ORACLE®

# 3612/7204 ICT Database Systems

**Graph Databases** 

David Meibusch Principal Software Engineer Oracle Labs Australia May, 2016



Copyright © 2016, Oracle and/or its affiliates. All rights reserved.

#### Disclaimer

The following is intended to provide some insight into a line of research in Oracle Labs. It is intended for information purposes only, and may not be incorporated into any contract. It is not a commitment to deliver any material, code, or functionality, and should not be relied upon in making purchasing decisions. Oracle reserves the right to alter its development plans and practices at any time, and the development, release, and timing of any features or functionality described in connection with any Oracle product or service remains at the sole discretion of Oracle. Any views expressed in this presentation are my own and do not necessarily reflect the views of Oracle.



# **Graph Theory**

- Nodes (vertices)
- Relationships (edges)



#### Mathematical properties

- Cyclic, acyclic
- Directed, undirected
- Reachability
- Transitive closures
- Shortest paths



## **Applications of Graph Theory**



© Koushikchakraborty13 - Wikimedia Commons CC-BY-SA-3.0



© SURENDAR KUMAR - Wikimedia Commons CC-BY-SA-3.0



© Daniel Keedy - Wikimedia Commons CC-BY-SA-3.0





© YYK - Wikimedia Commons CC-BY-SA-3.0

#### ORACLE

### Graph Algorithms Centrality

- Degree Centrality
- Closeness Centrality
- Betweenness Centrality
- PageRank

ORACLE

. . .



Network of Thrones © The Mathematical Association of America, 2016 - http://dx.doi.org/10.4169/mathhorizons.23.4.18

#### Modelling Graph in Relational DB Node and Edge tables

| id | name    | type      | start | end |
|----|---------|-----------|-------|-----|
| 1  | Tyrion  | talked-to | 1     | 2   |
| 2  | Cersei  | talked-to | 1     | 3   |
| 3  | Sansa   | talked-to | 3     | 4   |
| 4  | Robb    | fought    | 1     | 4   |
| 5  | Stannis | fought    | 2     | 5   |



#### Modelling Graph in Relational DB Tyrion has talked to...

| id | name    | type      | start | end |
|----|---------|-----------|-------|-----|
| 1  | Tyrion  | talked-to | 1     | 2   |
| 2  | Cersei  | talked-to | 1     | 3   |
| 3  | Sansa   | talked-to | 3     | 4   |
| 4  | Robb    | fought    | 1     | 4   |
| 5  | Stannis | fought    | 2     | 5   |

| SELECT n.name                    |  |
|----------------------------------|--|
| FROM node n                      |  |
| LEFT JOIN edge e ON n.id = e.end |  |
| WHERE e.start = 1;               |  |



#### Modelling Graph in Relational DB Tyrion conversations

| id | name    | type      | from | to |
|----|---------|-----------|------|----|
| 1  | Tyrion  | talked-to | 1    | 2  |
| 2  | Cersei  | talked-to | 1    | 3  |
| 3  | Sansa   | talked-to | 3    | 4  |
| 4  | Robb    | fought    | 1    | 4  |
| 5  | Stannis | fought    | 2    | 5  |

| SELECT n.name                        |  |
|--------------------------------------|--|
| WHERE id IN (                        |  |
| SELECT start FROM edge WHERE end = 1 |  |
| UNION                                |  |
| SELECT end FROM edge WHERE start = 1 |  |
| );                                   |  |
| / >                                  |  |



#### Modelling Graph in Relational DB Tyrion Chinese Whispers

| id | name    | type      | from | to | WITH RECURSIVE closure(id, name)           |
|----|---------|-----------|------|----|--|
| 1  | Tyrion  | talked-to | 1    | 2  | SELECT n.id, n.name FROM node              |
| 2  | Cersei  | talked-to | 1    | 3  | WHERE n.id = 1                             |
| 3  | Sansa   | talked-to | 3    | 4  | UNION ALL<br>SELECT n.id, n.name FROM node |
| 4  | Robb    | fought    | 1    | 4  | LEFT JOIN edge e ON n.id = e.end           |
| 5  | Stannis | fought    | 2    | 5  | WHERE e.start = id                         |
|    |         |           |      |    | SELECT * FROM closure;                     |



#### Graph Database

- Use nodes, edges, and properties to represent and store data
- Provide means to traverse the graph
- Allows fast implementation of graph algorithms





ORACLE

### Neo4J

 Graph on-disk with in-memory cache

- CRUD
  - Create, Read, Update, Delete
- ACID transactions
- OLTP



- Labelled Property Graph Model
  - Node and relationships
  - Node/value pairs (properties)
  - Nodes can be labelled
  - Relationships are named and directed
  - Relationship/value pairs (properties)



#### **Neo4J Implementation**

 Node and Relationship store files (on disk)

#### Node (15 bytes)



#### Relationship (34 bytes)







Graph Databases © Neo Technology, 2015 - <u>http://graphdatabases.com/</u>

(emil)<-[:KNOWS]-(jim)-[:KNOWS]->(ian)-[:KNOWS]->(emil)



Cypher query language
 – "ASCII art" for graph matching

Accessing Neo4J graph



# Cypher example



# neoy

#### Enemy of my enemy

MATCH (kin)-[:feuds]->(enemy)-[:feuds]->(friend) WHERE kin.family = 'Stark' **RETURN** kin, friend



# Cypher example 2



#### Chinese Whispers (transitive closure)

```
MATCH (tyrion: {name = 'Tyrion'})
    -[:talks-to*]->(people)
```

```
RETURN people
```

```
MATCH p=shortestPath(
  (tyrion: {name = 'Tyrion'})-[:talks-to*]->
  (ramsay: {name = 'Ramsay'}))
```

RETURN p

#### ORACLE



#### Graph Databases







## Oracle<sup>®</sup> Parallel Graph Analytics (PGX)

- Parallel, in-memory graph analytic framework
- Must fit in memory
- Immutable graph
  - Mutating creates a new graph
- No ACID, OLTP...

• Property Graph Model

- Execute graph algorithms
- Write custom graph algorithms in Green-Marl
- PGQL query language





#### PGX Implementation Adjacency Matrix



|   | 0 | 1 | 2 | 3 | 4 |
|---|---|---|---|---|---|
| 0 |   | а | b |   |   |
| 1 |   |   |   | С |   |
| 2 |   |   |   | d |   |
| 3 |   |   |   |   | е |
| 4 | g |   |   |   | f |

- Edge iteration
  - loop through the array
- Large space requirements
  - Great for dense graphs, but most are very sparse





# PGX Implementation

**Compressed Sparse Row** 

|   |   |   |   |   |   | Array of nodes | [0,        | 1, | 2,  | 3,  | 4] |    |     |
|---|---|---|---|---|---|----------------|------------|----|-----|-----|----|----|-----|
|   | 0 | 1 | 2 | 3 | 4 | -              |            | 2  | -   | -   | -  |    |     |
| 0 |   | а | b |   |   | Array of edges | [a,        | b, | С,  | d,  | e, | g, | f]  |
| 1 |   |   |   | С |   |                | <b>Г</b> 4 | 2  | 2   | 2   |    | •  | 4 7 |
| 2 |   |   |   | d |   | Edge column    | [1,        | 2, | 3,  | 3,  | 4, | 0, | 4]  |
| 3 |   |   |   |   | е | Row offsets    | Γο         |    | 2   | С   | Л  | 51 |     |
| 4 | g |   |   |   | f | NOW UNSELS     | [0,        |    | , ک | , כ | 4, | [כ |     |

• Space dependent on the edge + node count





#### Accessing PGX Graph

Java<sup>™</sup> API

• Green-Marl algorithm

PGQL query language





### PGQL example



#### Enemy of my enemy

SELECT kin, friend
WHERE (kin WITH name = 'Stark')
-[e1:feuds]->(enemy)
-[e2:feuds]->(friend)



### Comparing

#### RDBMS

- Faster on large numbers of records
- Use less storage space
- Tortuous SQL for paths

• Very mature technology

#### Graph Database

- Faster on highly connected data
- Must store relationships
- Natural path queries

Re-emerging technology



# Frappé

**Code Comprehension Tool** 





## Current Tools for C/C++ Codebases

#### • IDEs

- Issues with build integration
- Use own indexer (not the compilers)
- -Instead...
- Fall back to text editors and text-search tools
  - $-\operatorname{Vim}$  and emacs
  - Grep and cscope
- Fast and simple but imprecise



ORACLE

## Higher Level Task

- Tools provide defs/refs
  - Can go from a symbol to its definition or its references
- But usually have higher level task in mind
  - Where did this invalid value get introduced?
  - If I change this, what's going to break?
  - How did the code reach this point?

• Can we answer these queries directly?

## Frappé Graph Model

- Code entities are nodes
  - With properties: name, modifiers, etc.
- References are edges
  - With properties: source location, qualifiers, etc.
- Includes data from
  - File system: directory and file hierarchy
  - Preprocessor: includes, macros, their expansion and interrogations
  - AST: functions, locals, types, and relations between them
  - Build system: modules, libraries, executables, and linking information between them



#### Linux Kernel Graph Oracle<sup>®</sup> Linux Kernel 2.6

- Approximately 11.4 million LOC
  - Around 1.6 million lines compiled

| Node count | 508 032   |
|------------|-----------|
| Edge count | 3 991 063 |
| DB Size    | 787 MB    |



#### Experiences and Challenges Temporal

- Developers work on multiple versions of the code
  - Hours to weeks ago if working on a bug fix
  - Weeks to months ago if working on a new feature
  - Months to years ago if backporting a bug fix
- Need to be able to query any of these versions



#### Experiences and Challenges Temporal

- Could include temporal aspect in model — Complicates model and makes queries verbose
- Ideally the database layer would handle it
  - Efficient storage
  - Succinct cross-version queries
- Difficult, but has applications in many domains





#### Database Futures

- 1960s Hierarchical
- 1970s, 1980s, 1990s Relational
- 1990s Object, Object Relational
- 2000s NoSQL
  - Key-Value, Document, Distributed, Graph, ...



# Thank You!

David Meibusch Oracle Labs, Australia 340 Adelaide St, Brisbane



ORACLE®