Considerations for TAO

- Must handle large datasets.
- Average request in hours (ideally minutes).
- Scale over large number of distributed cores.
- Use an SQL capable DB.

How to choose a DBMS?

Data access patterns

Data access patterns

Millennium

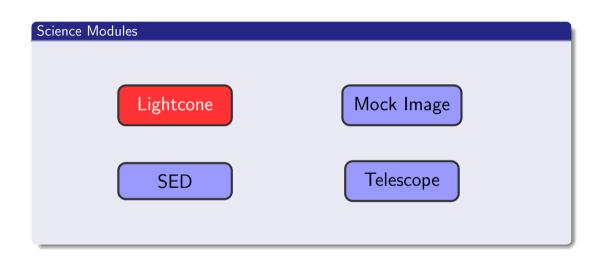
- $\bullet \approx 750,000,000$ galaxies
- ≈ 300GB
- http://www.mpa-garching.mpg.de/galform/virgo/millennium

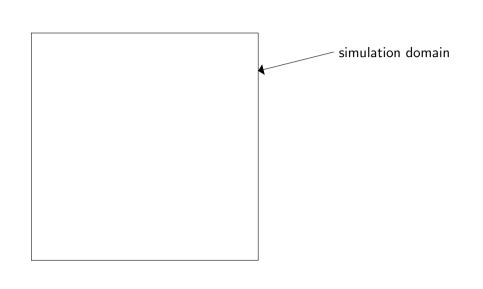
Bolshoi

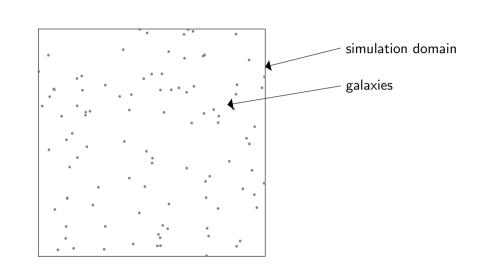
- ≈ 1TB
- http://hipacc.ucsc.edu/Bolshoi

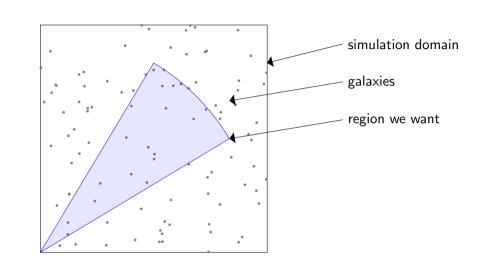
Data access patterns

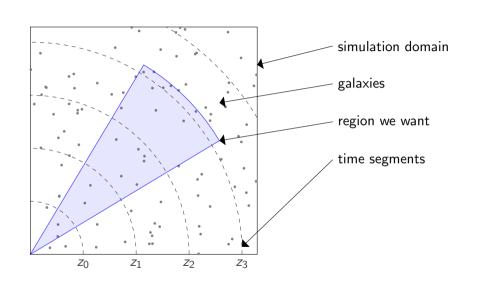
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```
SELECT * FROM snapshot_004 WHERE (9437.5 + IF(39.8397 + Pos1 \langle 62.5, 39.8397 + Pos1, Pos1 + 39.8397-62.5) - 0) \langle 9427.7048129608065 AND (9437.5 + IF(39.8397 + Pos1 \langle 62.5, 39.8397 + Pos1, Pos1 + 39.8397-62.5) - 0) \rangle 9408.2000081888491 AND (187.5 + IF(26.503 + Pos2 \langle 62.5, 26.503 + Pos2, Pos2 + 26.503-62.5) - 3.45846e-323) \langle 246.78854155076195 AND (187.5 + IF(26.503 + Pos2)
```

 \langle 62.5, 26.503 + Pos2, Pos2 + 26.503-62.5 \rangle - 3.45846e-323 \rangle \rangle 0 AND (187.5 + IF(55.9087 + Pos3 \langle 62.5, 55.9087 + Pos3, Pos3 + 55.9087-62.5 \rangle - 6.90856e-310 \rangle \langle 246.78854155076195 AND (187.5 + IF(55.9087 + Pos3 \langle 62.5, 55.9087 + Pos3, Pos3 + 55.9087-62.5 \rangle - 6.90856e-310 \rangle \rangle 0 AND SQRT(POW((9437.5 + IF(39.8397 + Pos1))

 $\langle 62.5, 39.8397 + Pos1, Pos1 + 39.8397-62.5 \rangle - 0, 2 \rangle$

```
+ POW((187.5 + IF(26.503 + Pos2 \langle 62.5, 26.503 + Pos2, Pos2 + 26.503-62.5) - 3.45846e-323), 2) + POW((187.5 + IF(55.9087 + Pos3 \langle 62.5, 55.9087 + Pos3, Pos3 + 55.9087-62.5) - 6.90856e-310), 2)) \langle 9427.7048129608065 AND SQRT(POW((9437.5 + IF(39.8397 + Pos1 \langle 62.5, 39.8397 + Pos1, Pos1 + 39.8397-62.5) - 0), 2) + POW((187.5 + IF(26.503 + Pos2 \langle 62.5, 26.503 + Pos2, Pos2 + 26.503-62.5) - 3.45846e-323), 2) + POW((187.5 + IF(55.9087 + Pos3 \langle 62.5, 55.9087 + Pos3, Pos3 + 55.9087-62.5) - 6.90856e-310), 2)) \rangle 9414.6512343460909 AND SQRT(POW((9437.5 + IF(39.8397 + Pos1 \langle 62.5, 39.8397 + Pos1, Pos1 +
```

39.8397-62.5) - 0), 2) + POW(($187.5 + IF(26.503 + Pos2 \land 62.5, 26.503 + Pos2, Pos2 + 26.503-62.5$) - 3.45846e-323), 2) + POW(($187.5 + IF(55.9087 + Pos3 \land 62.5, 55.9087 + Pos3, Pos3 + 55.9087-62.5$) - 6.90856e-310), 2)) \land 9427.7048129608065

AND

```
\begin{array}{l} (9437.5 + IF(39.8397 + Pos1 \ \langle \ 62.5, \ 39.8397 + Pos1, \ Pos1 + 39.8397 - 62.5) - \\ 0)/(SQRT(POW((9437.5 + IF(39.8397 + Pos1 \ \langle \ 62.5, \ 39.8397 + Pos1, \ Pos1 + \\ 39.8397 - 62.5) - 0), \ 2) + POW((187.5 + IF(26.503 + Pos2 \ \langle \ 62.5, \ 26.503 + Pos2, \ Pos2 + 26.503 - 62.5) - 3.45846e-323), \ 2))) \ \rangle \ 0.070737201667702906 \ AND \ (9437.5 + IF(39.8397 + Pos1 \ \langle \ 62.5, \ 39.8397 + Pos1, \ Pos1 + 39.8397 - 62.5) - \\ \end{array}
```

0)/(SQRT(POW((9437.5 + IF(39.8397 + Pos1 \langle 62.5, 39.8397 + Pos1, Pos1 + 39.8397 - 62.5) - 0), 2) + POW((187.5 + IF(26.503 + Pos2 \langle 62.5, 26.503 + Pos2,

Pos2 + 26.503-62.5) - 3.45846e-323), 2))) \langle 1 AND SQRT(POW((9437.5 + IF(39.8397 + Pos1 \langle 62.5, 39.8397 + Pos1, Pos1 + 39.8397-62.5) - 0), 2) + POW((187.5 + IF(26.503 + Pos2 \langle 62.5, 26.503 + Pos2, Pos2 + 26.503-62.5) -

```
3.45846e-323), 2))/(SQRT(POW((9437.5 + IF(39.8397 + Pos1 \langle 62.5, 39.8397 + Pos1, Pos1 + 39.8397-62.5) - 0), 2) + POW((187.5 + IF(26.503 + Pos2 \langle 62.5, 26.503 + Pos2, Pos2 + 26.503-62.5) - 3.45846e-323), 2) + POW((187.5 + IF(55.9087 + Pos3 \langle 62.5, 55.9087 + Pos3, Pos3 + 55.9087-62.5) - 6.90856e-310), 2))) \rangle 0.070737201667702906 AND SQRT(POW((9437.5 + IF(39.8397 + Pos1 \langle 62.5, 39.8397 + Pos1, Pos1 + 39.8397-62.5) - 0), 2) + POW((187.5 + IF(26.503 + Pos2 \langle 62.5, 26.503 + Pos2, Pos2 + 26.503-62.5) - 3.45846e-323), 2))/(SQRT(POW((9437.5 + IF(39.8397 + Pos1 \langle 62.5, 39.8397 + Pos1, Pos1 + 39.8397-62.5) - 0), 2) + POW((187.5 + IF(39.8397 + Pos1 \langle 62.5, 26.503 + Pos2, Pos2 + 26.503 + Pos2 \langle 62.5, 26.503 + Pos2, Pos2 + Pos1 \langle 62.5, 39.8397 + Pos1, Pos1 + 39.8397-62.5) - 0), 2) + POW((187.5 + IF(26.503 + Pos2))
```

Pos2 + 26.503-62.5) - 3.45846e-323), 2) + POW((187.5 + IF(55.9087 + Pos3 < 62.5))

55.9087 + Pos3, Pos3 + 55.9087-62.5) - 6.90856e-310, 2))) (1

Very large amount of data to search

- + Complicated SQL query+ Multiple users
- = Trouble

Solution

Distribute over multiple servers.

Distributed DBMS Systems

- MySQL Cluster
 - Difficult to manage.
- pgpool
- Bugs with some queries.
- PostgresXC
- Older PostgresQL.
 - Small development team.
- Custom (PostgresQL)
 - Reinventing the wheel?

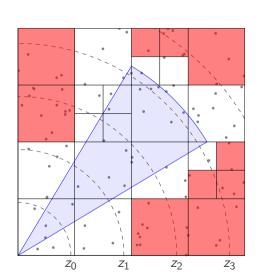
*Z*₀ z_1 *Z*₂ *Z*3

We can do better!

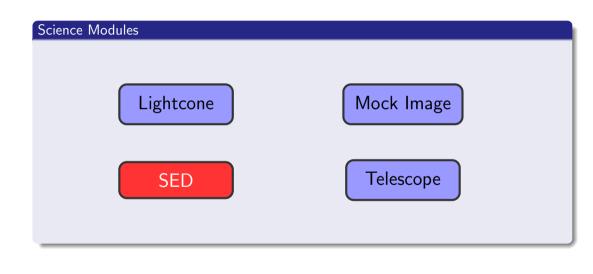
 z_0 z_1 z_2 *Z*3

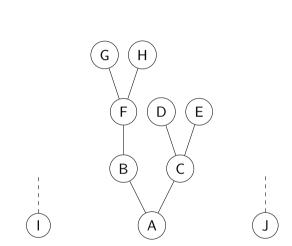
We can do better!

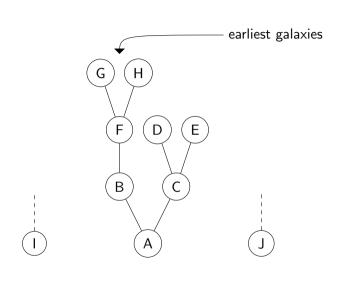
We can do better!

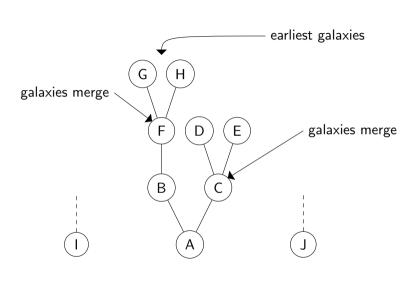


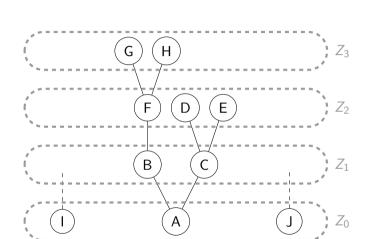
Data access patterns

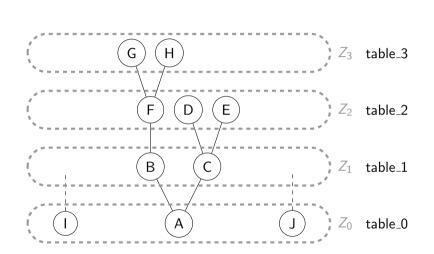


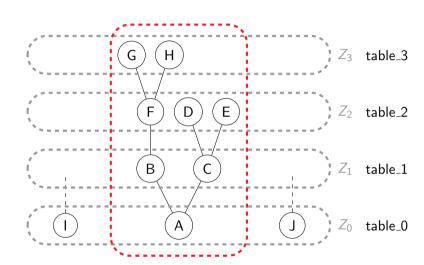


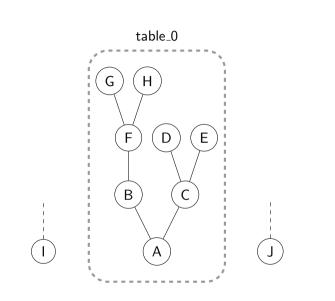












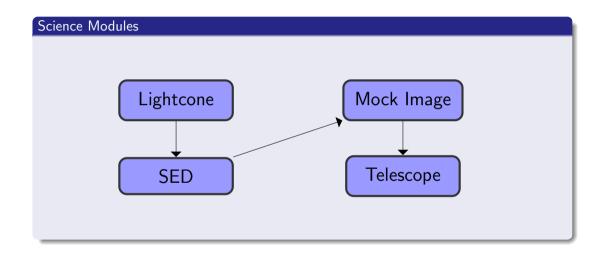
Database is looking good...

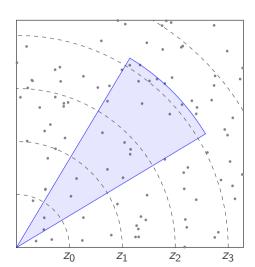
... what about large computation?

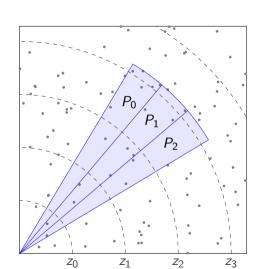
pprox 2.5 billion galaxies in Bolshoi dataset, how many to process, on average, per request?

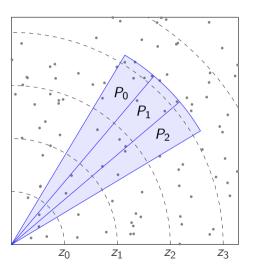
We will need to parallelise computation.

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Balanced? Probably, but need to investigate.

We will also utilise GPUs (eventually).

Algorithms

- Cubic spline interpolation.
- Fourth order Gaussian integration.
- Both easily accelerated by GPUs.