

A Comprehensive Study on the Energy Efficiency of Java Thread-Safe Collections



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Disclaimer

Miguel
turns
8mo
today!



Motivations

First, energy consumption is not only a concern for unwired devices, but also for data centers



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Second, multicore CPUs are ubiquitous



First, energy consumption is not only a concern for unwired devices, but also for data centers



Second, multicore CPUs are ubiquitous



Third, data structures are the fundamentals of computer programming

In case you are a Java
programmer...

List<Object> lists = ...;

- **ArrayList**
- **LinkedList**

```
List<Object> lists = new ArrayList<>();
```

Thread →



Non Thread-Safe

`List<Object> lists = ...;`

- **ArrayList**
- **LinkedList**

Thread-Safe

- **Vector**
- **Collections.synchronizedList()**
- **CopyOnWriteArrayList**

```
List<Object> lists = new Vector<>();
```

Thread →

List<Object> lists = new Vector<>();

Thread →

List<Object> lists = new Vector<>();



Thread-safe!



Thread →

List<Object> lists = new Vector<>();

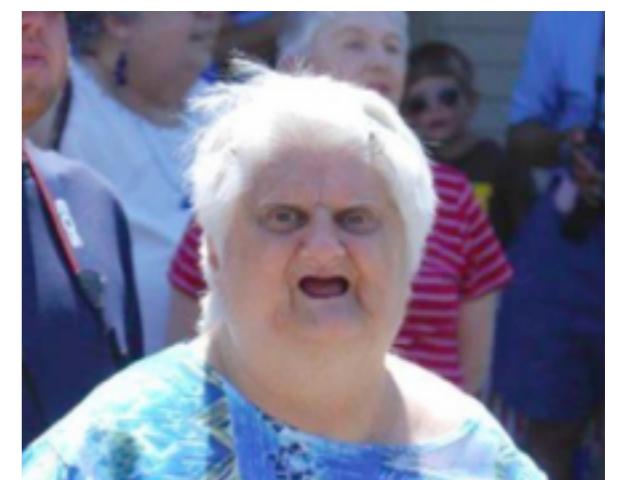
```
public class Vector<E> {  
    public synchronized void addElement(E obj) {}  
    public synchronized boolean removeElement(Object obj) {}  
    public synchronized E get(int index) {}  
    ...  
}
```

Thread →

List<Object> lists = new Vector<>();



```
public class Vector<E> {  
    public synchronized void addElement(E obj) {}  
    public synchronized boolean removeElement(Object obj) {}  
    public synchronized E get(int index) {}  
    ...  
}
```



```
List<Object> lists = new CopyOnWriteArrayList<>();
```

Thread



Thread-safe!

List<Object> lists = **new CopyOnWriteArrayList<>();**

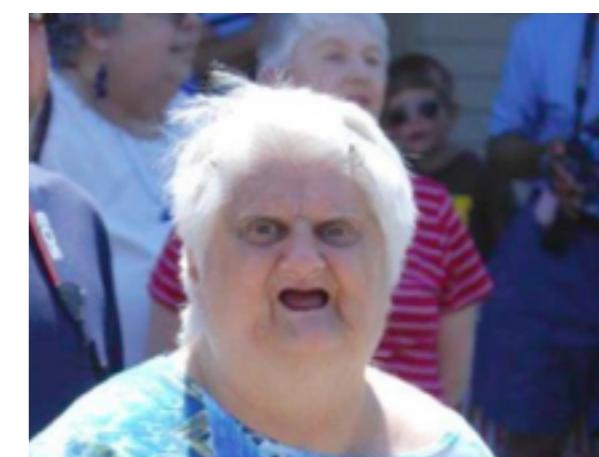
Thread



✓ Thread-safe!

List<Object> lists = new CopyOnWriteArrayList<>();

```
public class CopyOnWriteArrayList<E> {  
    private E get(Object[] a, int index) {  
        return (E) a[index];  
    }  
  
    public boolean add(E e) {  
        final ReentrantLock lock = this.lock;  
        lock.lock();  
        try {  
            Object[] elements = getArray();  
            int len = elements.length;  
            Object[] newElements = Arrays.copyOf(elements, len + 1);  
            newElements[len] = e;  
            setArray(newElements);  
            return true;  
        } finally {  
            lock.unlock();  
        }  
    }  
}
```



Non Thread-Safe

`List<Object> lists = ...;`

- **ArrayList**
- **LinkedList**

Thread-Safe

- **Vector**
- **Collections.synchronizedList()**
- **CopyOnWriteArrayList**



List<Object> lists = ...;

Set<Objects> sets = ...;

Map<Object, Object> maps = ...;

List<Object> lists = ...;

Set<Objects> sets = ...;

Map<Object, Object> maps = ...;



List<Object>

Set<Objects>

Map<Object



16 Collections

List
ArrayList
Vector
Collections.syncList()
CopyOnWriteArrayList

Set
LinkedHashSet
Collections.syncSet()
CopyOnWriteArraySet
ConcurrentSkipListSet
ConcurrentHashSet
ConcurrentHashSetV8

Map
LinkedHashMap
Hashtable
Collections.syncMap()
ConcurrentSkipListMap
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Non thread-safe

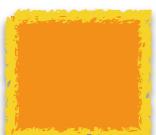
Thread-safe

16 Collections

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 Java 7

 Java 8

16 Collections

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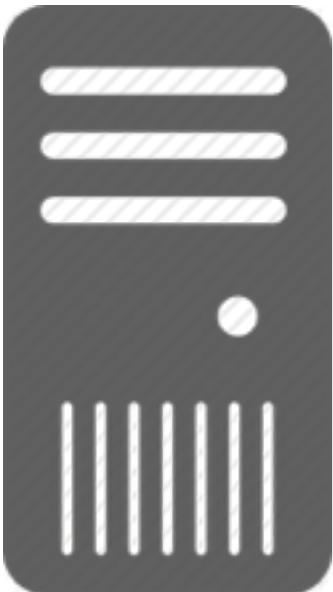
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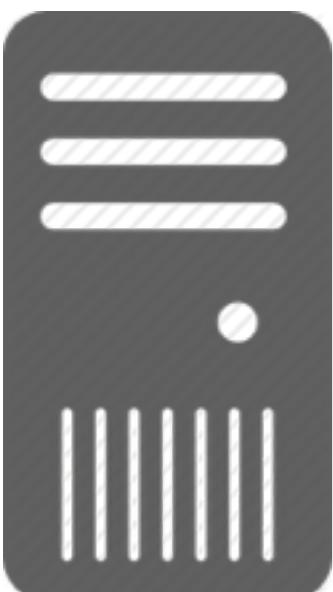
x 3 Operations

Traversal	Insertion	Removal
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2 Environments

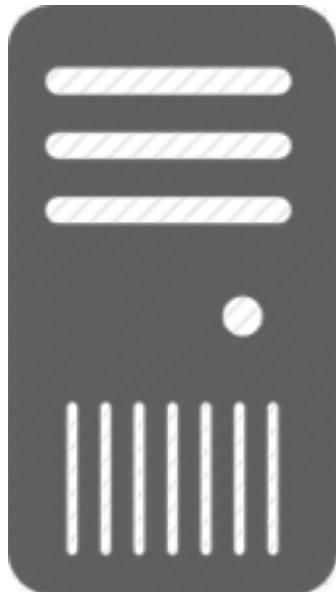


AMD CPU: A 2×16 -core, running Debian, 2.4 GHz, 64GB of memory, JDK version 1.7.0 11, build 21.



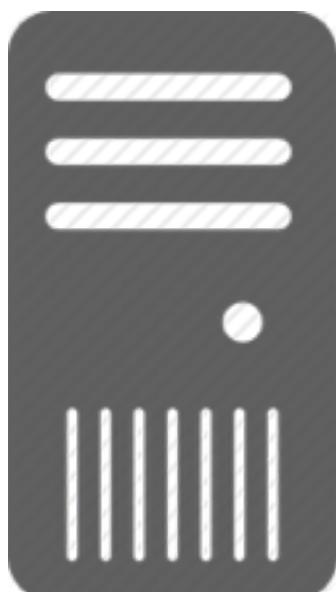
Intel CPU: A 2×8 -core (32-cores w/ hyper-threading), running Debian, 2.60GHz, with 64GB of memory, JDK version 1.7.0 71, build 14.

2 Environments



AMD CPU: A 2×16 -core, running Debian, 2.4 GHz, 64GB of memory, JDK version 1.7.0 11, build 21.

Hardware-based energy measurement



Intel CPU: A 2×8 -core (32-cores w/ hyper-threading), running Debian, 2.60GHz, with 64GB of memory, JDK version 1.7.0 71, build 14.

Software-based energy measurement

More details about how the experiments were conducted?



Artifacts Track

Friday (10:45 AM - 12:15 PM, University)

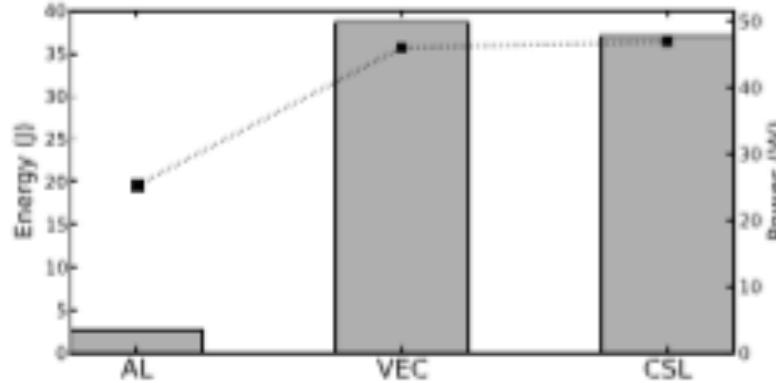
- Breno D. Cruz, Paul W. McBurney and Collin McMillan. *TraceLab Components for Reproducing Source Code Summarization Experiments*
 - Neil Walkinshaw and Mathew Hall. *Data and Analysis code for GP EFSM Inference (Scorecard)*
 - Mona Rahimi and Jane Cleland-Huang. *Cassandra Source Code, Feature Descriptions across 27 versions, with Starting and Ending Version Trace Matrices*
 - Leonard Punt, Sjoerd Visscher and Vadim Zaytsev. *A Tool for Detecting and Refactoring the A?B*A Pattern in CSS*
- Gustavo Pinto, Kenan Liu, Fernando Castor and Yu David Liu. *A Comprehensive Study on the Energy Efficiency of Java's Thread-Safe Collections*
 - Leonard Punt, Sjoerd Visscher and Vadim Zaytsev. *The A?B*A Pattern: Undoing Style in CSS and Refactoring Opportunities it Presents*

<http://icsme2016.github.io/program/accepted.html>

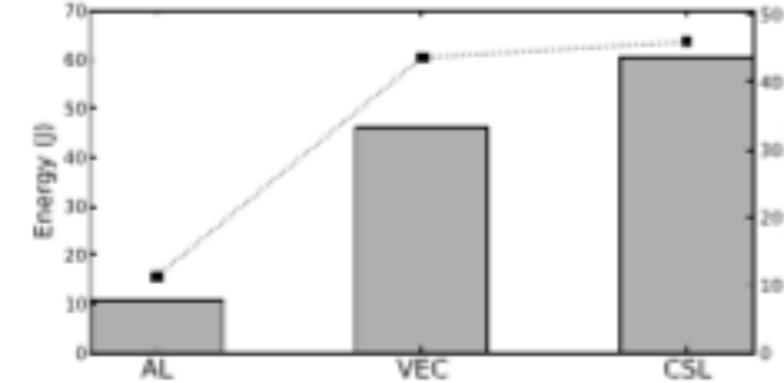
Results

Lists

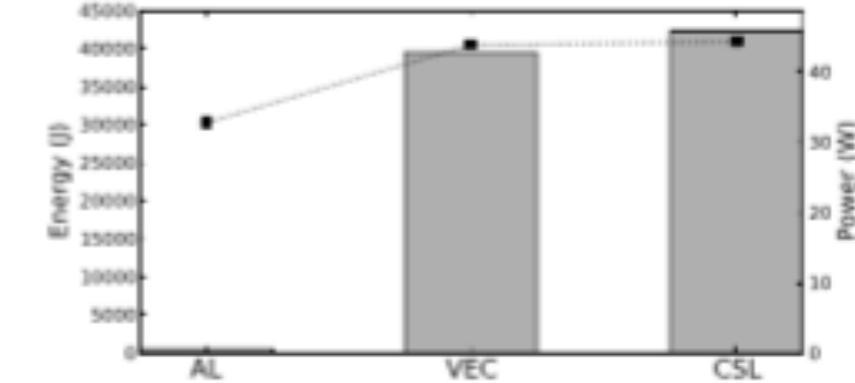
AMD CPU



Traversal

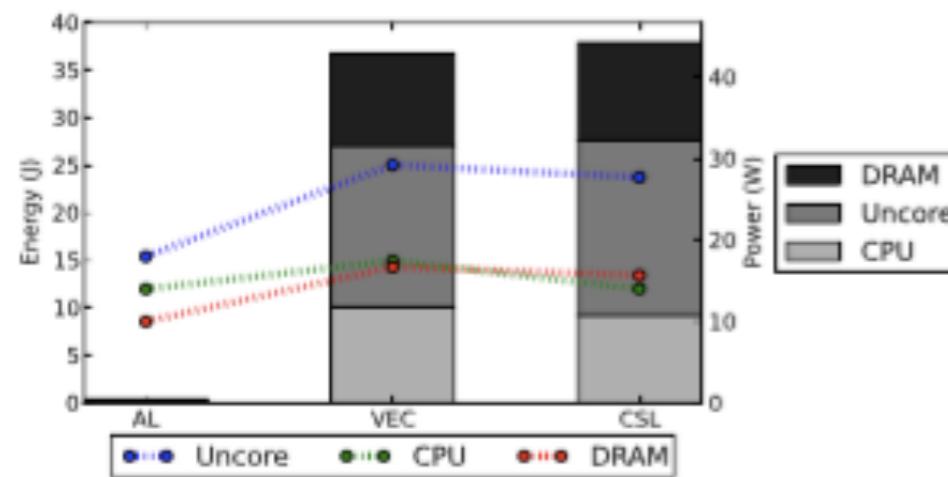


Insertion

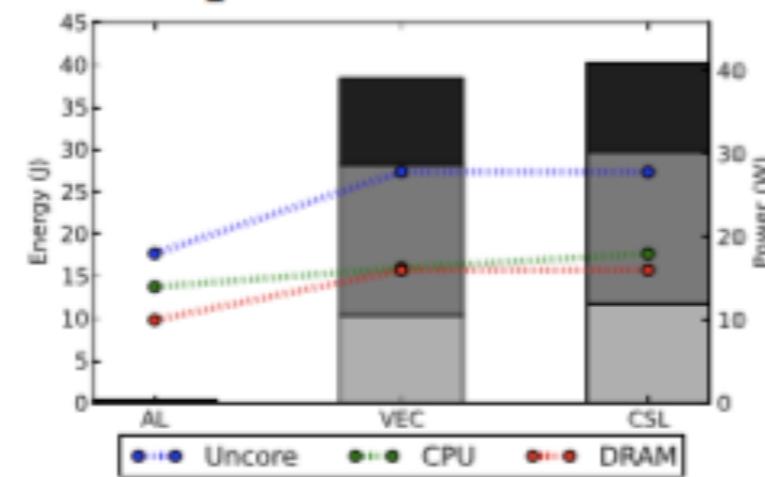


Removal

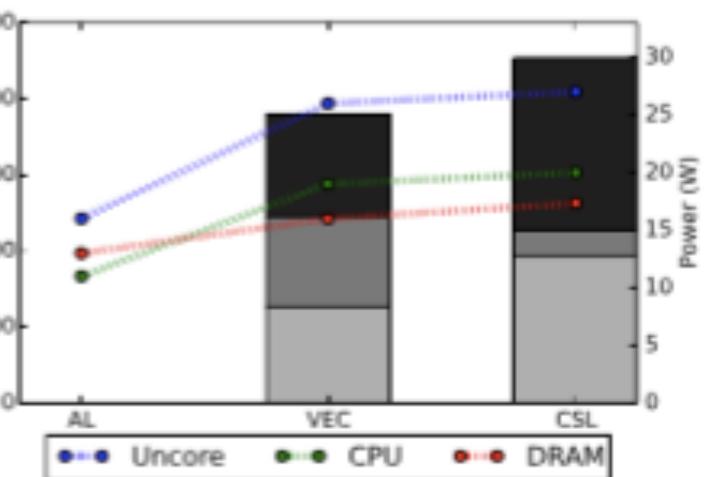
Intel CPU



Traversal

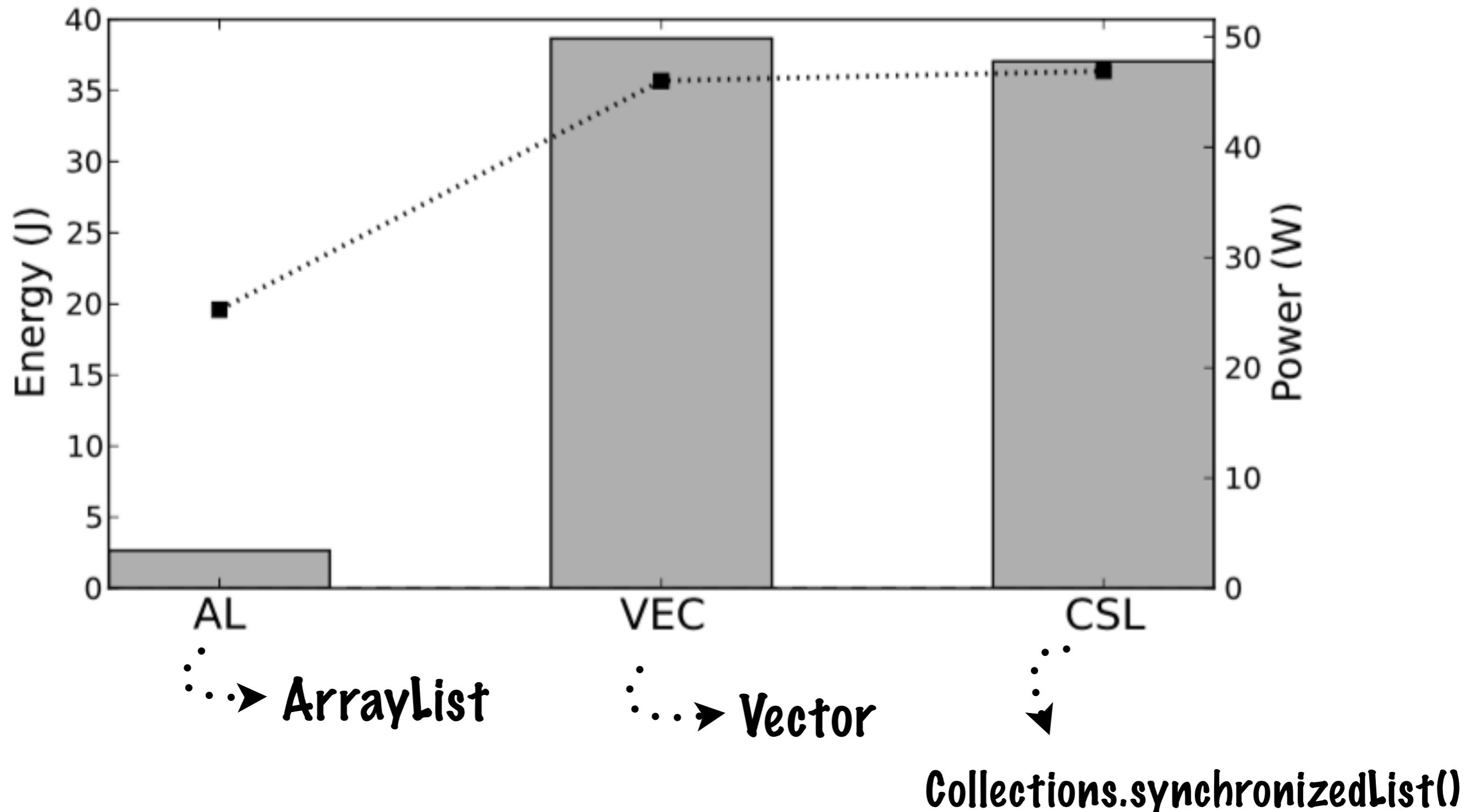


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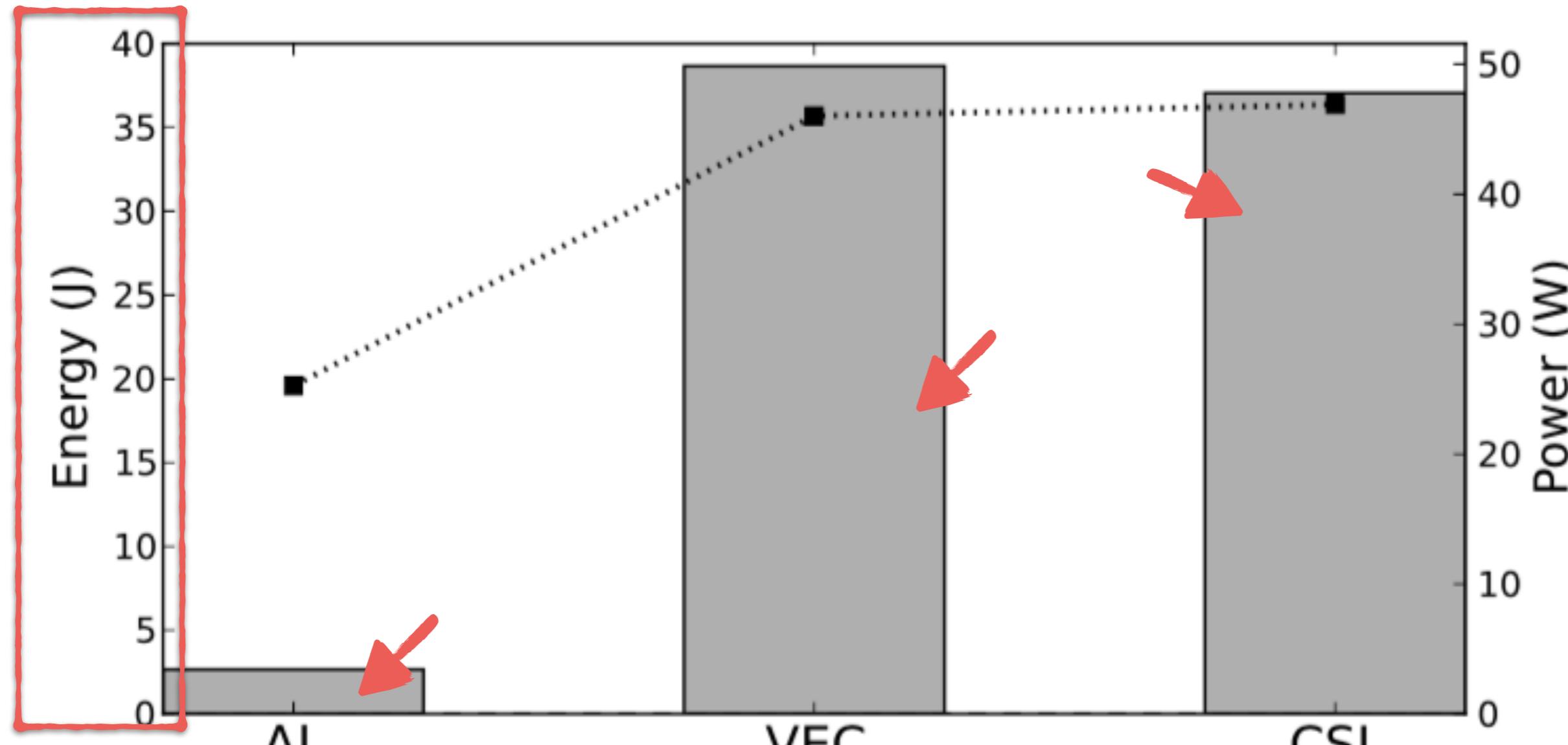
Removal

Lists



Lists

Energy (Joules)



AL

ArrayList

VEC

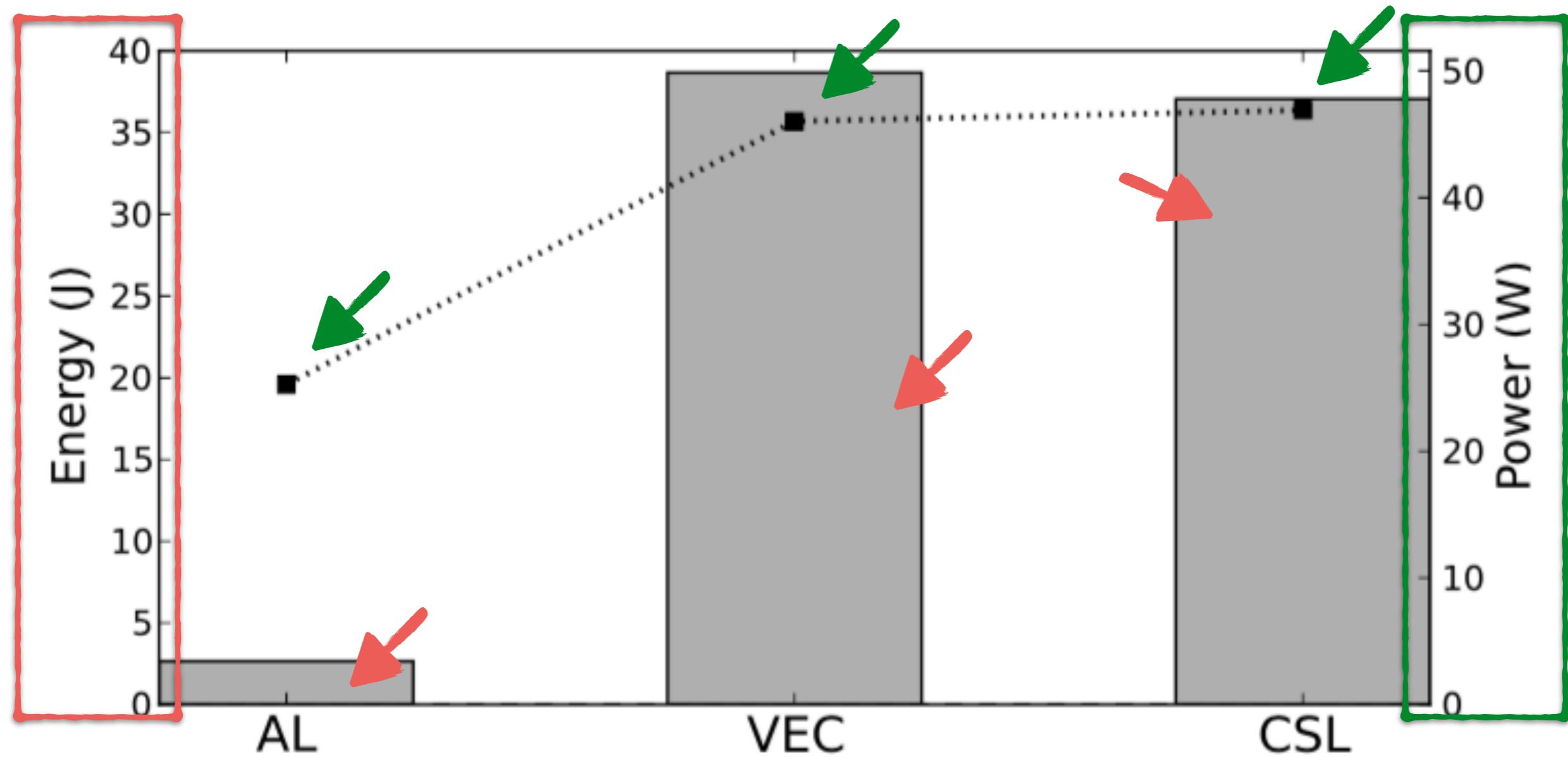
Vector

CSL

Collections.synchronizedList()

Energy (Joules)

Power (Watts)



...> ArrayList

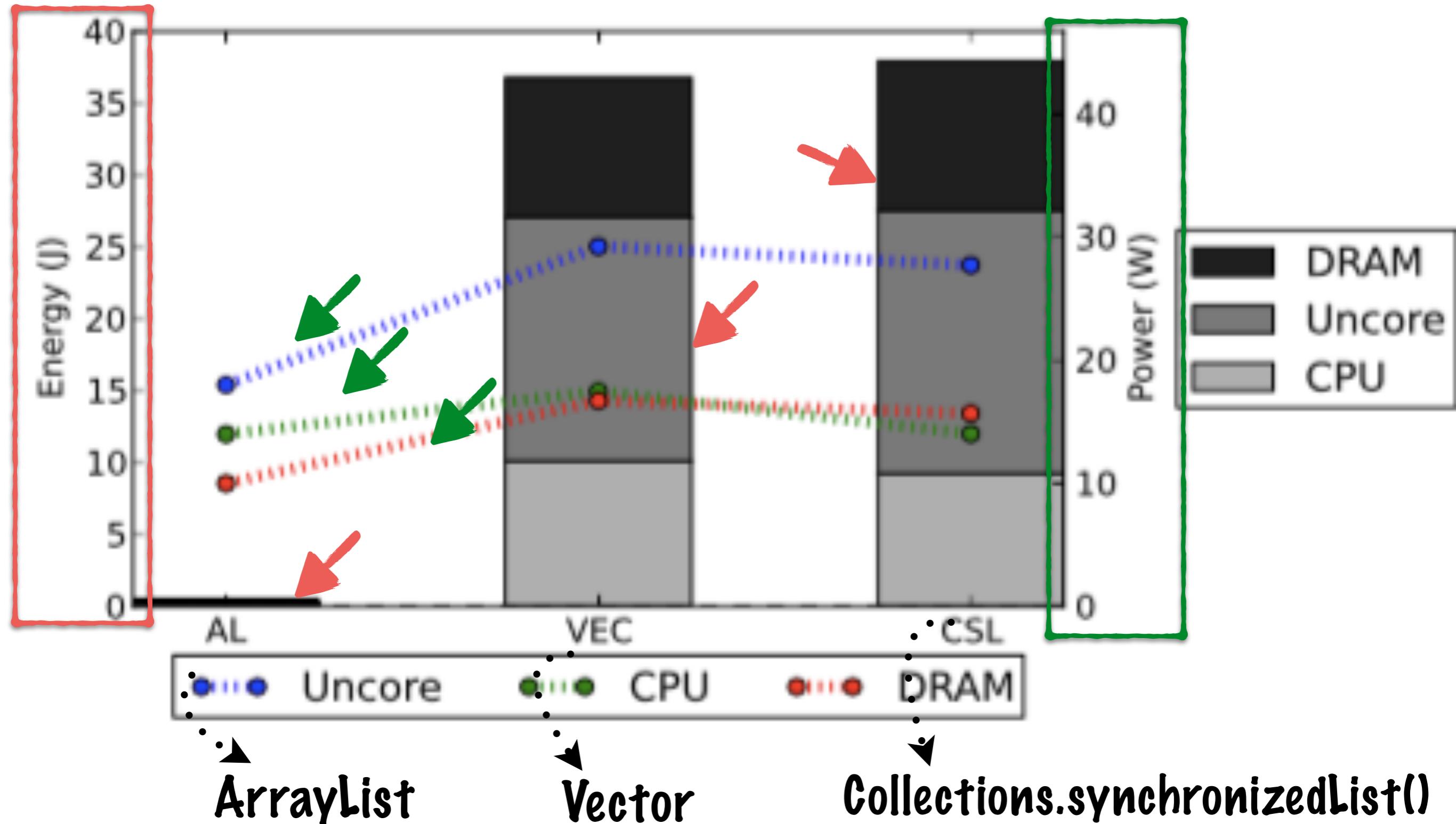
...> Vector

Collections.synchronizedList()

Lists

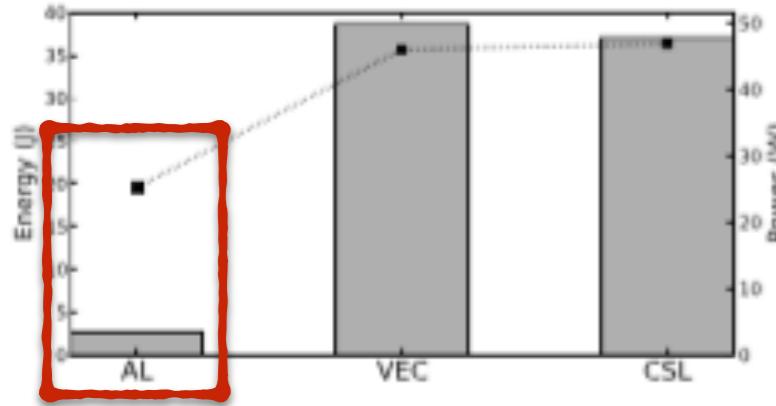
Energy (Joules)

Power (Watts)

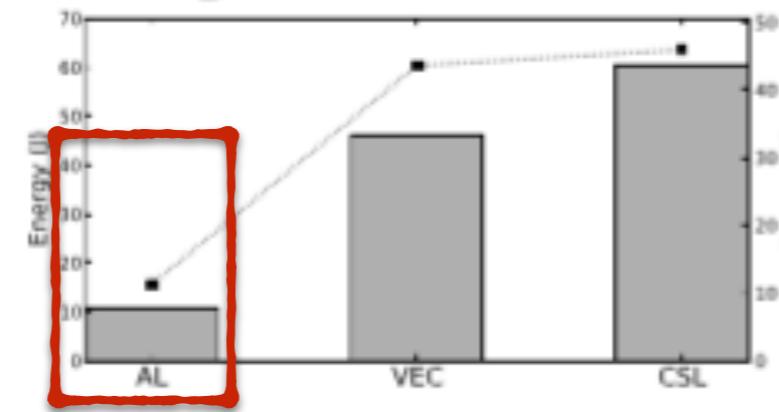


Lists

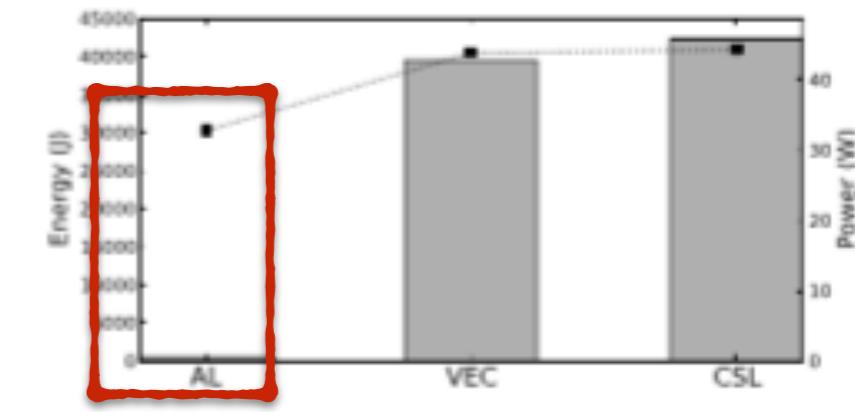
AMD CPU



Traversal

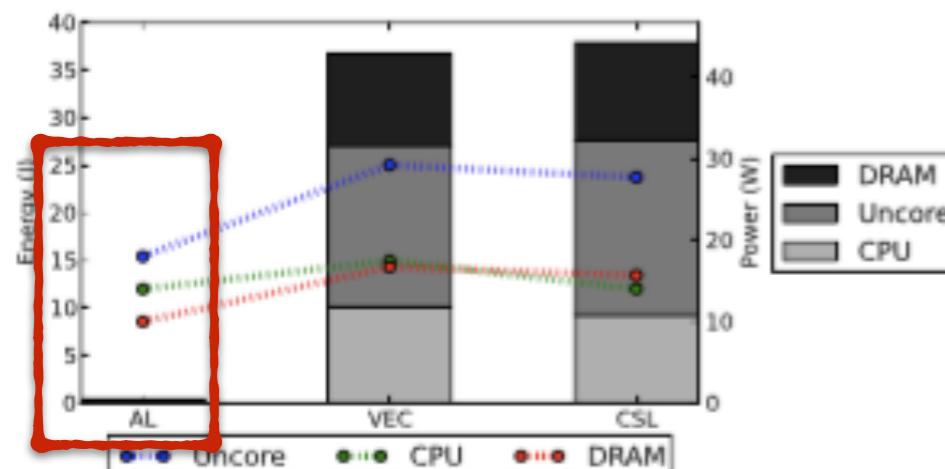


Insertion

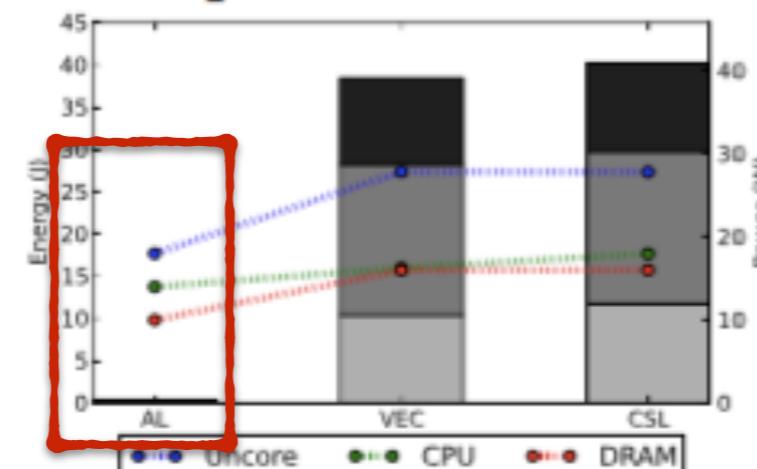


Removal

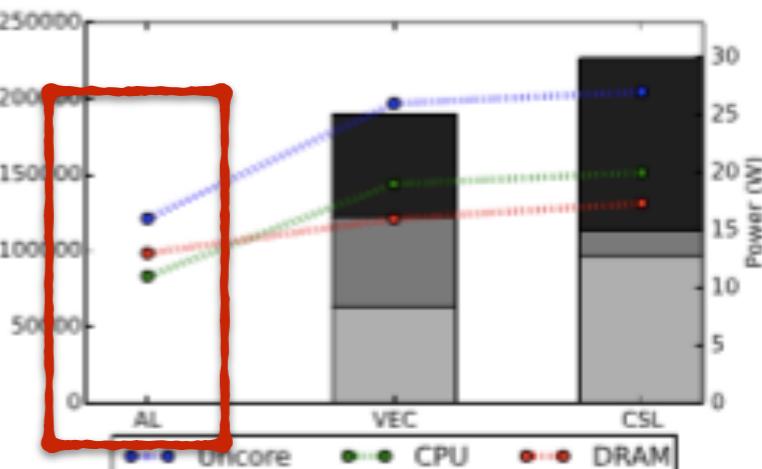
Intel CPU



Traversal



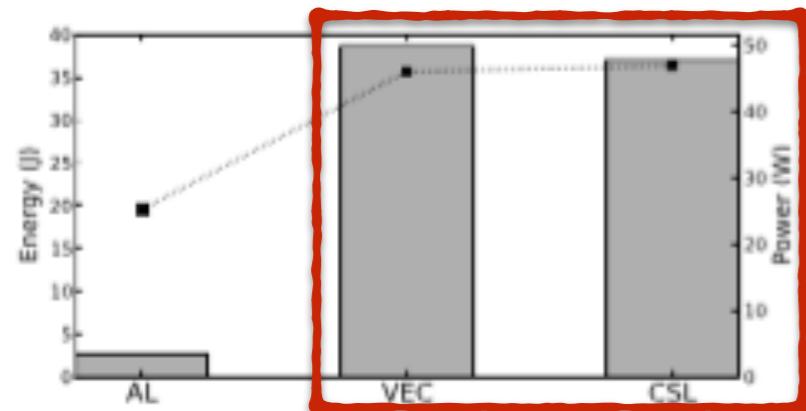
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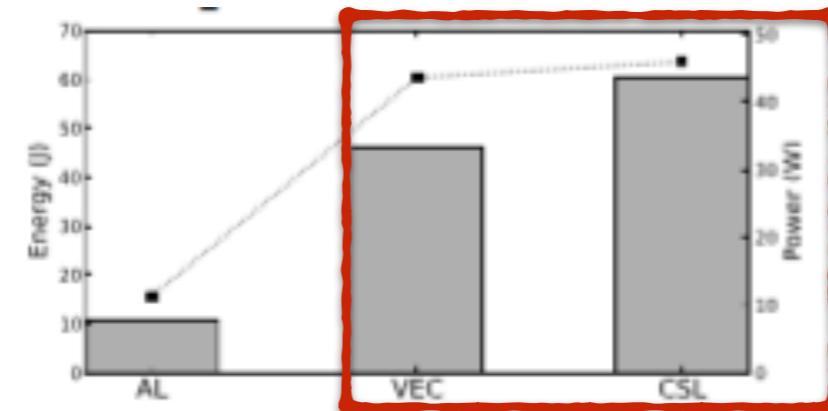
Removal

Lists

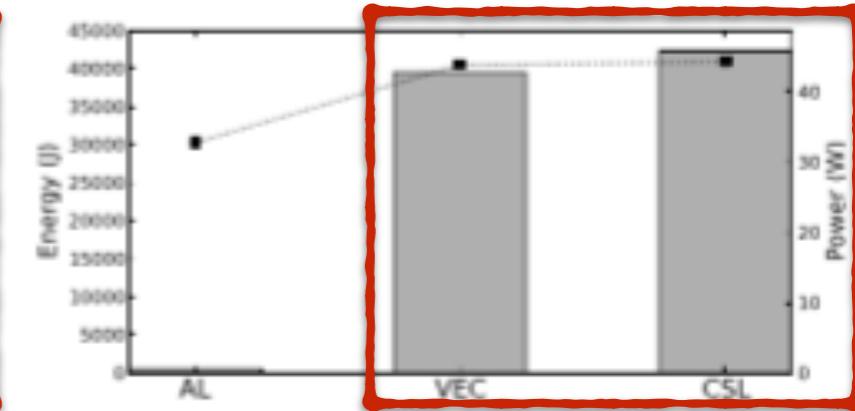
AMD CPU



Traversal

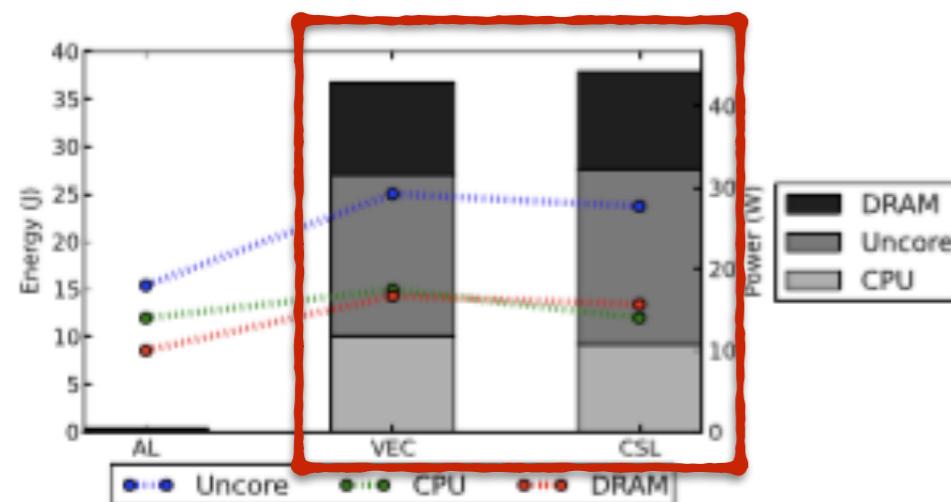


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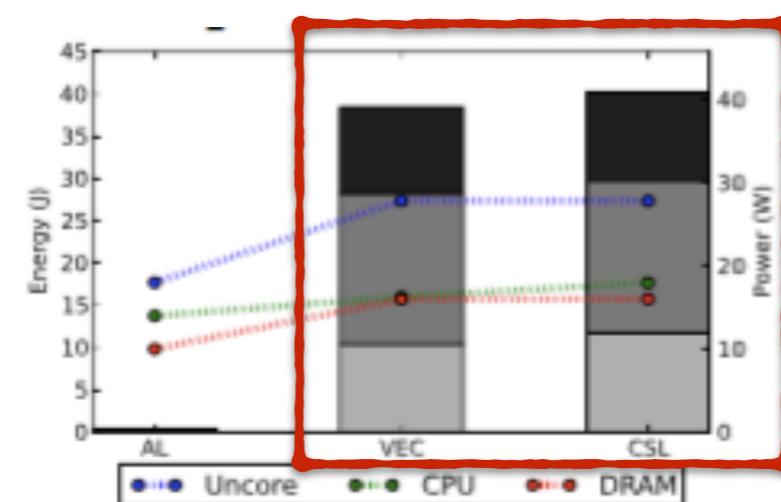


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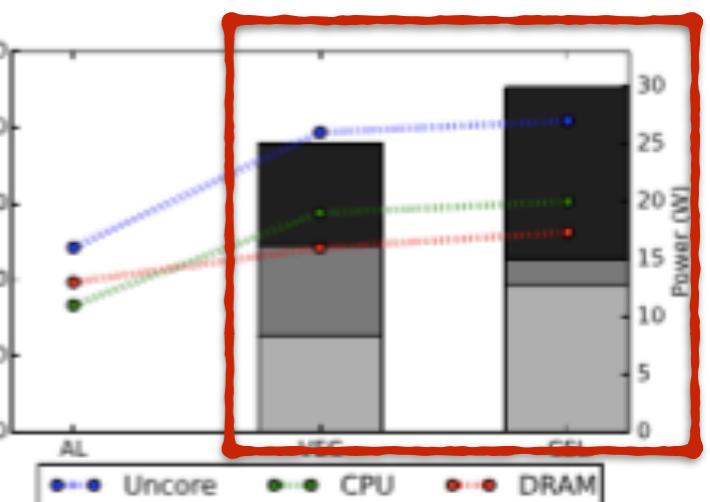
Intel CPU



Traversal



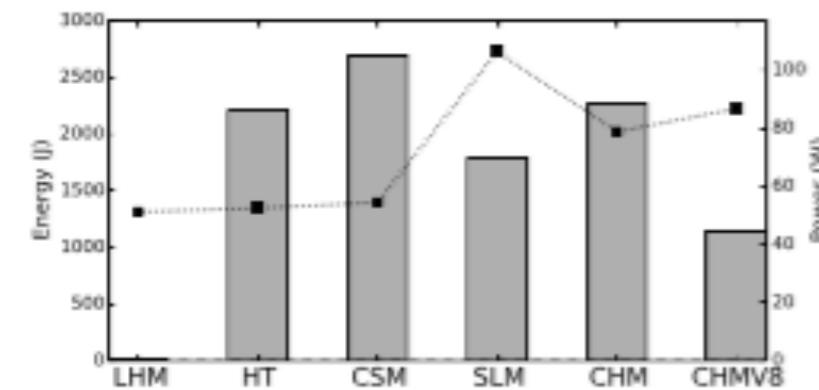
Insertion



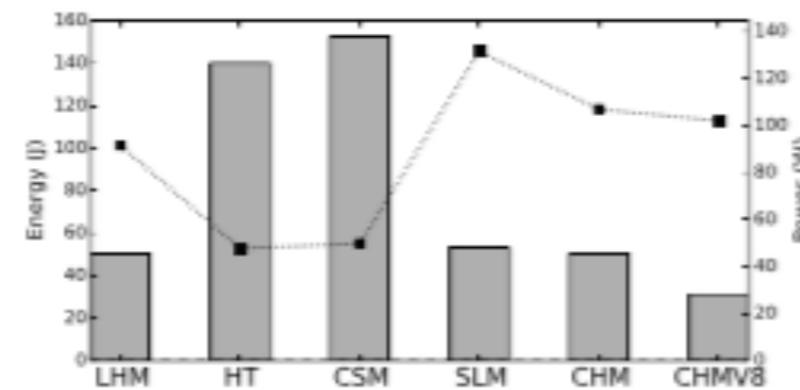
Removal

Maps

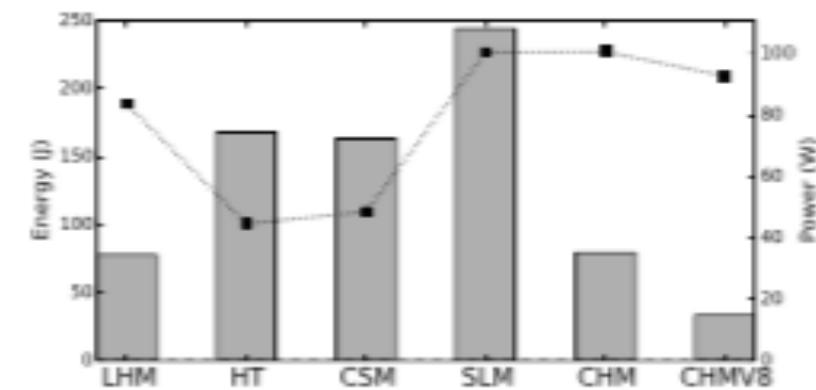
AMD CPU



Traversal

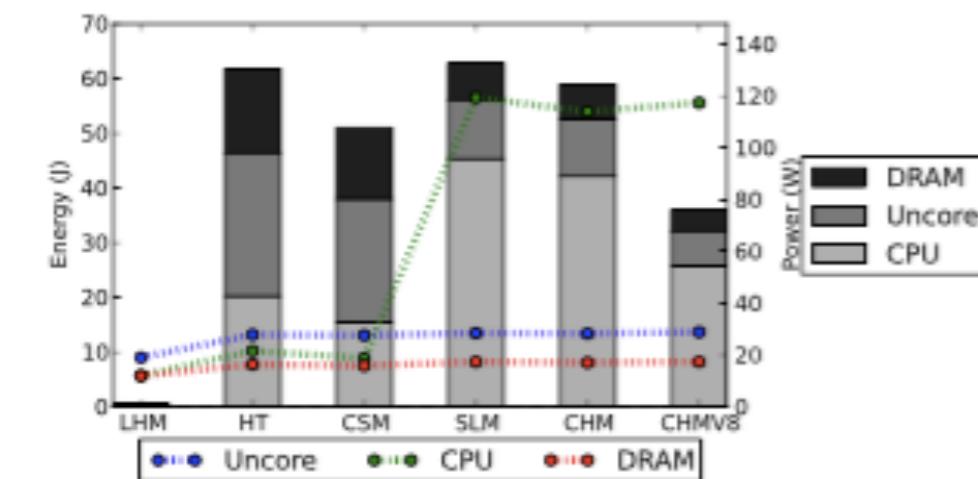


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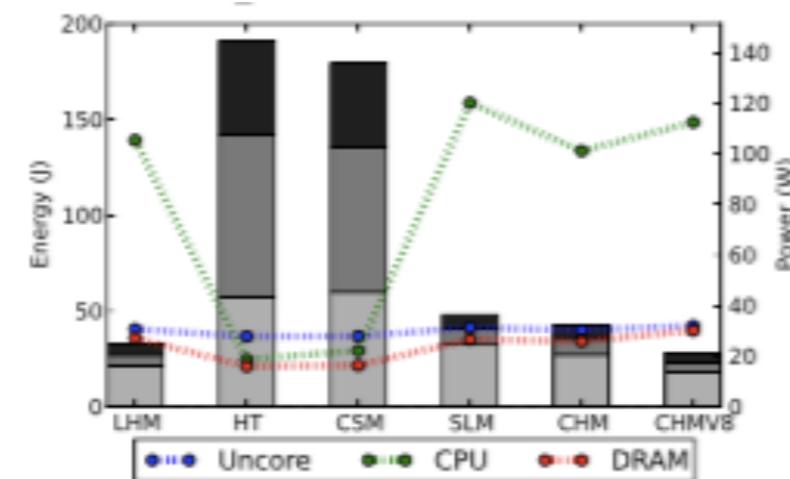


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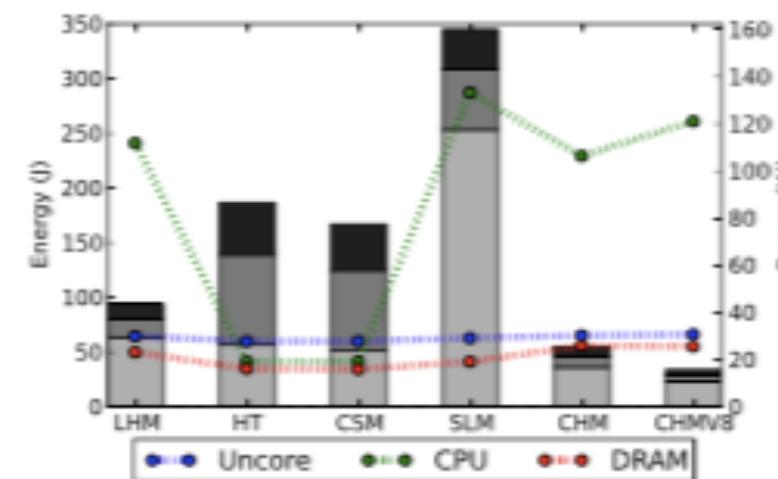
Intel CPU



Traversal



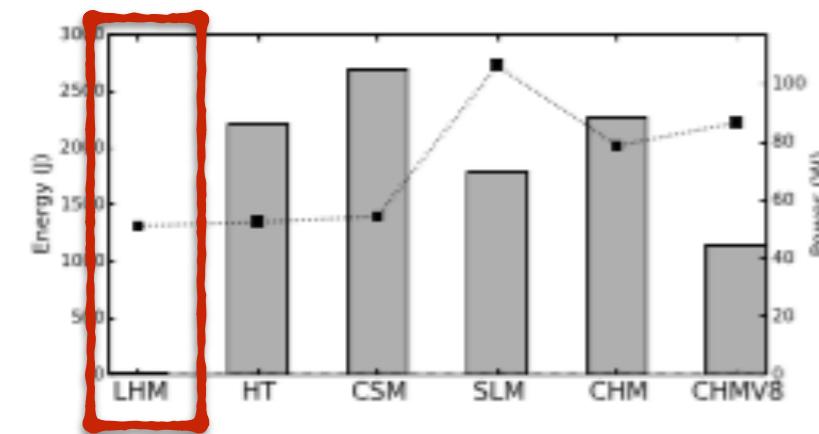
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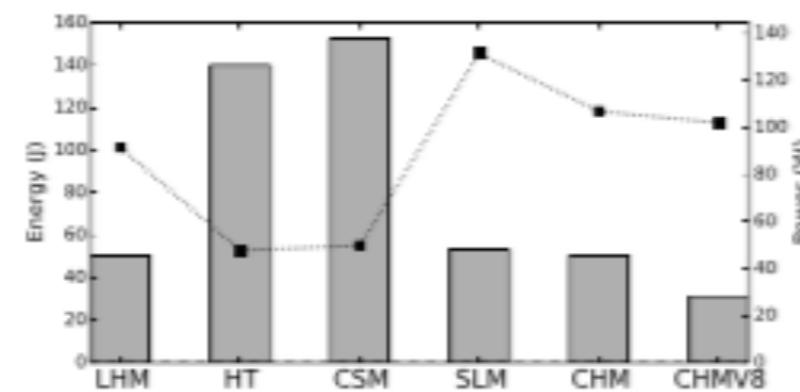
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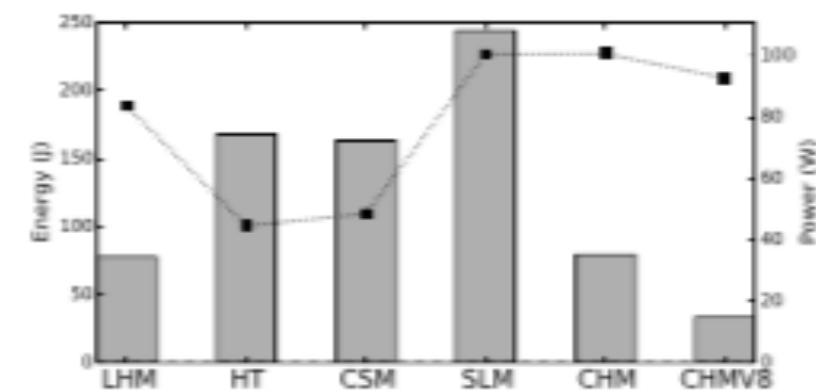
AMD CPU



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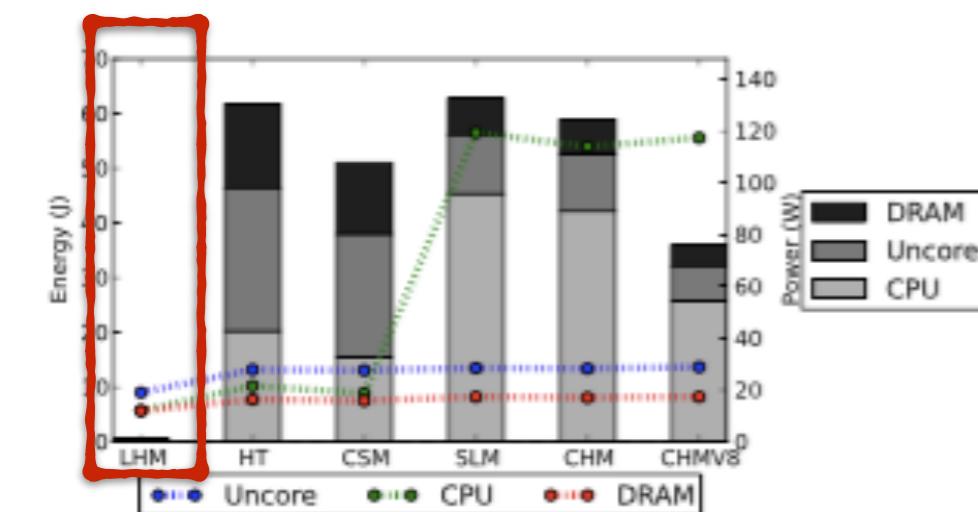


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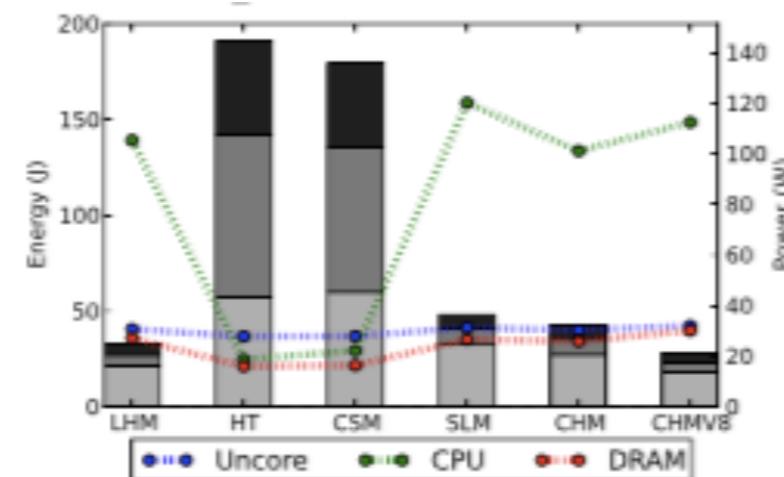


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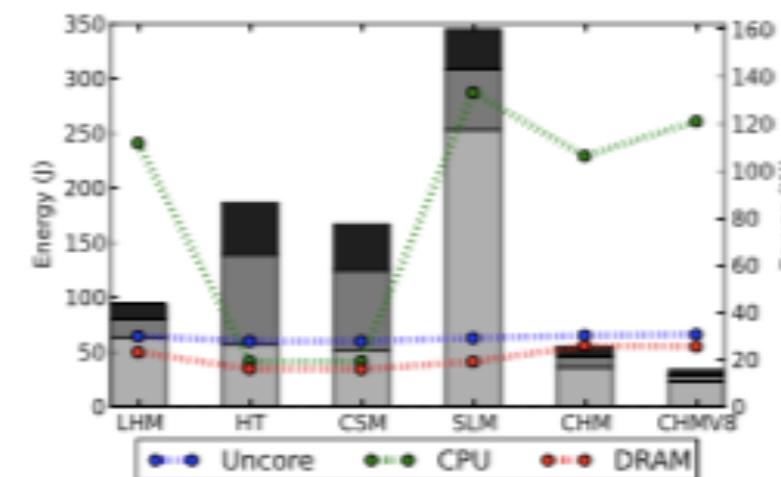
Intel CPU



Traversal



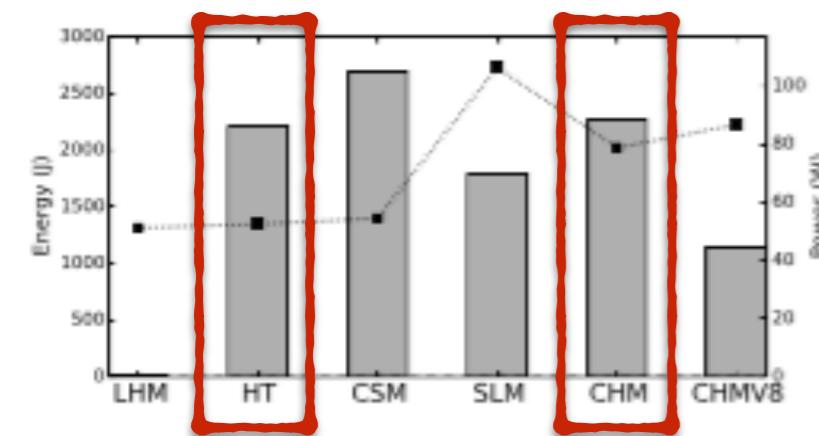
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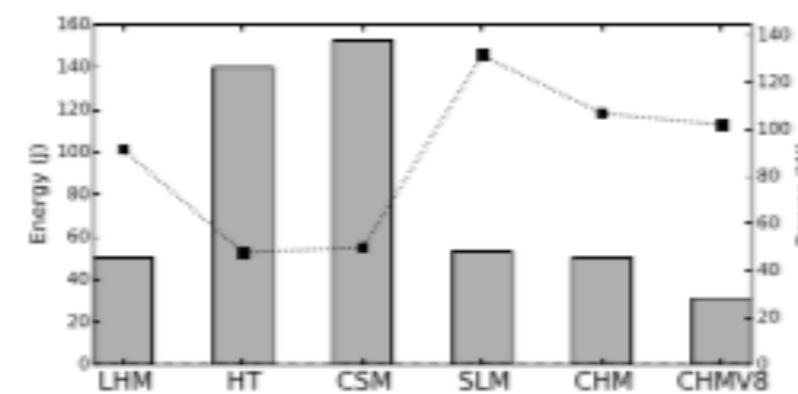
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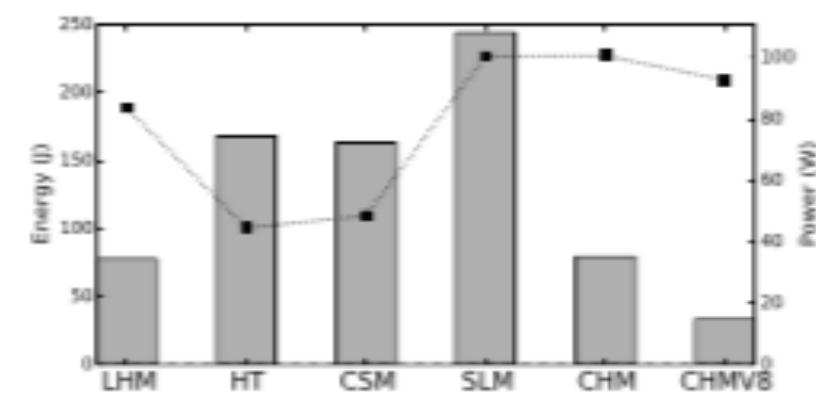
AMD CPU



Traversal

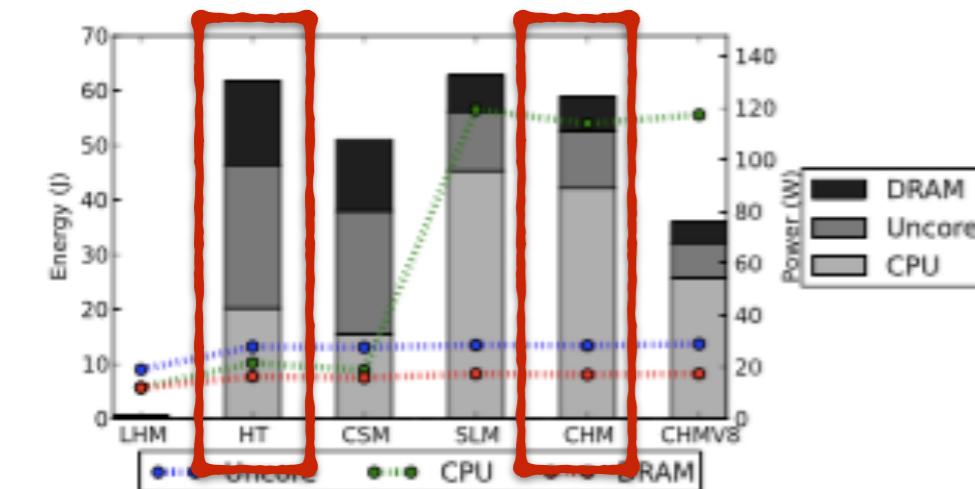


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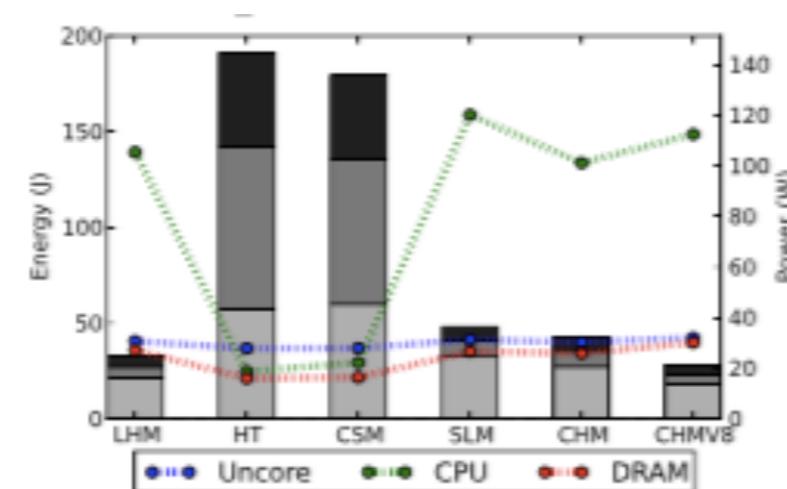


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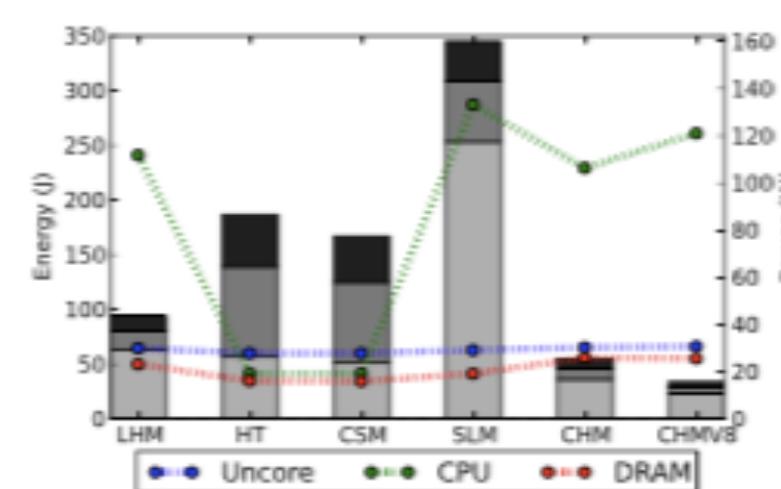
Intel CPU



Traversal



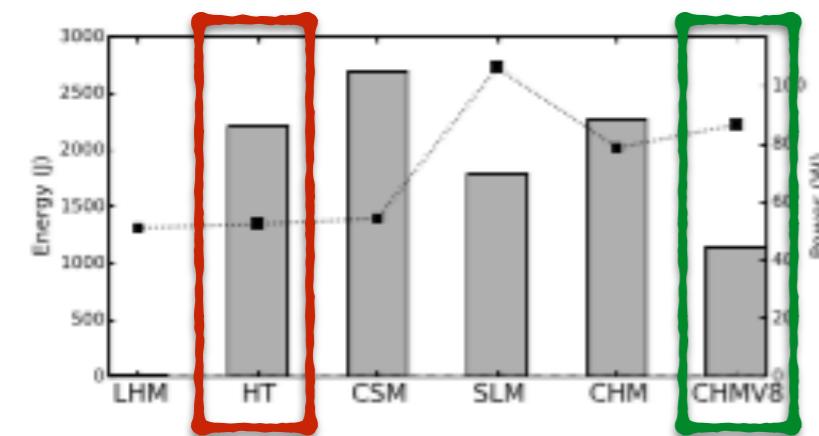
Insertion



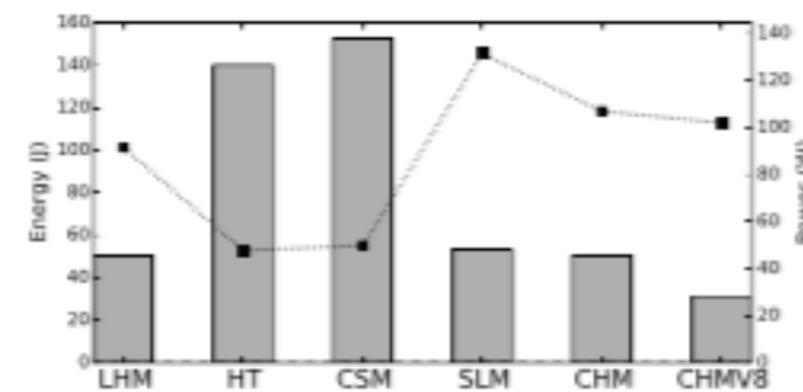
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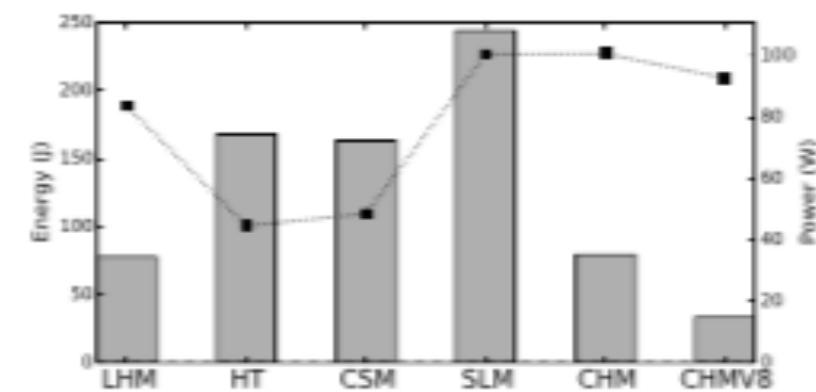
AMD CPU



Traversal

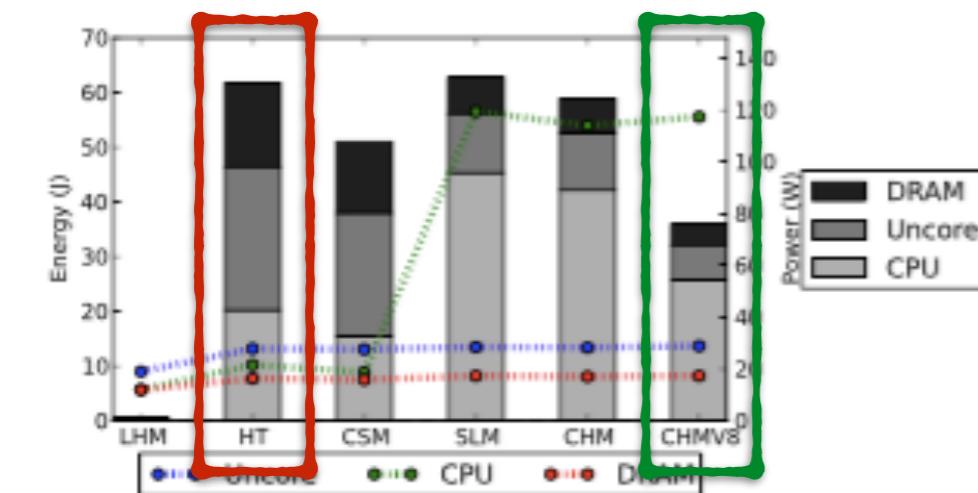


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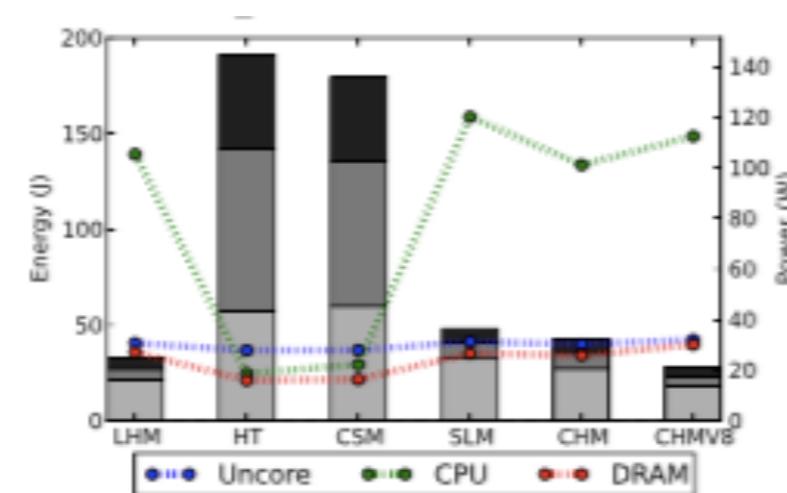


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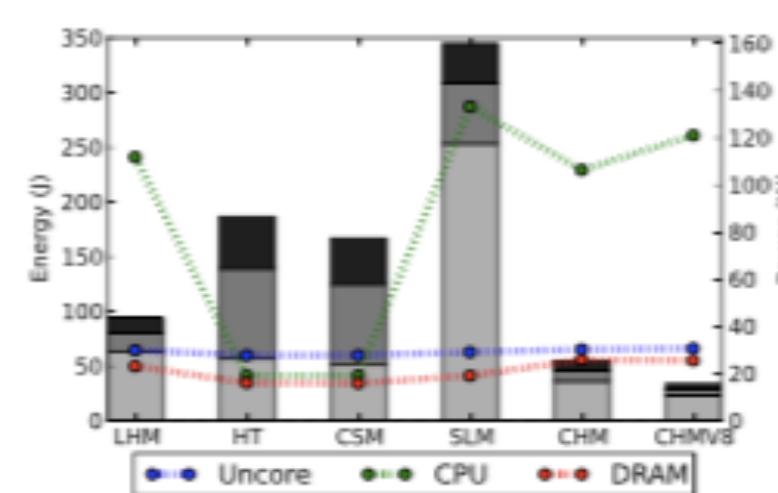
Intel CPU



Traversal



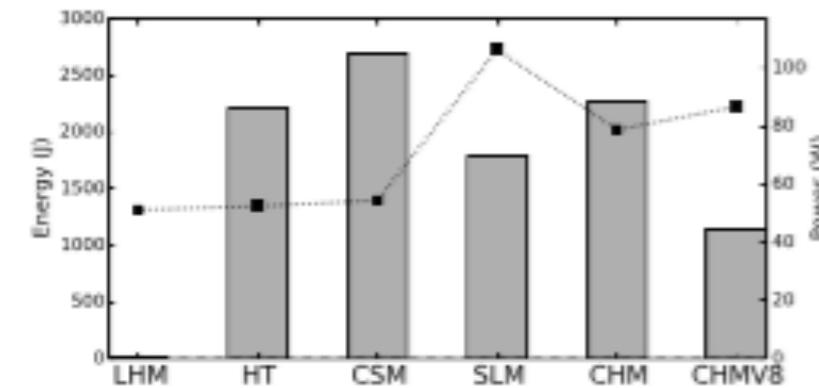
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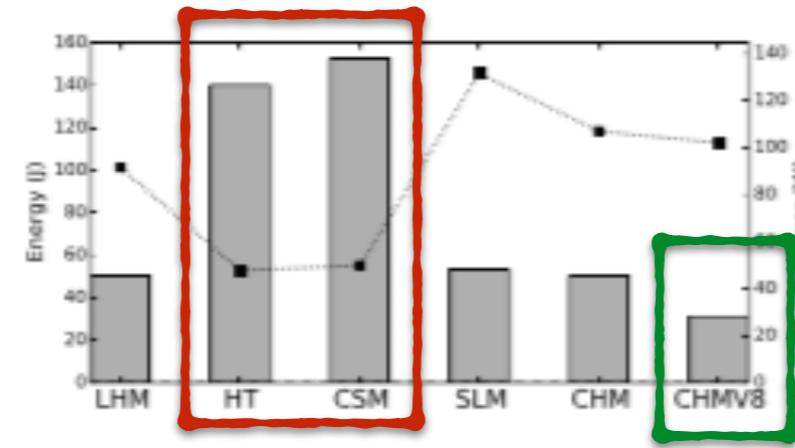
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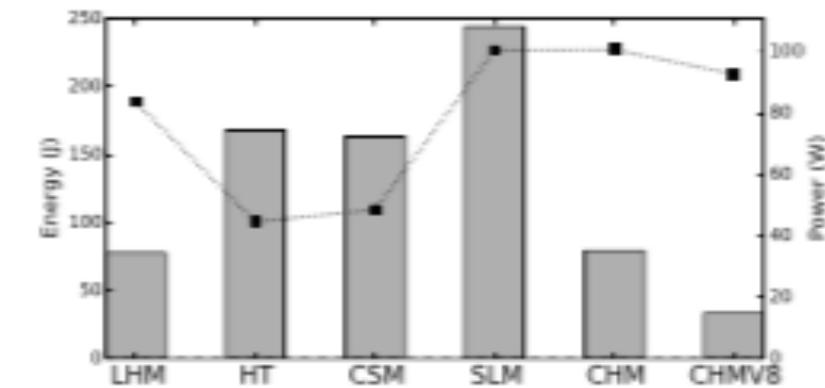
AMD CPU



Traversal

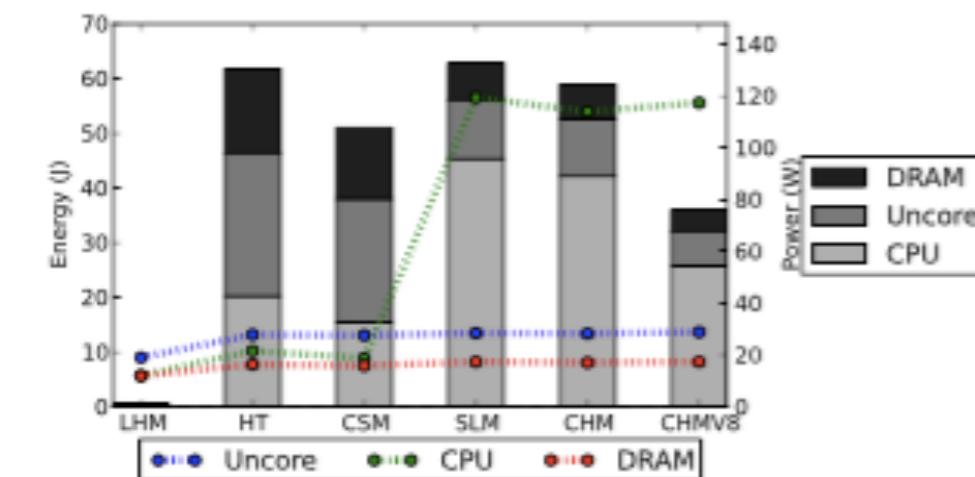


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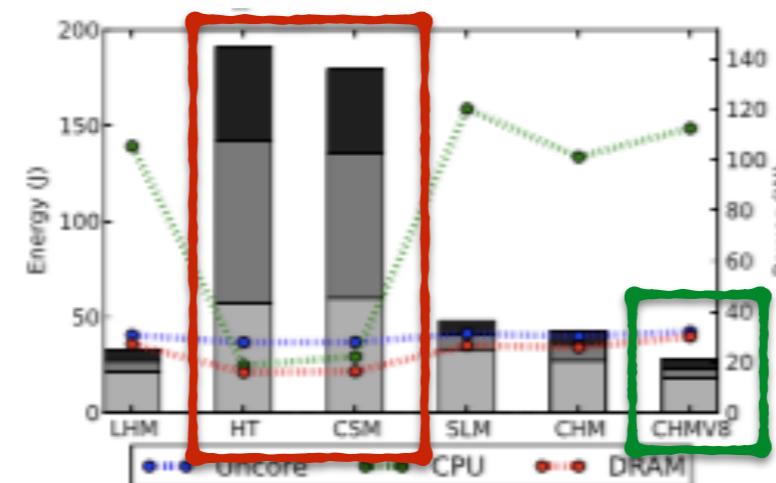


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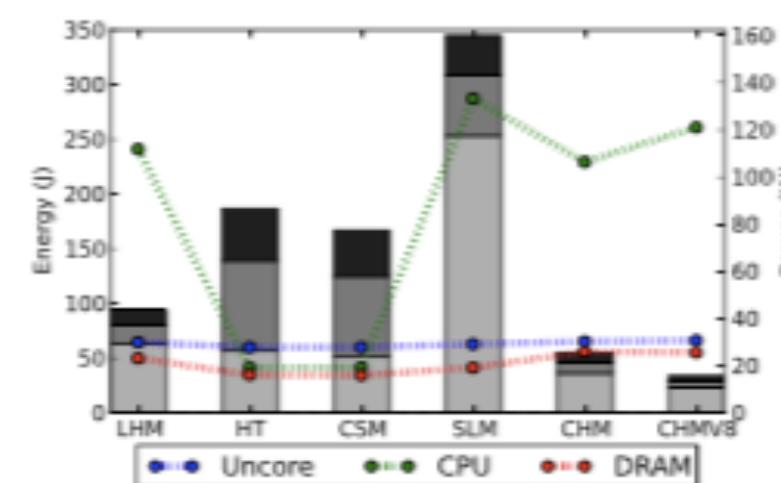
Intel CPU



Traversal



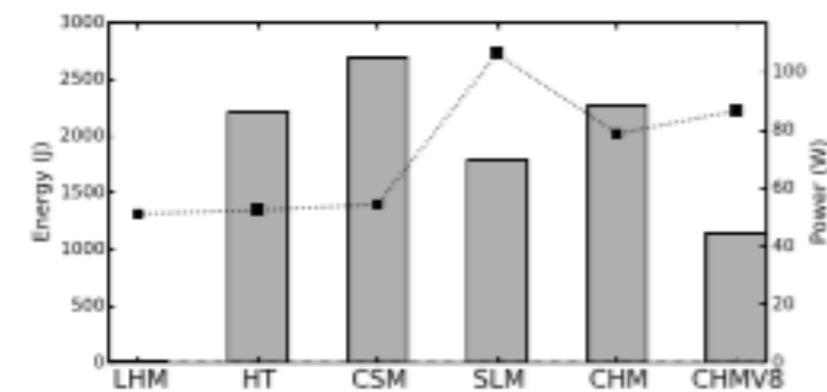
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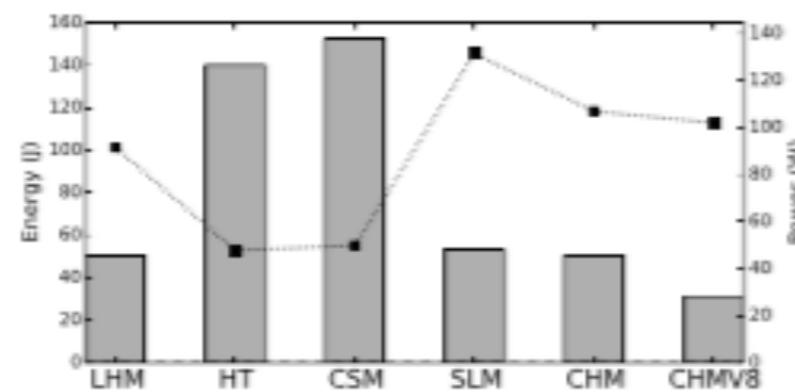
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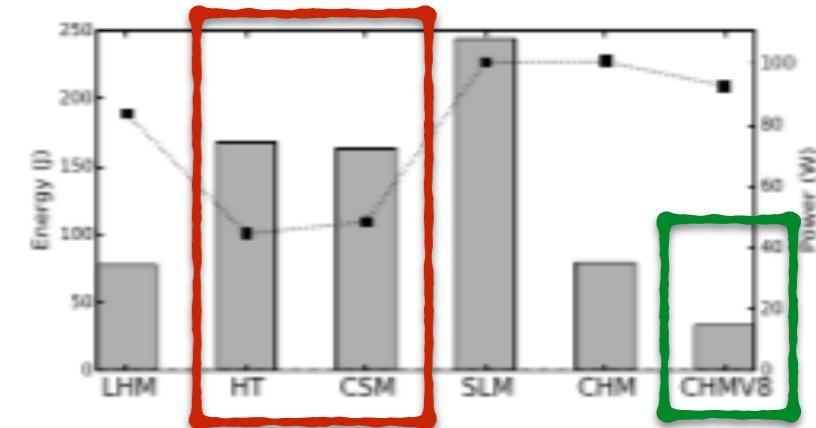
AMD CPU



Traversal

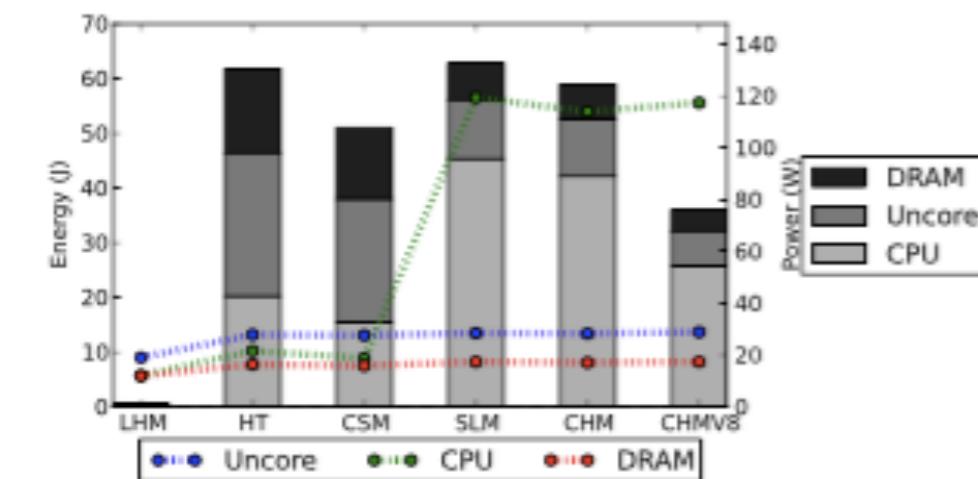


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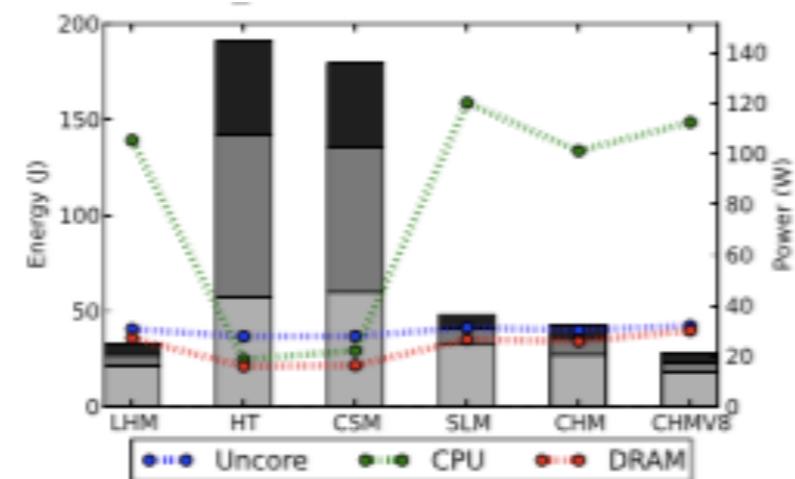


Removal

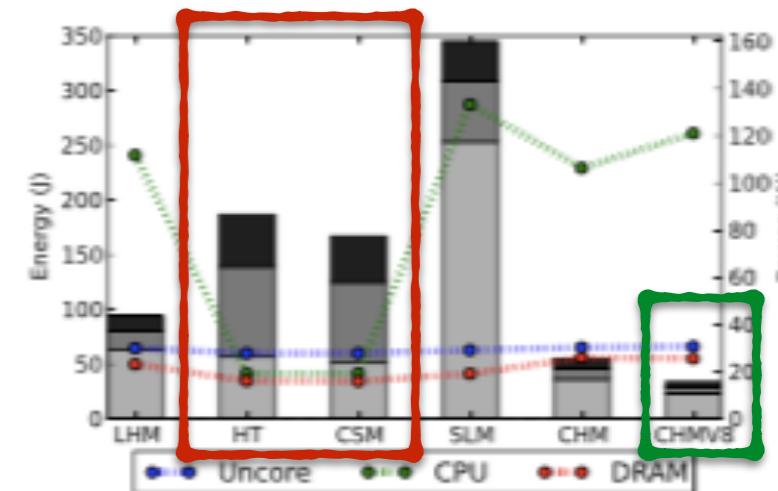
Intel CPU



Traversal



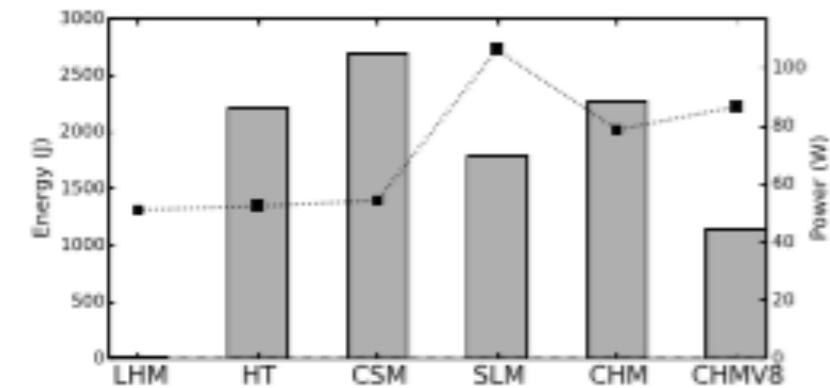
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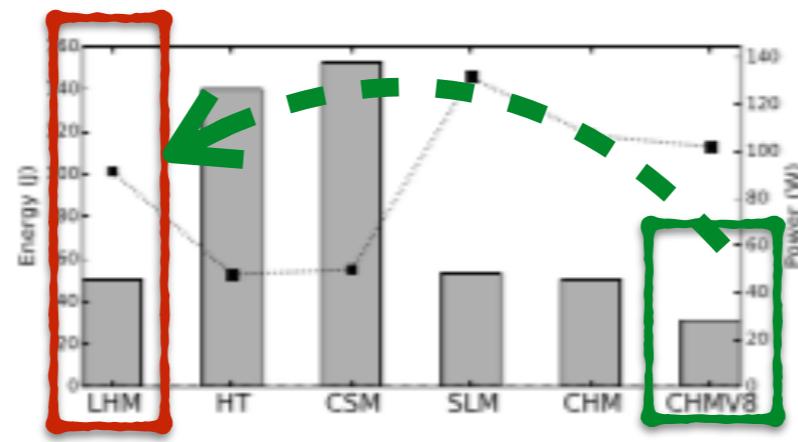
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Maps

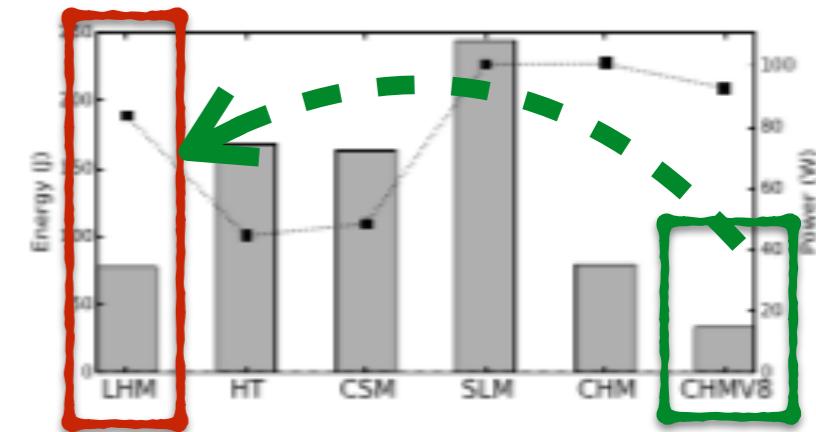
AMD CPU



Traversal

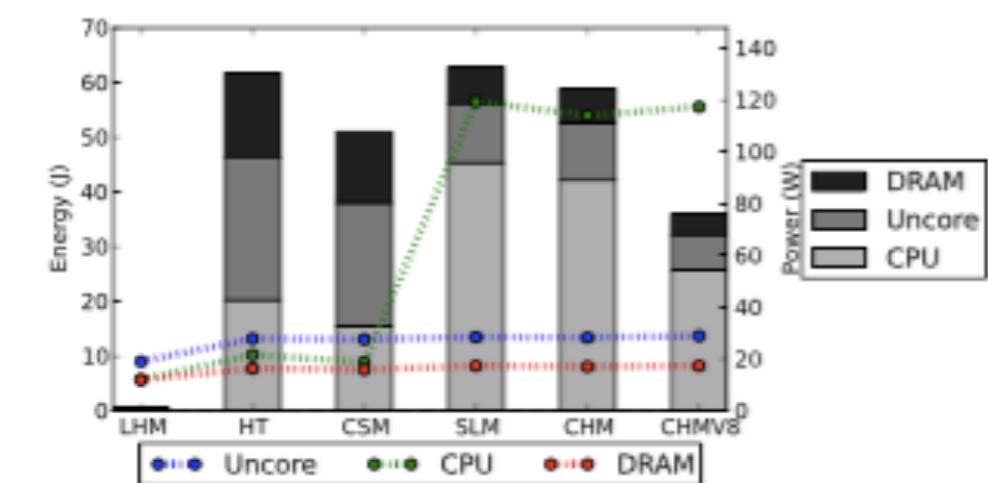


Insertion

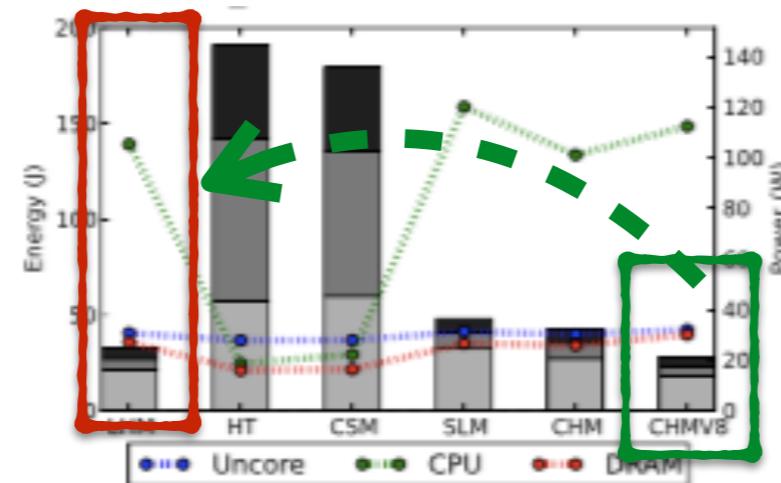


Removal

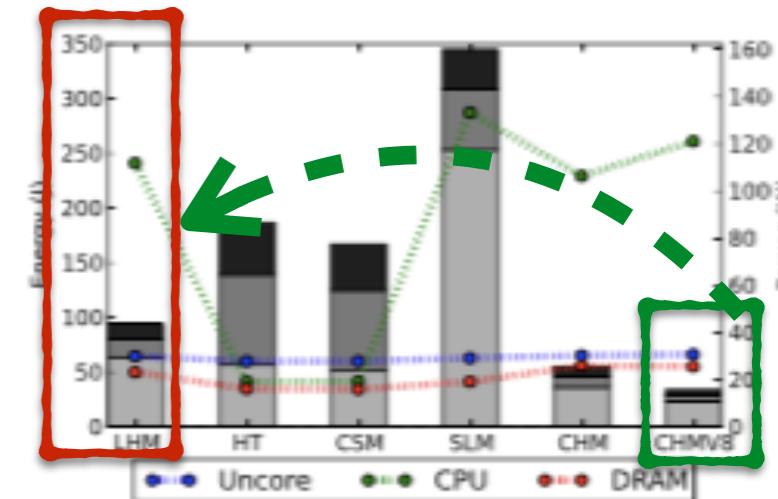
Less energy than the non thread-safe implementation!



Traversal



Insertion

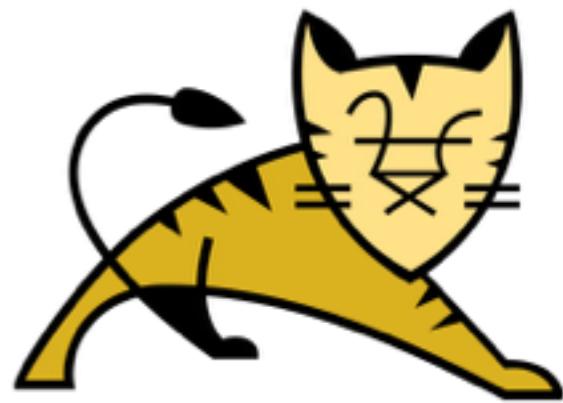


Removal

Case Study

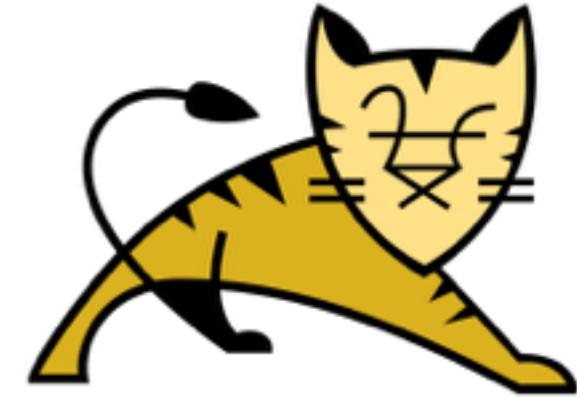
the *DaCapo* benchmark suite

Tomcat



- > A web server
- > More than 170K lines of Java code
- > More than 300 Hashtables

Tomcat



- > A web server
- > More than 170K lines of Java code
- > More than 300 Hashtables

Xalan

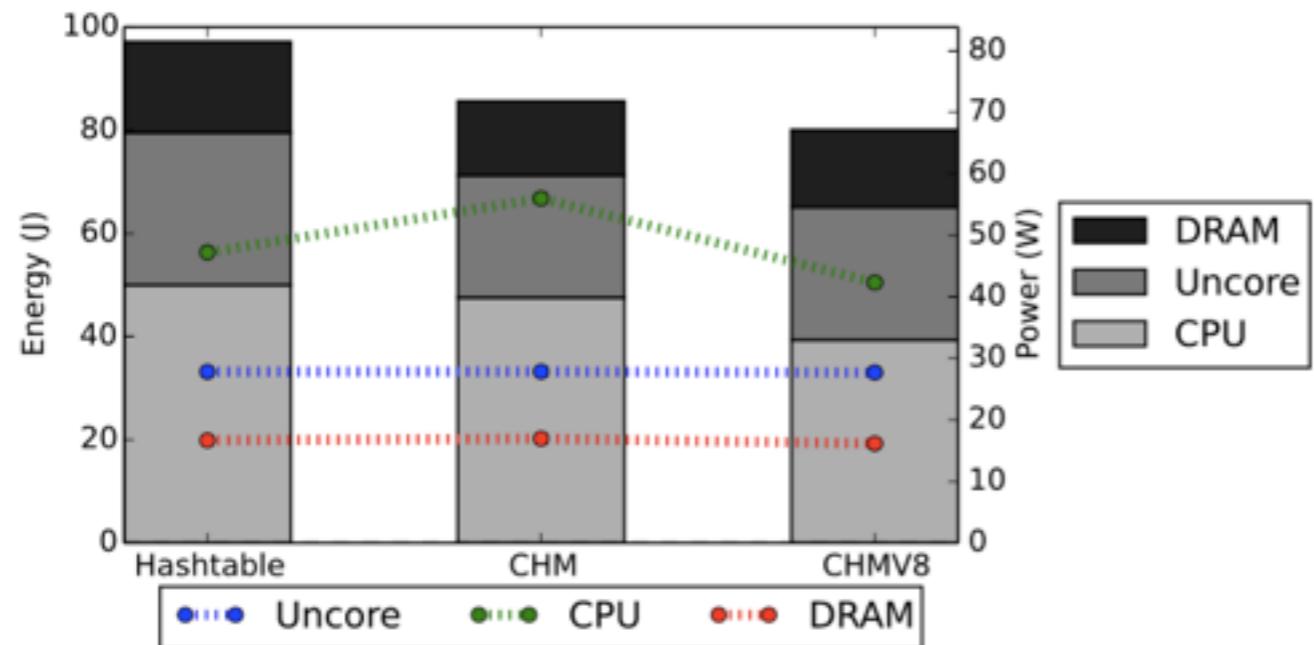


- > Parses XML in HTML documents
- > More than 188K lines of Java code
- > More than 140 Hashtables

Task:

For each **Hashtable** instance, change it for a **ConcurrentHashMap** one. Do it again for **ConcurrentHashMapV8**

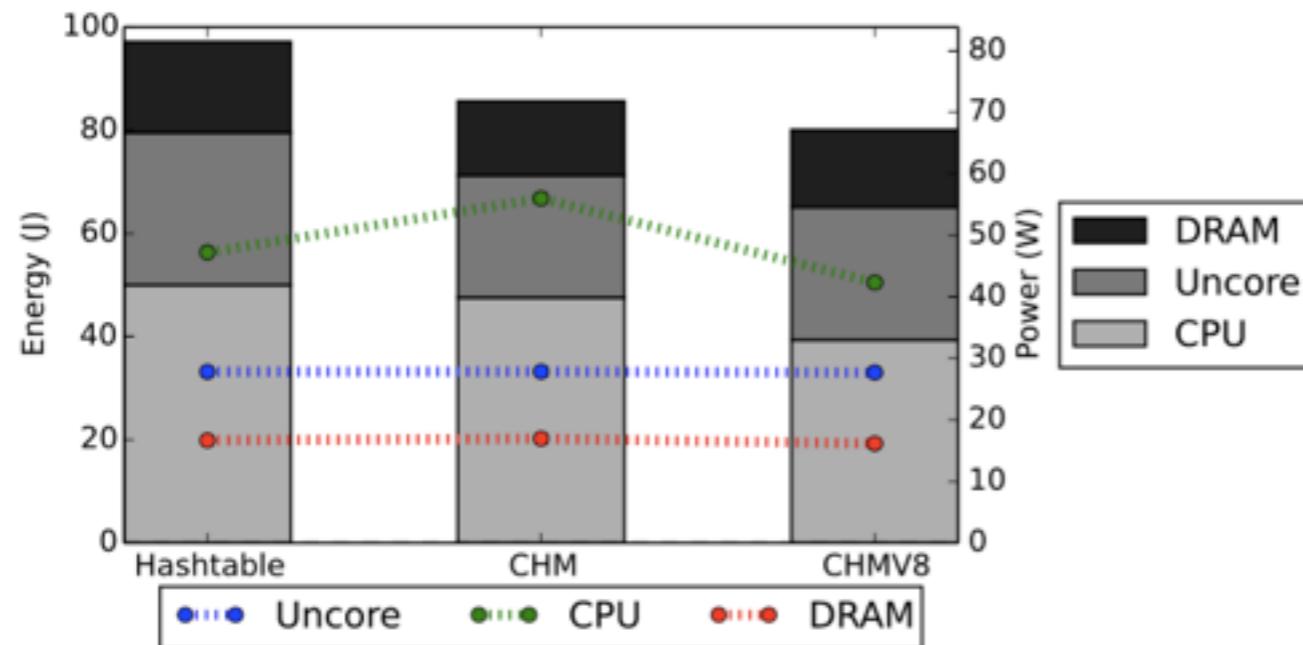
Tomcat



Hashtable to CHM: -12.21%

Hashtable to CHMV8: -17.82%

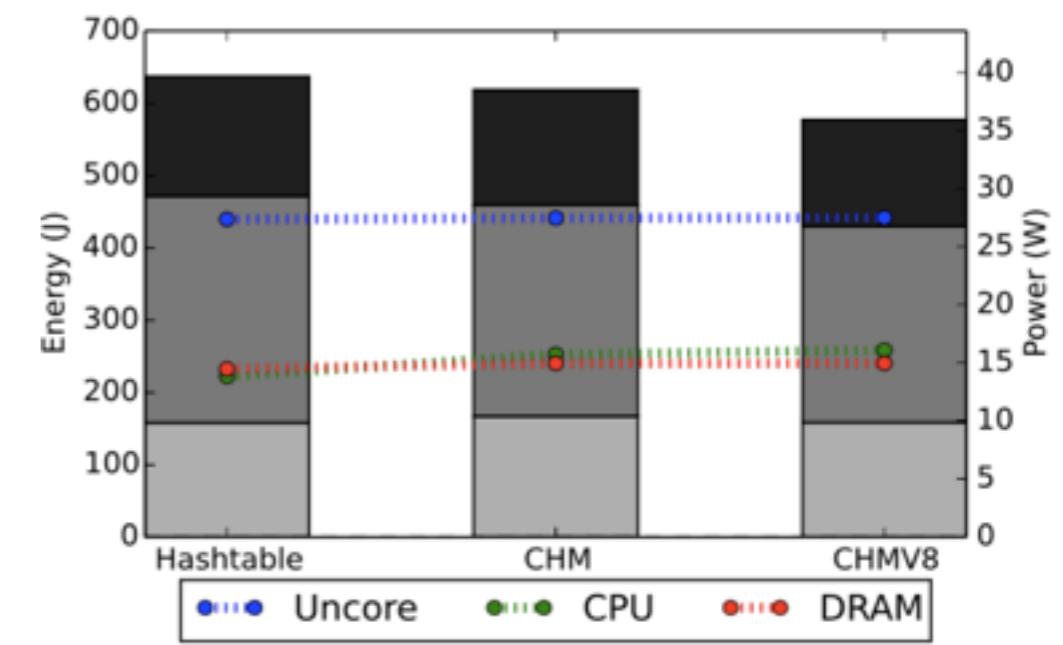
Tomcat



Hashtable to CHM: -12.21%

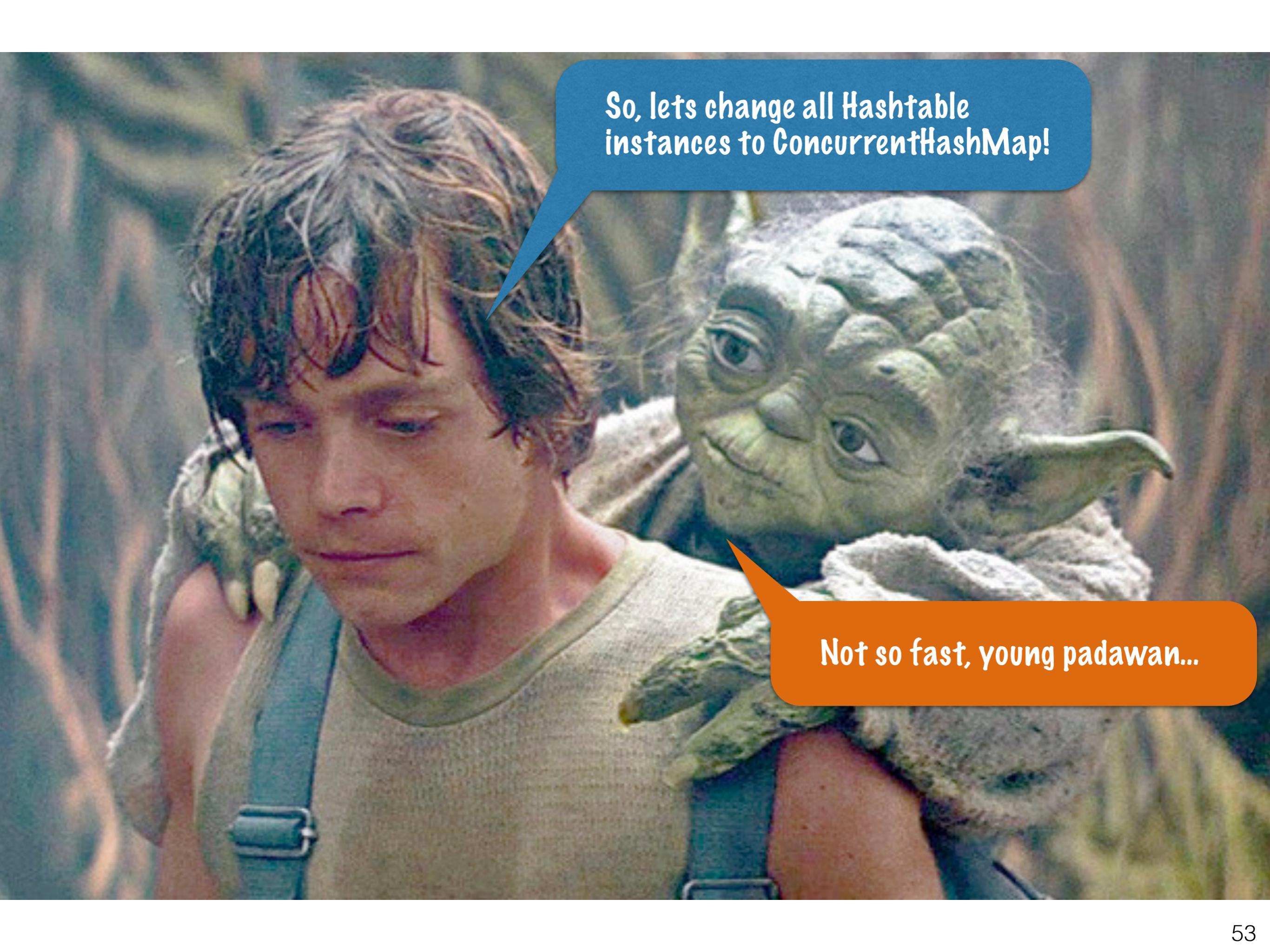
Hashtable to CHMV8: -17.82%

Xalan



Hashtable to CHM: -5.82%

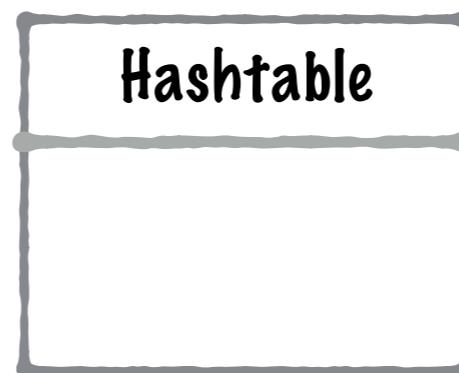
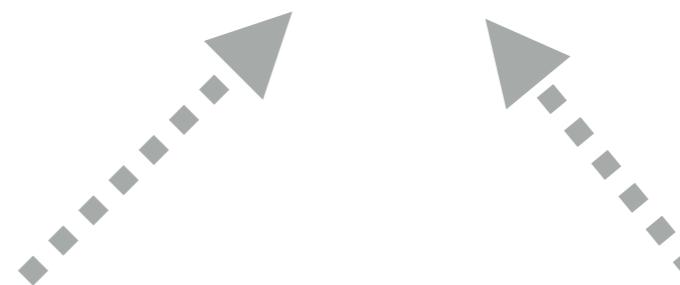
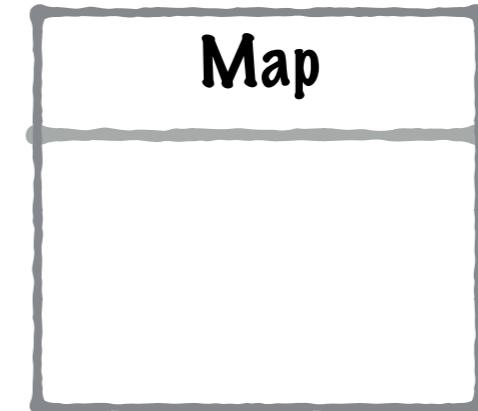
Hashtable to CHMV8: -9.32%



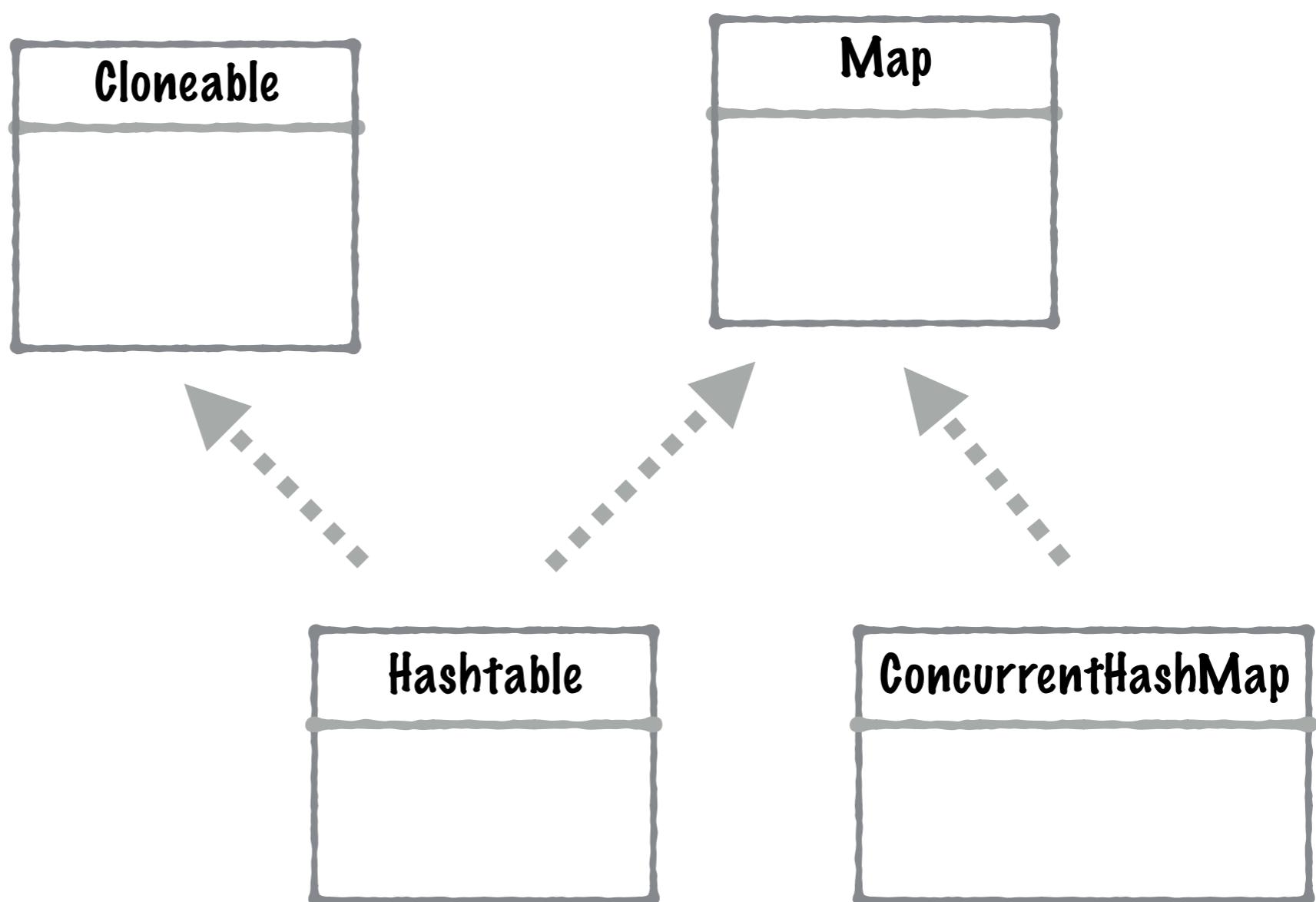
So, lets change all Hashtable
instances to ConcurrentHashMap!

Not so fast, young padawan...

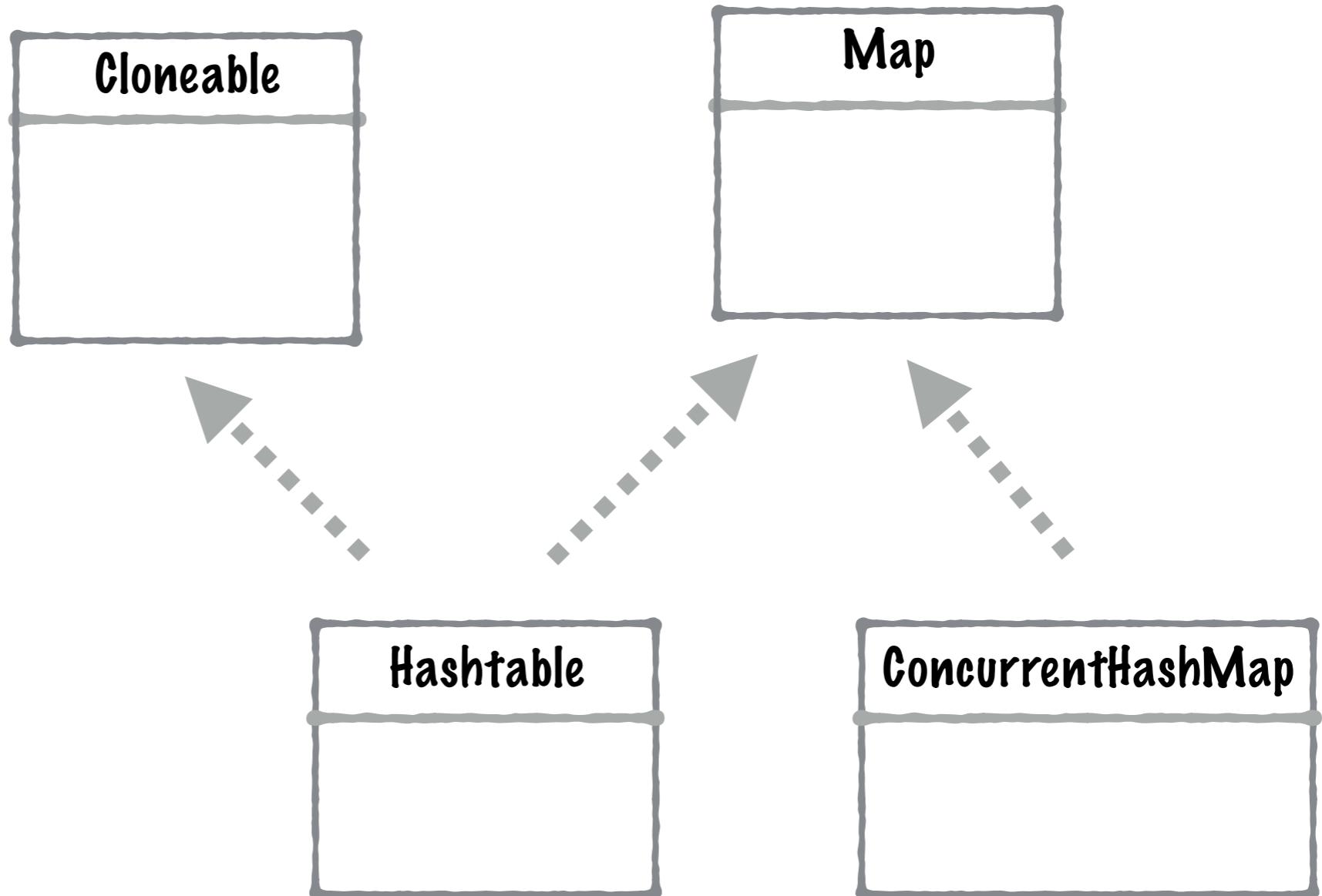
implements



implements



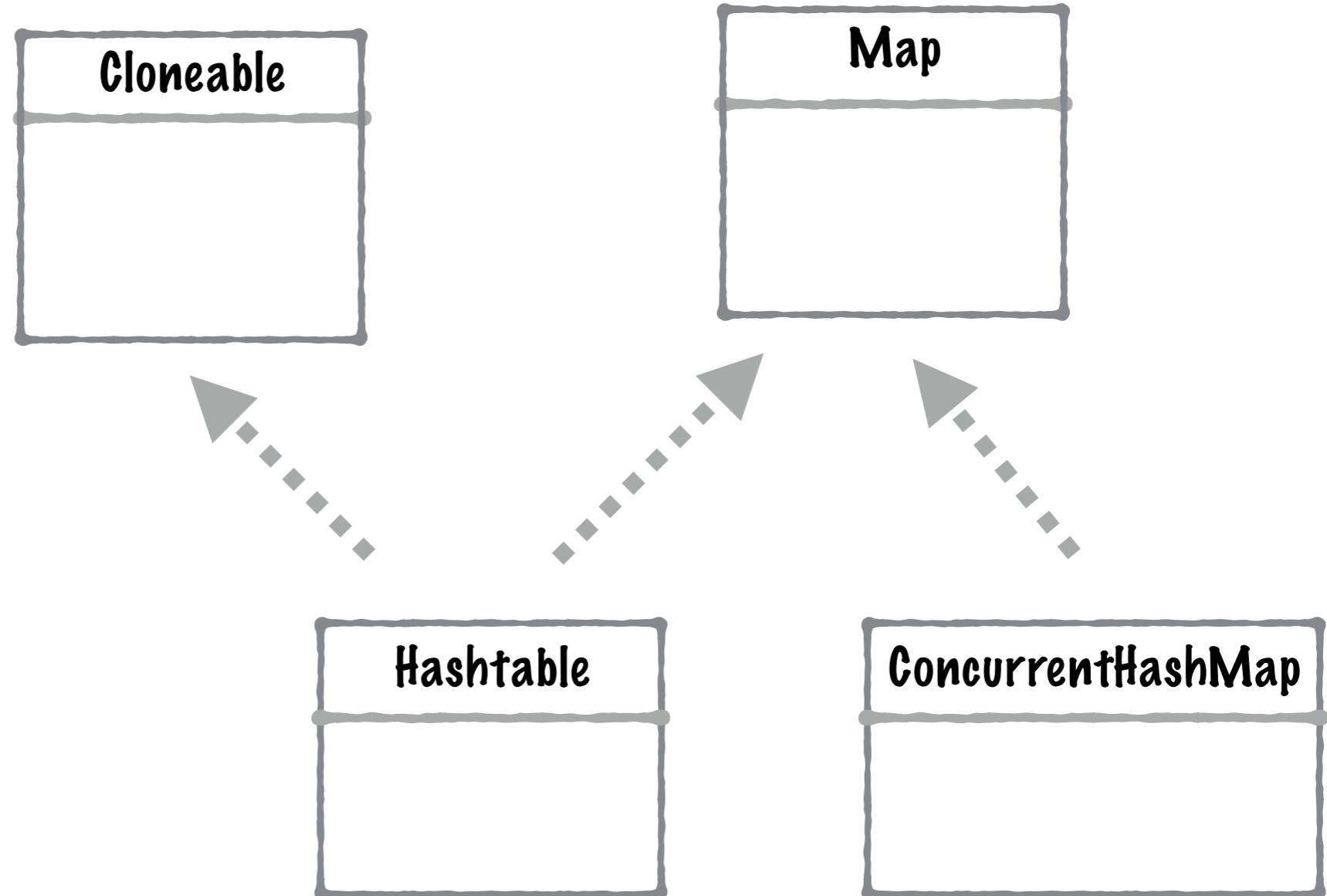
implements



```
List<Object> obj = new Hashtable<>();  
obj.clone();
```

// works fine

implements



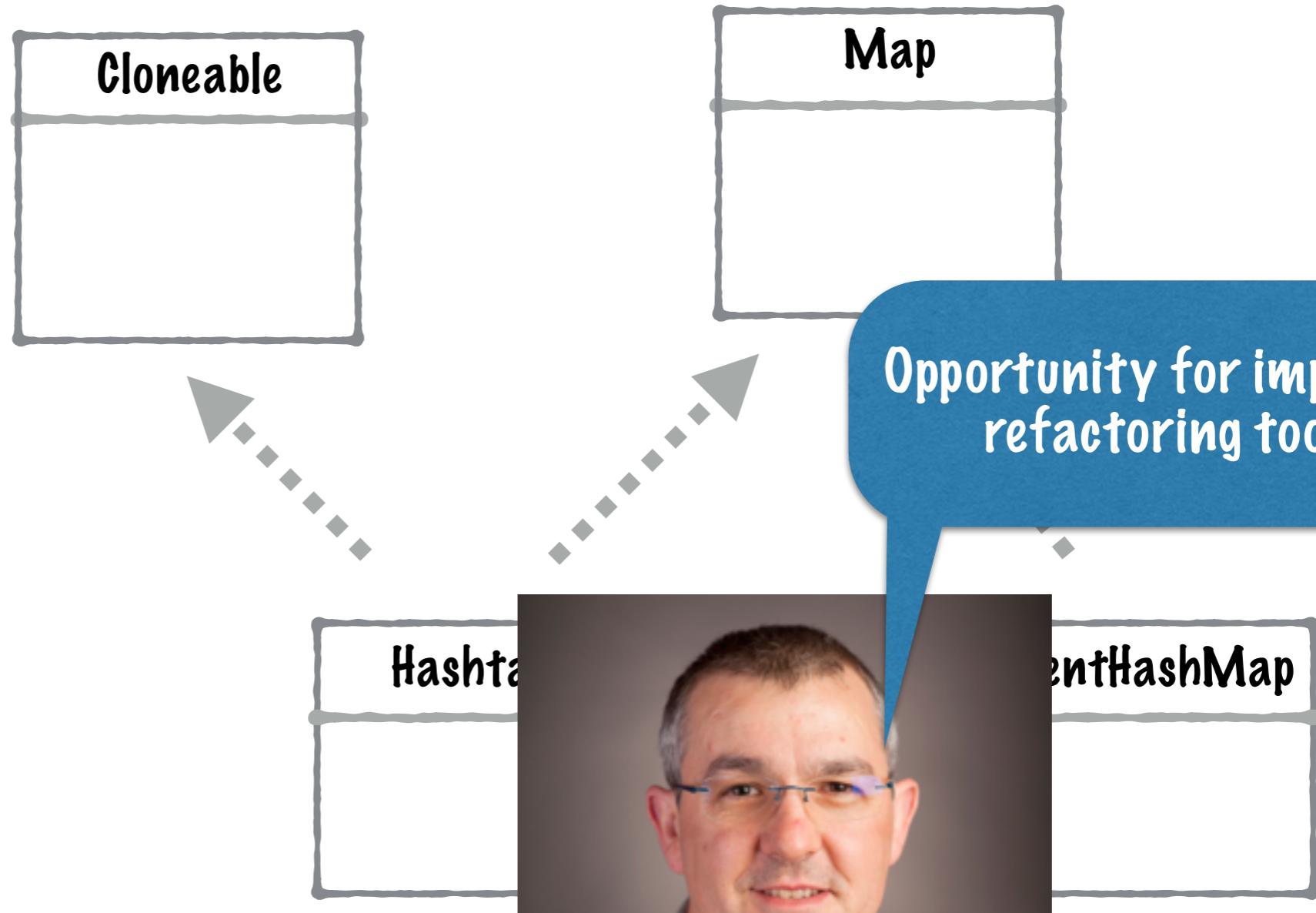
```
List<Object> obj = new Hashtable<>();  
obj.clone();
```

// works fine

```
List<Object> obj = new ConcurrentHashMap<>();  
obj.clone();
```

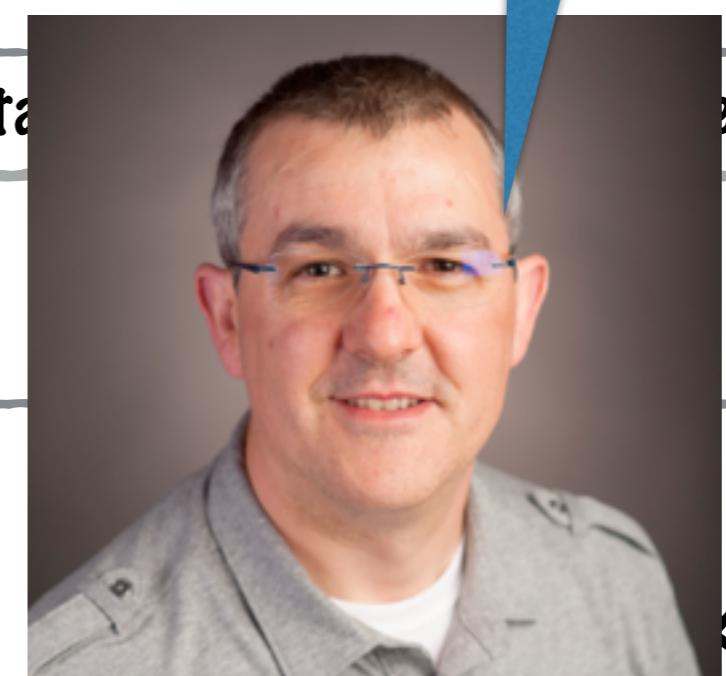
// compiler error

implements



```
List<Object> obj = new Hashtable<>();  
obj.clone();
```

```
List<Object> obj = new ConcurrentHashMap<>();  
obj.clone();
```



Danny Dig

as fine

// compiler error

Take Away Messages



Small changes can have
GREAT impacts, when it
comes to energy
consumption



Stay up-to-date with the
new releases of the
`java.util.concurrent` library

Doug Lea

In Summary

Experimental Environments

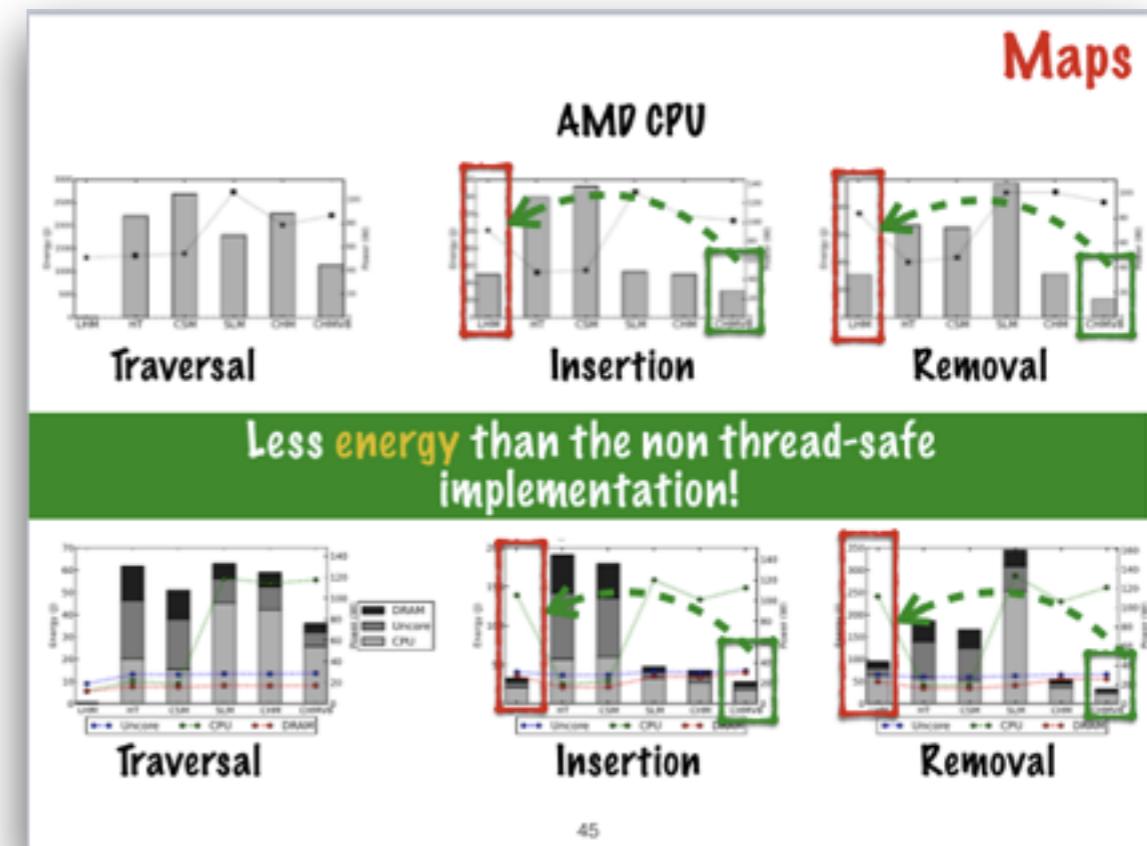


AMD CPU: A 2x16-core, running Debian, 2.4 GHz, 64GB of memory, JDK version 1.7.0 11, build 21.



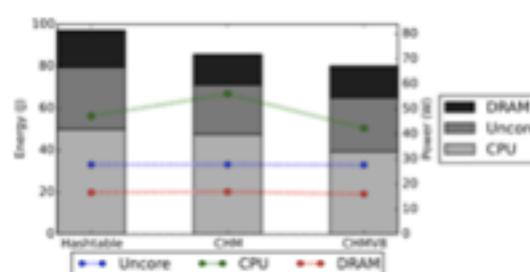
Intel CPU: A 2x8-core (32-cores w/ hyper-threading), running Debian, 2.60GHz, with 64GB of memory, JDK version 1.7.0 71, build 14.

27



45

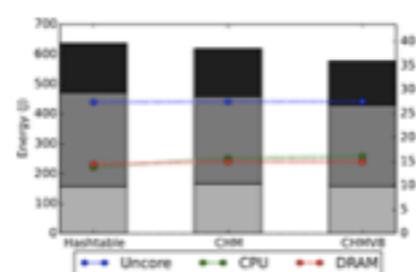
Tomcat



Hashtable to ChM: **-12.21%**

Hashtable to ChM8: **-17.82%**

Xalan

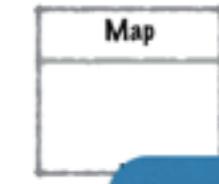
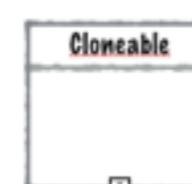


Hashtable to ChM: **-5.82%**

Hashtable to ChM8: **-9.32%**

51

implements



Opportunity for improving refactoring tools!



`List<Object> obj = new Hashtable<>();
obj.clone();`

`List<Object> obj = new ConcurrentHashMap<>();
obj.clone();`

// compiler error

Experimental Environments



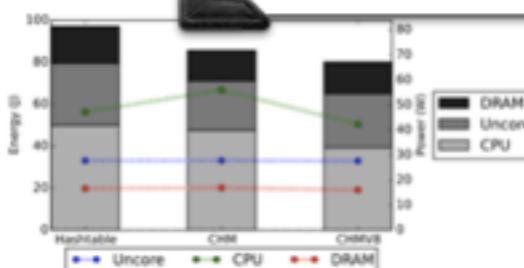
AMD CPU: A 2x16-core, running Debian, 2.4 GHz, 64GB of memory, JDK version 1.7.0 11, build 21.



Interrupt
vector

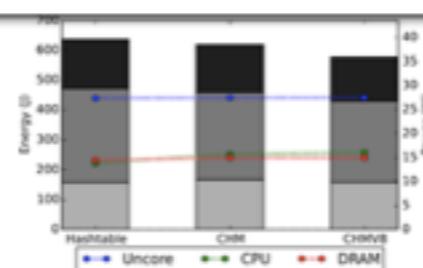
THANKS

Tow



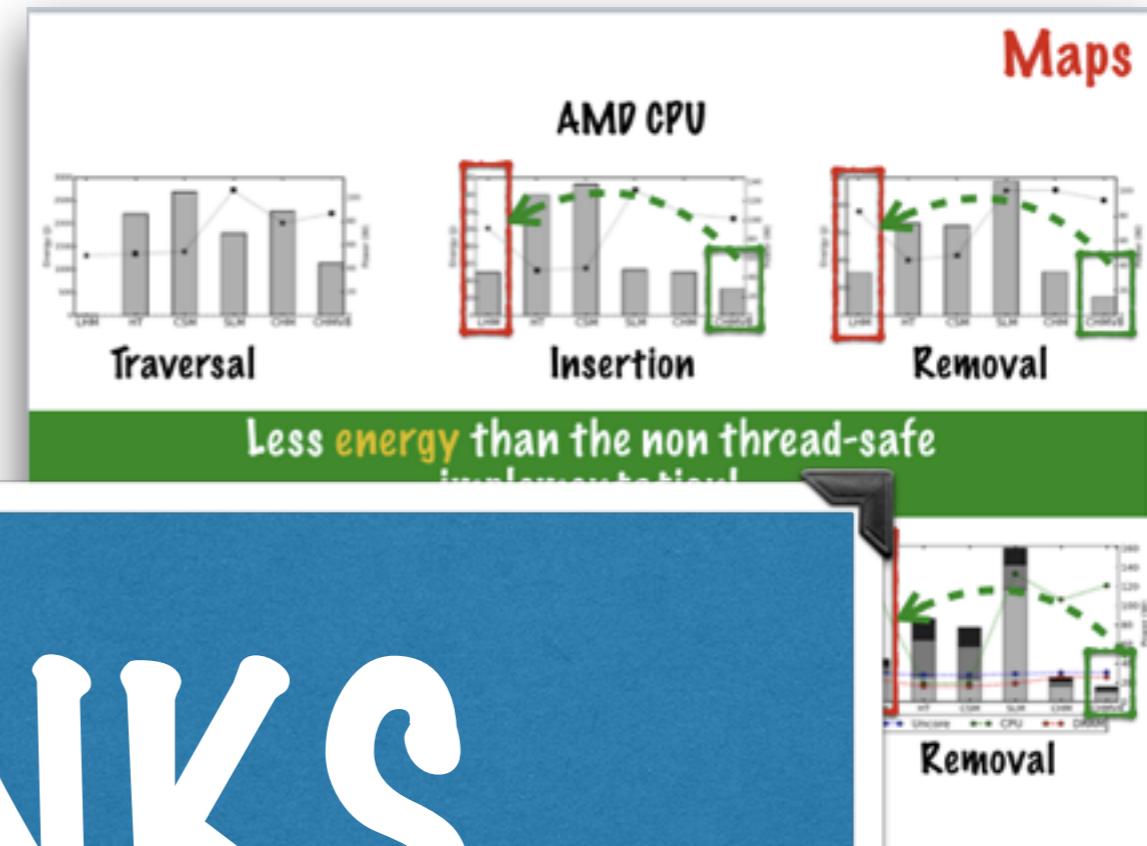
Hashtable to CHM: **-12.21%**

Hashtable to CHM8: **-17.82%**



Hashtable to CHM: **-5.82%**

Hashtable to CHM8: **-9.32%**



```
List<Object> obj = new Hashtable<>();
obj.clone();
```



Opportunity for improving
refactoring tools!

```
List<Object> obj = new ConcurrentHashMap<>();
obj.clone();
```

// compiler error

A Comprehensive Study on the Energy Efficiency of Java Thread-Safe Collections



Gustavo Pinto



Kenan Liu



Fernando Castor



David Liu

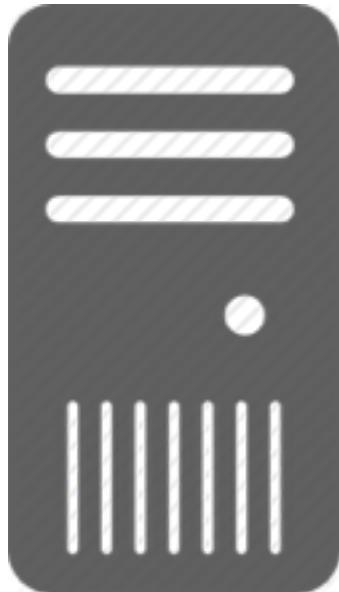


BINGHAMTON
UNIVERSITY
STATE UNIVERSITY OF NEW YORK

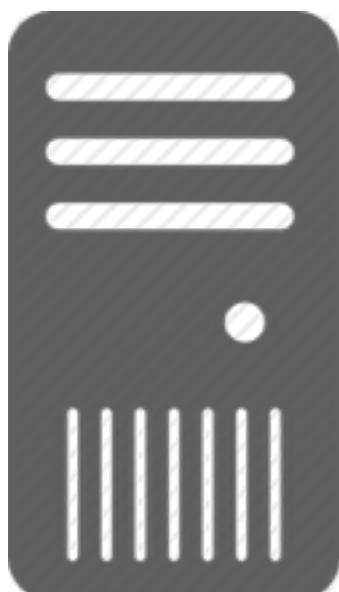


BINGHAMTON
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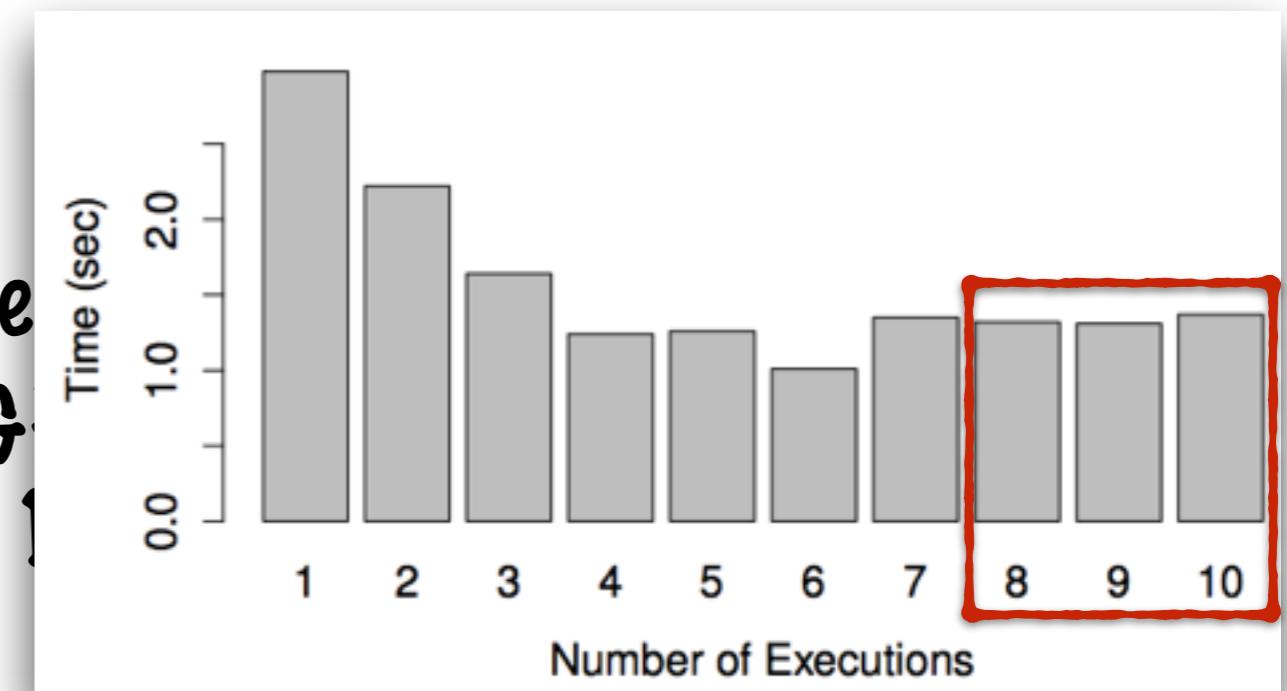
Experimental Environments



AMD CPU: A 2×16 -core, running Debian, 2.4 GHz, 64GB of memory, JDK version 1.7.0 11, build 21.

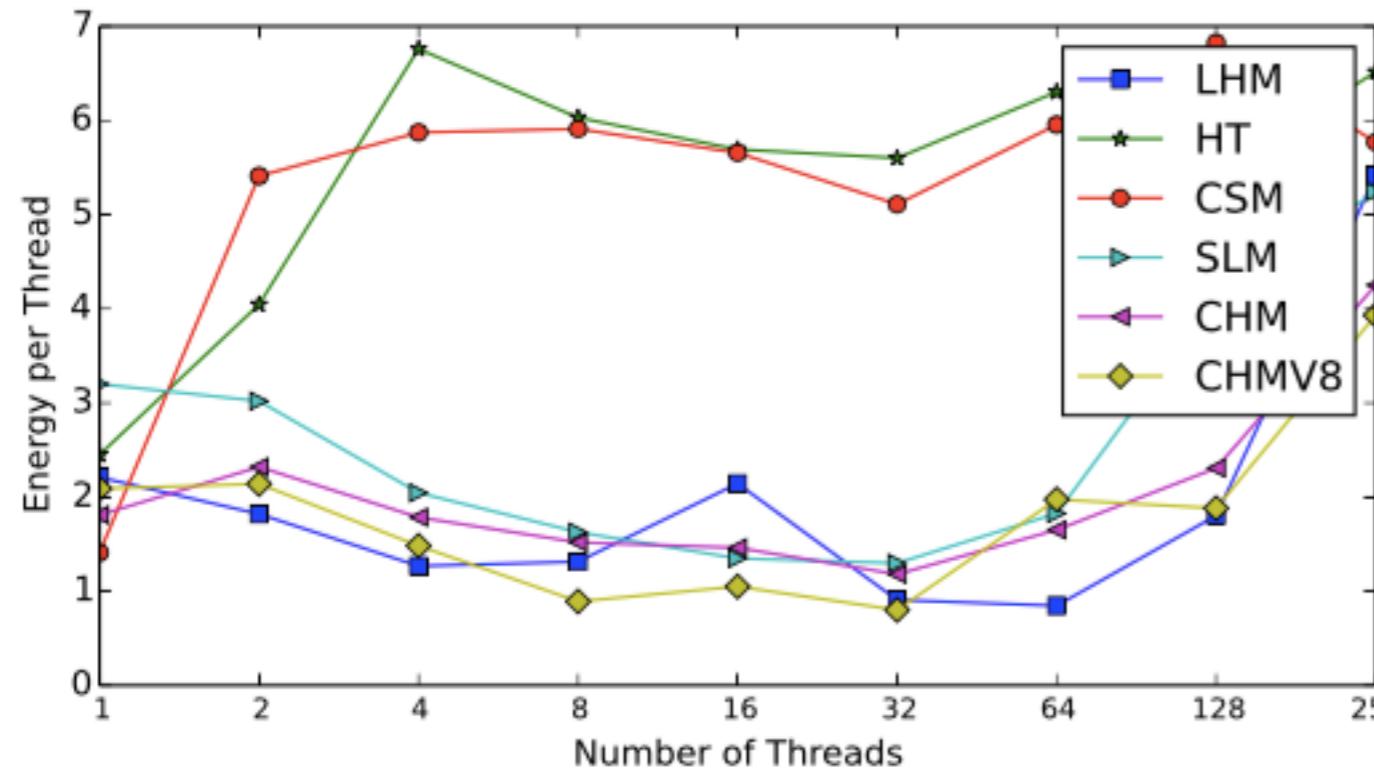


Intel CPU: A 2×8 -core running Debian, 2.60GHz, version 1.7.0 71, build 1



Maps (scaling number of threads)

Traversal



Intel CPU

Insertion

