I MapReduced a Neo store

Creating large neo4j databases with hadoop

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GoDataDriven

PROUDLY PART OF THE XEBIA GROUP

Hadoop and Neo

Recreate db

Agile exploration

No waiting please!

Neo4J

Hadoop

What?

Why?

Insight

Learning internal structure of Neo4J

How?

Rownumbers

Joining a lot!

Gather from HDFS

Todo

End

Q

Who?

Kris

Meetups

NLHUG

Graph databases Amsterdam

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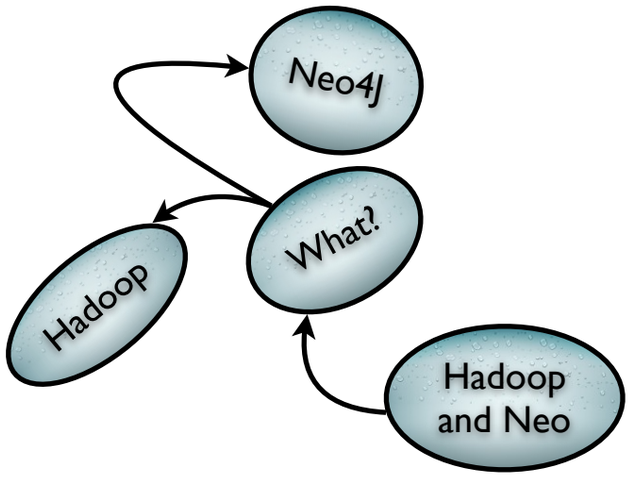
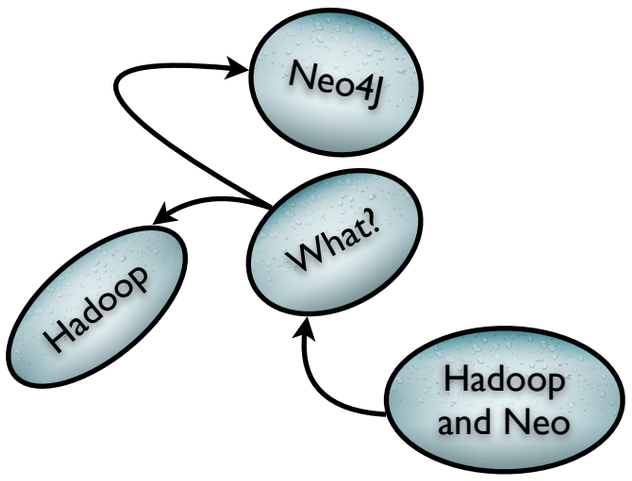


Hadoop

WIKIPEDIA
The Free Encyclopedia

Apache Hadoop is an open-source framework that supports data-intensive distributed applications

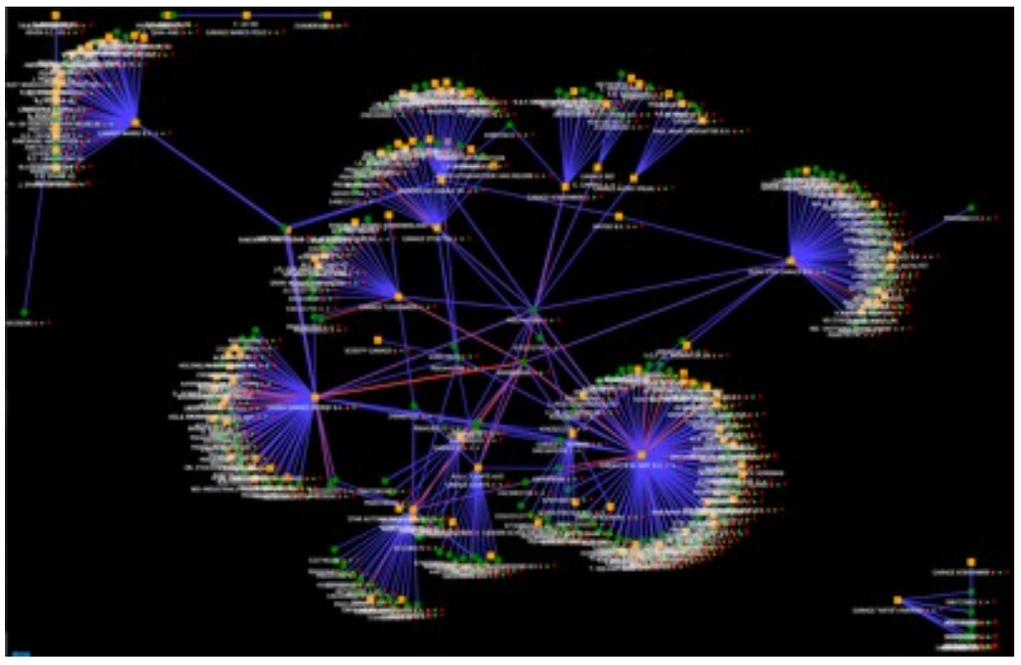


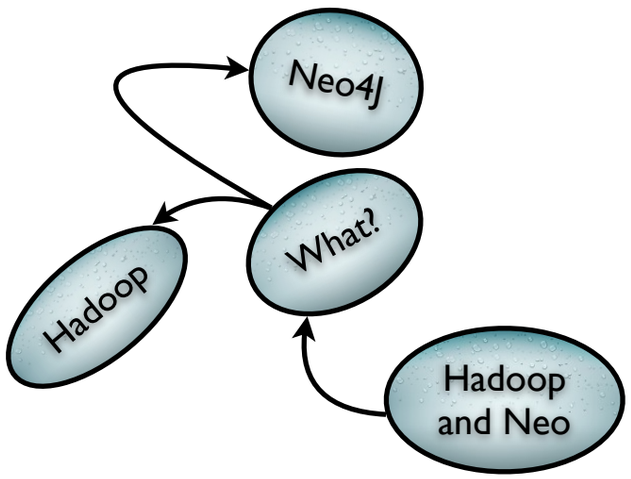
Neo4J

WIKIPEDIA
The Free Encyclopedia

Neo4j
the graph database

Neo4j is an open-source graph database, implemented in Java. The developers describe Neo4j as "embedded, disk-based, fully transactional Java persistence engine that stores data structured in graphs rather than in tables"





Use case: Create large neo4j database

Multiple times!

about 30.000.000 nodes
and 700.000.000 edges
between them.

each node has 9 properties
each edge has 4 properties

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Meetups

NLHUG

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Todo

Q

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Insight

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NLHUG

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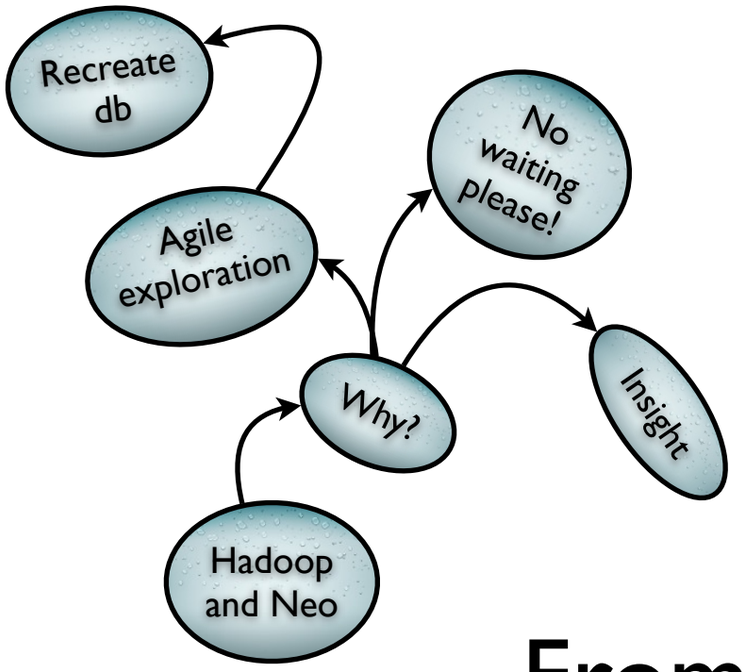
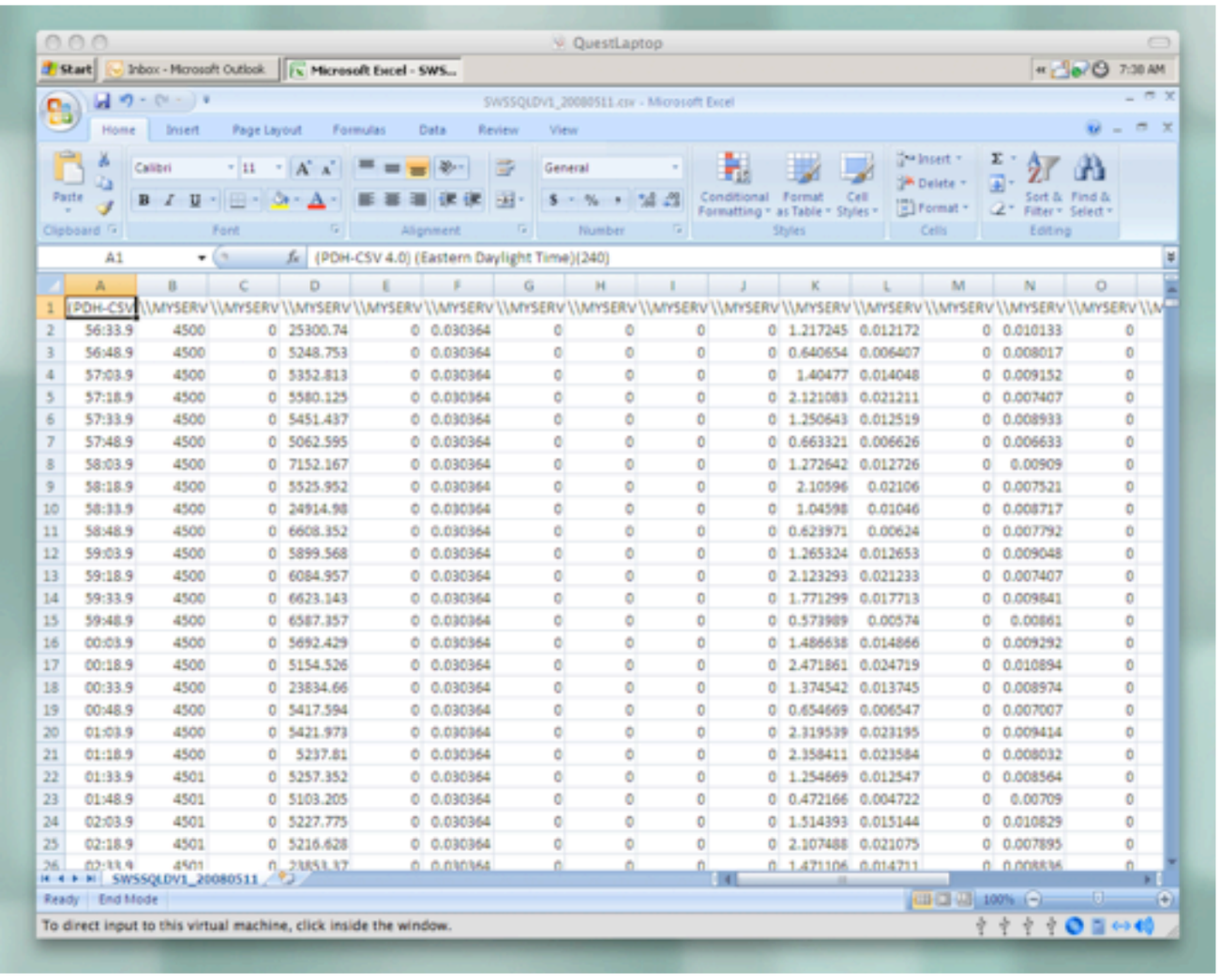


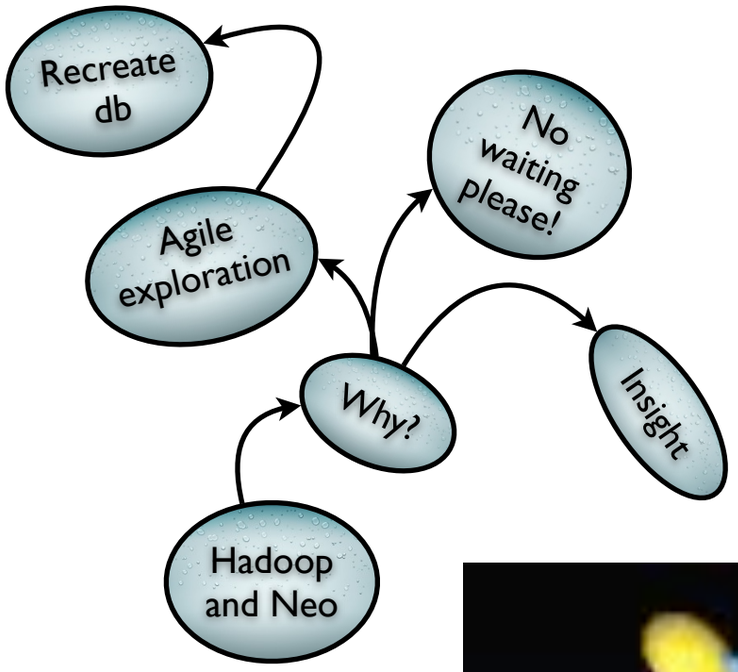
From



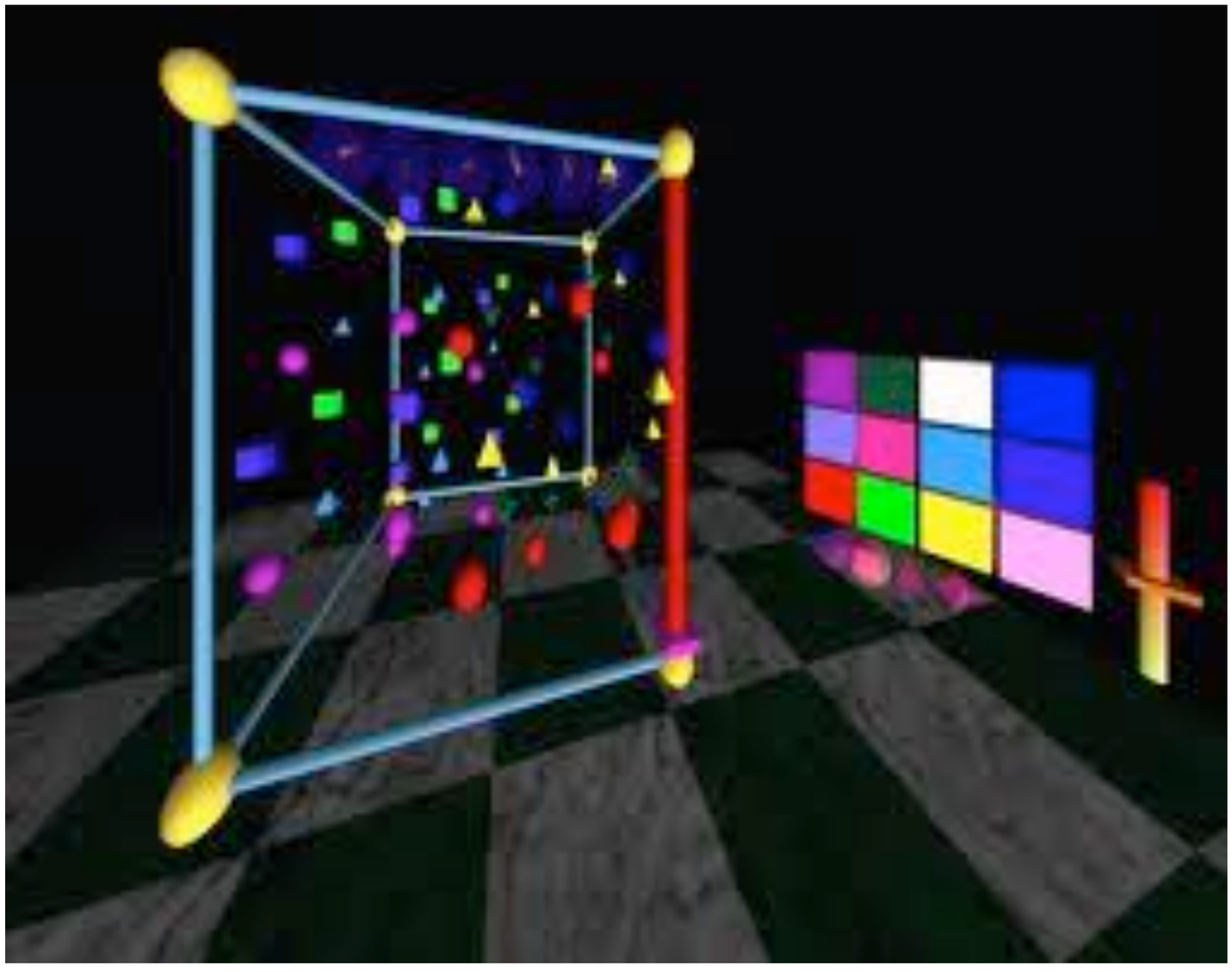
Insight

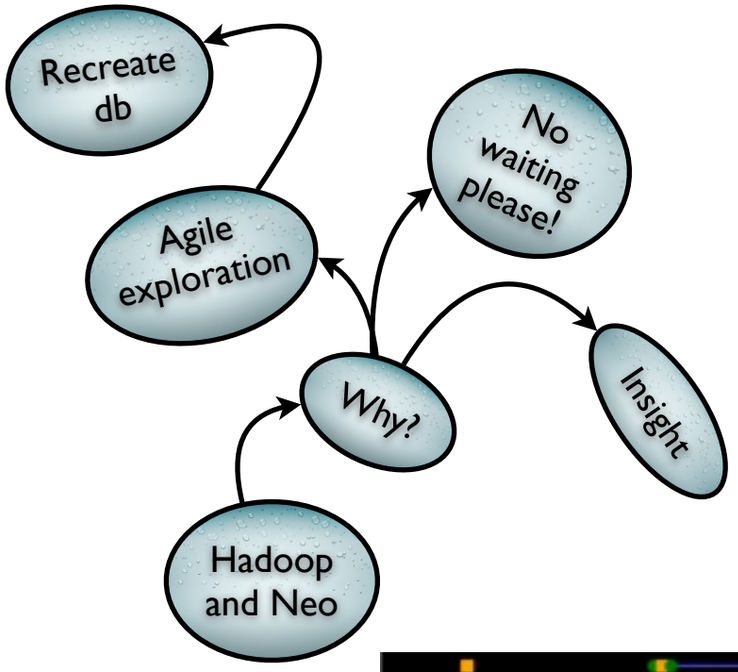
To

Tuesday, June 4, 13



Agile exploration

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Insight
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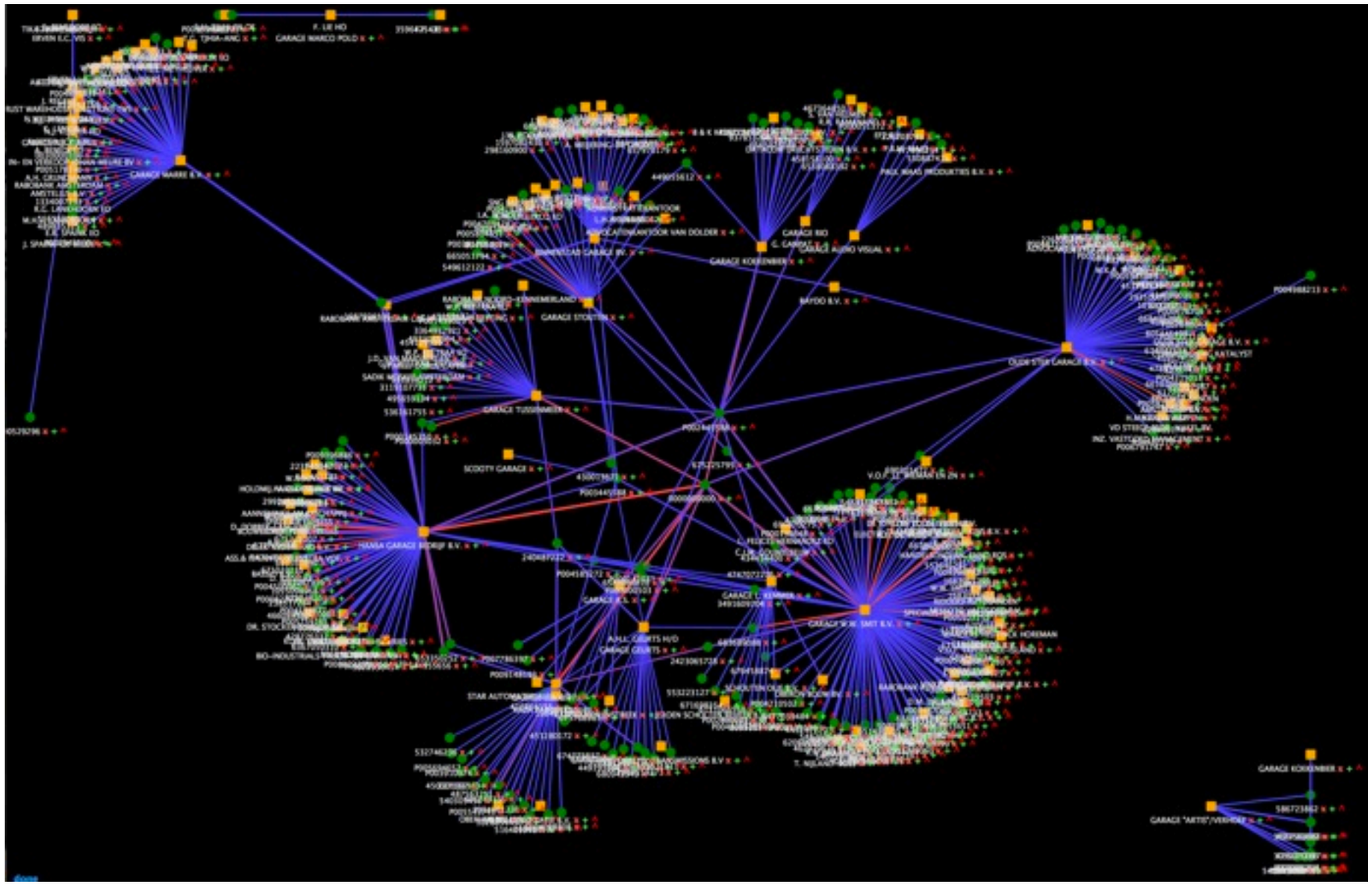
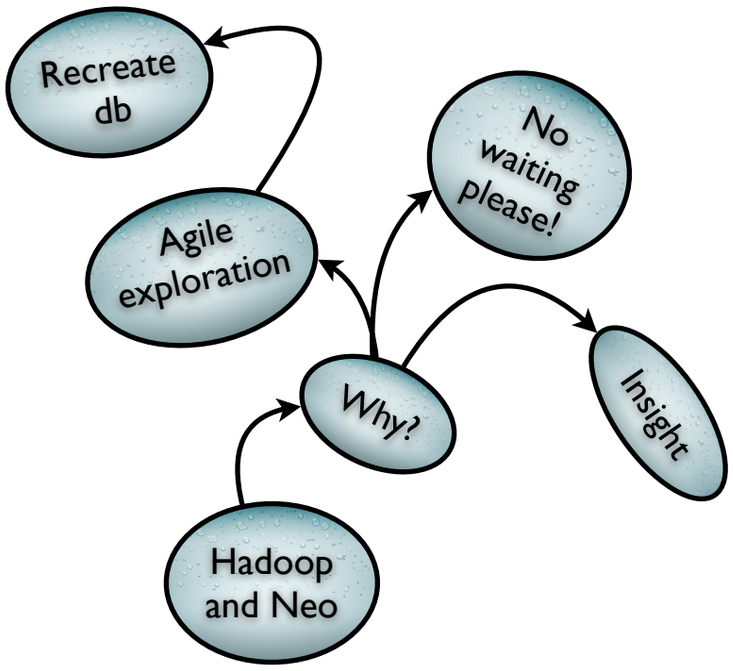
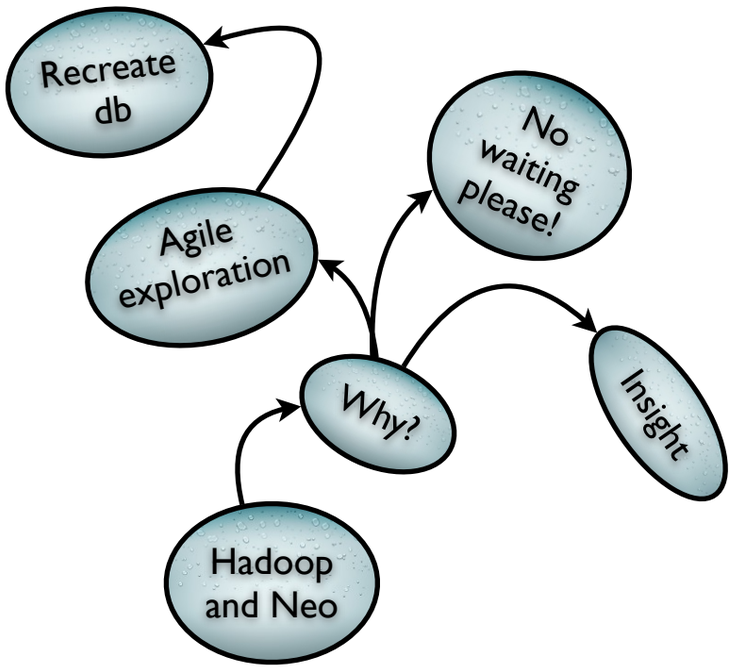
Re-create db





Re-create db

Neo4j
the world's leading graph database



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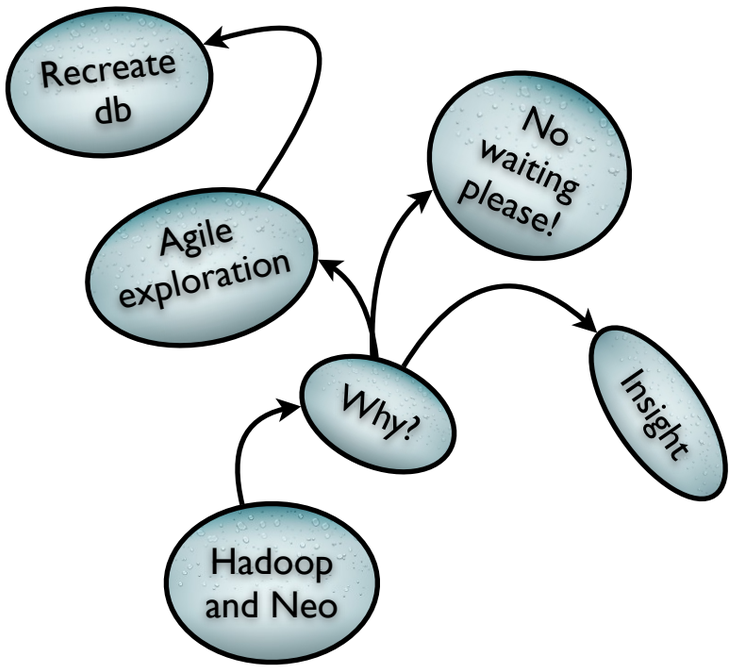
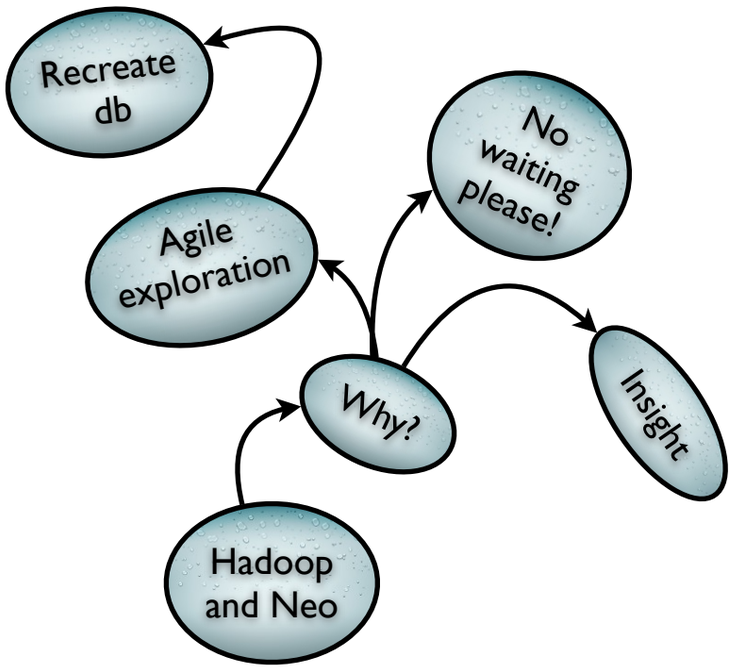


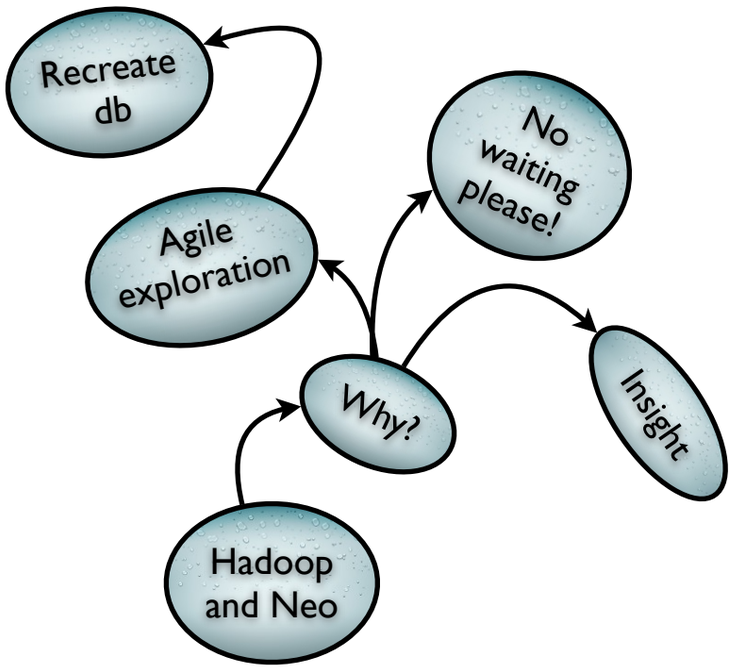
Multiple ways to create a Neo4J database

- Just add nodes and edges with:
  - Java api
  - Rest api
  - Cypher via rest
- Batch import functionality
- My way ;-)



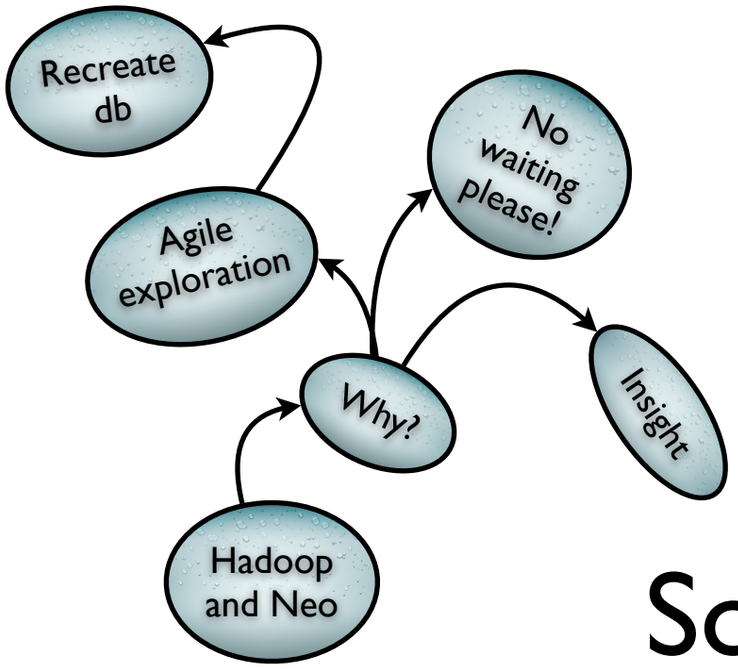
Multiple ways to create a Neo4J database

Just adding nodes and edges has some problems.
Neo4J being transactional will give a lot of transaction overhead for large graphs.



Multiple ways to create a Neo4J database

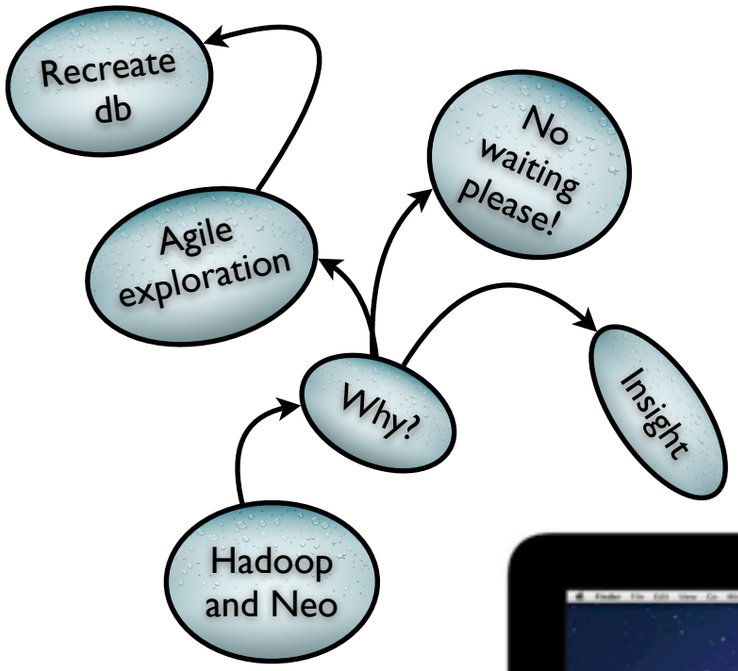
Batch import is non transactional so thats a good way to start



Some batch import code

```
String line;
while ((line = reader.readLine()) != null) {
    String[] parts = line.split(SPLIT_STRING);

    long fileNodeId = Long.parseLong(parts[0]);
    long nodeId;
    for (int c = 0; c < nodeFields.length; c++) {
        properties[1 + c * 2] = objectFromProperty(parts[c + 1].trim());
    }
    nodeId = db.createNode(map(properties));
    index.add(nodeId, map(properties));
}
```



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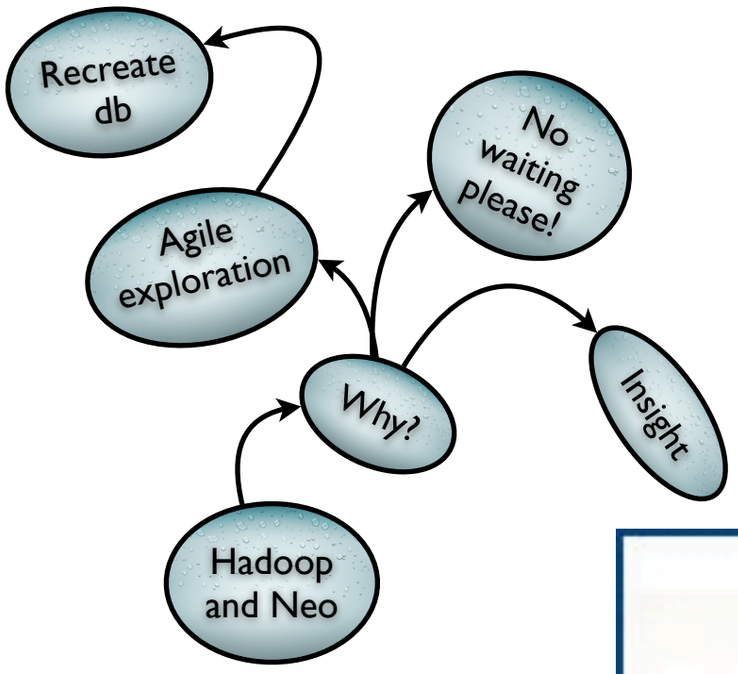

No waiting please!

16 (+2) hours

code improved: 3 (+2) hours

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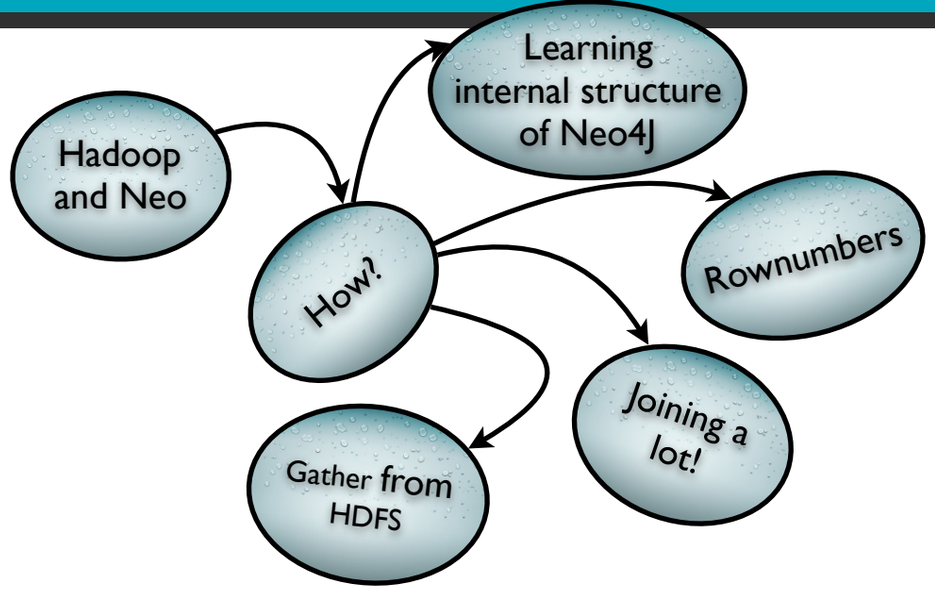
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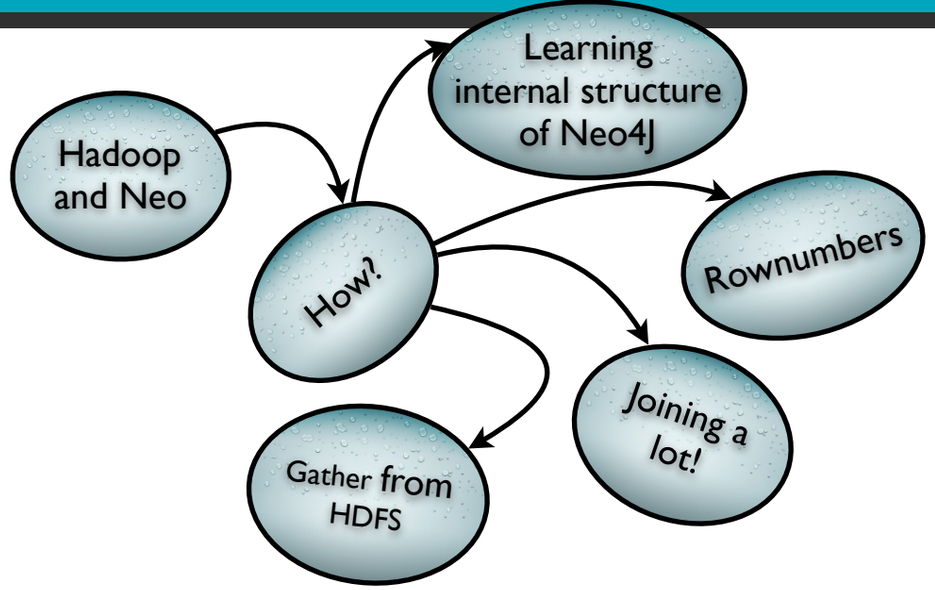
NO RUNNING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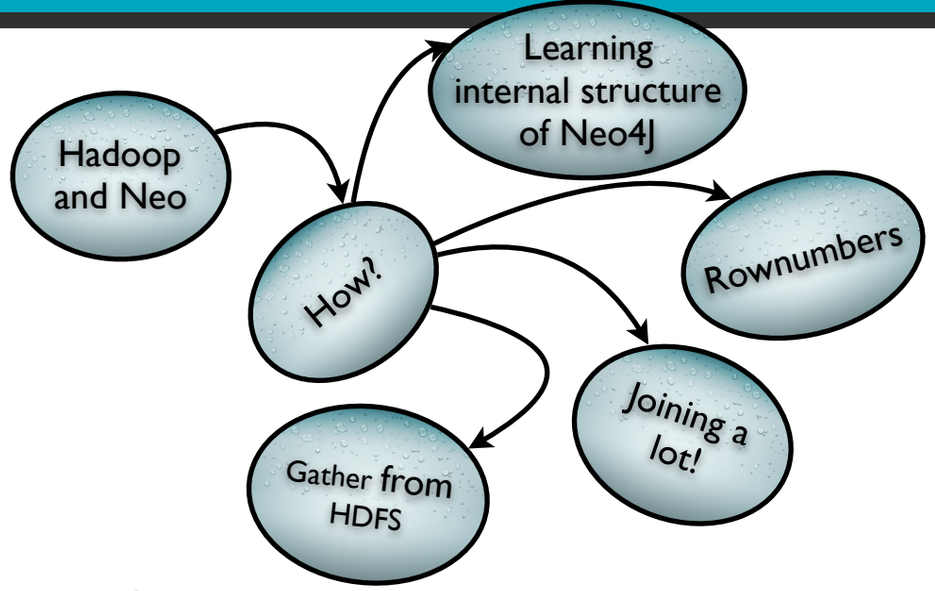
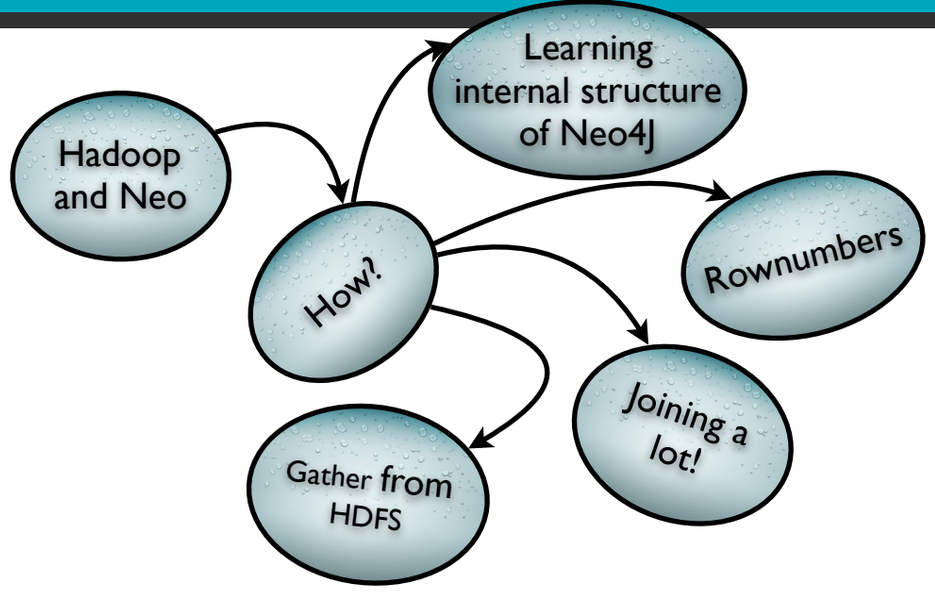
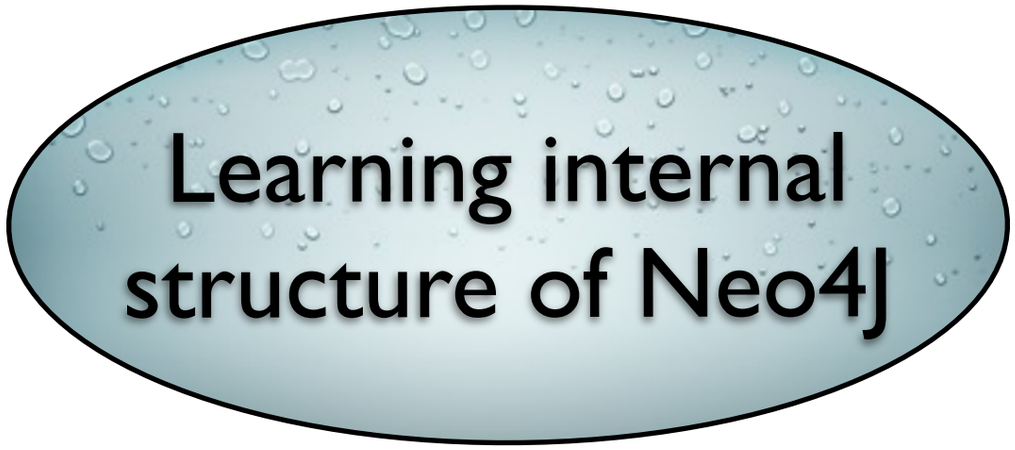


Learning internal structure of Neo4J

Name	Date Modified	Size
messages.log	Friday, March 8, 2013 3:18 PM	169 KB
neostore	Friday, March 8, 2013 3:26 PM	54 bytes
neostore.id	Friday, March 8, 2013 3:18 PM	9 bytes
neostore.nodestore.db	Friday, March 8, 2013 3:26 PM	900 KB
neostore.nodestore.db.id	Friday, March 8, 2013 3:18 PM	9 bytes
neostore.propertystore.db	Friday, March 8, 2013 3:26 PM	16.8 MB
neostore.propertystore.db.arrays	Friday, March 8, 2013 3:26 PM	12...ytes
neostore.propertystore.db.arrays.id	Friday, March 8, 2013 3:18 PM	9 bytes
neostore.propertystore.db.id	Friday, March 8, 2013 3:18 PM	9 bytes
neostore.propertystore.db.index	Friday, March 8, 2013 3:26 PM	10 KB
neostore.propertystore.db.index.id	Friday, March 8, 2013 3:18 PM	9 bytes
neostore.propertystore.db.index.keys	Friday, March 8, 2013 3:26 PM	1 KB
neostore.propertystore.db.index.keys.id	Friday, March 8, 2013 3:18 PM	9 bytes
neostore.propertystore.db.strings	Friday, March 8, 2013 3:26 PM	1.4 MB
neostore.propertystore.db.strings.id	Friday, March 8, 2013 3:18 PM	9 bytes
neostore.relationshipstore.db	Friday, March 8, 2013 3:26 PM	20.6 MB
neostore.relationshipstore.db.id	Friday, March 8, 2013 3:18 PM	9 bytes
neostore.relationshiptypestore.db	Friday, March 8, 2013 3:26 PM	25 bytes
neostore.relationshiptypestore.db.id	Friday, March 8, 2013 3:18 PM	9 bytes
neostore.relationshiptypestore.db.names	Friday, March 8, 2013 3:26 PM	22...ytes
neostore.relationshiptypestore.db.names.id	Friday, March 8, 2013 3:18 PM	9 bytes

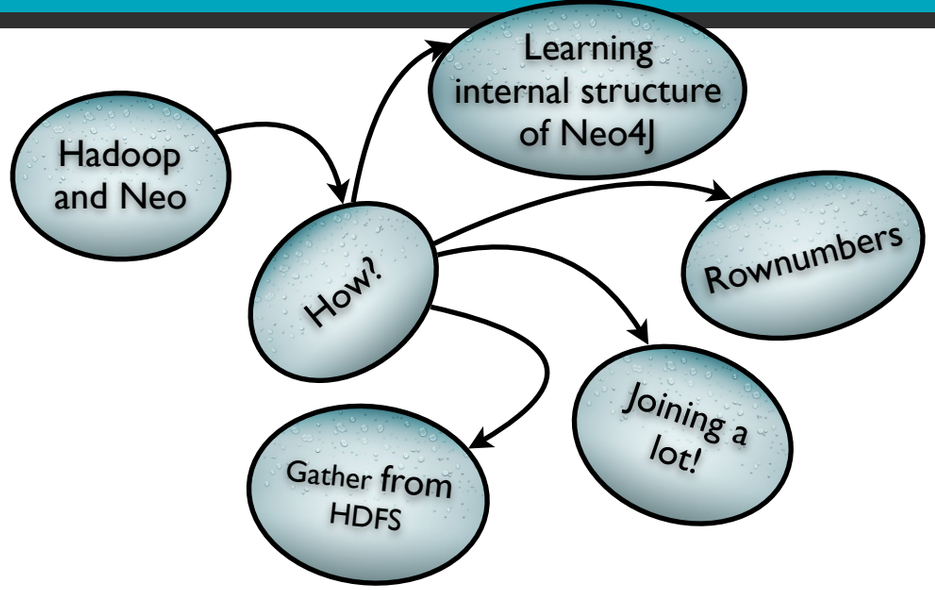




Lucky most work already done by

Chris Gioran

In essence it's all: doubly linked lists sequentially stored on disk



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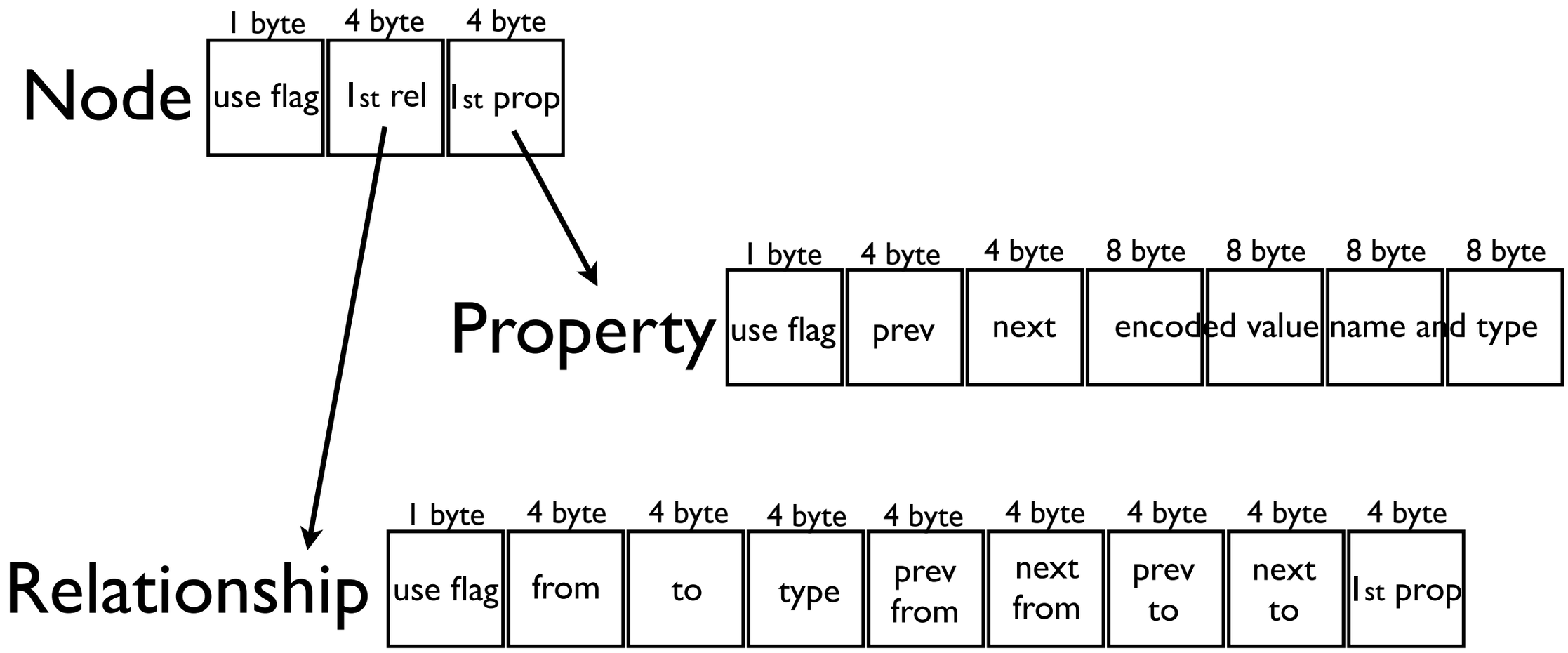

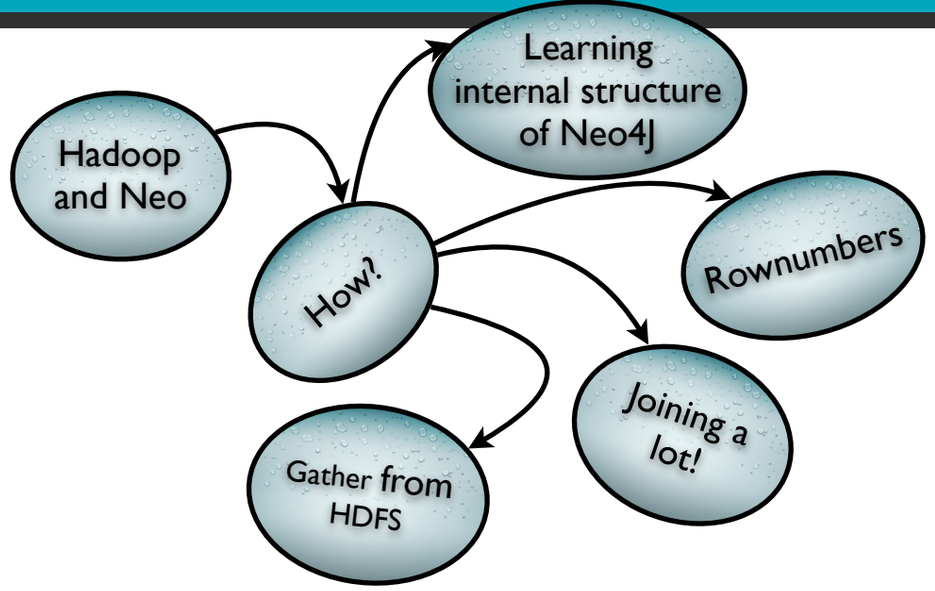
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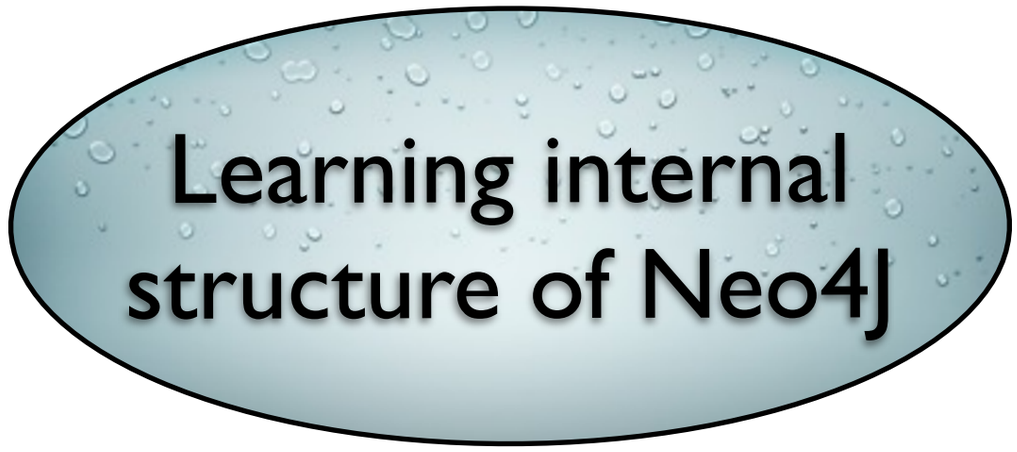
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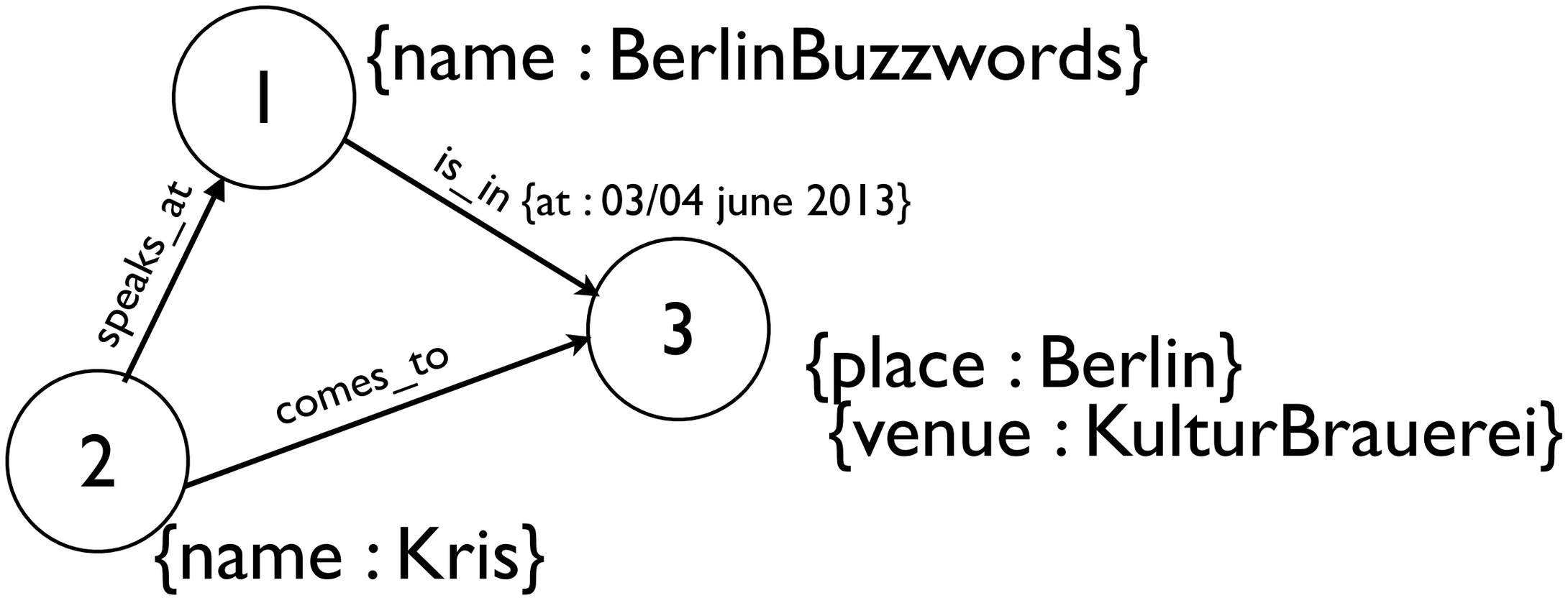
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{name : BerlinBuzzwords}
is_in
{at : 03/04 june 2013}
speaks_at
comes_to
3
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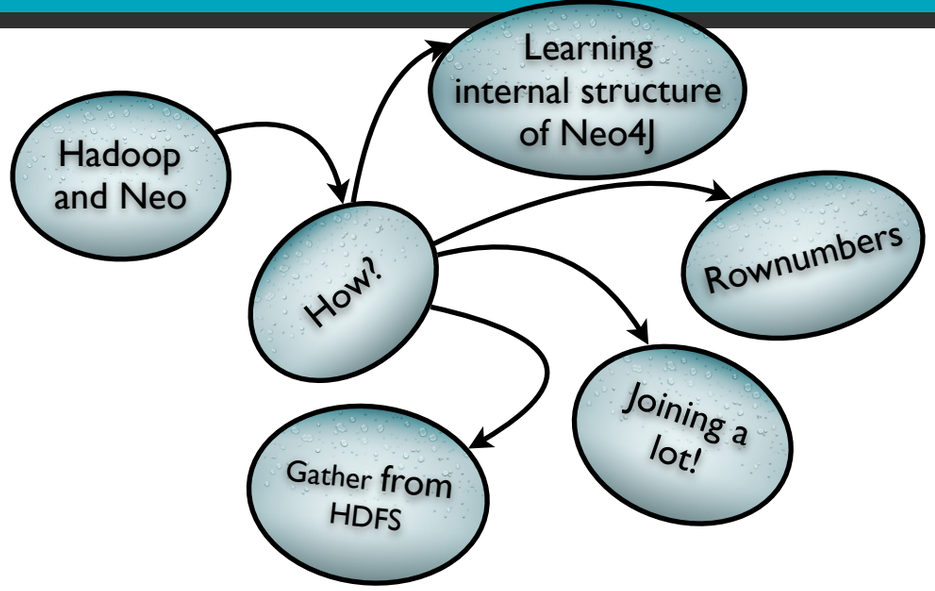

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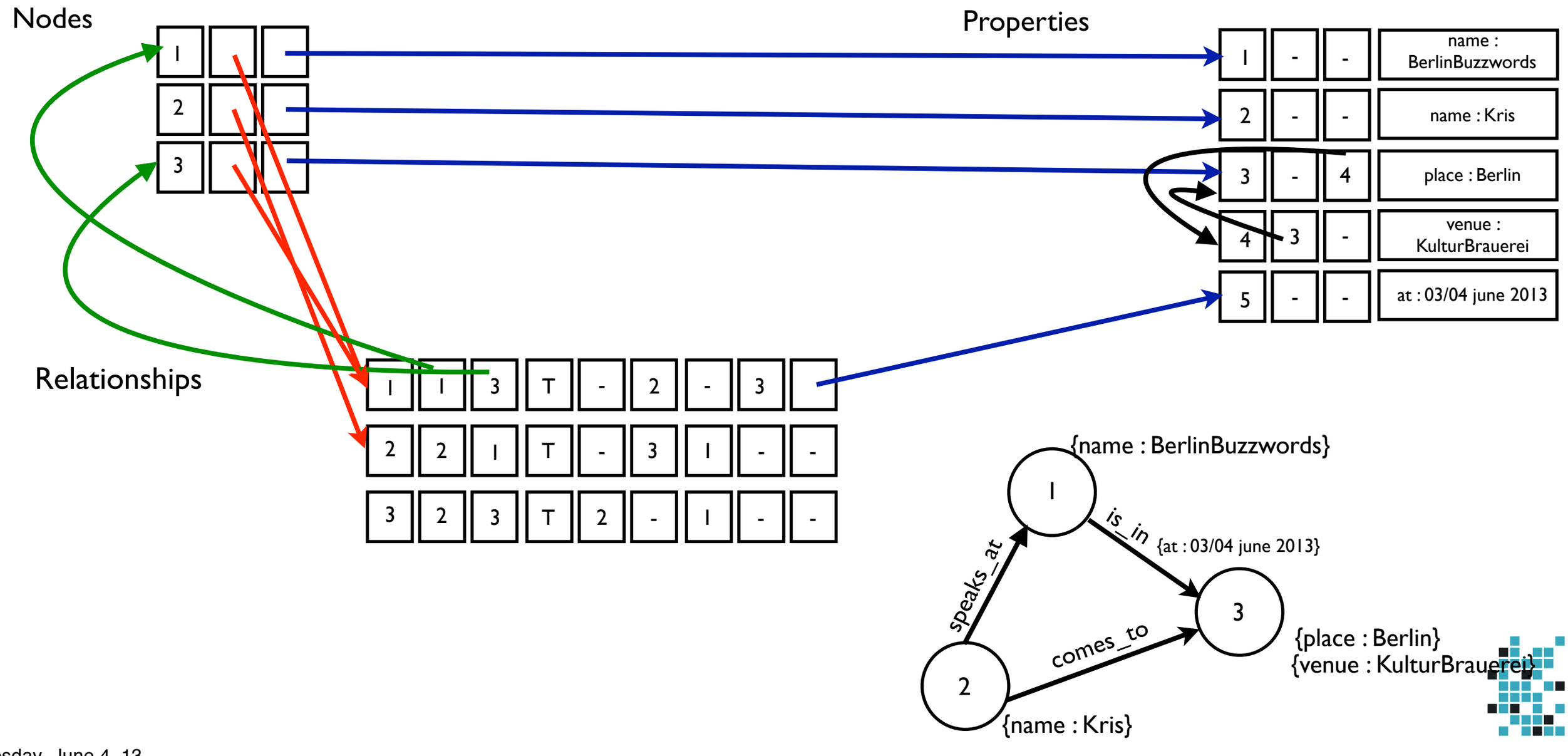
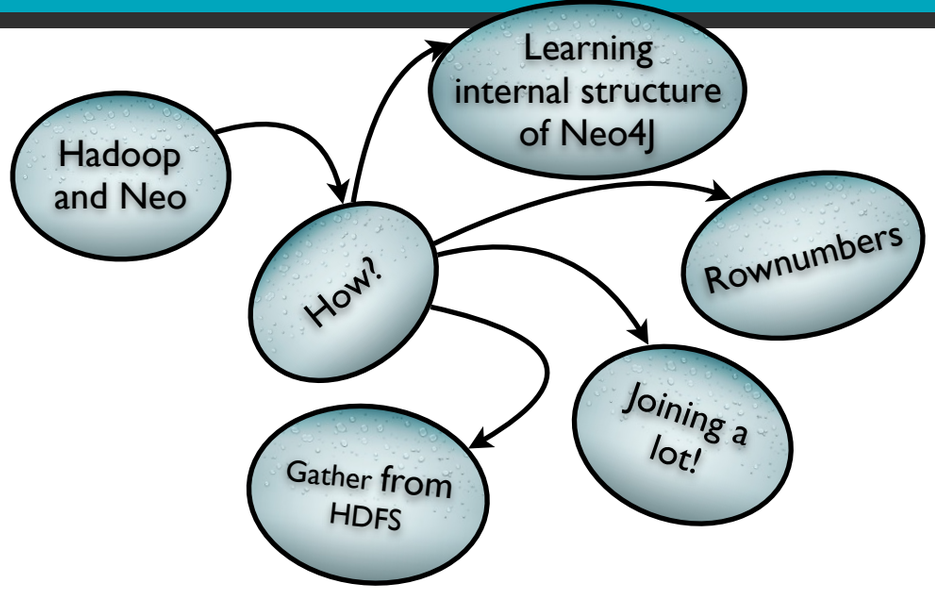
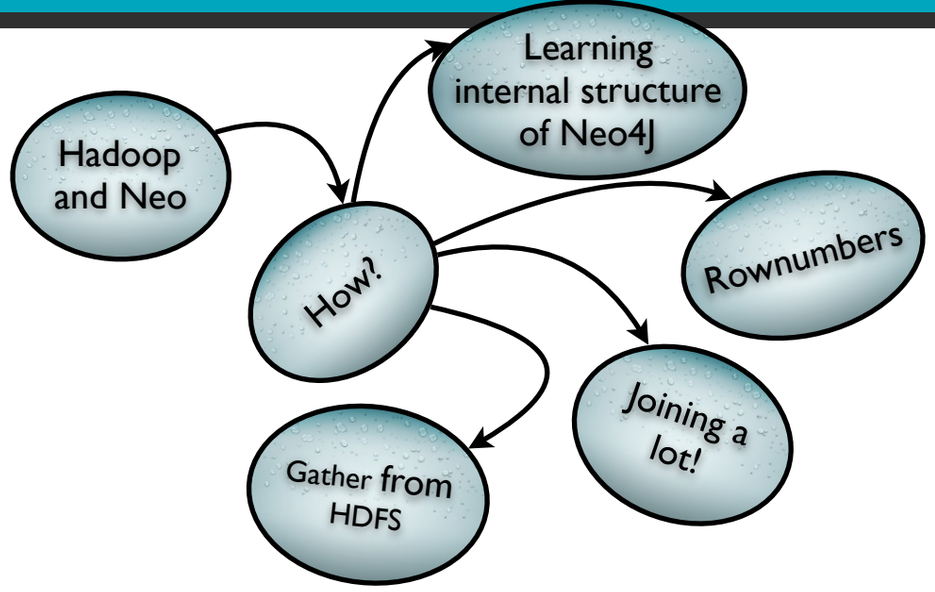


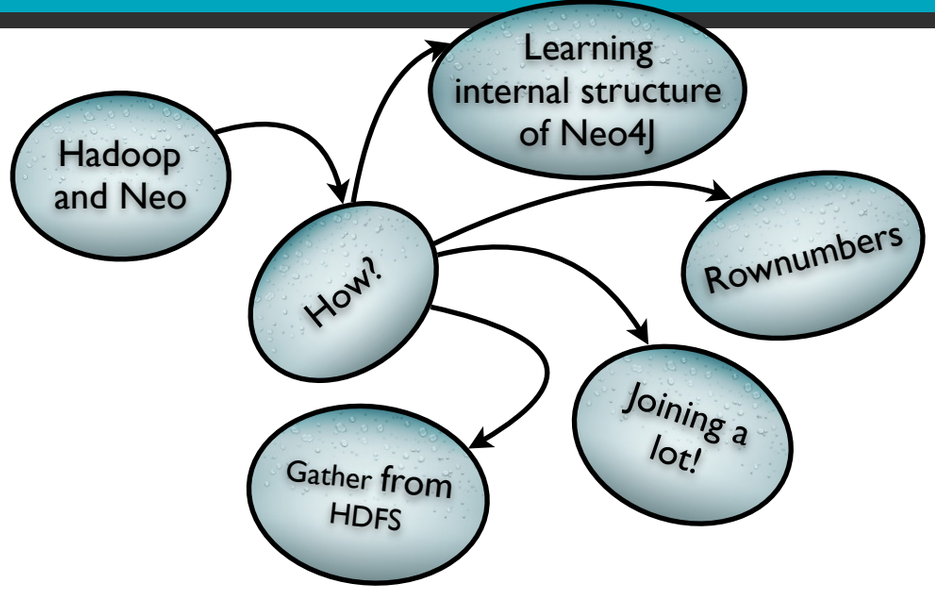


01 ff ff ff ff ff ff ff ff 01 00 00 01 ec 00 00
00 00 01 00 00 00 67 00 00 00 01 01 00 00 00 7e
00 00 00 02 01 00 00 00 02 00 00 00 03 01 00 00
00 08 00 00 00 04 01 00 00 00 03 00 00 00 05 01
00 00 00 04 00 00 00 07 01 00 00 02 5c 00 00 00
08 01 00 00 01 f6 00 00 00 09 01 00 00 00 08 00
00 00 0a 01 00 00 00 0c 00 00 00 0b 01 00 00 00
52 00 00 00 0c 01 00 00 00 24 00 00 00 0d 01 00
00 00 0c 00 00 00 0e 01 00 00 02 00 00 00 00 0f
01 00 00 00 0e 00 00 00 10 01 00 00 00 10 00 00

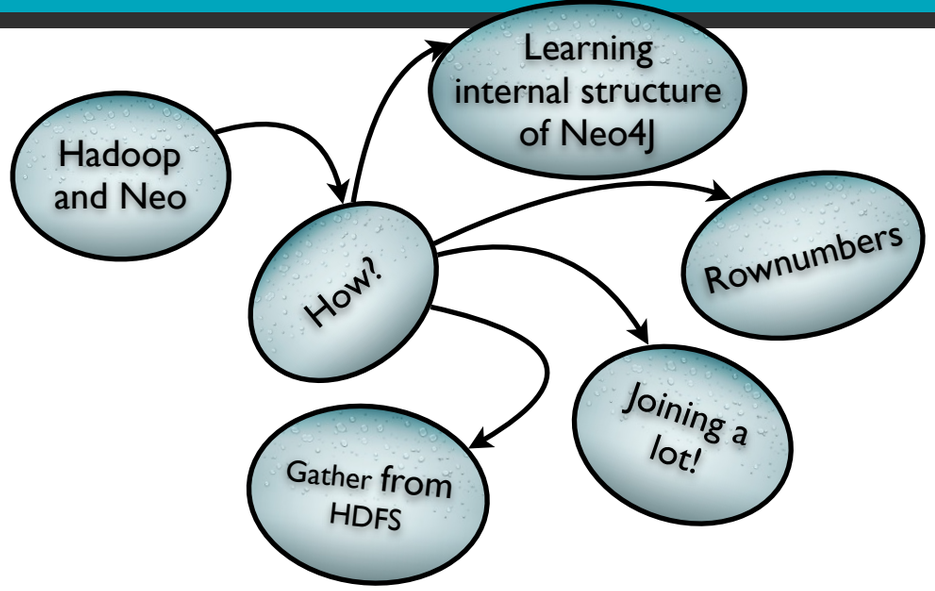
Position in the file matters



We need a rownumber generator

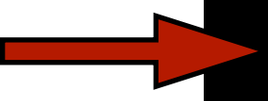


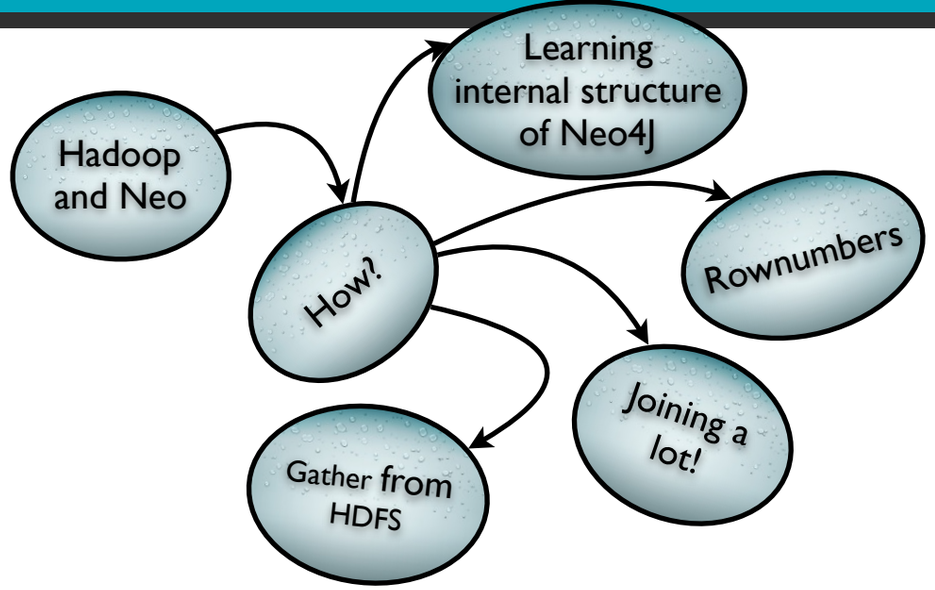
*nix has one build into `cat`



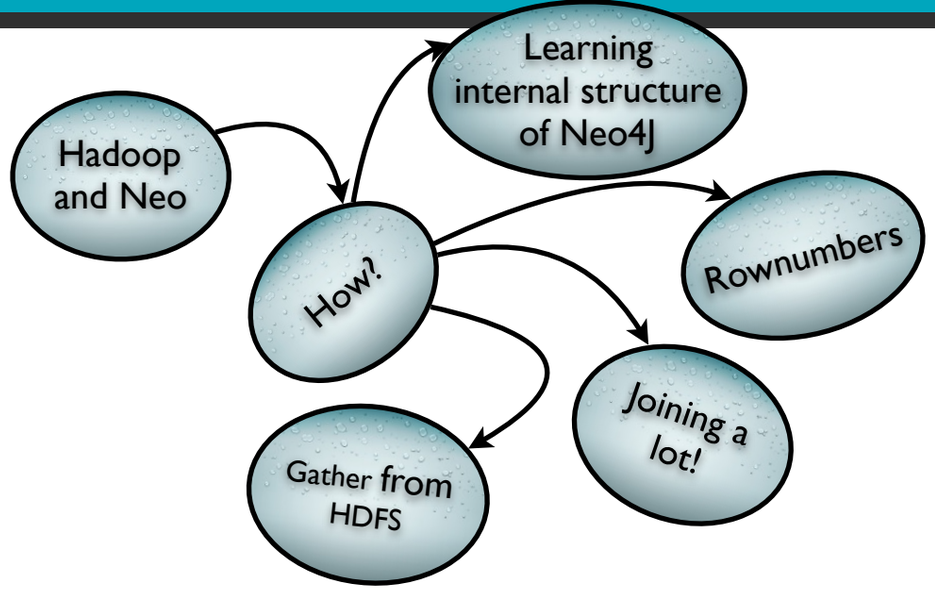
Rownumbers

```
CAT(1)                    BSD General Commands Manual                   CAT(1)

NAME
     cat -- concatenate and print files

SYNOPSIS
     cat [-benstuv] [file ...]

DESCRIPTION
     The cat utility reads files sequentially, writing them to the standard output.  The file operands are pro-
     cessed in command-line order.  If file is a single dash (`-') or absent, cat reads from the standard
     input.  If file is a UNIX domain socket, cat connects to it and then reads it until EOF.  This complements
     the UNIX domain binding capability available in inetd(8).

     The options are as follows:

     -b      Number the non-blank output lines, starting at 1.

     -e      Display non-printing characters (see the -v option), and display a dollar sign (`$') at the end of
             each line.

     -n      Number the output lines, starting at 1.

     -s      Squeeze multiple adjacent empty lines, causing the output to be single spaced.

     -t      Display non-printing characters (see the -v option), and display tab characters as `^I'.

     -u      Disable output buffering.

     -v      Display non-printing characters so they are visible.  Control characters print as `^X' for con-
             trol-X; the delete character (octal 0177) prints as `^?'.  Non-ASCII characters (with the high bit
             set) are printed as `M-' (for meta) followed by the character for the low 7 bits.

EXIT STATUS
     The cat utility exits 0 on success, and >0 if an error occurs.
```





We need a distributed ‘cat -n’



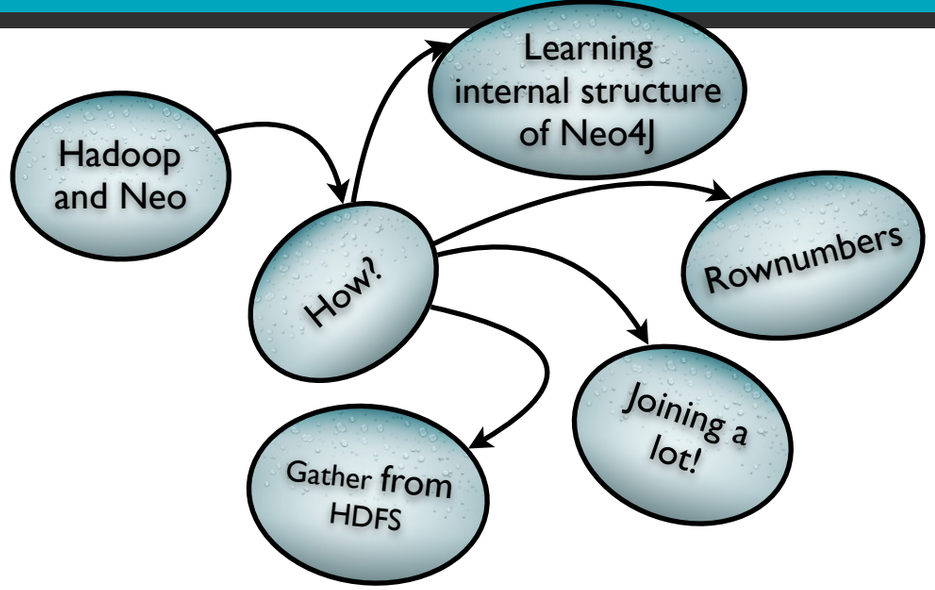
We need a distributed ‘cat -n’

to convert:

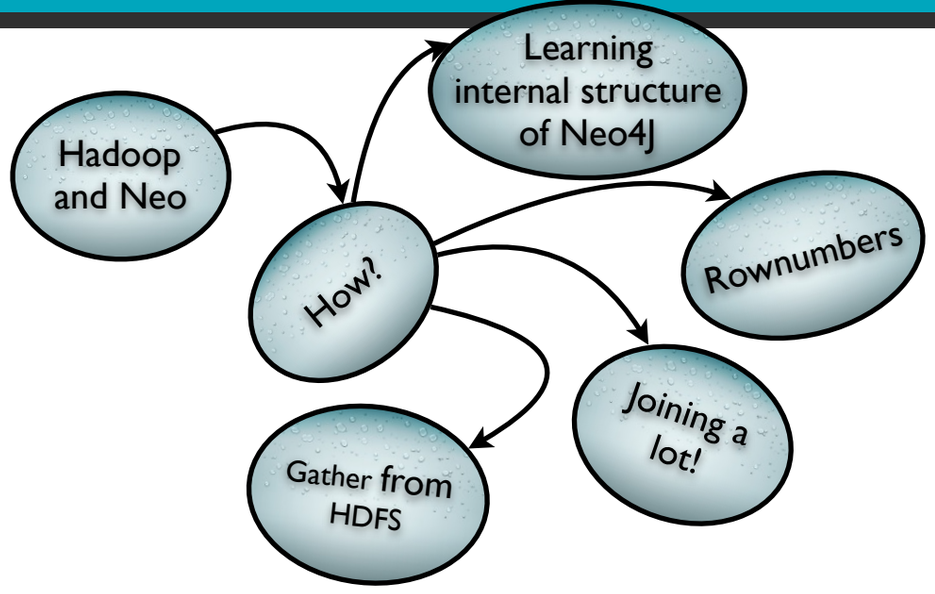
ABC
DEF
GHI
JKL
MNO
PQR
STU
VWX
YZ0

into:

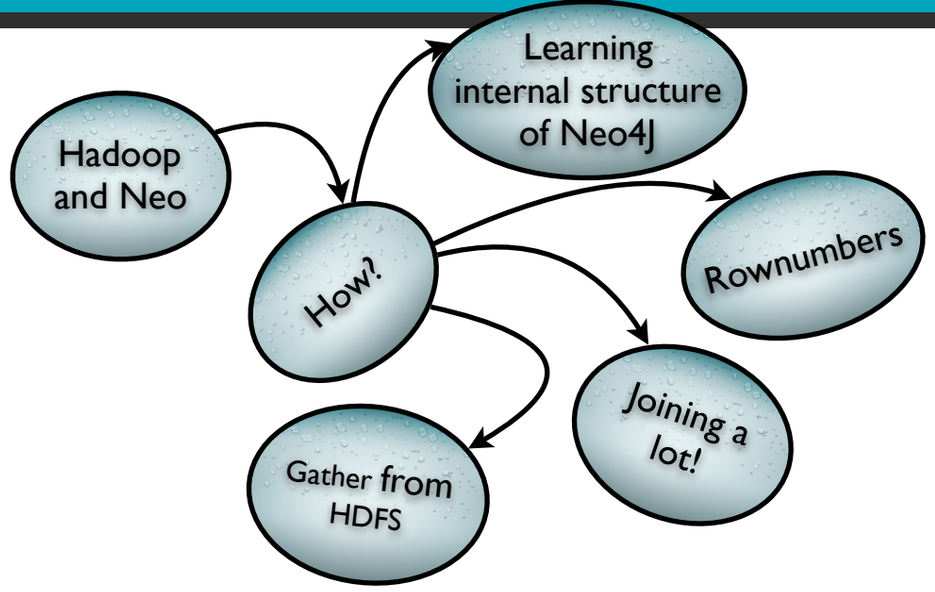
0 ABC
1 DEF
2 GHI
3 JKL
4 MNO
5 PQR
6 STU
7 VWX
8 YZ0



Easy way out is a 1 (one) reducer job doing the numbering. But that's no fun right!



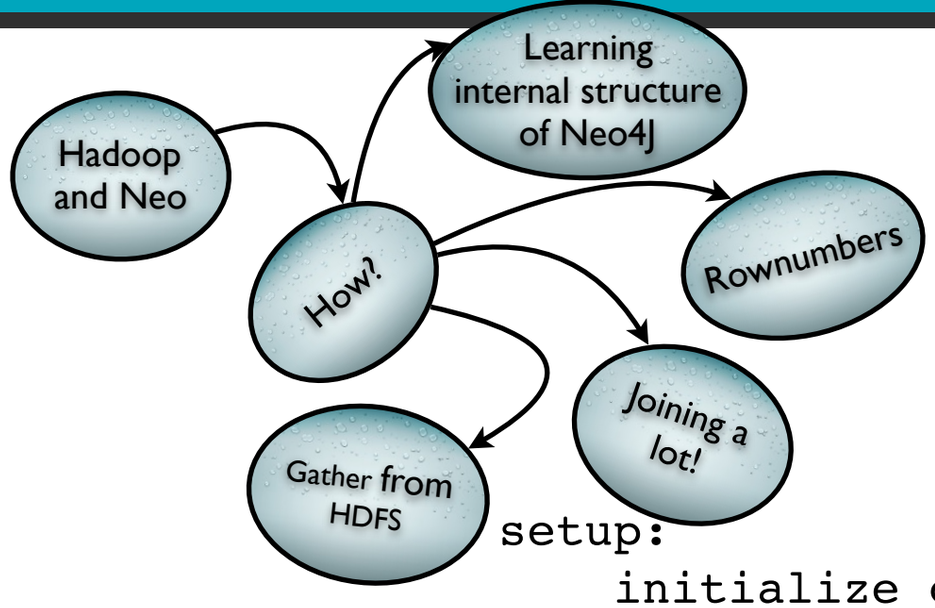
1. Run the data through a mapper and have the mapper emit each record AS IS
2. Have each mapper keep track of how many records it sends to each reducer
3. Have each reducer process the count records and accumulate the counts from each mapper it receives
4. Have each reducer emit each record prepended by a row ID starting the ID sequence at the number calculated



1. Run the data through a mapper and have the mapper emit each record AS IS
2. Have each mapper keep track of how many records it sends to each reducer

mapper:

```
setup:
    initialize counters

map:
    read input ==> emit as is, increment the correct counter

cleanup:
    emit all counters
```



Rownumbers

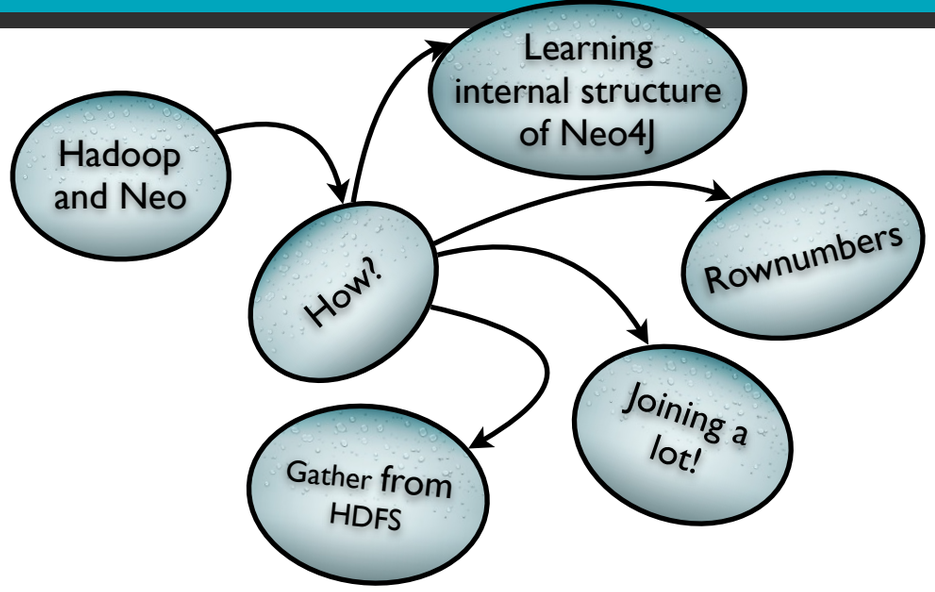
ABC (hash=0)
DEF (hash=1)
GHI (hash=2)
JKL (hash=0)
MNO (hash=1)
---------- split
PQR (hash=2)
STU (hash=0)
VWX (hash=1)
YZ0 (hash=1)

mapper 0:

```
setup:
    initialize counters = [0, 0, 0]
map:
    input "ABC" ==> emit "ABC", increment counters[0]
    input "DEF" ==> emit "DEF", increment counters[1]
    input "GHI" ==> emit "GHI", increment counters[2]
    input "JKL" ==> emit "JKL", increment counters[0]
    input "MNO" ==> emit "MNO", increment counters[1]   //now [2, 2, 1]
cleanup:
    emit counter for partition 0: none
    emit counter for partition 1: counters[0] = 2
    emit counter for partition 2: counters[0] + counters[1] = 4
```

mapper 1:

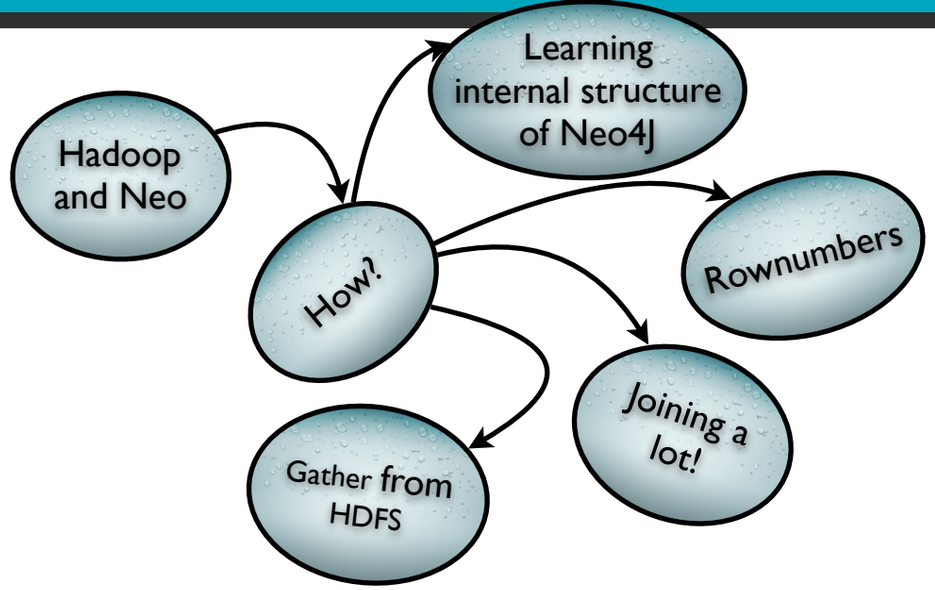
```
setup:
    initialize counters = [0, 0, 0]
map:
    input "PQR" ==> emit "PQR", increment counters[2]
    input "STU" ==> emit "STU", increment counters[0]
    input "VWX" ==> emit "VWX", increment counters[1]
    input "YZ0" ==> emit "YZ0", increment counters[1]   //now [1, 2, 1]
cleanup:
    emit counter for partition 0: none
    emit counter for partition 1: counters[0] = 1
    emit counter for partition 2: counters[0] + counters[1] = 3
```



1. Have each reducer process the count records and accumulate the counts from each mapper it receives
2. Have each reducer emit each record prepended by a row ID starting the ID sequence at the number calculated

reducer:

```
reduce:
    initialize offset = 0
    calculate offset to start numbering based on all counter records from the mappers
    read input ==> emit current offset + input, increment offset
```



reducer 0:

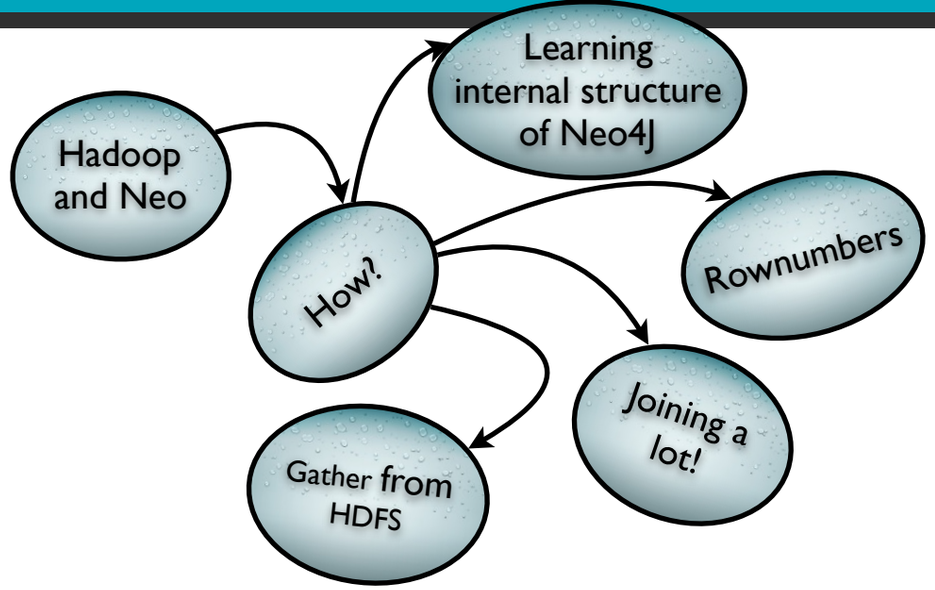
```
reduce:
    initialize offset = 0
    input "ABC" ==> emit "offset <tab> ABC", increment offset   //emits 0<tab>ABC
    input "JKL" ==> emit "offset <tab> JKL", increment offset   //emits 1<tab>ABC, and so on...
    input "STU" ==> emit "offset <tab> STU", increment offset   //last emitted offset is 2
```

reducer 1:

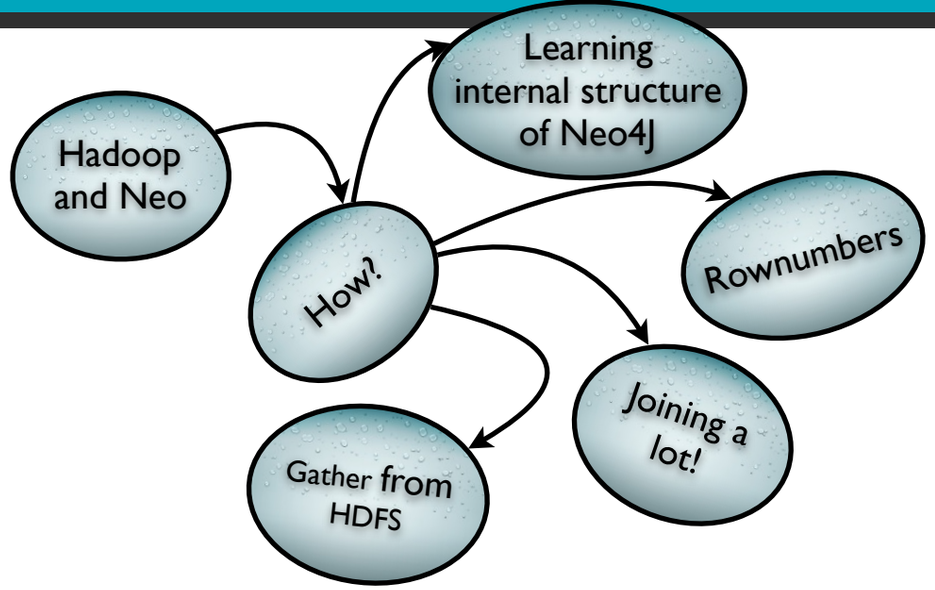
```
reduce:
    initialize offset = 0
    input counter with value 2 ==> offset = offset + 2
    input counter with value 1 ==> offset = offset + 1  //now offset == 3
    input "DEF" ==> emit "offset <tab> DEF", increment offset   //emits 3<tab>DEF
    input "MNO" ==> emit "offset <tab> MNO", increment offset   //emits 4<tab>MNO, and so on...
    input "VWX" ==> emit "offset <tab> VWX", increment offset
    input "XY0" ==> emit "offset <tab> XY0", increment offset   //last emitted offset is 6
```

reducer 2:

```
reduce:
    initialize offset = 0
    input counter with value 4 ==> offset = offset + 4
    input counter with value 3 ==> offset = offset + 3  //now offset == 7
    input "GHI" ==> emit "offset <tab> GHI", increment offset   //emits 7<tab>GHI
    input "PQR" ==> emit "offset <tab> PQR", increment offset   //emits 8<tab>PQR
```


Hadoop and Neo
Learning internal structure of Neo4J
How?
Rownumbers
Joining a lot!
Gather from HDFS

Rownumbers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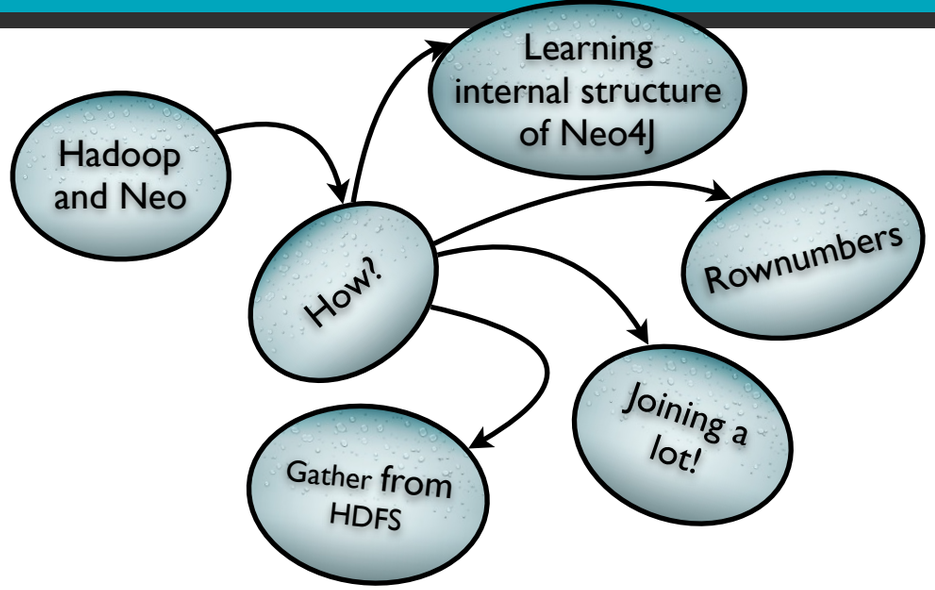
Is that all?


Rownumbers



Is that all?

No!

A custom partitioner:

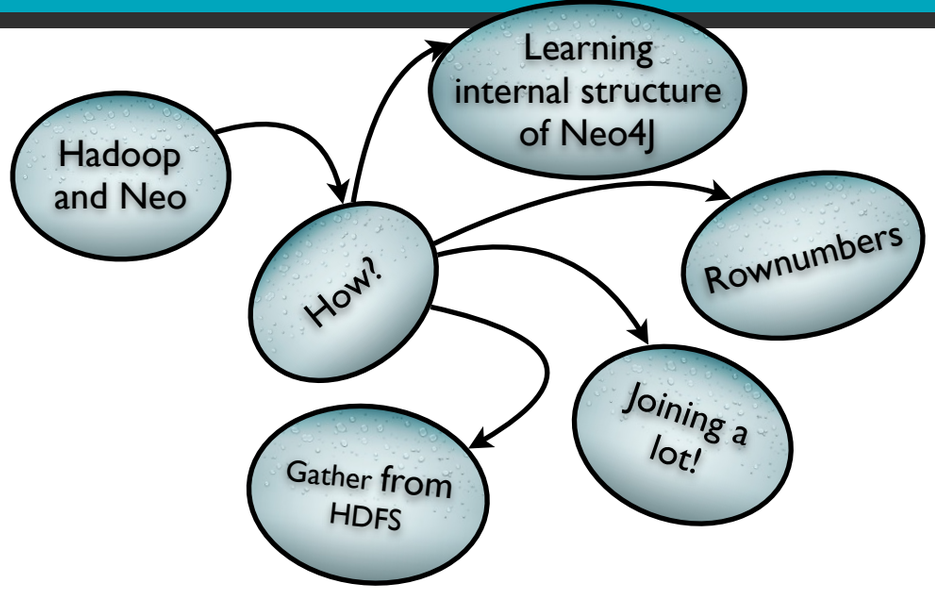
```
public static class Partitioner extends Partitioner<ByteWritable, RowNumberWritable> {
    @Override
    public int getPartition(ByteWritable key, RowNumberWritable value, int numPartitions) {
        if (key.get() == (byte) RowNumberJob.COUNTER_MARKER) {
            return value.getPartition();
        } else {
            return Partitioner.partitionForValue(value, numPartitions);
        }
    }

    public static int partitionForValue(RowNumberWritable value, int numPartitions) {
        return (value.getValue().hashCode() & Integer.MAX_VALUE) % numPartitions;
    }
}
```

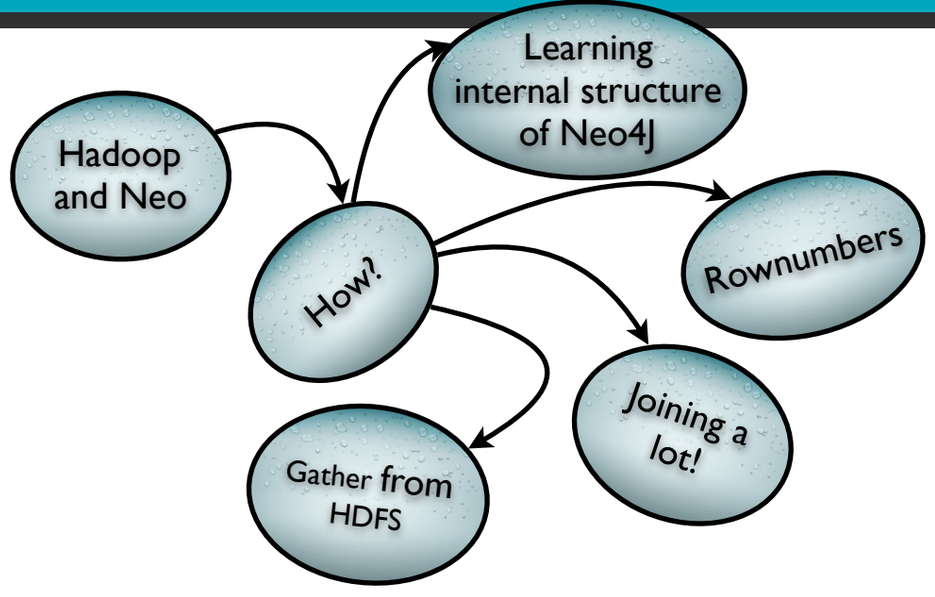
A custom grouping comparator:

```
public class IndifferentComparator implements RawComparator<ByteWritable> {
    @Override
    public int compare(ByteWritable left, ByteWritable right) {
        return 0;
    }
}
```

A custom writable

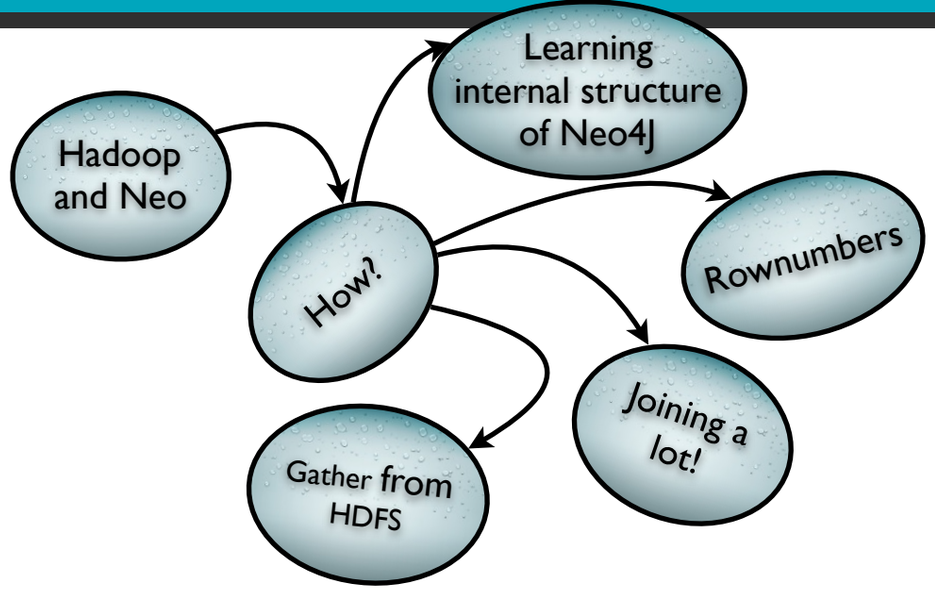


Step 1: Prepare properties
Step 2a: Output properties
Step 2b: Output nodes/edges and first property reference
Step 3: Join edges and nodes to get from-id and to-id
Step 4: Output nodes with first edge and first property reference
Step 5: Output edges



Step 1: Prepare properties

Propertierecords can hold multiple properties
We need to find the first property reference for each node and edge, so we need to know the total properties structure first



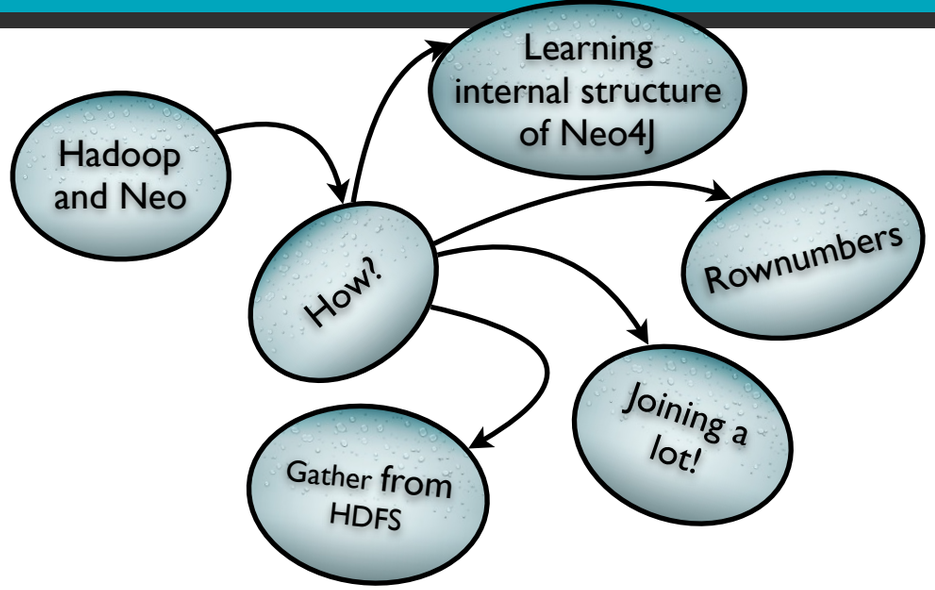
Step 2a: Output properties

Step 2b: Output nodes/edges and first property reference

We output the bytearray structure of the neo4j property files

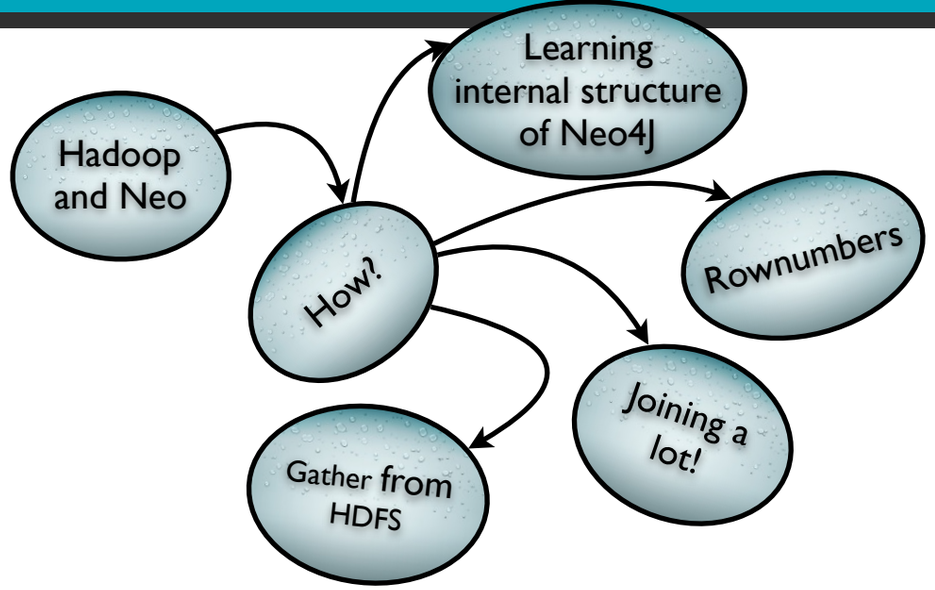
And we can output the node id with functional id and the first property pointer

For edges we output the edgeid, fromnode, tonode and first property pointer



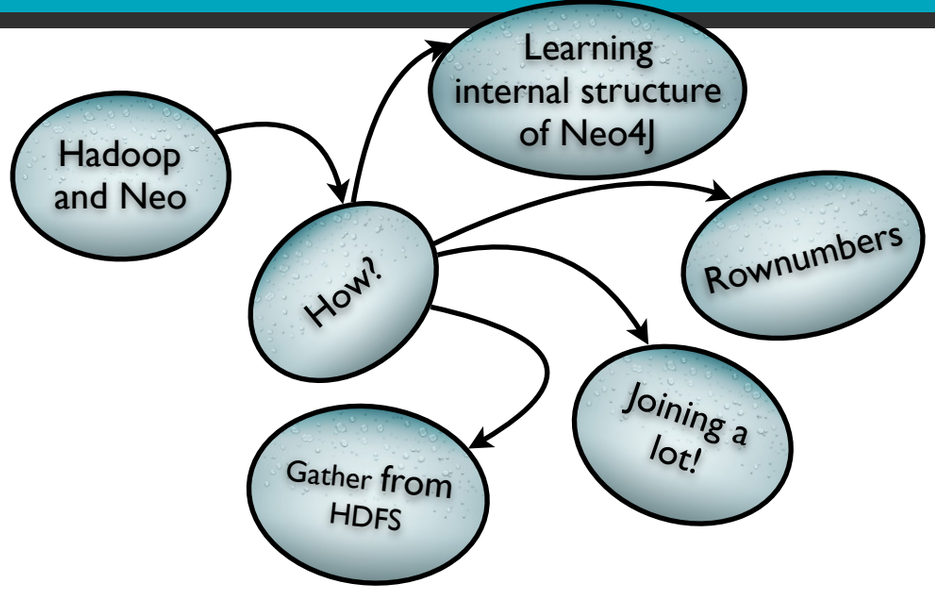
Step 3: Join edges and nodes to get from-id and to-id

Remember we added rownumbers to the data and we need to use them as our pointers. Not the original functional id.



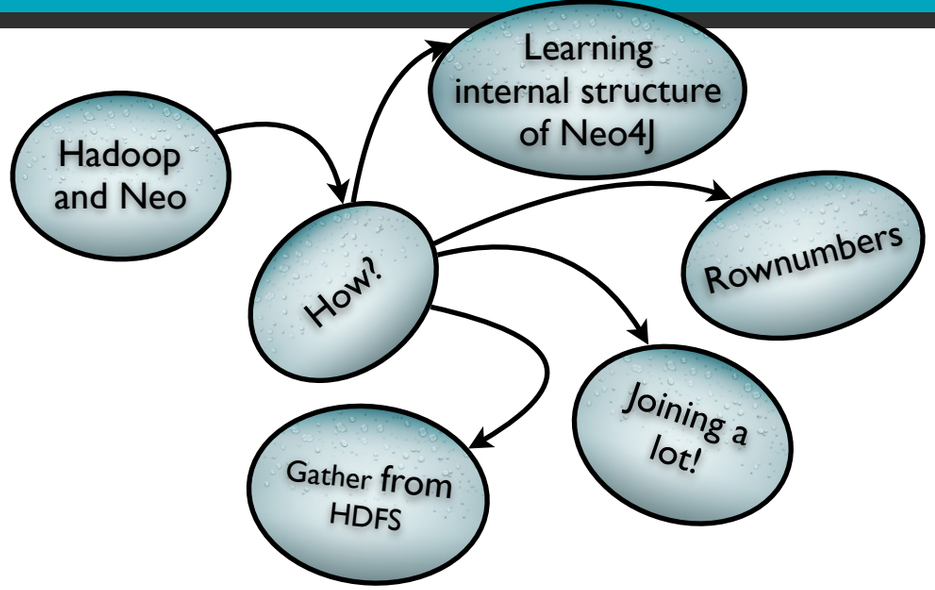
Step 4: Output nodes with first edge and first property reference

It's actually more complicated. Need to selfjoin all edges of a node to determine the first.



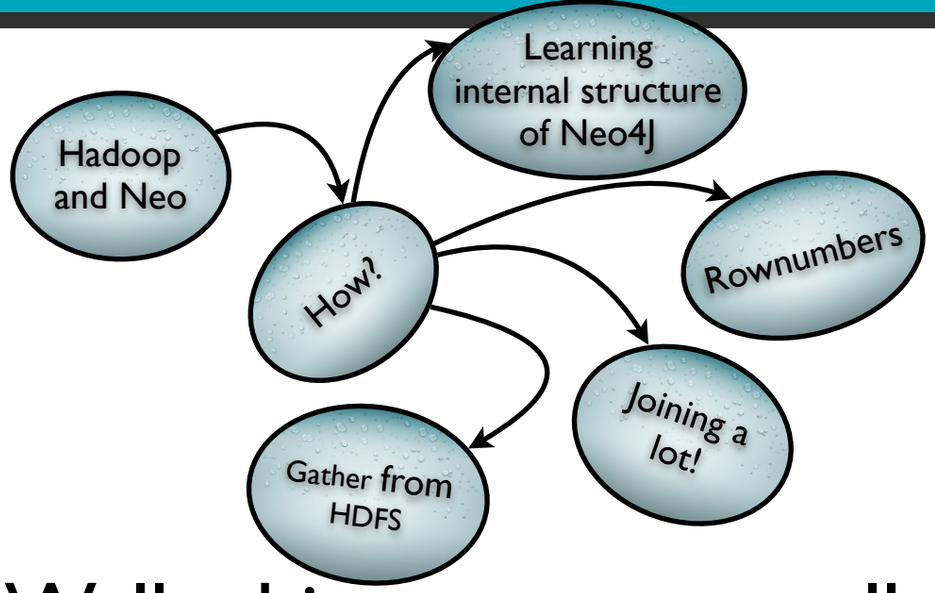
Step 5: Output edges

Making sure you have them sorted to put in the next and previous edge reference



Just a simple

```
hadoop fs -cat <HDFS PATH>/neostore.nodestore.db/part-r-*
```



Well a bit more to get all data

```
#!/bin/bash

rm -rf ./graph.db
mkdir graph.db/

TO=./graph.db/
FROM=${1}
hadoop fs -get ${FROM}/neostore ${TO}
hadoop fs -get ${FROM}/neostore.id ${TO}
hadoop fs -get ${FROM}/neostore.nodestore.db.id ${TO}
hadoop fs -get ${FROM}/neostore.relationshipstore.db.id ${TO}
hadoop fs -get ${FROM}/neostore.relationshiptypestore.db ${TO}
hadoop fs -get ${FROM}/neostore.relationshiptypestore.db.id ${TO}
hadoop fs -get ${FROM}/neostore.relationshiptypestore.db.names ${TO}
hadoop fs -get ${FROM}/neostore.relationshiptypestore.db.names.id ${TO}

hadoop fs -get ${FROM}/properties/neostore.propertystore.db.* ${TO}

hadoop fs -cat ${FROM}/neostore.nodestore.db/part-r-* > ${TO}/neostore.nodestore.db
hadoop fs -cat ${FROM}/neostore.relationshipstore.db/part-r-* > ${TO}/neostore.relationshipstore.db

hadoop fs -cat ${FROM}/nodeproperties/propertystore.db/props-r-* ${FROM}/edgeproperties/propertystore.db/props-r-* ${FROM}/p
hadoop fs -cat ${FROM}/properties/neostore.propertystore.db.strings.header ${FROM}/nodeproperties/propertystore.db/strings-

rm ${TO}/*.footer
rm ${TO}/*.header
exit

```

Recreate db

Agile exploration

No waiting please!

Neo4J

Hadoop

What?

Why?

Insight

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Todo

End

Q

Who?

Kris

Meetups

NLHUG

Graph databases Amsterdam

GoDataDriven

Hadoop and Neo

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Rownumbers

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Q

```
START me = node("Kris Geusebroek")
MATCH me-[:WORKS_AT]-("GoDataDriven")
    , me-[:MEMBER]-("meetup.com/NLHUG")
    , me-[:MEMBER]-("meetup.com/GraphdbAmsterdam")
WHERE me.twitter = "@krisgeus"
  AND me.github = "github.com/krisgeus"
  AND me.email = "krisgeusebroek@godatadriven.com"
RETURN "THANK YOU!"
```

Hadoop and Neo

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How?

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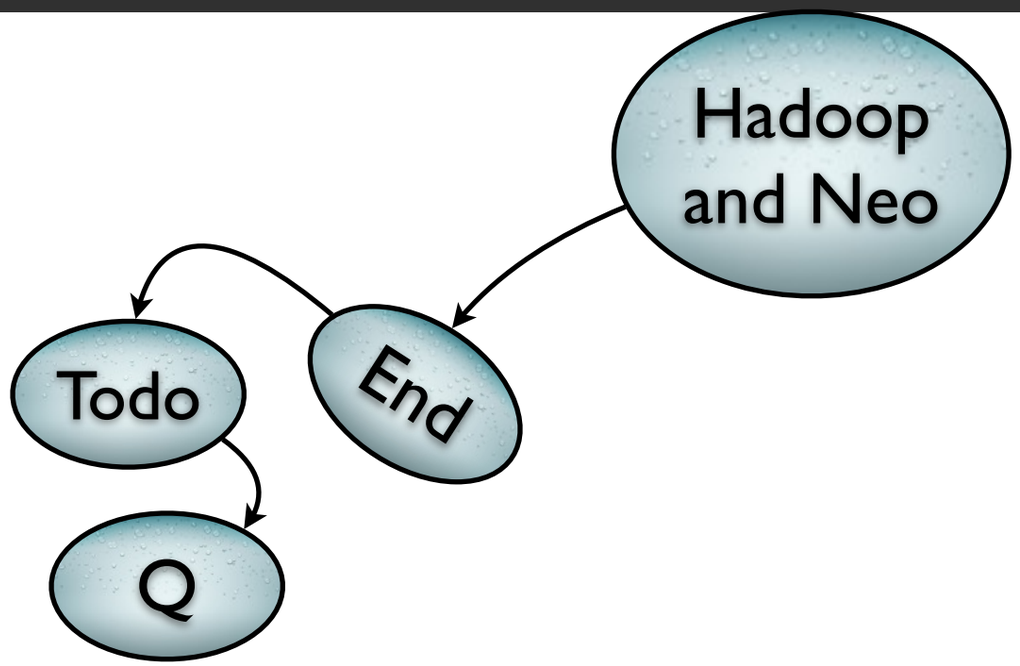
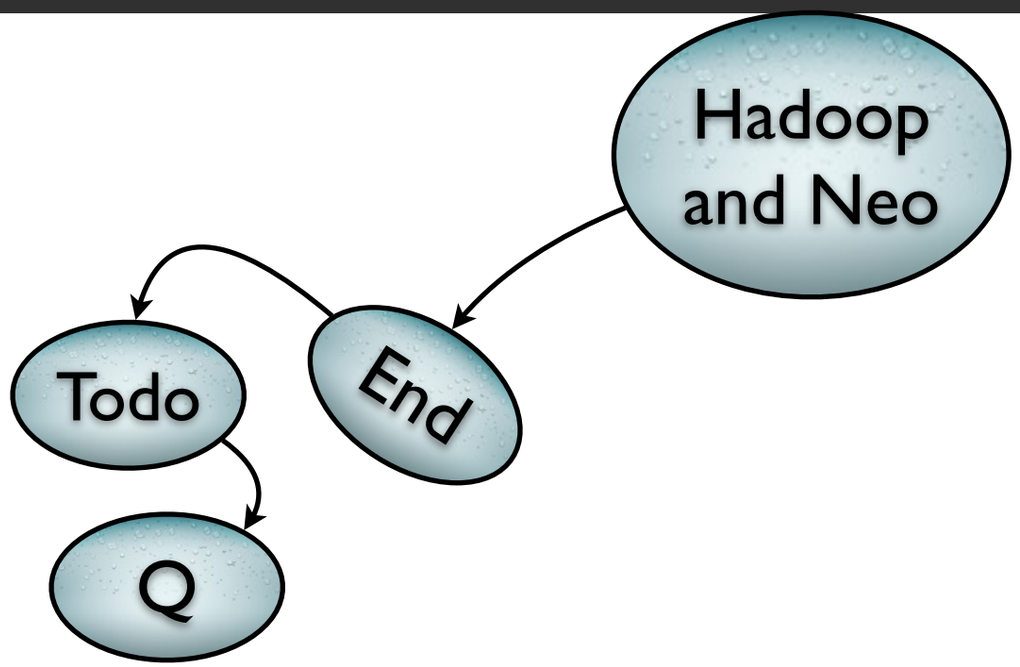


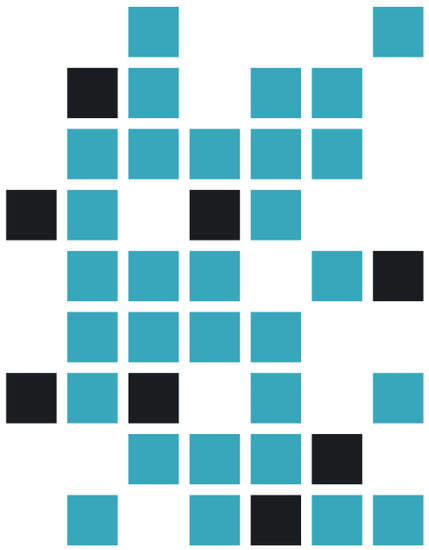
Todo:

- Indexes
- Array properties
- Neo4J 2.0 compatibility
- Inverse direction



Code is on

https://github.com/krisgeus/graphs



GoDataDriven

We're hiring / Questions? / Thank you!

Kris Geusebroek
Big Data Hacker

@krisgeus
krisgeusebroek@godatadriven.com