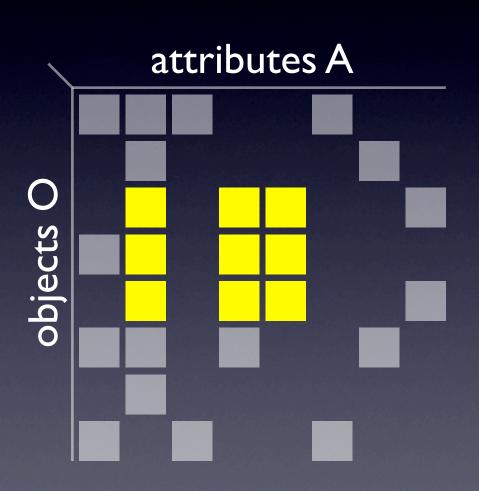
Formal Concept Analysis in Java

Daniel Götzmann

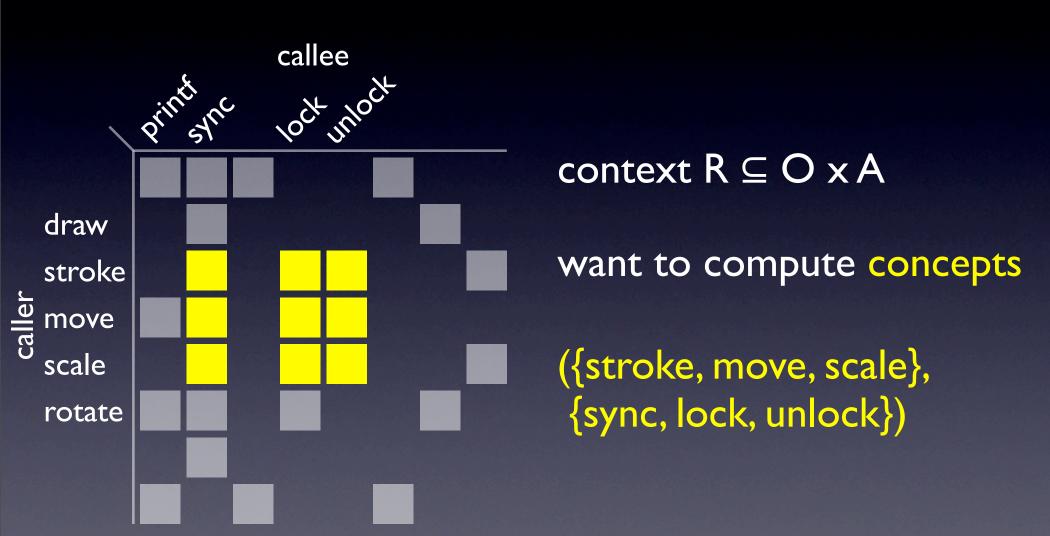
Concept Analysis



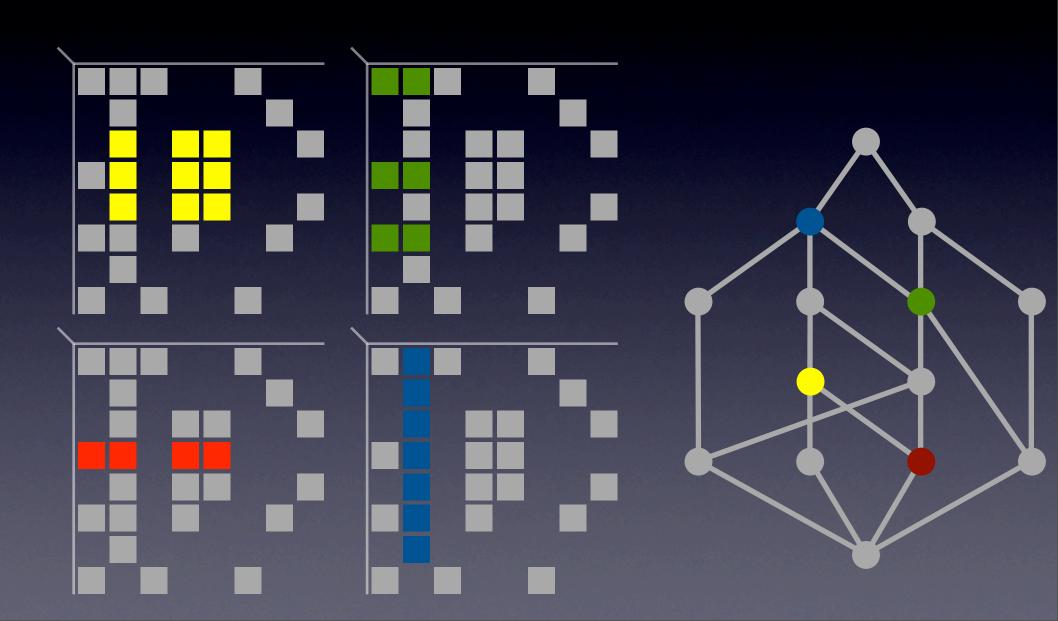
context $R \subseteq O \times A$

want to compute concepts

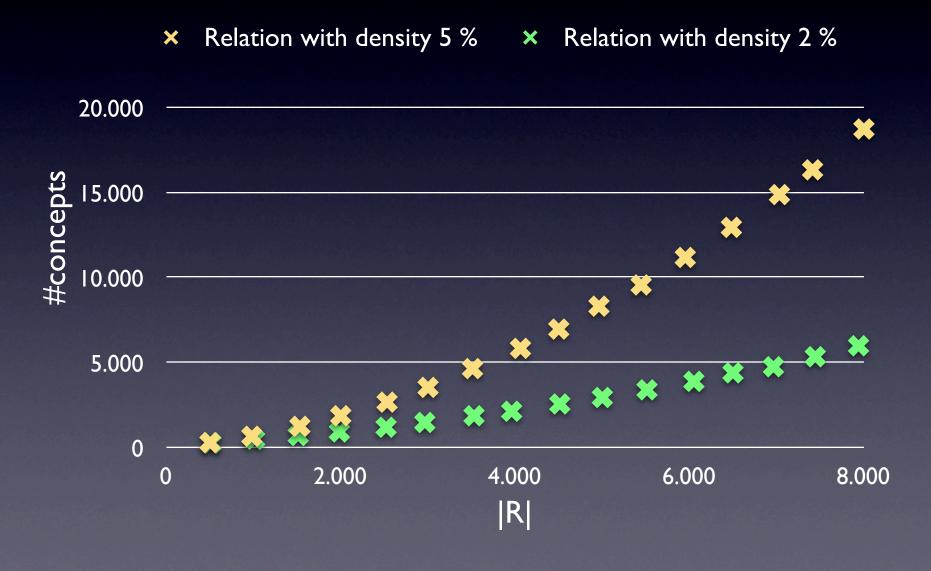
Concept Analysis



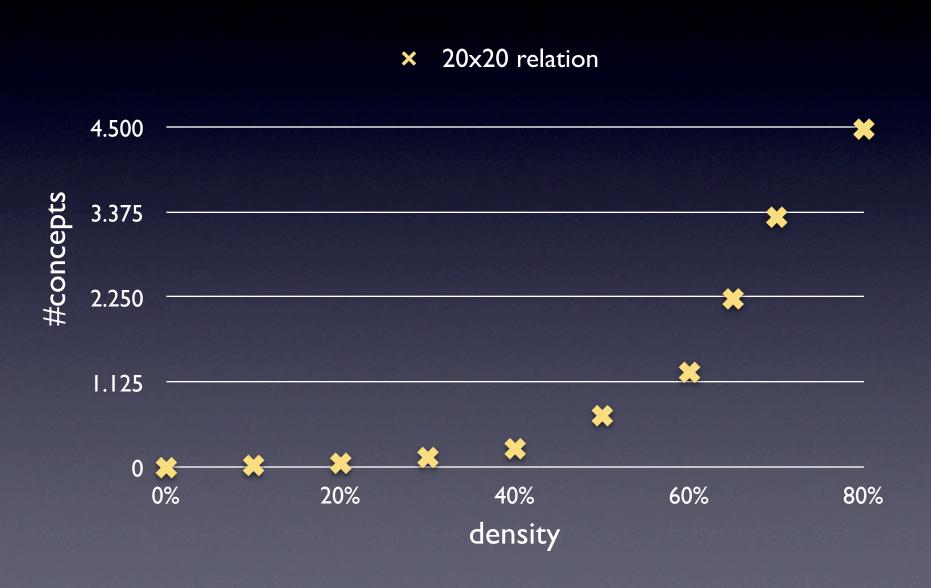
Concept Lattice



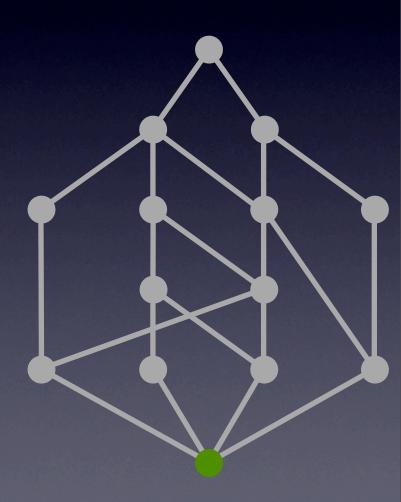
Lattice Size



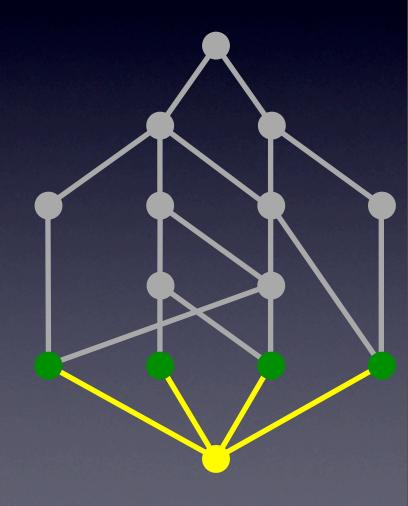
Worst Case Scenario



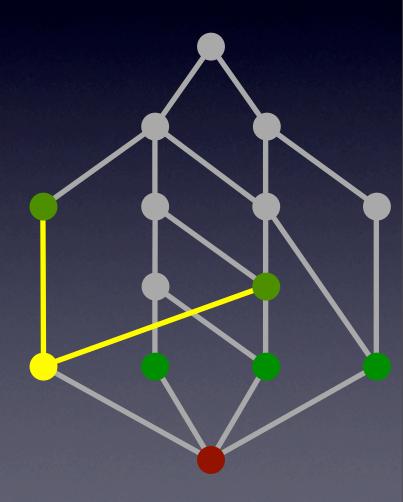
start at the bottom



start at the bottom
compute the upper neighbors
recursively



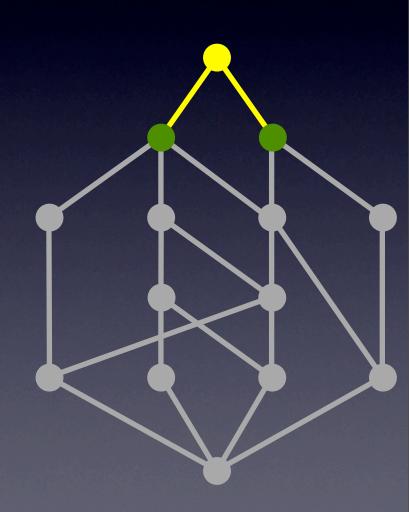
start at the bottom
compute the upper neighbors
recursively



start at the bottom

compute the upper neighbors recursively

alternatively: start at the top

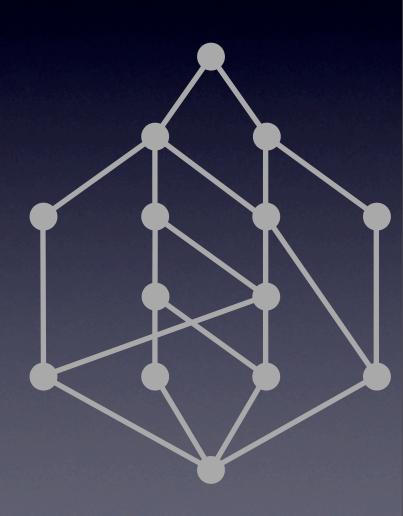


start at the bottom

compute the upper neighbors recursively

alternatively: start at the top

same idea for the edges

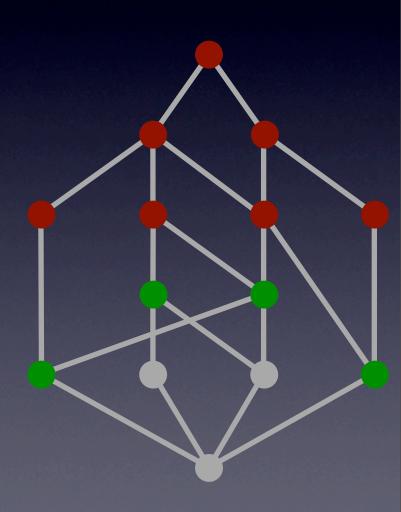


Implementation

iterators

don't pre-compute the entire lattice

less data in memory



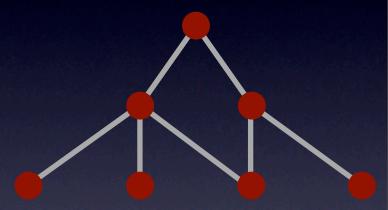
Implementation

iterators

don't pre-compute the entire lattice

less data in memory

only compute upper/lower parts of the lattice



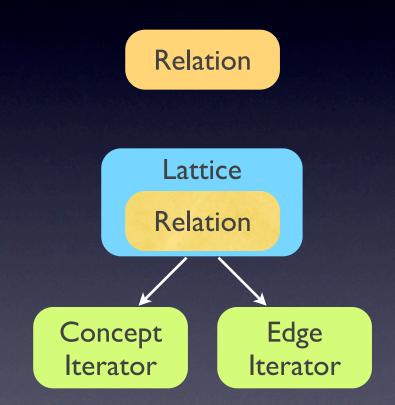
How to use it

generate a relation

generate a lattice for that relation

get an iterator from that lattice

use iterator as usual



How to use it

```
Lattice lattice = new HybridLattice (rel);
Iterator<Concept> it = lattice.conceptIterator
                       (Traversal.TOP_ATTRSIZE);
while (it.hasNext()) {
    Concept c = it.next();
    System.out.println(c.toString());
```

How to use it

```
Lattice lattice = new HybridLattice (rel);
Iterator<Concept> it = lattice.conceptIterator
                       (Traversal.TOP_ATTRSIZE);
while (it.hasNext()) {
    Concept c = it.next();
    if (c.getAttributes().size > 10)
        break;
    System.out.println(c.toString());
```

Data structures

Set Set of of attributes

Map
mapping each object
to a set of attributes

Relation

Map mapping each attribute to a set of objects

Only allow java.lang.Comparable objects because

- they are usually immutable
- they can be sorted easily
- the user still has many possibilities

Data structures

Concept

Set of objects

Set of attributes Relation

Map mapping each object to a set of attributes

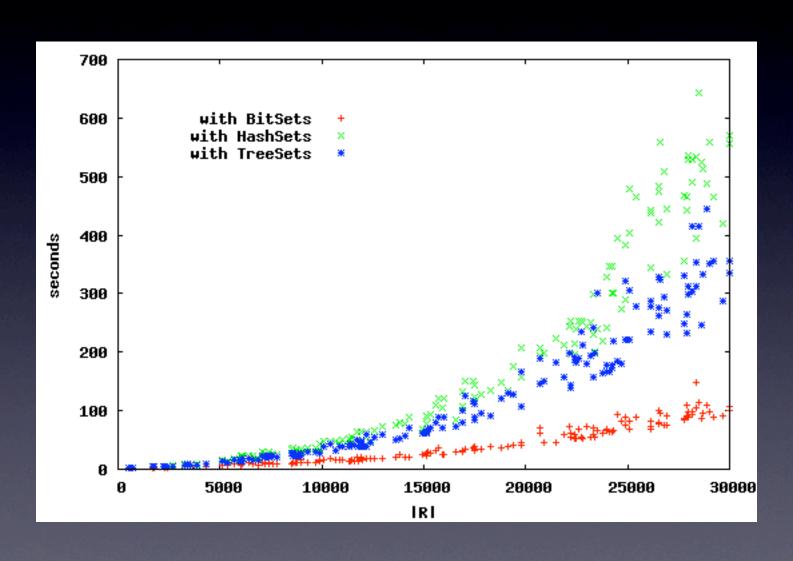
Map mapping each attribute to a set of objects

TreeSet is a sorted set

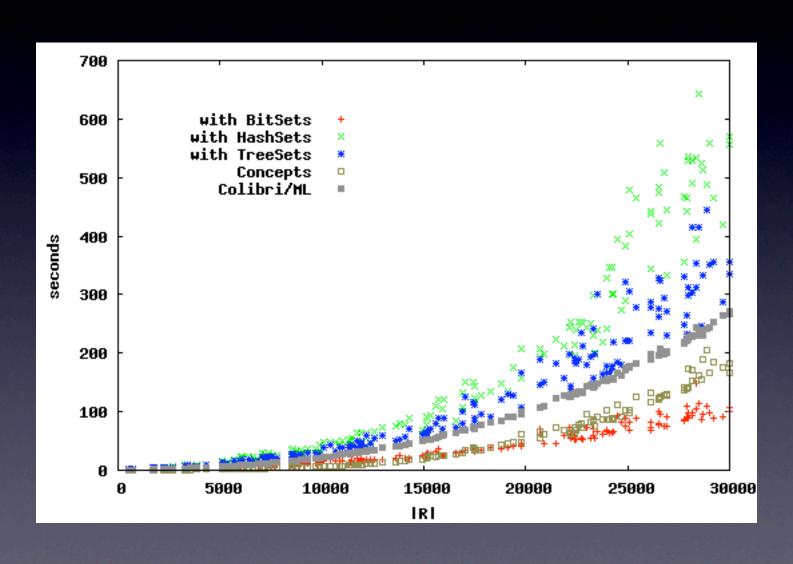
HashSet not sorted, but faster operations

BitSet sorted, fast intersection operation, but can not be used directly

Performance



Performance



Correctness

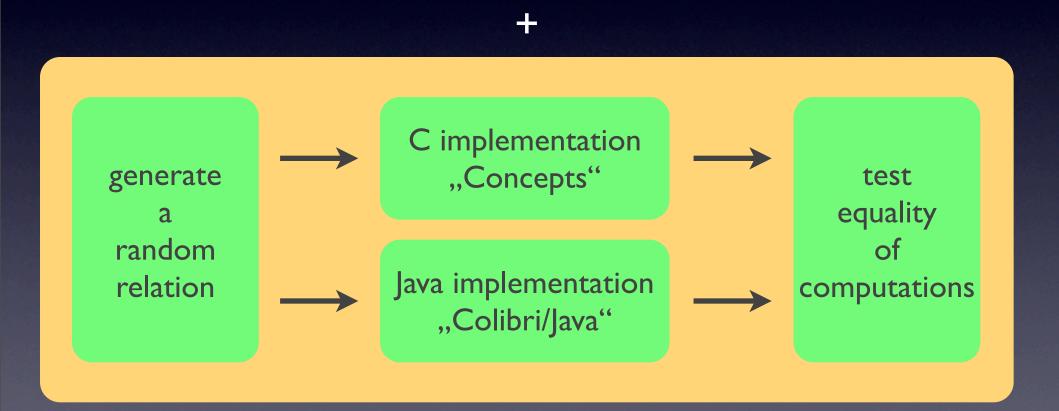
JUnit tests

Problem:

Whether or not all concepts and edges are computed correctly can not be tested with unit tests.

Correctness

JUnit tests



Conclusion

Iterators are convenient to use.

BitSet-based data structure has best performance.

Good performance for large contexts with low density.

Faster Colibriant	R = 16000 density 1%	R = 30000 density 1%	R = 16000 density 4%
Bitset-based "Colibri/Java"	25 s	101 s	64 s
C implementation "Concepts"	24 s	166 s	586 s
ML implementation ,,Colibri/ML"	60 s	265 s	120 s

Next Step

clean up code
add some JavaDoc
release under GPL
publish at Google Code
become famous



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