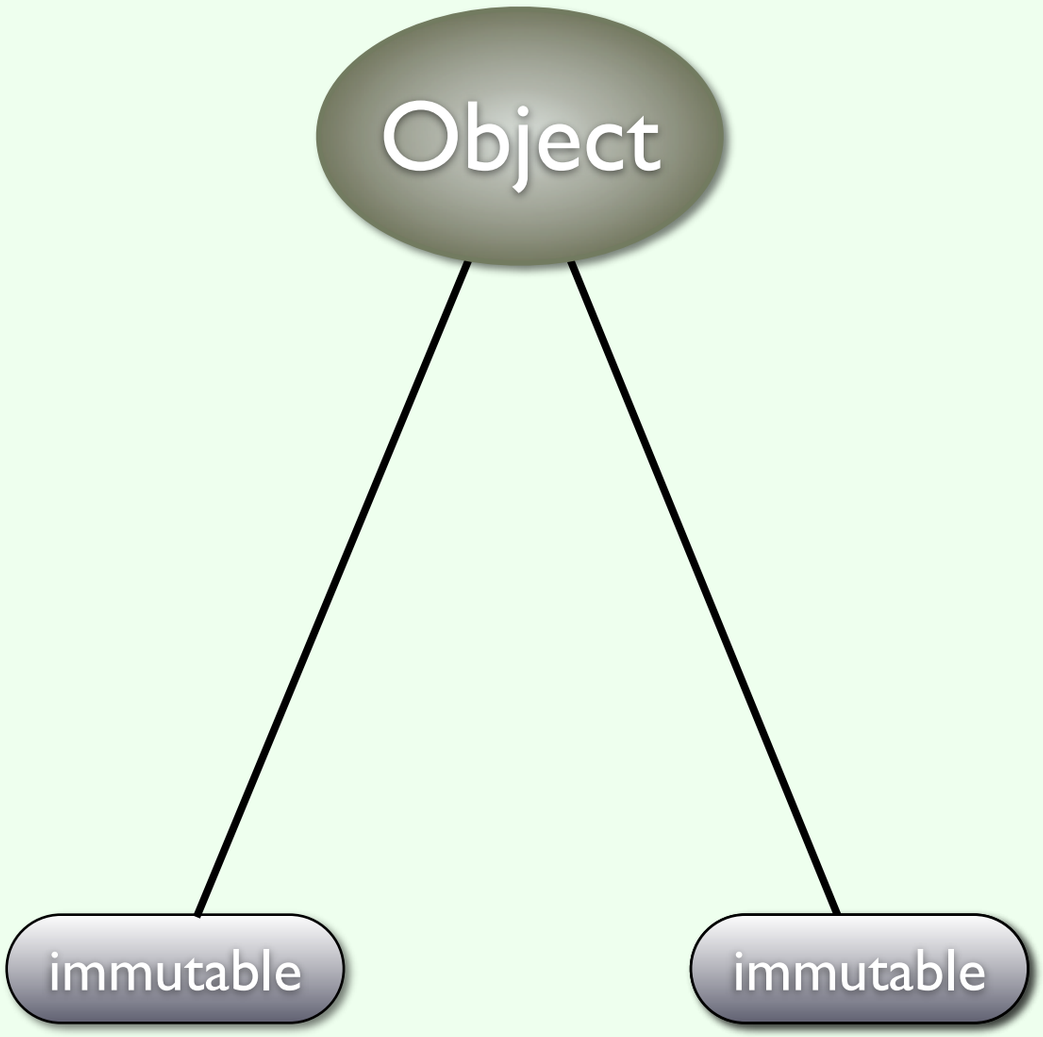

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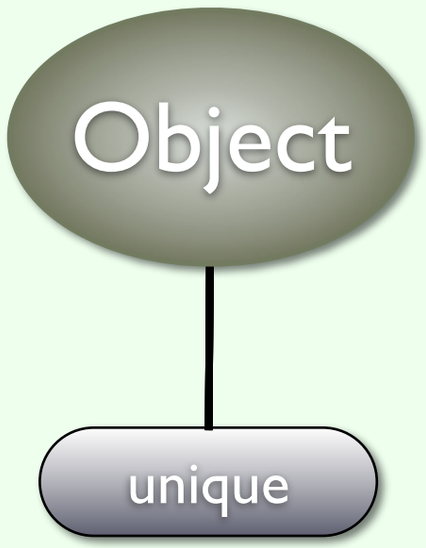

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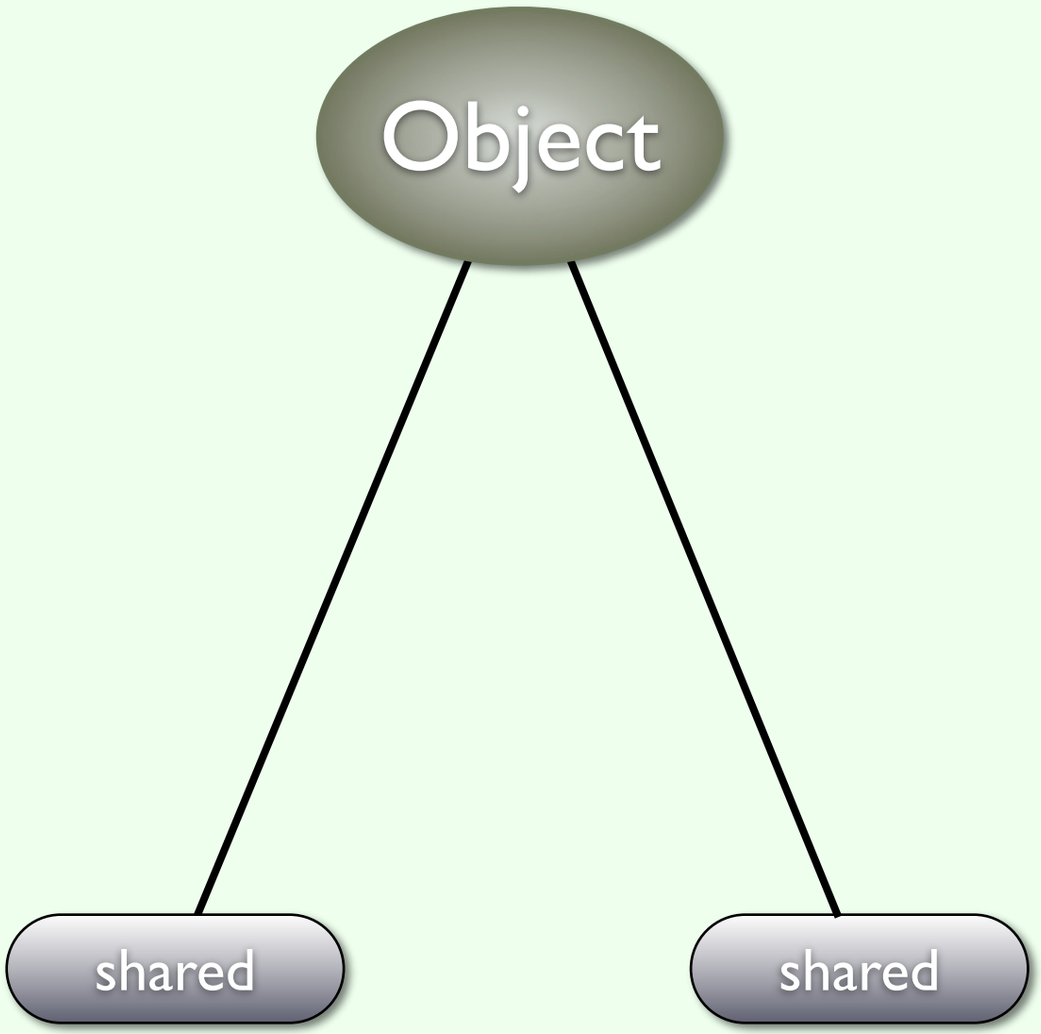
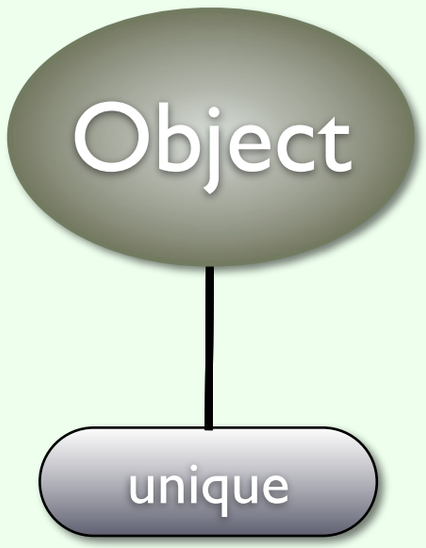


Shared Permission

- aliases = N
- access= RW
- “shared data”
- requires synchronization

Access Permissions



Unique Permission

- aliases = 1
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- “thread local”
- no synchronization

Permission Example

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public void deposit(unique Account account, immutable Amount amount) {...}
public void withdraw(unique Account account, immutable Amount amount){...}


public void transfer(unique Account from,
                     unique Account to,
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    withdraw(from, amount);


    deposit(to, amount);


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Syntax: permission [>> permission] type var

BORROW: unique Account from

unique >> unique Account from

CHANGE: unique >> immutable Account account

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Using Permissions for Parallelization

- infer **permissions flow** based on **lexical order**
- define operations can run in parallel iff **intersection** of their required permissions does **not contain unique permissions**

Dataflow Example

transfer(unique Account from, unique Account to, immutable Amount amount)

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from: unique to: unique amount: immutable

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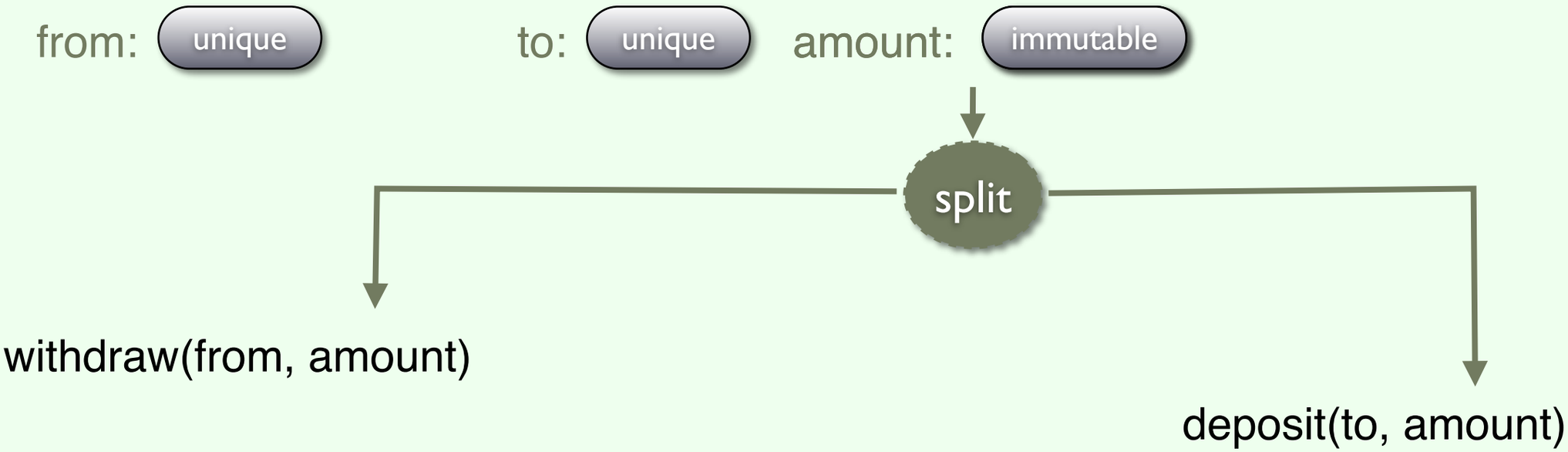

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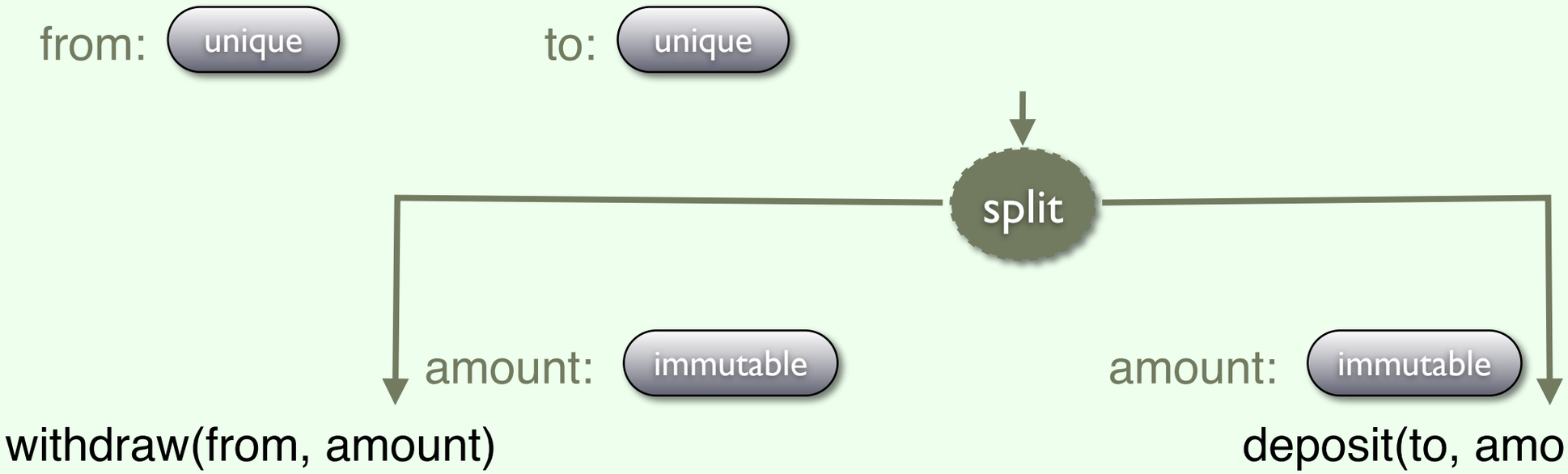

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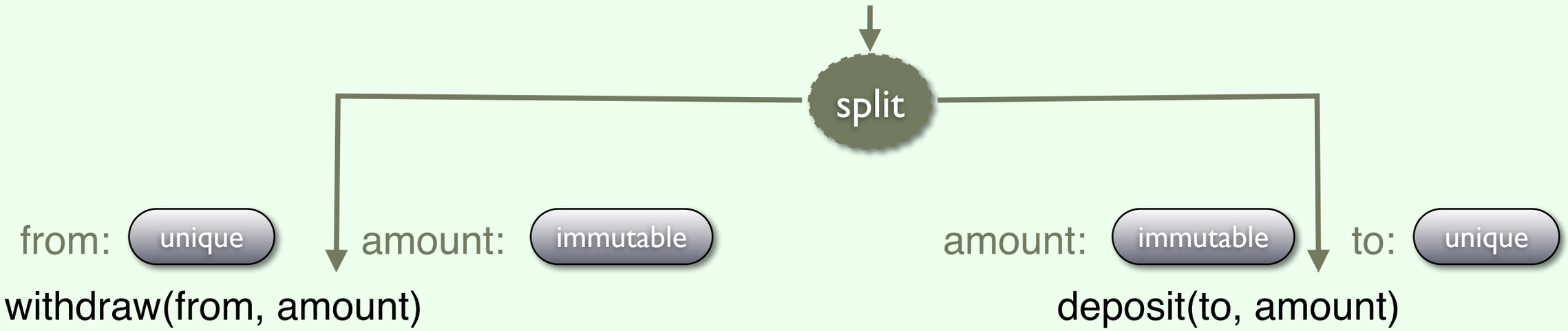

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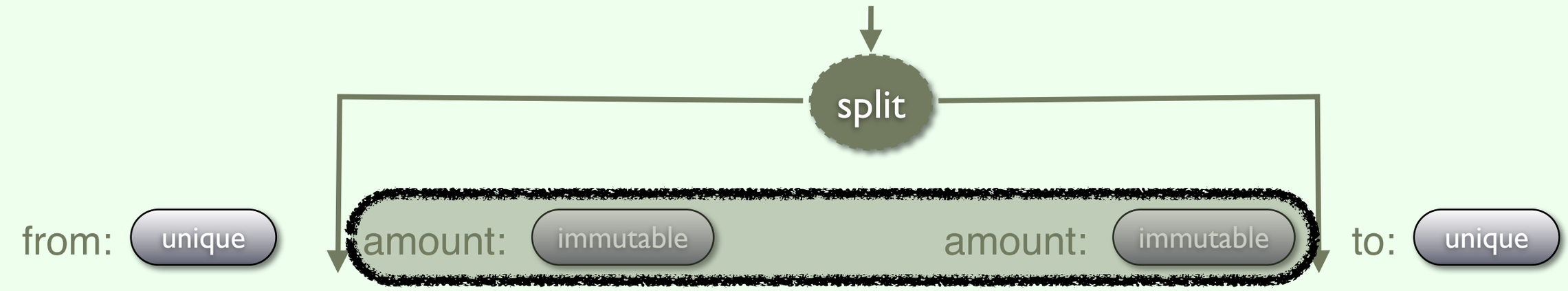

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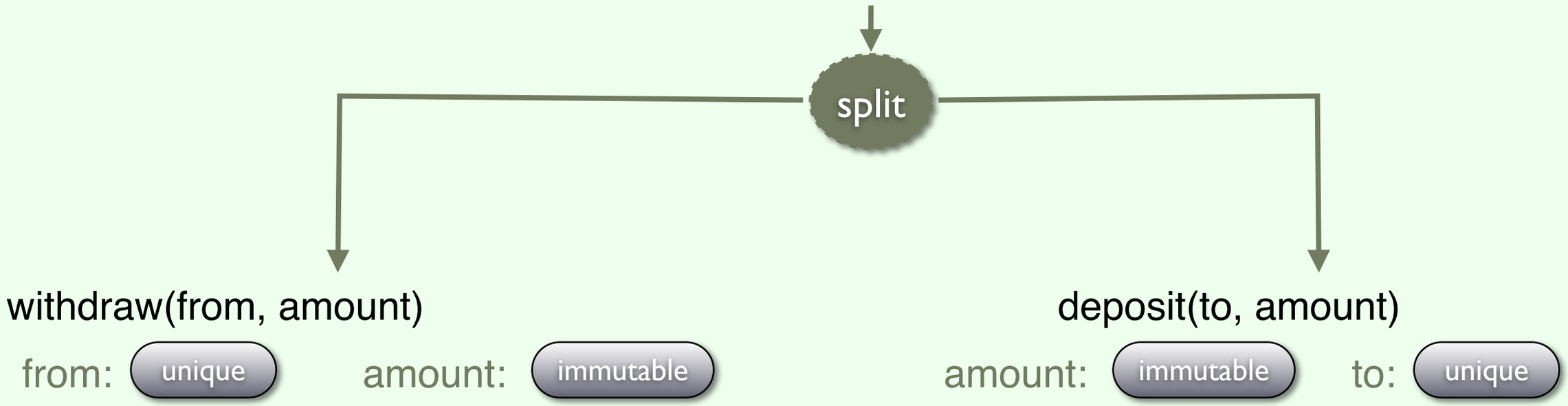

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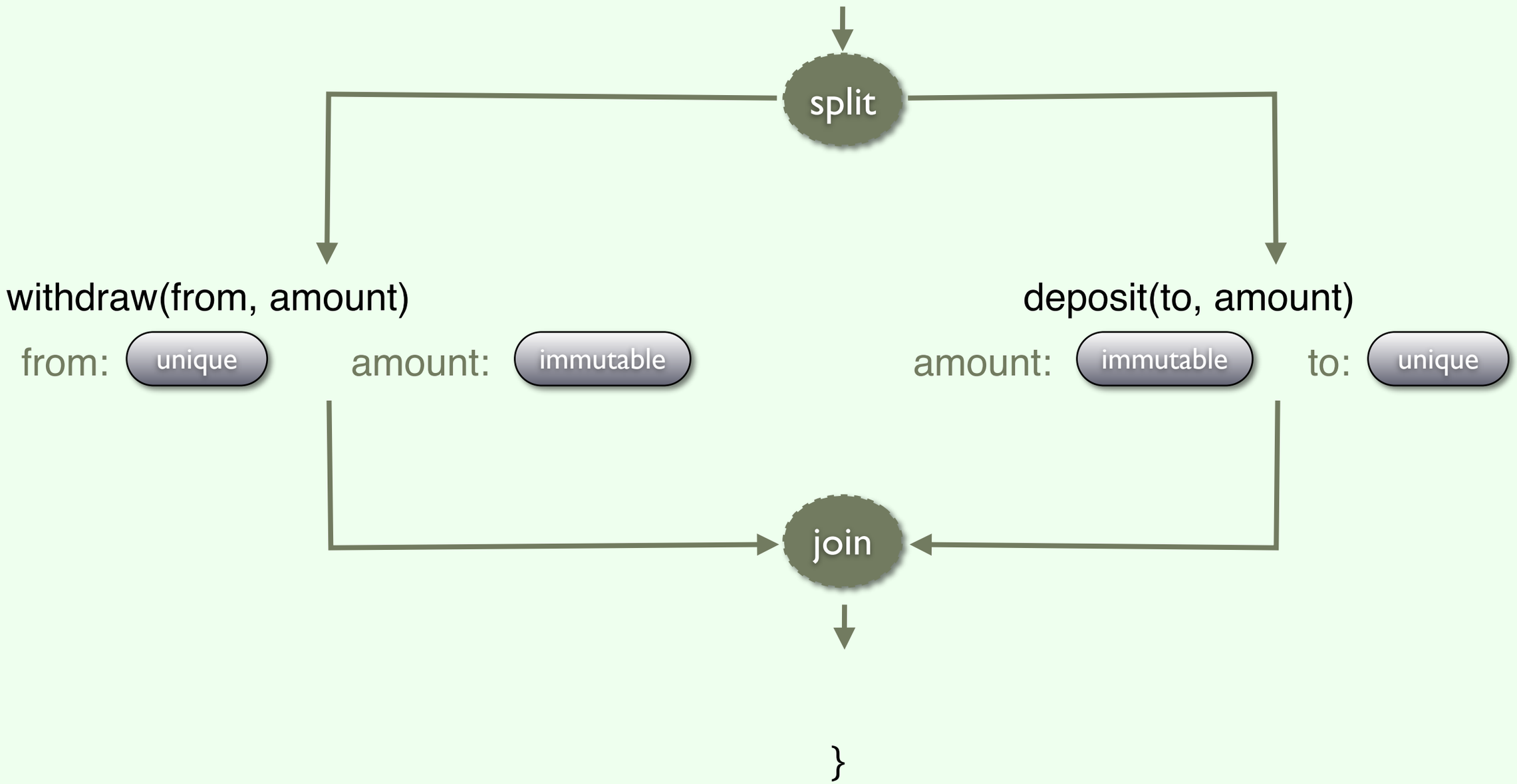

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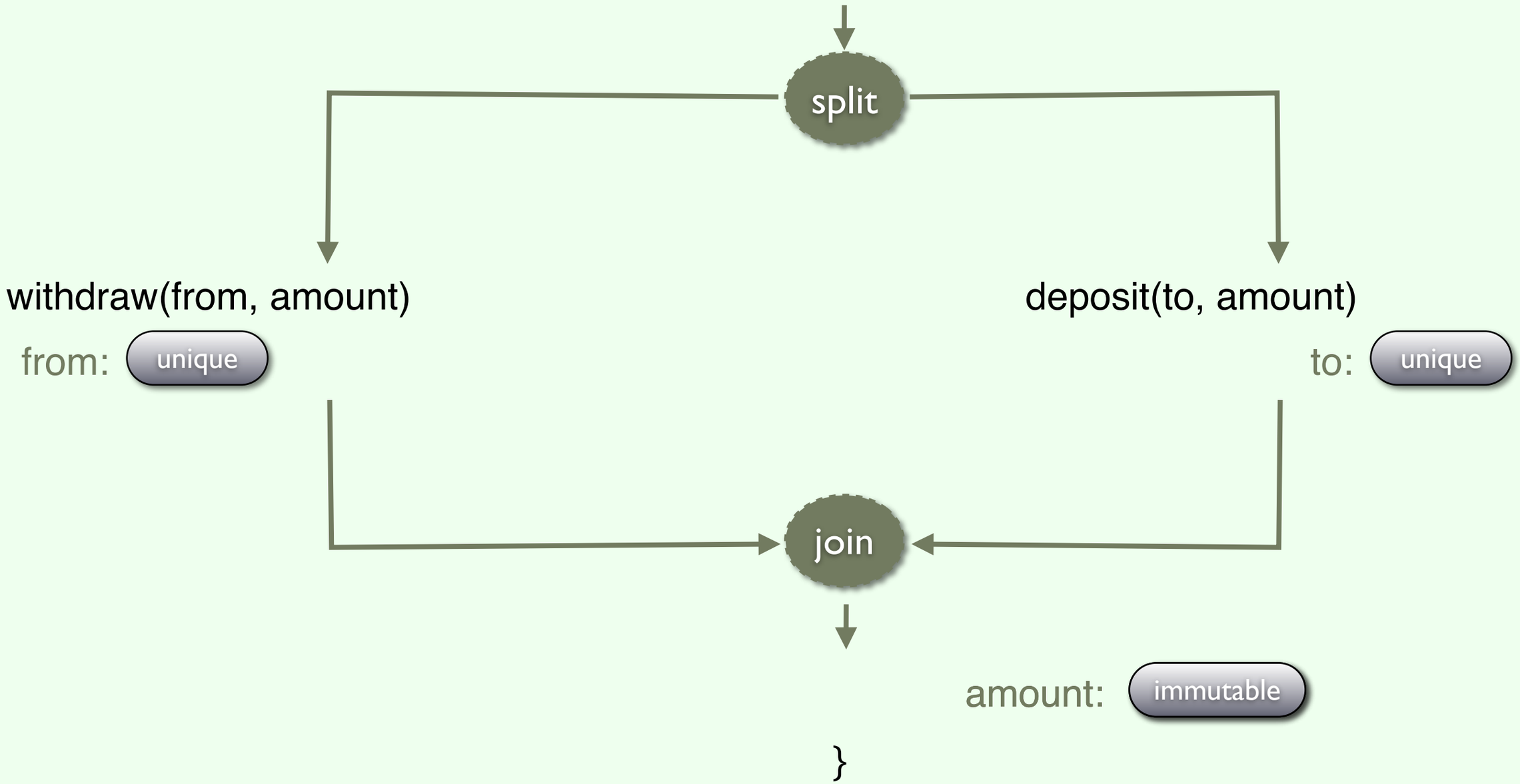

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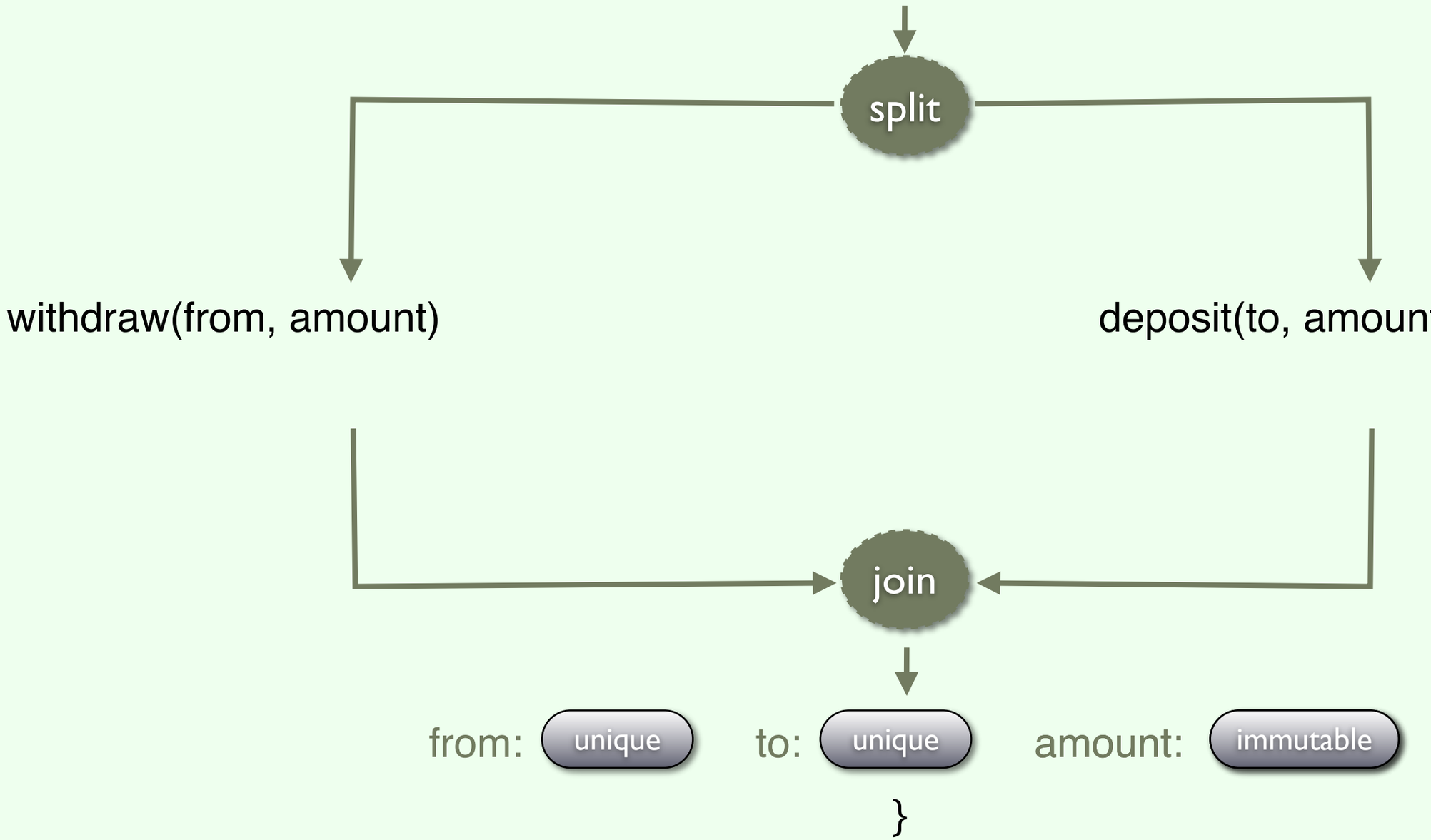

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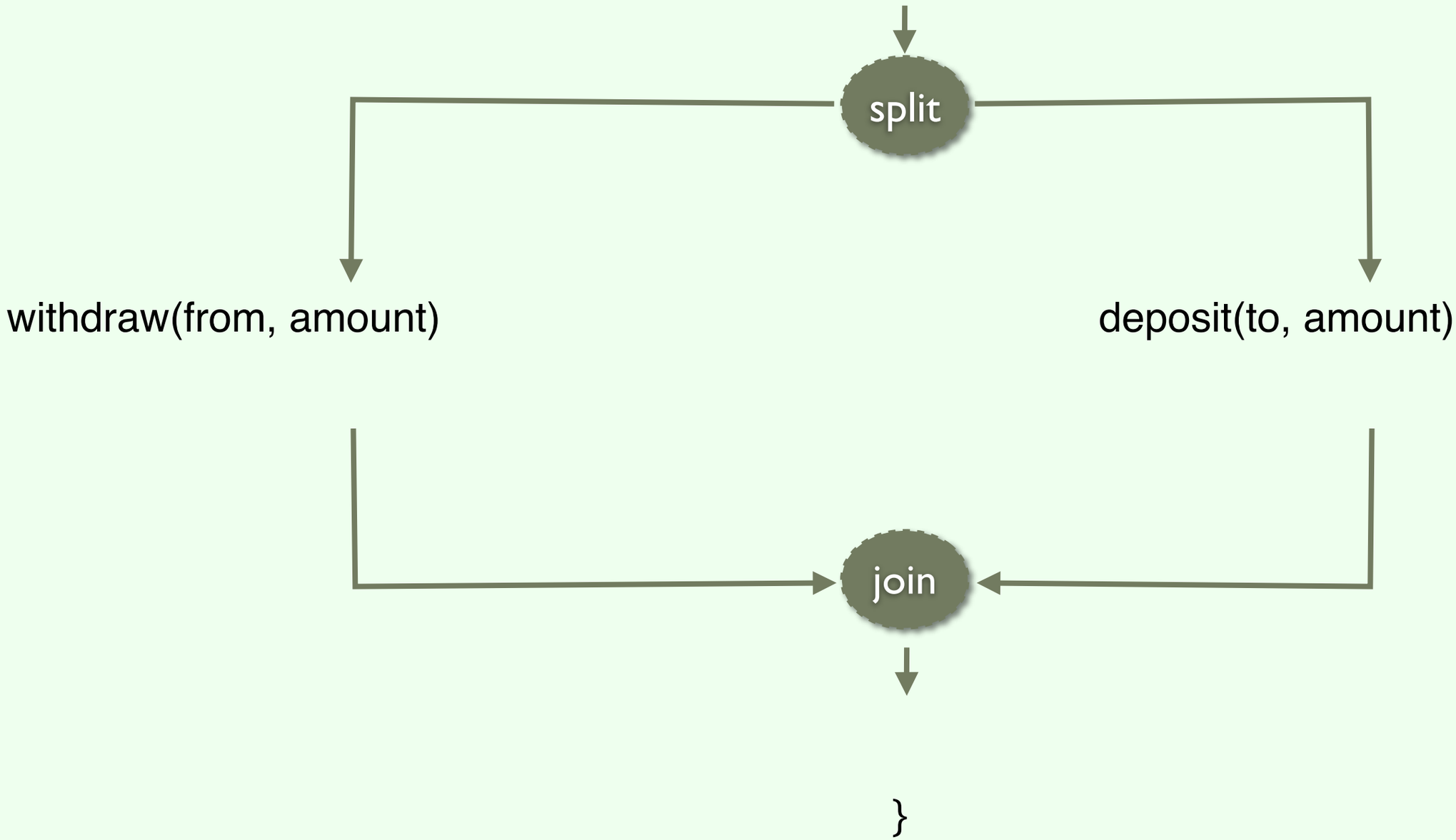

}

Shared Data Issues

- causes **non-determinism** but sometimes order matters
    - e.g., object that needs to follow protocol
- all accesses to shared objects **require synchronization**
    - sometimes shared permissions are unavoidable
        - e.g., doubly linked list

Data Groups

- bundle shared objects into data groups
  - abstract collection of objects
  - disjoint partitions of heap

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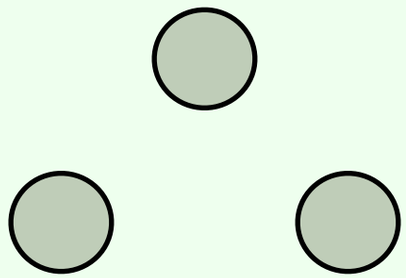

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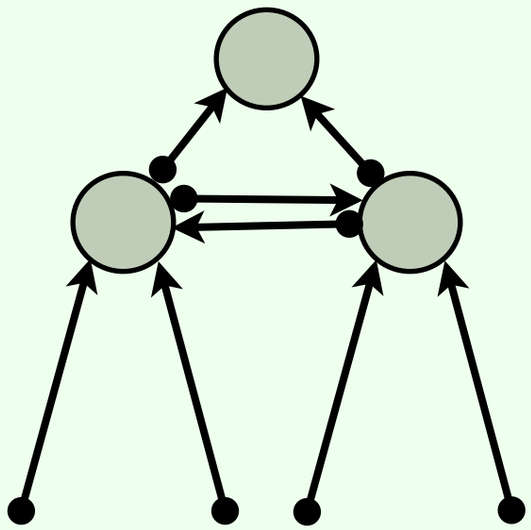

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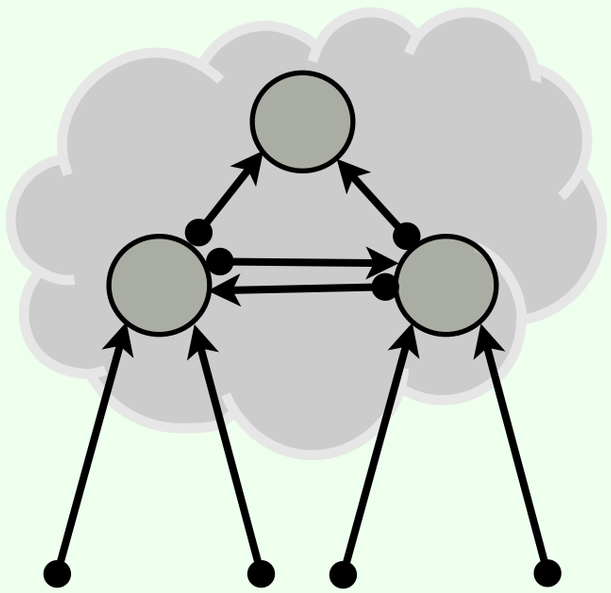
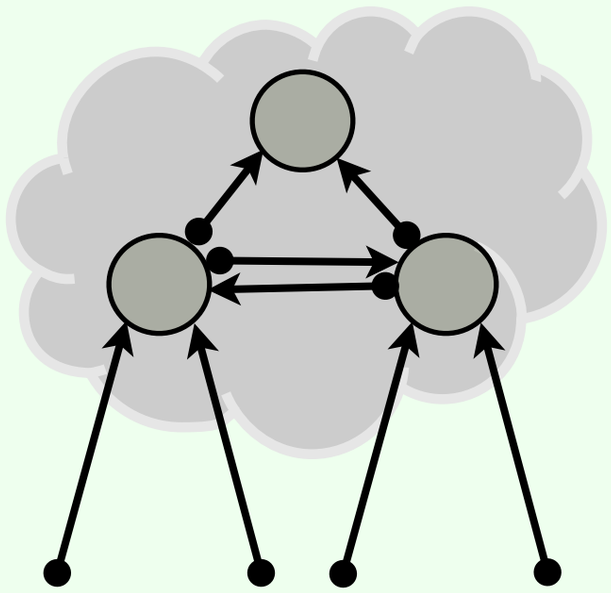
  - abstract collection of objects
  - disjoint partitions of heap



Data Groups Permissions

- similar to access permissions for data groups
- manual split/joining by user
- user controlled mechanism for granularity



Data Groups Permissions

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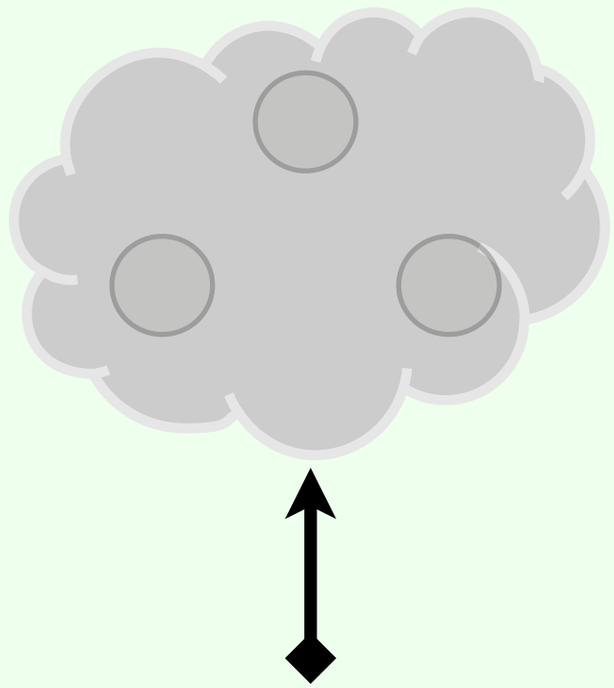
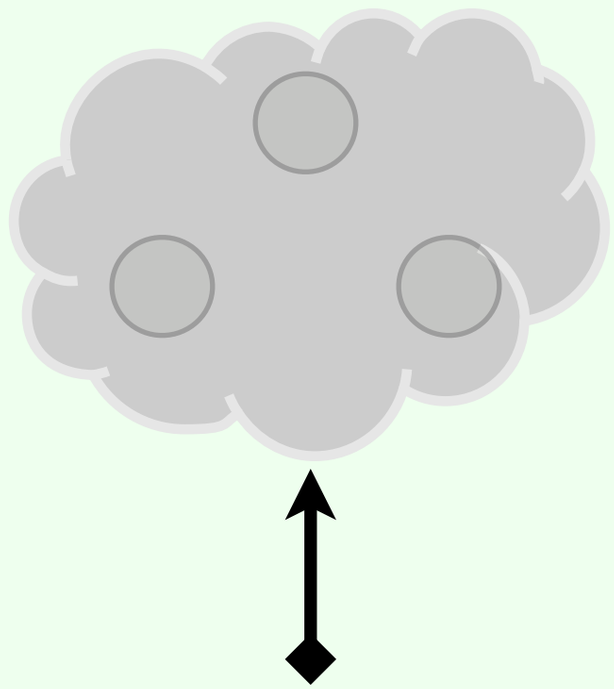
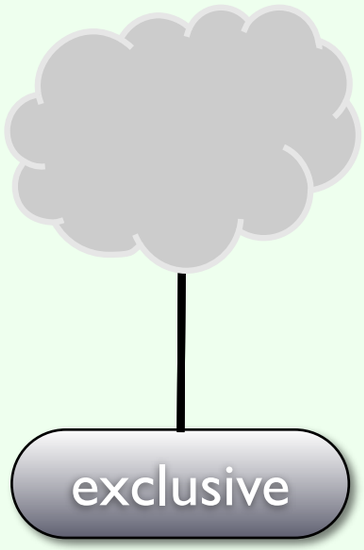


Data Groups Permissions

- data groups are embedded in objects
  - strong encapsulation, ownership
- group permissions are derived from receiver permissions



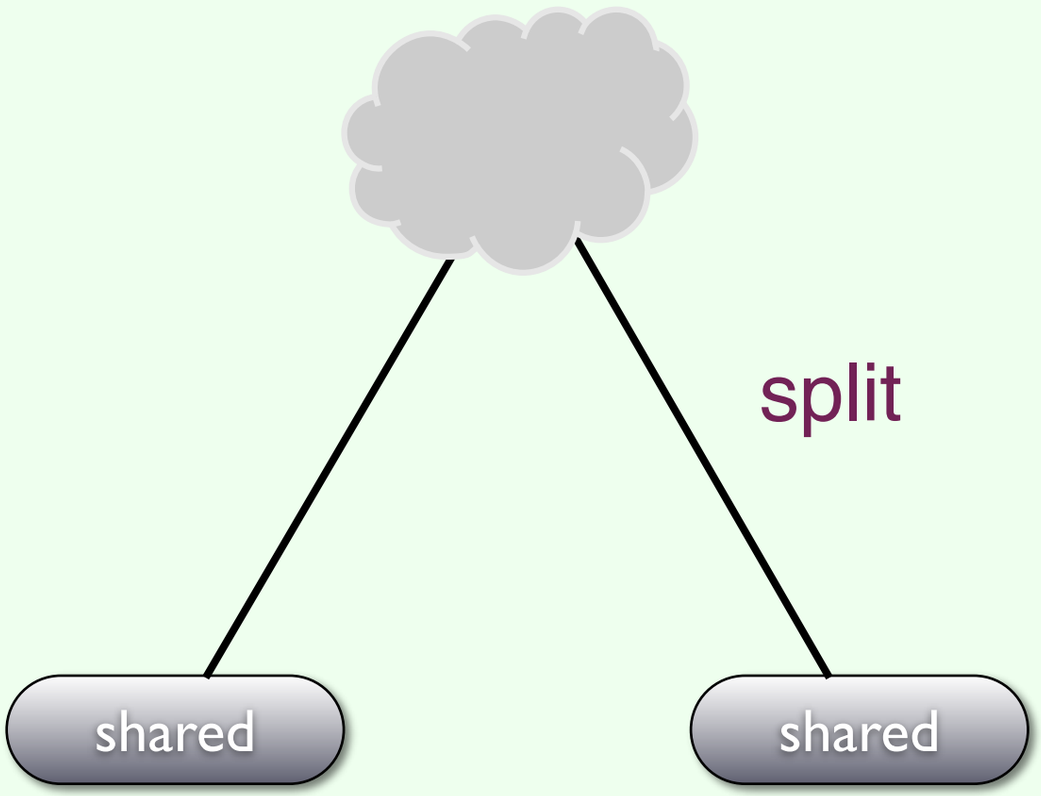
Group Permissions



Exclusive Permission

- aliases = 1
- access= RW
- “thread local”
- no synchronization

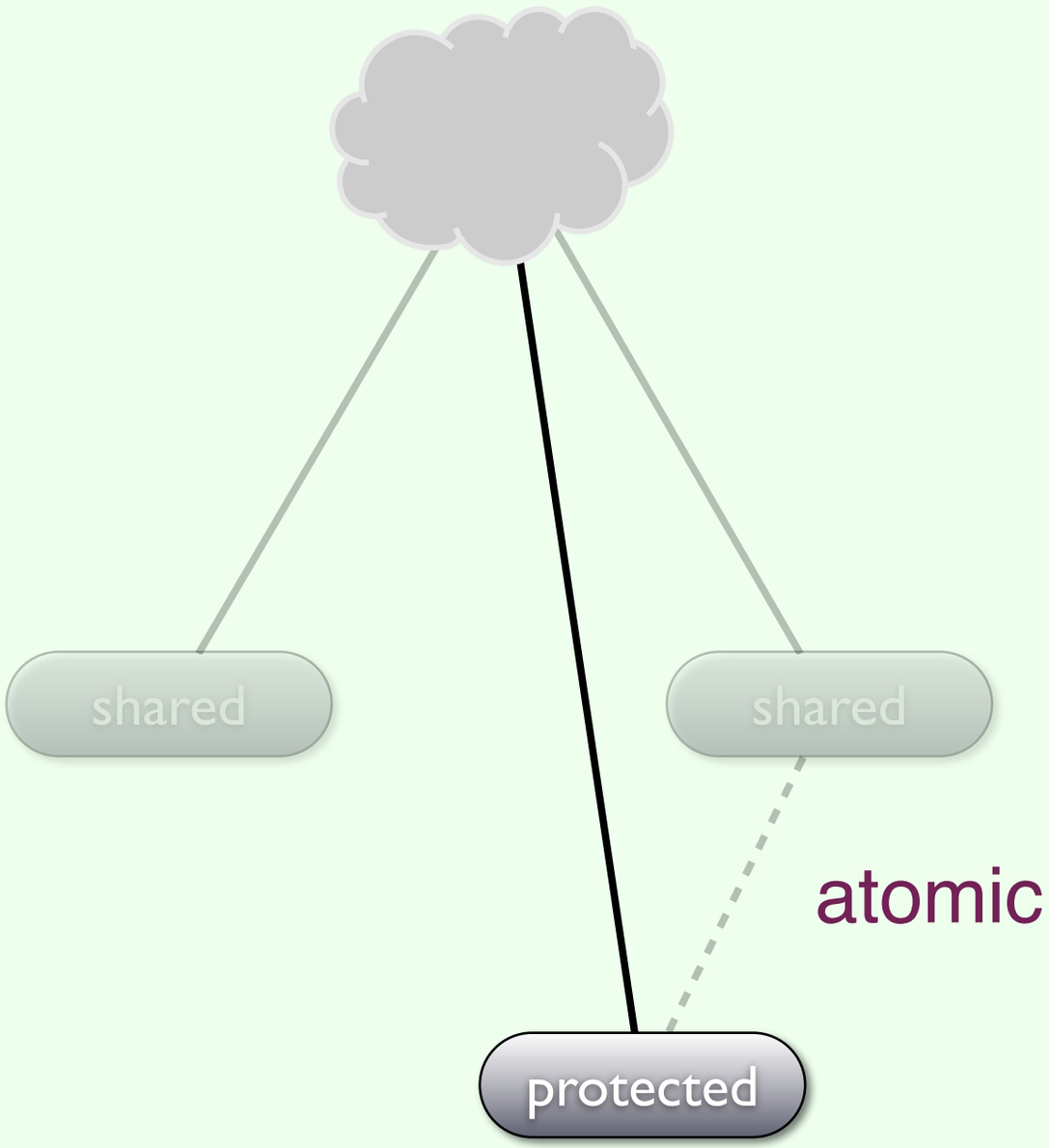
Group Permissions



Shared Permission

- aliases = N
- access= none
- “shared data”
- requires synchronization

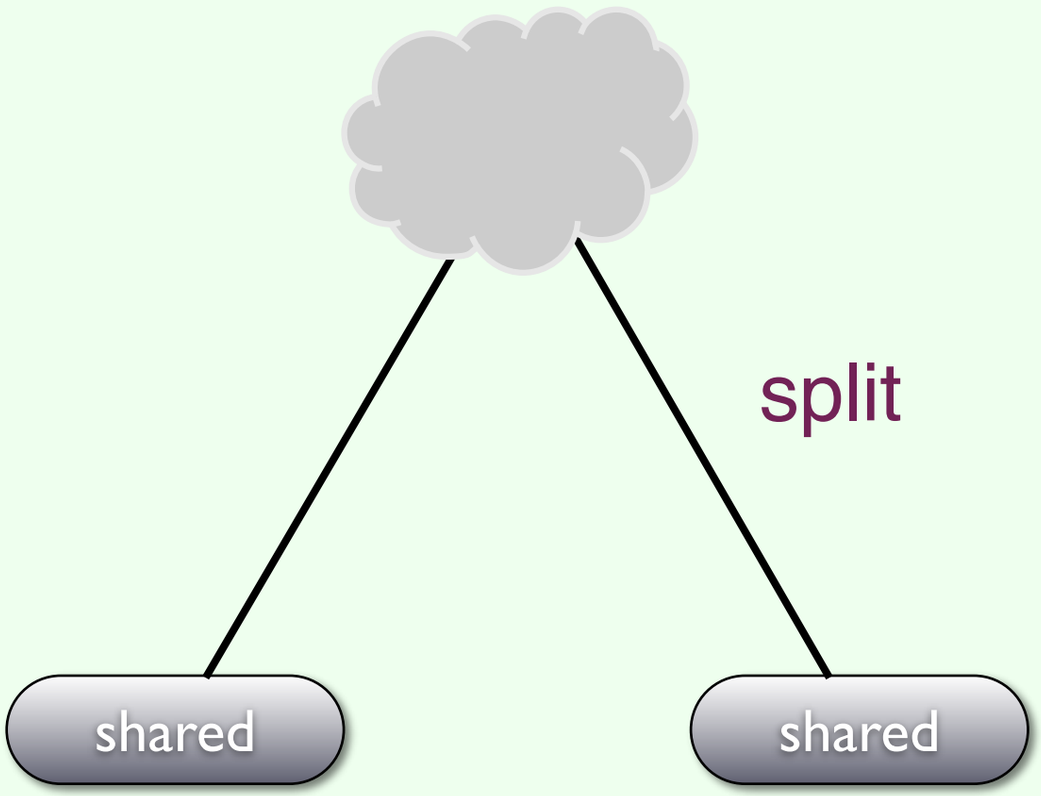
Group Permissions



atomic Permission

- aliases = 1
- access= RW
- “protected ”
- is synchronized

Group Permissions



Shared Permission

- aliases = N
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- “shared data”
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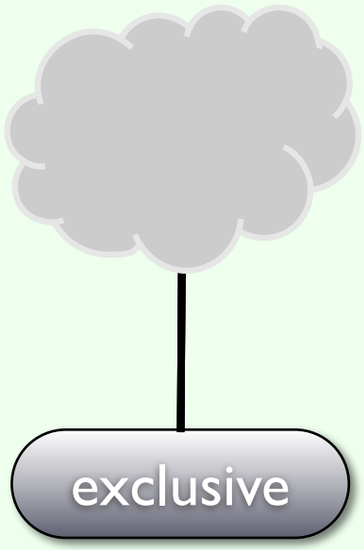
Group Permissions



Exclusive Permission

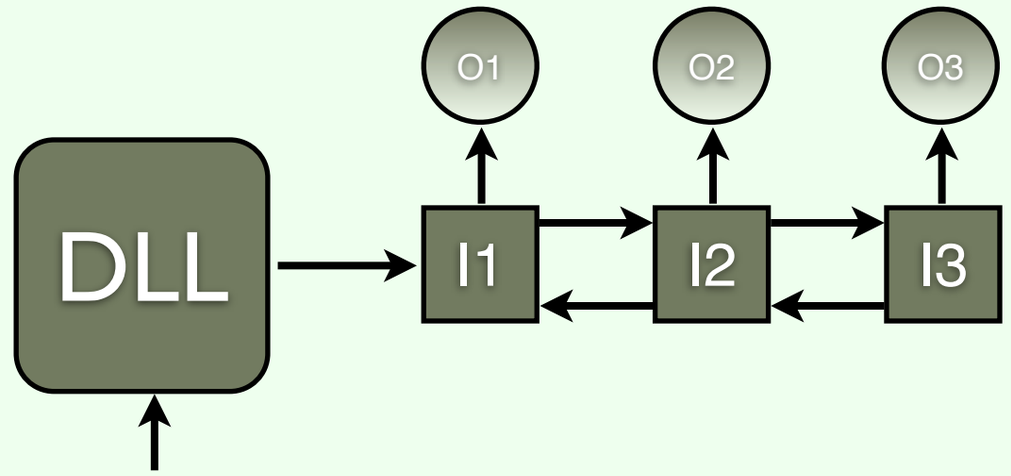
- aliases = 1
- access= RW
- “thread local”
- no synchronization

Data Group Example

```
class DLLItem {
     public Object data;
     public DLLItem prev;
     public DLLItem next;
}

public class DLL {
     private DLLItem head;

     public void add(Object data) {
          DLLItem li = new DLLItem();
          this.head.prev = li;
          li.next = this.head;
          li.data = data;
          this.head = li;
     }
}
```



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}

public class DLL {
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    public void add(                Object data)          {
                DLLItem li = new DLLItem();
        this.head.prev = li;
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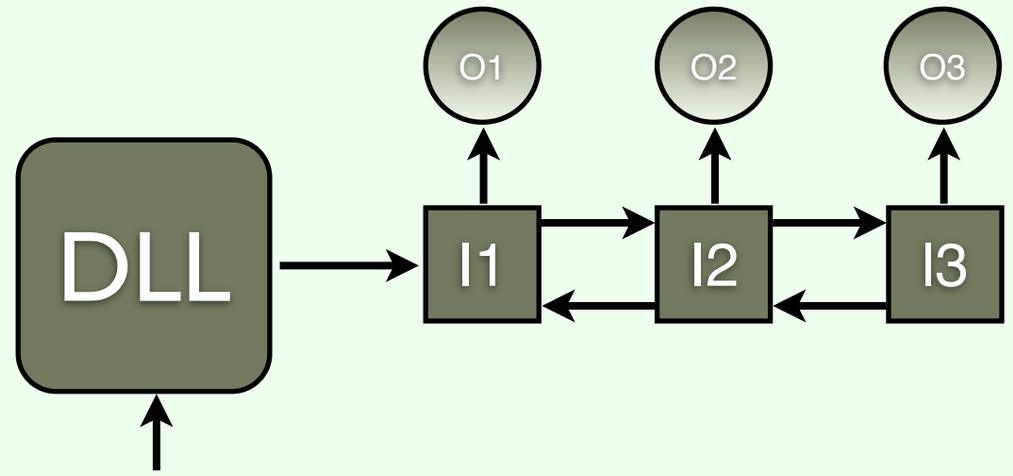
    }
}
```



Data Group Example

```
class DLLItem {
    public          Object data;
    public shared   DLLItem prev;
    public shared   DLLItem next;
}

public class DLL {
    private shared DLLItem head;

    public void add(                Object data)          {
        shared DLLItem li = new DLLItem();
        this.head.prev = li;
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        li.data = data;
        this.head = li;
    }
}
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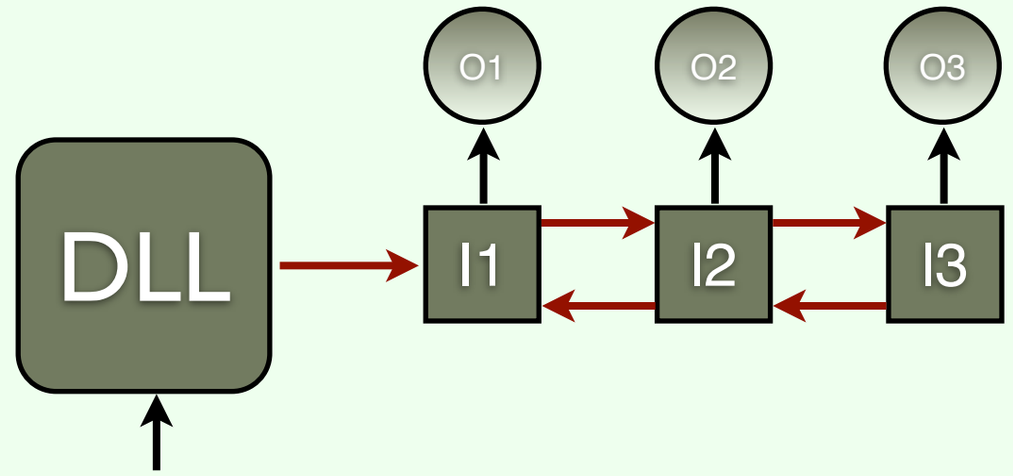

Data Group Example

```
class DLLItem {
    public unique Object data;
    public shared DLLItem prev;
    public shared DLLItem next;
}

public class DLL {
    private shared DLLItem head;

    public void add(unique >> none Object data)          {
        shared DLLItem li = new DLLItem();
        this.head.prev = li;
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        li.data = data;
        this.head = li;
    }
}
```
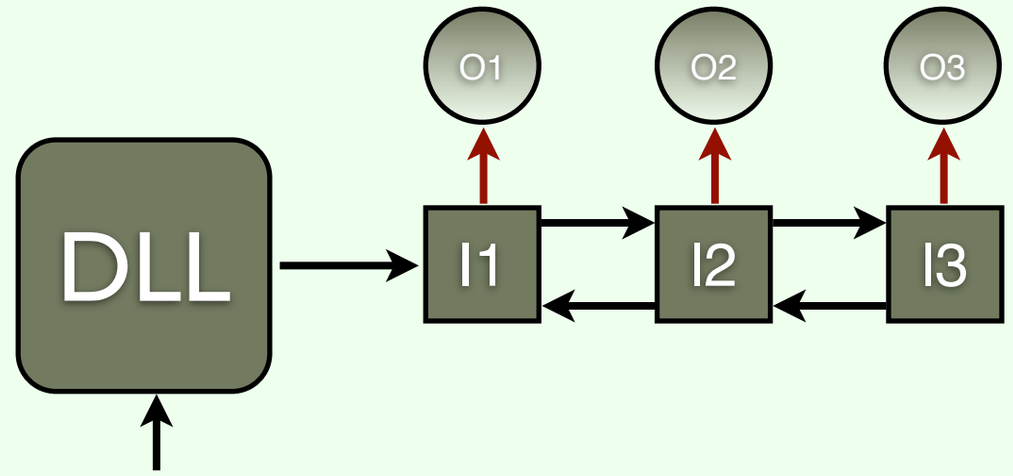
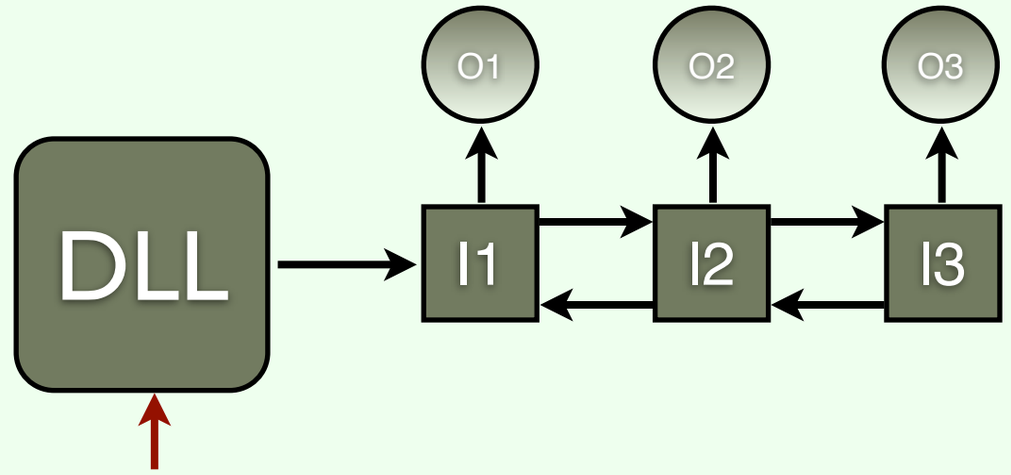



Data Group Example

```
class DLLItem {
     public unique Object data;
     public shared DLLItem prev;
     public shared DLLItem next;
}

public class DLL {
     private shared DLLItem head;

     public void add(unique >> none Object data) : unique {
          shared DLLItem li = new DLLItem();
          this.head.prev = li;
          li.next = this.head;
          li.data = data;
          this.head = li;
     }
}
```



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        this.head.prev = li;
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    }
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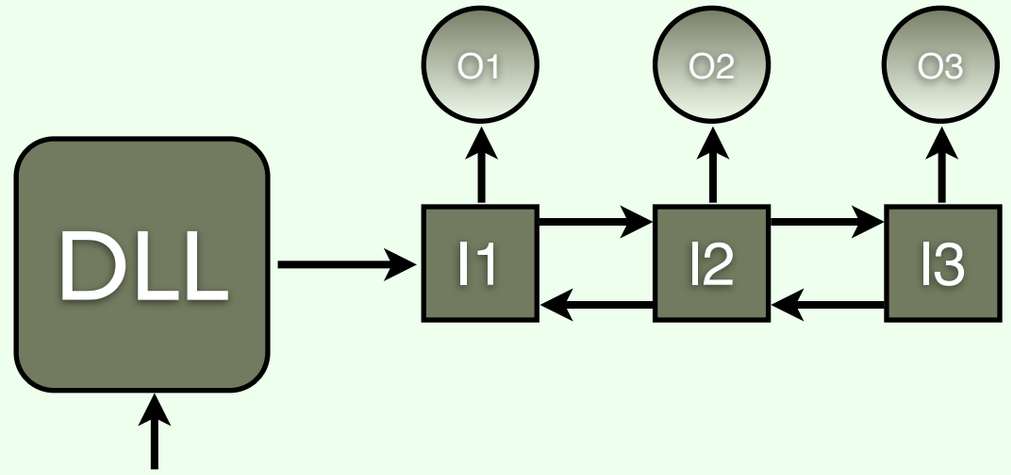

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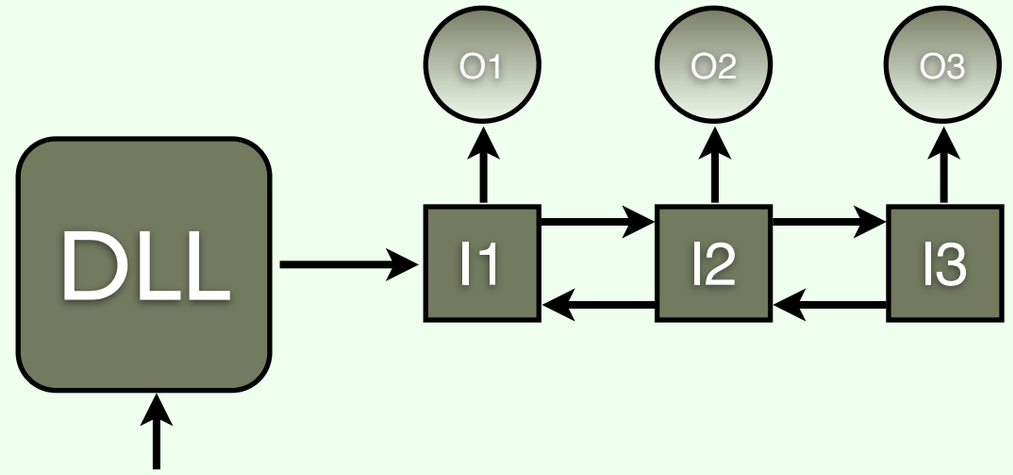
     }
}
```



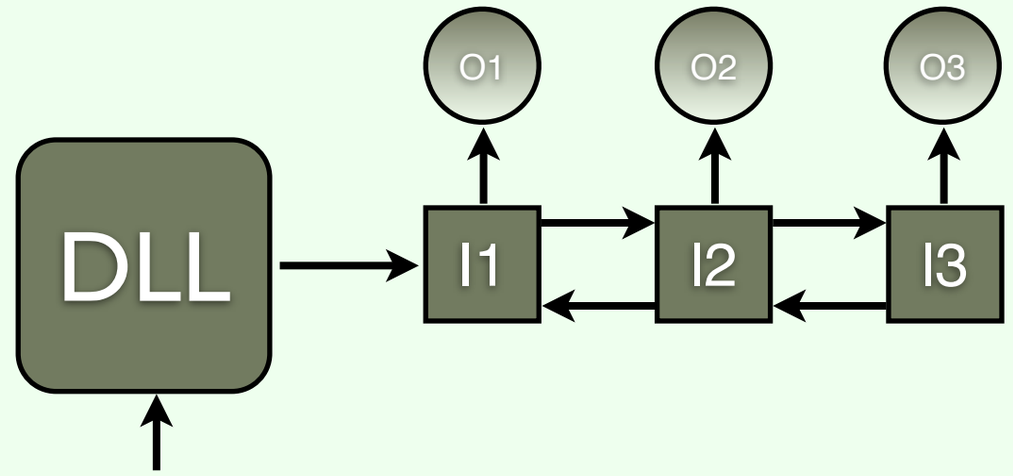
ERROR: Access shared data

Data Group Example

```
class DLLItem {
    public unique Object data;
    public shared DLLItem prev;
    public shared DLLItem next;
}

public class DLL {
    private shared DLLItem head;

    public void add(unique >> none Object data) : unique {
        atomic {
          shared DLLItem li = new DLLItem();
          this.head.prev = li;
          li.next = this.head;
          li.data = data;
          this.head = li;
        }
    }
}
```



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        atomic {
          shared DLLItem li = new DLLItem();
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        }
    }
}
```
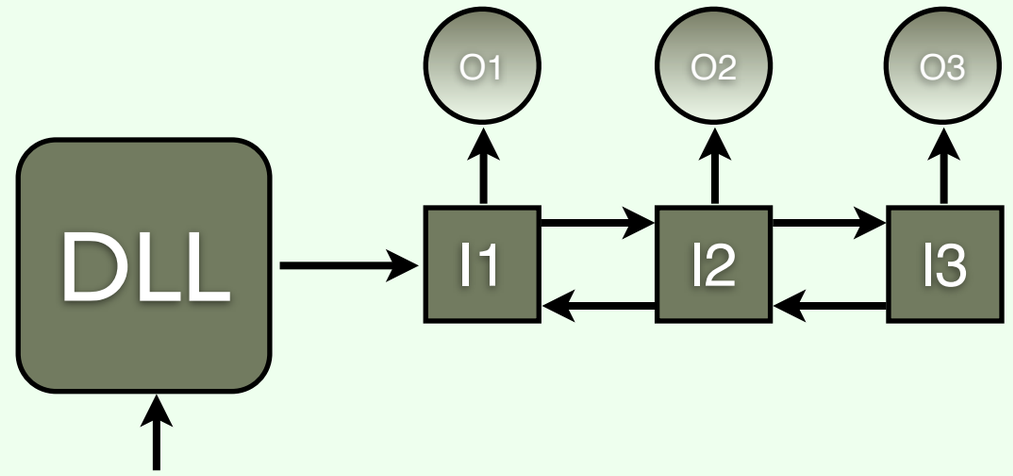
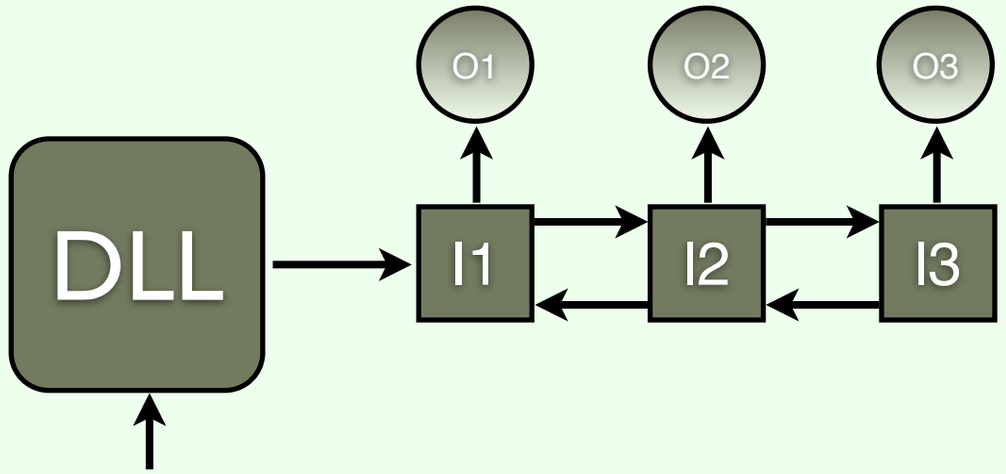



Unique receiver means no aliases

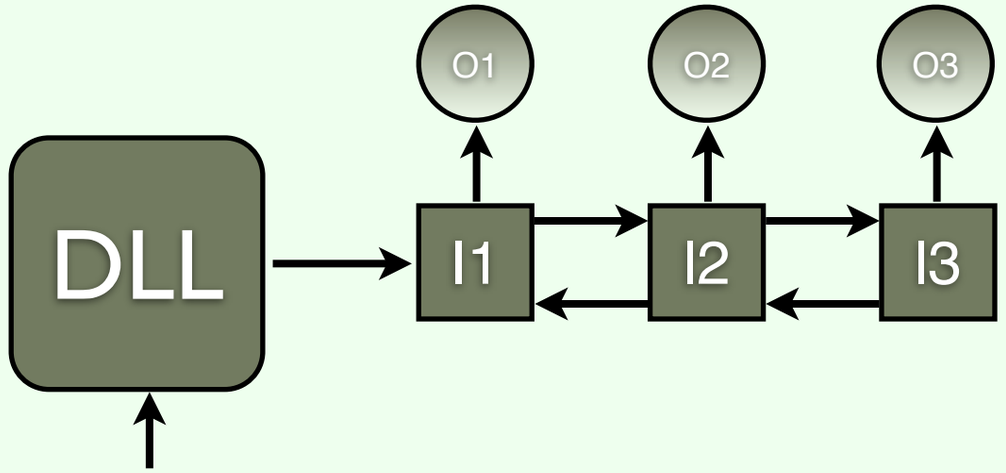
Data Group Example

```
class DLLItem    {
    public unique Object data;
    public shared DLLItem    prev;
    public shared DLLItem    next;
}

public class DLL {
    group nodes;
    private shared DLLItem head;

    public void add(unique >> none Object data) : unique {

        shared DLLItem         li = new DLLItem      ();
        this.head.prev = li;
        li.next = this.head;
        li.data = data;
        this.head = li;

    }
}
```



Data Group Example

```
class DLLItem<G> {
    public unique Object data;
    public shared DLLItem<G> prev;
    public shared DLLItem<G> next;
}

public class DLL {
    group nodes;
    private shared DLLItem head;

    public void add(unique >> none Object data) : unique {

        shared DLLItem        li = new DLLItem      ();
        this.head.prev = li;
        li.next = this.head;
        li.data = data;
        this.head = li;

    }
}
```



Data Group Example

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class DLLItem<G> {
    public unique Object data;
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}

public class DLL {
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    public void add(unique >> none Object data) : unique {

        shared DLLItem<nodes> li = new DLLItem<nodes>();
        this.head.prev = li;
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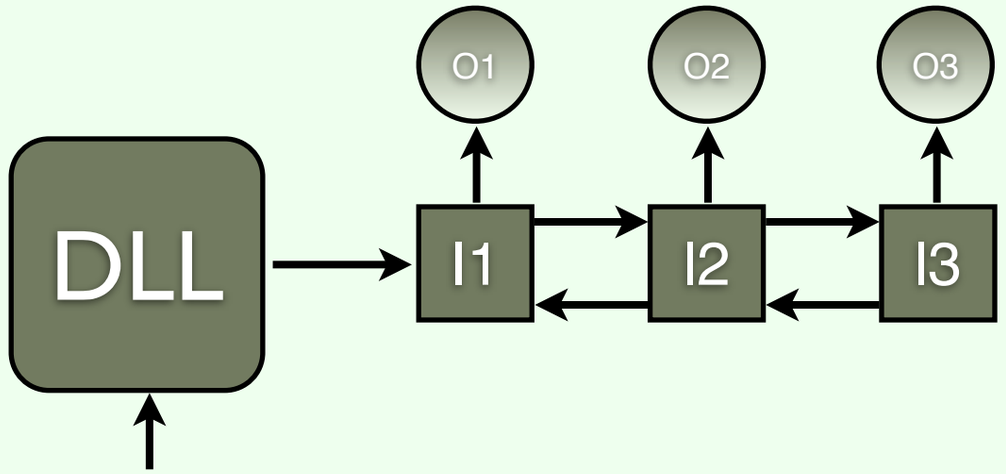
    }
}
```



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    public shared DLLItem<G> next;
}

public class DLL {
    group nodes;
    private shared DLLItem head;

    public void add(unique >> none Object data) : unique {

        shared DLLItem<nodes> li = new DLLItem<nodes>();
        this.head.prev = li;
        li.next = this.head;
        li.data = data;
        this.head = li;

    }
}
```
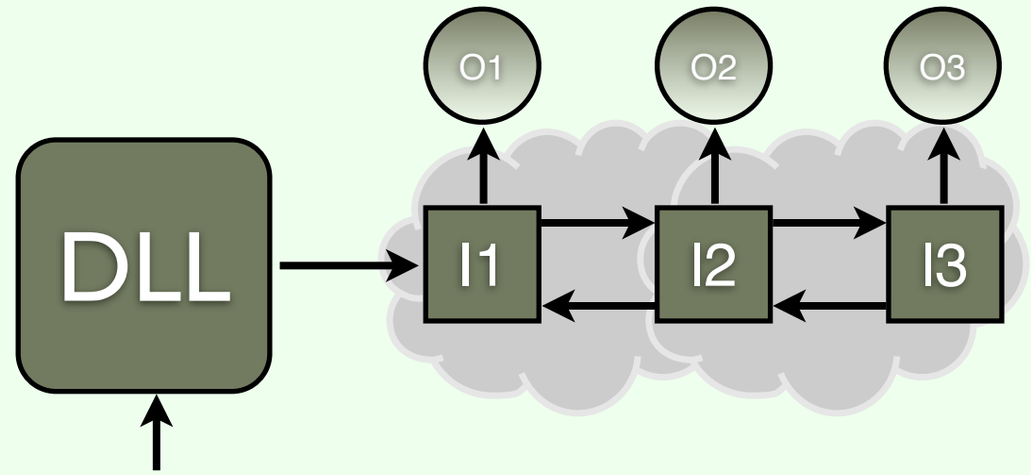
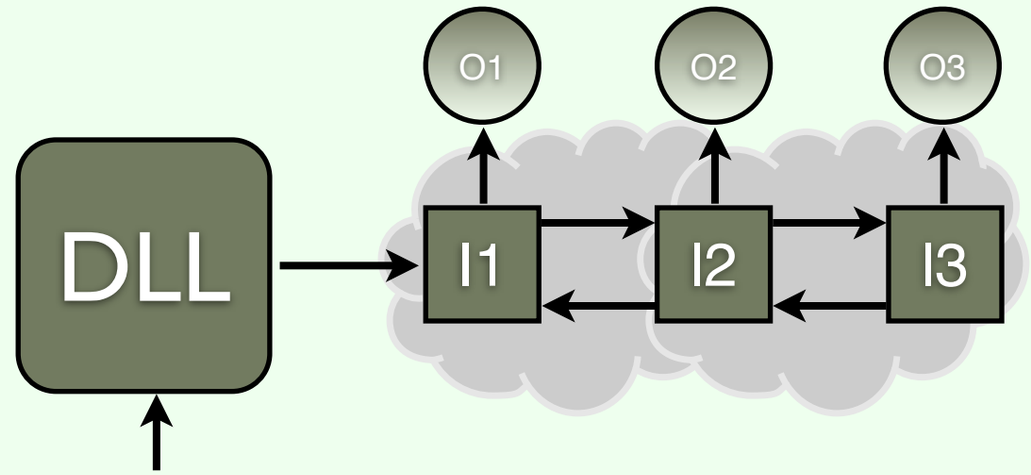



Data Group Example

```
class DLLItem<G> {
    public unique Object data;
    public shared DLLItem<G> prev;
    public shared DLLItem<G> next;
}

public class DLL {
    group nodes;
    private shared DLLItem head;

    public void add(unique >> none Object data) : unique {
        unpack {
          shared DLLItem<nodes> li = new DLLItem<nodes>();
          this.head.prev = li;
          li.next = this.head;
          li.data = data;
          this.head = li;
        }
    }
}
```



Data Group Example

```
public void add(unique >> none Object data) : unique {

    unpack {

        ...

        li.data = data;

    }

}
```

Data Group Example

```
public void add(unique >> none Object data) : unique {
    // this: unique      data: unique
    unpack {

        ...

        li.data = data;

    }

}
```

Data Group Example

```
public void add(unique >> none Object data) : unique {

    unpack {
        // this:  unique    this.nodes:  exclusive    data:  unique
        ...

        li.data = data;

    }


}
```

Data Group Example

```
public void add(unique >> none Object data) : unique {

    unpack {

        ...
        // this: unique    this.nodes: exclusive        data: unique
        li.data = data;

    }


}
```

Data Group Example

```
public void add(unique >> none Object data) : unique {

    unpack {

        ...

        li.data = data;
        // this: unique    this.nodes: exclusive
    }


}
```

Data Group Example

```
public void add(unique >> none Object data) : unique {

    unpack {

        ...

        li.data = data;

    }

    // this: unique

}
```

Data Group Example

```
public void add(unique >> none Object data) : unique {

    unpack {

        ...

        li.data = data;

    }

}
```

Progress so far

μÆMINIUM

- core-calculus based on group permissions
- **concurrent-by-default** type system
- soundness proof for absence of **race conditions** (cf. 'safety' hypothesis)

Dataflow Runtime

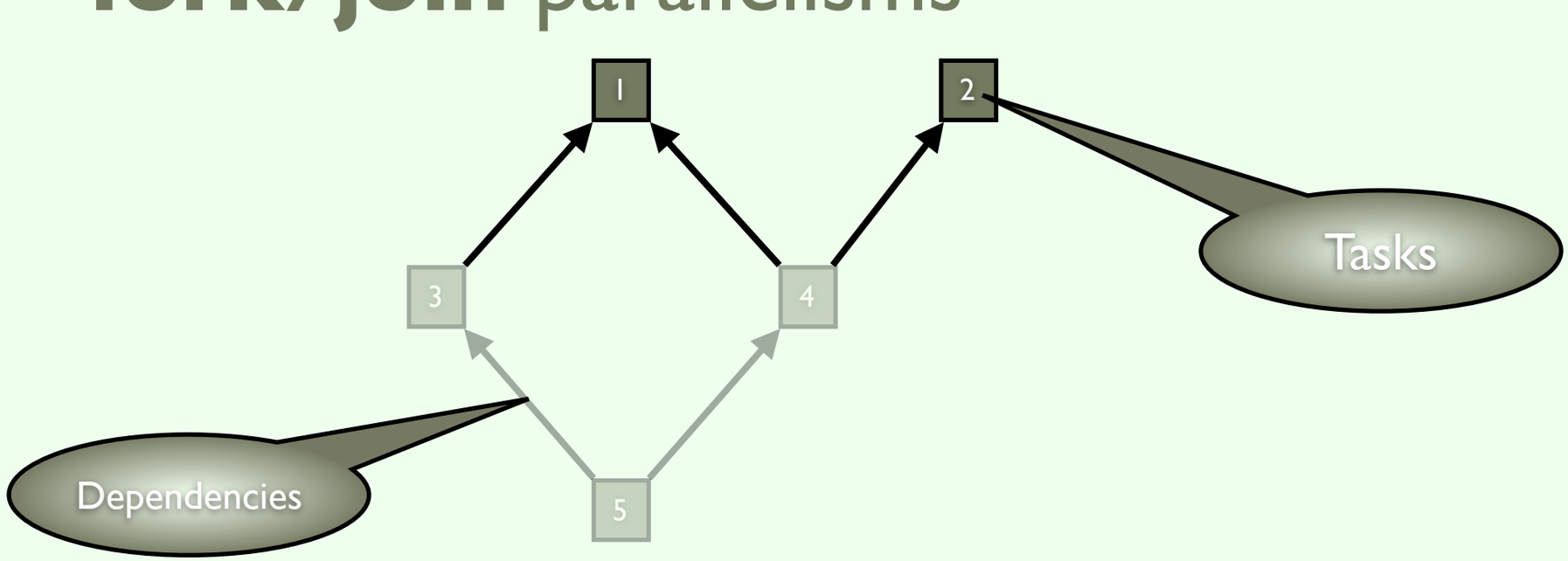
- data flow runtime system for ÆMINIUM
- **task** based runtime system for **dataflow** and **fork/join** parallelisms
- support for **locks** and **STM**
- **dynamic detection** of **deadlocks** (for the lock based approach)

Dataflow Runtime

- support for 3 kinds of tasks
- **Non-Blocking** -- computation intensive
- **Blocking** -- I/O tasks
- **Atomic** -- task that require protection

Dataflow Runtime

- data flow runtime system for ÆMINIUM
- task based support for **dataflow** and **fork/join** parallelisms



Dataflow Runtime

- data flow runtime system for ÆMINIUM
- task based support for **dataflow** and **fork/join** parallelisms

task dependency

fork/join dependency

Dataflow Runtime

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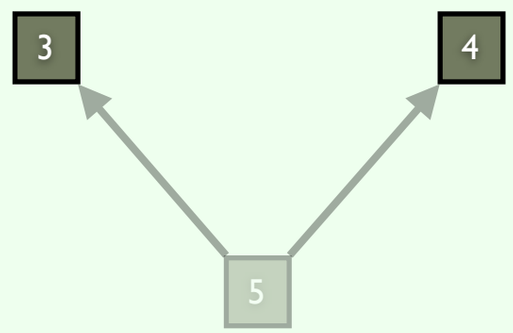

task dependency

fork/join dependency

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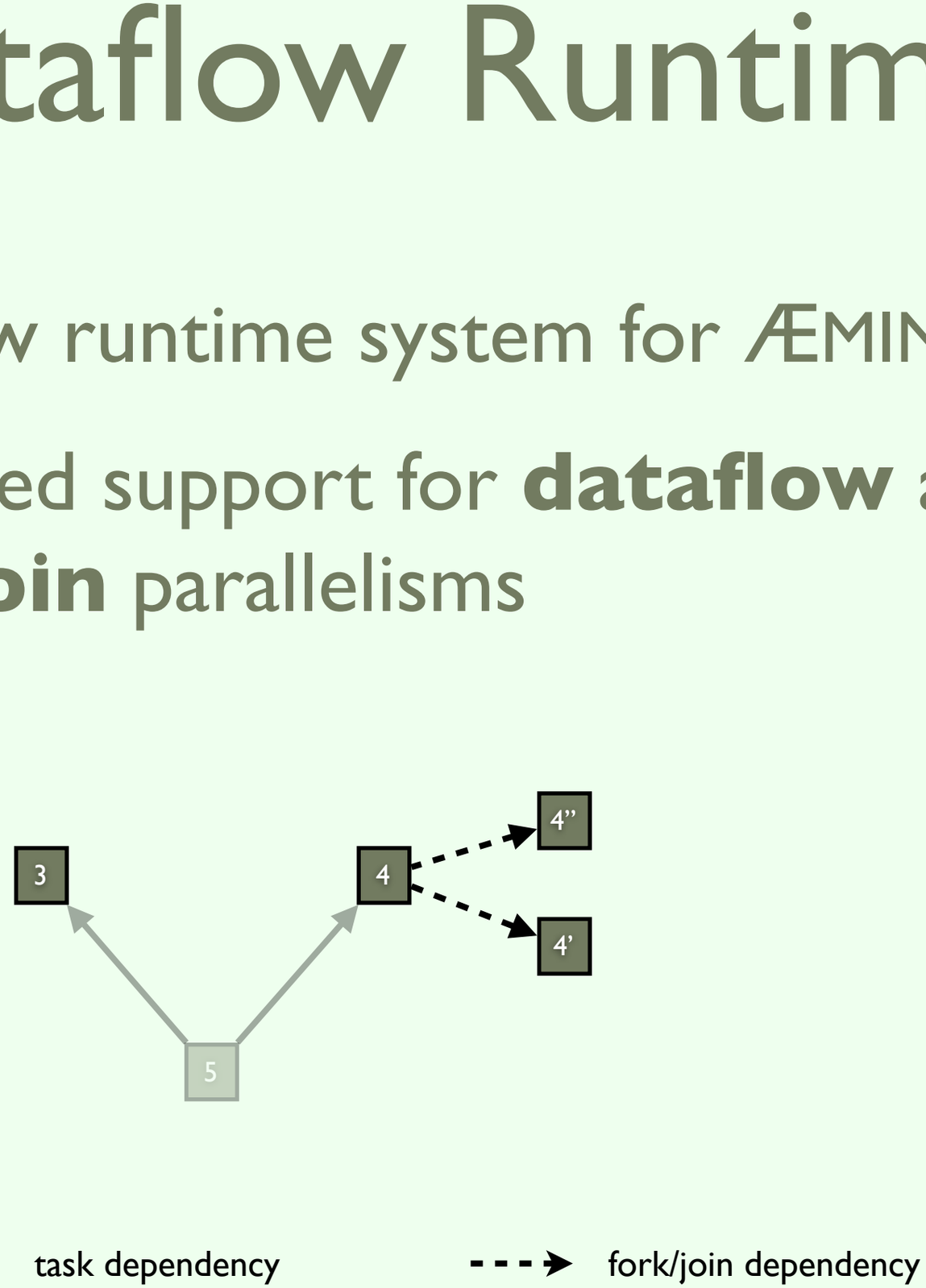

Dataflow Runtime

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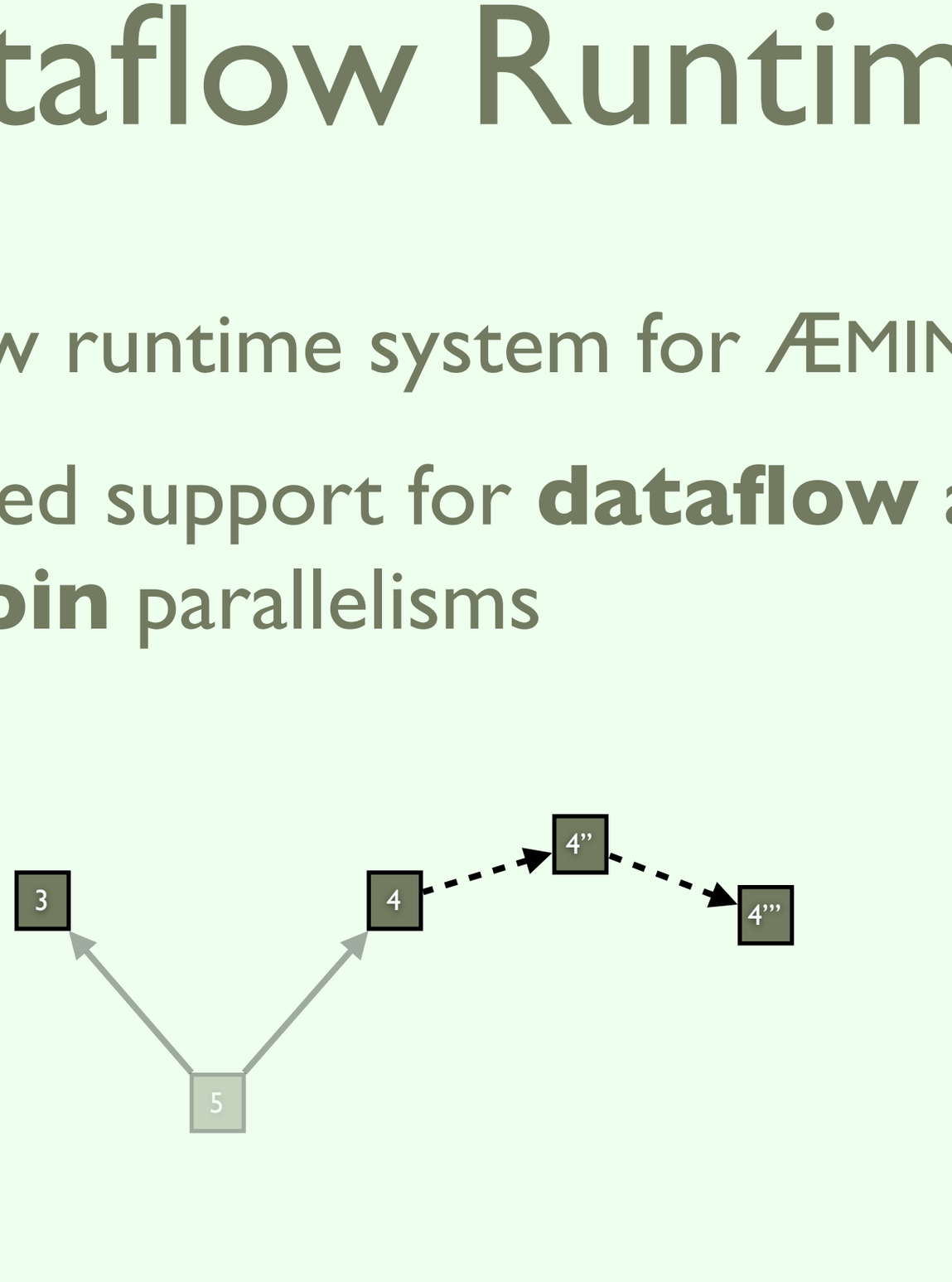

Dataflow Runtime

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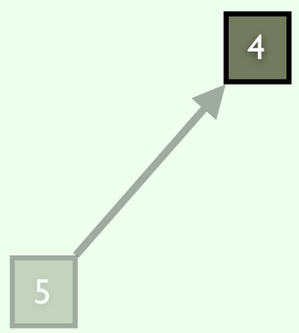
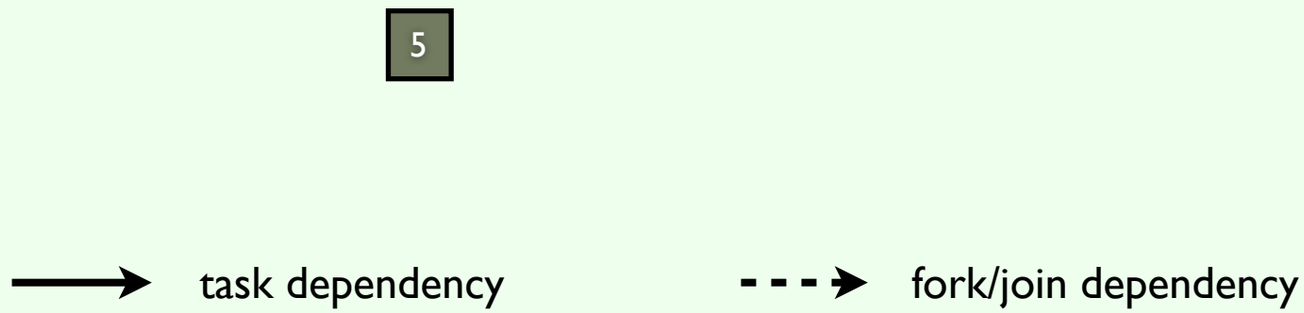


task dependency fork/join dependency

Dataflow Runtime

- data flow runtime system for ÆMINIUM
- task based support for **dataflow** and **fork/join** parallelisms



Dataflow Runtime

- data flow runtime system for ÆMINIUM
- task based support for **dataflow** and **fork/join** parallelisms

task dependency

fork/join dependency

Dataflow Runtime Performance Evaluation

- compare performance to Java's fork/join framework
  - run micro benchmarks used by the fork/join paper
  - ÆMINIUM runtime about 35% slower

Dataflow Runtime "Atomic" Evaluation

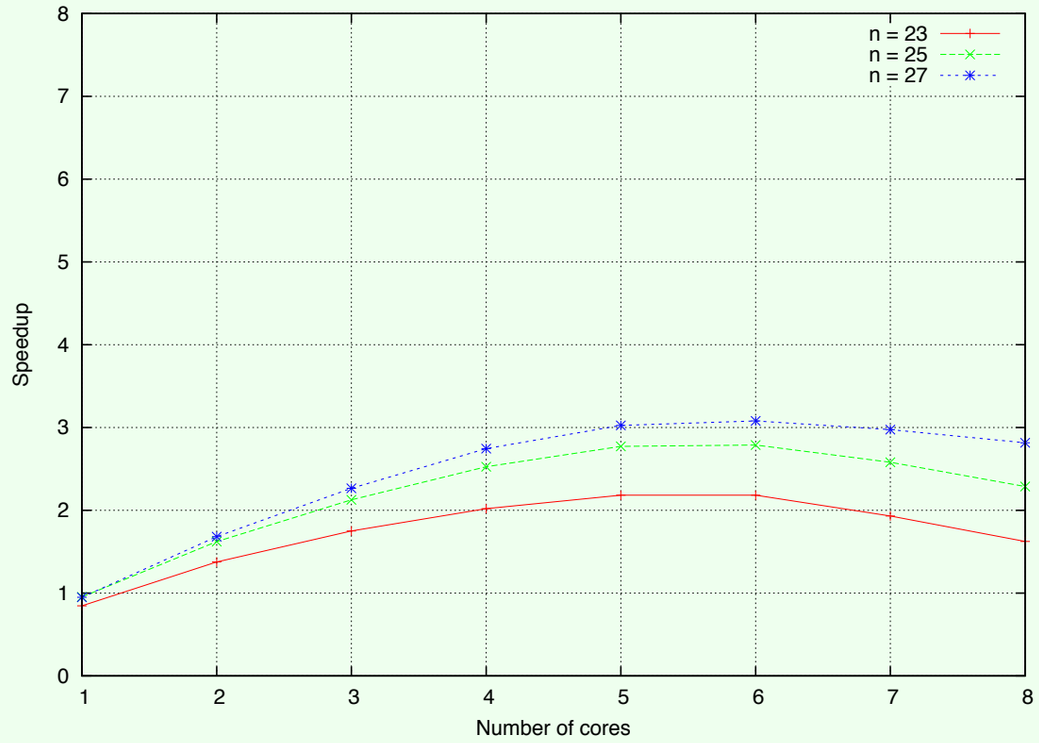
- compare worst, best and intermediate case
  - one global lock vs one lock per object
  - access single object vs multiple objects
  - read vs write
- the locking based implementation outperformed STM based implementation in almost all cases

Proof of Concept

- Master thesis of Manuel Mohr
- hand generated AST with type information
- each method call becomes a task
- showed principle feasibility

Proof of Concept

- performance improvements
- more optimize systems
- dynamic/static load balancing



Road ahead ...

Language Implementation

- implementing ÆMINIUM in Plaid
- Plaid has built-in support for permissions
- limited type checker for Plaid
  (lambda support is still missing)

Language Implementation

1. add ÆMINIUM to Plaid language/parser
2. extend Plaid typechecker with data groups
3. extend Plaid infrastructure to compute dataflow graph based on permission flow
4. extend Plaid code generator to produce parallel code

Approach

- 1st milestone
  - extend Plaid to compute permission flow and parallelize code (no data groups)
- 2nd milestone
  - extend Plaid with data groups
- Evaluate system

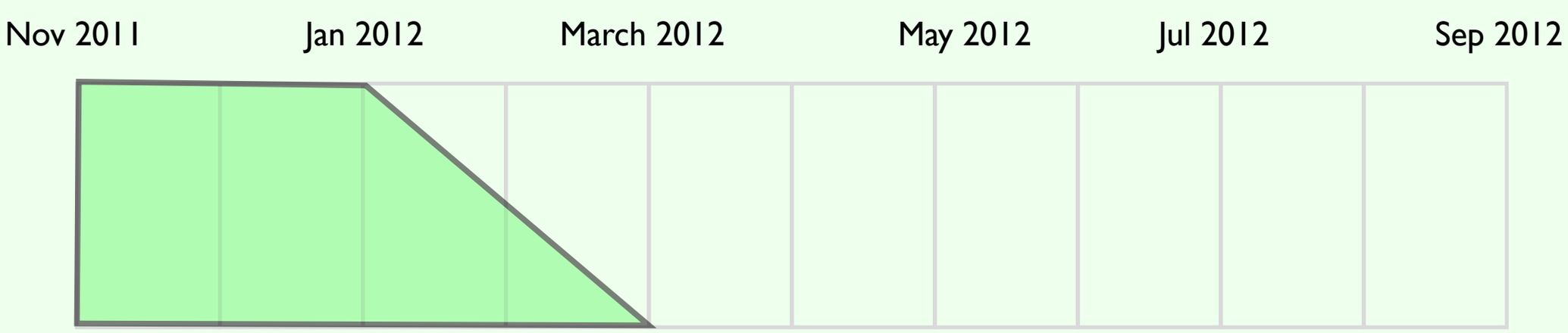
Evaluation

- conducting multiple case studies
- evaluating performance
  (cf. **efficiency** hypothesis)
- evaluating practicality
  (cf. **practical** hypothesis)

Evaluation

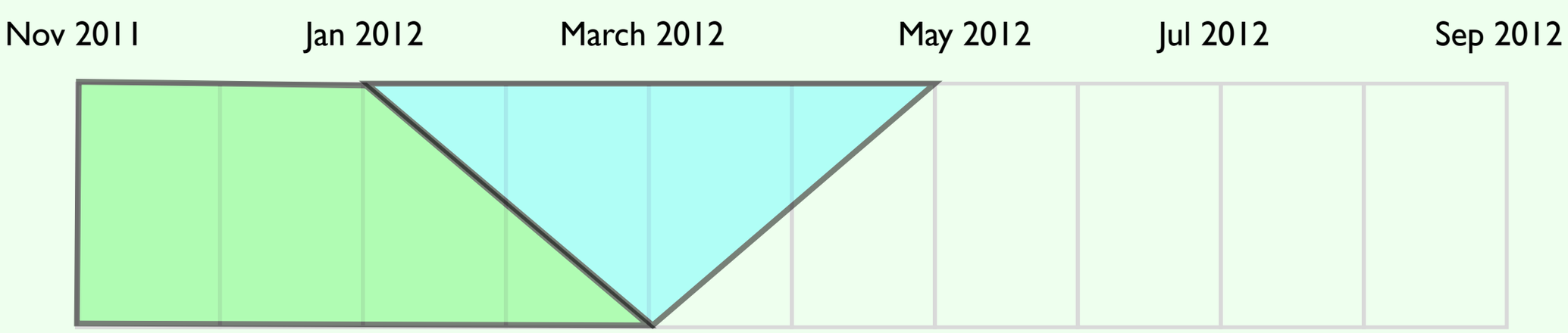
- selection of case studies
  - use applications with known parallel/ concurrency characteristics
    - use representative applications
      - existing real-world applications
      - existing benchmarks (SPLASH, SPEC, DaCapo, etc)
- rewrite applications in ÆMINIUM/Plaid

Time Line



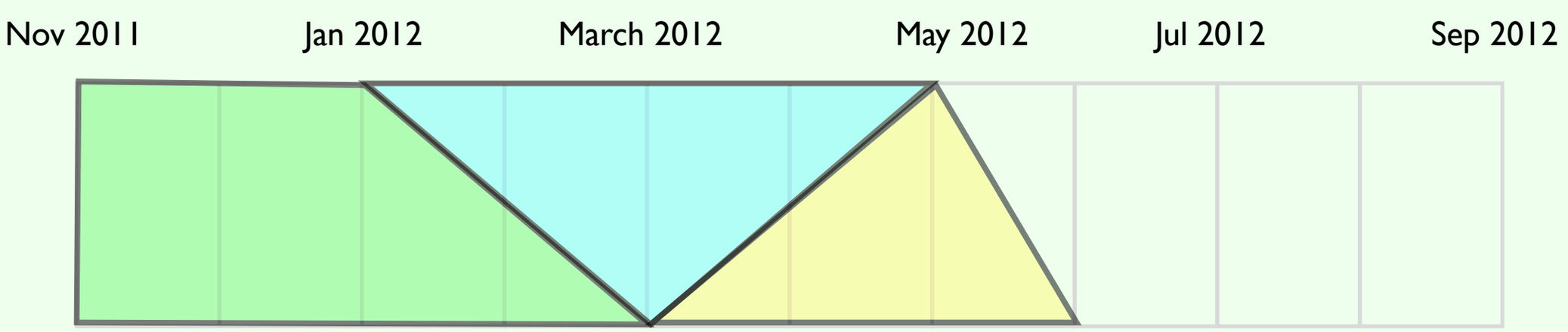
1st Milestone
permission only implementation

Time Line



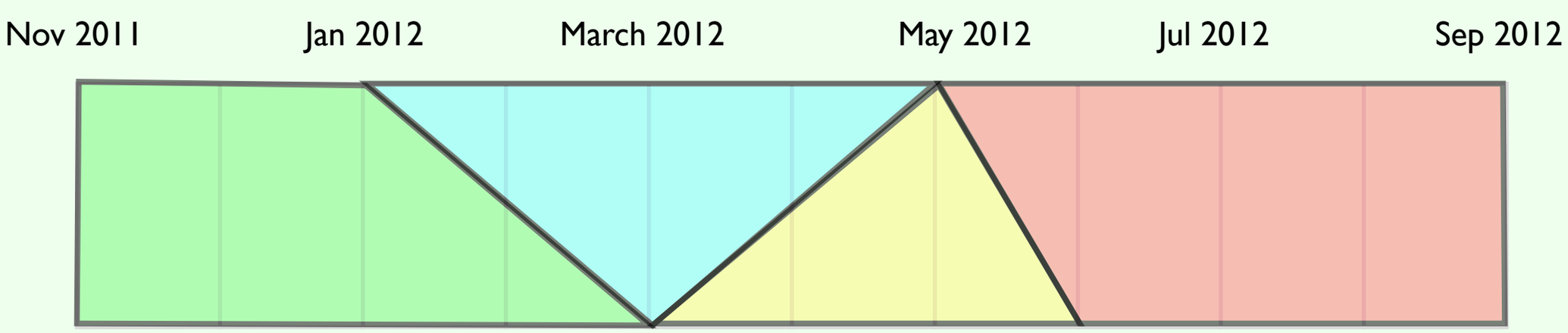
2nd Milestone
data group implementation

Time Line



Evaluation

Time Line



writing thesis

Risks

- Slow progress in Plaid
  - omit unnecessary features
  - parallelize/overlap work
  - 2 stage approach

Risks

- Granularity issues
  - implement optimization techniques (e.g., task merging, flattening, etc)
  - use dynamic load-balancing to avoid generation of "useless" tasks

Risks

- Lack of parallelism
  - no silver bullet
  - ensure that we do not pay extra in the case there is no parallelism

Thanks for the Attention!

Questions?