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Manage LiDAR

data with

PostgreSQL

www.2ndquadrant.com

is it possible?

2ndQuadrant Professional PostgresQL



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## Is the relational approach valid for LiDAR?

- The relational approach to the data:
  - data organized in *tuples*
  - tuples are part of tables
  - tables are related to each other through constraints (PK, FK, etc.)
- If the number of tuples grows:
  - indexes allow to reduce the complexity of a search to ~O(logN)...
  - ...but they must be contained in RAM!
  - OTHERWISE: the relational approach start to fail...





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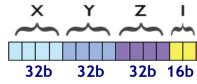


### PostgreSQL & LiDAR data

PostgreSQL is a relational DBMS with an extension for LiDAR data:
 pg pointcloud

https://github.com/pgpointcloud/pointcloud

- Part of the OpenGeo suite, completely compatible with PostGIS
  - two new datatype: pcpoint, pcpatch (compressed set of points)
    - N points (with all attributes from the survey)  $\rightarrow$  1 patch  $\rightarrow$  1 record



compatible with PDAL drivers to import data directly from .las





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## Relational approach to LiDAR data with PG

http://www.slideshare.net/GiuseppeBroccolo/gbroccolo-foss4-geugeodbindex

- GiST indexing in PostGIS
- GiST performances:
  - storage: 1TB RAID1, RAM 16GB, 8 CPU @3.3GHz, PostgreSQL9.3
  - index size ~O(table size)
  - Index was used:
    - up to ~300M points in bbox inclusion searches
    - up to ~10M points in kNN searches

LiDAR size:  $\sim O(10^9 \div 10^{11}) \rightarrow \text{few } \% \text{ can be properly indexed!}$ 



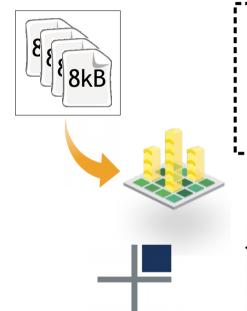




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# A new index in PG: Block Range INdexing



index node → row



index node → block



less specific than GiST!



**Really small!** 



(S. Riggs, A. Herrera)







data must be physically sorted on disk!



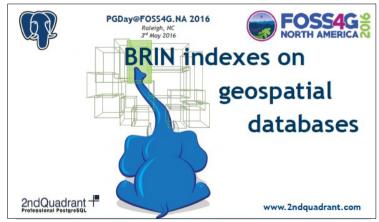
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### BRIN support for PostGIS datatypes

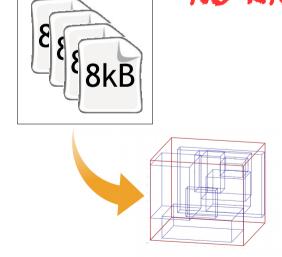


3rd May, PGDay @ FOSS4G.NA



G. Broccolo, J. Rouhaud, R. Dunklau



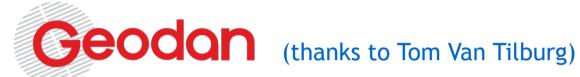




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### The LiDAR dataset: the ahn2 project



- 3D point cloud, coverage: almost the whole Netherlands
  - EPSG: 28992, ~8 points/m²
- 1.6TB, ~250G points in ~560M patches (compression: ~10x)
  - PDAL driver filter.chipper
- available RAM: 16GB
- the point structure:

| X   | Υ   | Z    | scan | LAS | time | RGB | chipper |
|-----|-----|------|------|-----|------|-----|---------|
| 32b | 32b | 32b_ | 40b  | 16b | 64b  | 48b | 32b     |

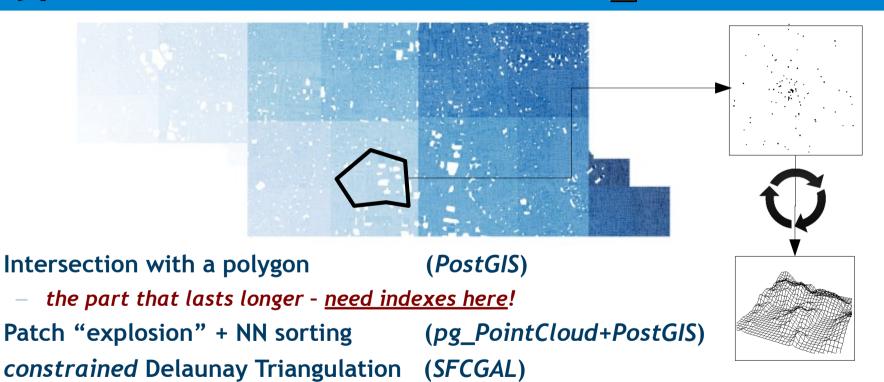
the "indexed" part (can be converted to PostGIS datatype)



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# Typical searches on ahn2 - x3d\_viewer





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## All just in the DB...



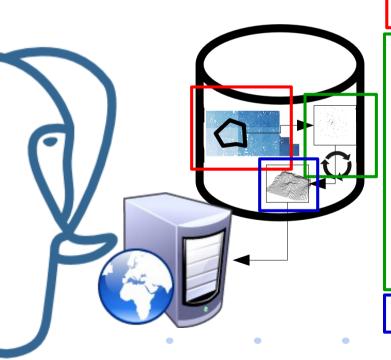
```
WITH patches AS (
SELECT patches FROM ahn2
WHERE patches && ST GeomFromText('POLYGON(...)')
), points AS (
SELECT ST Explode(patches) AS points
FROM patches
), sorted points AS (
SELECT points,
ST DumpPoints(ST GeomFromText('POLYGON(...)'))).geom AS poly pt
FROM points ORDER BY points <#> poly pt LIMIT 1;
), sel AS (
SELECT points FROM sorted points
WHERE points && ST GeomFromText('POLYGON(...)')
SELECT ST Dump(ST Triangulate2DZ(ST Collect(points))) FROM sel;
```



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# ...and with just one query!



```
WITH patches AS (
SELECT patches FROM ahn2
WHERE patches && ST_GeomFromText('POLYGON(...)')
```

```
), points AS (
   SELECT ST_Explode(patches) AS points
   FROM patches
), sorted_points AS (
   SELECT points,
   ST_DumpPoints(ST_GeomFromText('POLYGON(...)'))).geom AS poly_pt
   FROM points ORDER BY points <#> poly_pt LIMIT 1;
), sel AS (
   SELECT points FROM sorted_points
   WHERE points && ST_GeomFromText('POLYGON(...)')
)
```

SELECT ST\_Dump(ST\_Triangulate2DZ(ST\_Collect(points))) FROM sel;



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## patches && polygons - GiST performance

#### index building

GiST 2 d

#### index size

GiST 26GB

index not contained in RAM anymore

 $(\sim 5G \text{ points} \rightarrow \sim 3\%)$ 

#### searches based on GiST

| polygon<br>size | timing |  |
|-----------------|--------|--|
| ~O(m)           | ~40ms  |  |
| ~O(km)          | ~50s   |  |
| ~O(10km)        | hours  |  |



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# patches && polygons - BRIN performance

index building

index size

BRIN

4 h

**BRIN** 

15MB



#### searches based on BRIN



| polygon<br>size | timing |  |
|-----------------|--------|--|
| ~O(m)           | ~150s  |  |



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# patches && polygons - BRIN performance

#### index building

index size

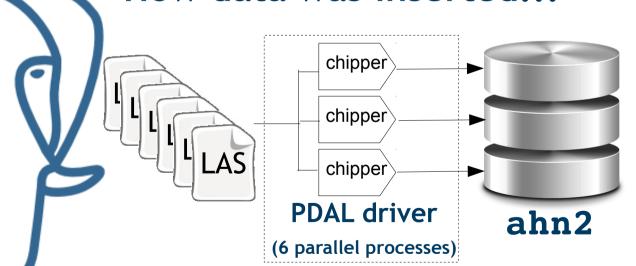
BRIN

4 h

**BRIN** 

15MB

### How data was inserted...



#### searches based on BRIN



| polygon<br>size | timing |  |
|-----------------|--------|--|
| ~O(m)           | ~150s  |  |



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# patches && polygons - BRIN performance

```
CREATE INDEX patch_geohash ON ahn2_subset
USING btree (ST_GeoHash(ST_Transform(Geometry(patch), 4326), 20));
CLUSTER ahn2 subset USING patch geohash;
```

(http://geohash.org/)

- ~150s  $\rightarrow$  ~800ms [radius ~O(m)]
  - x20 slower than GiST searches
  - x200 faster than Seq searches
    - (x1000 faster in ~0(100m) searches)

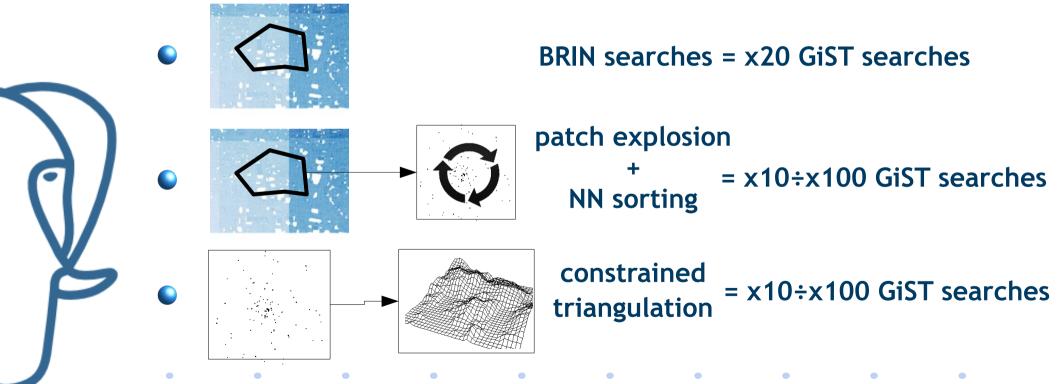




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# is the drop in performance acceptable?

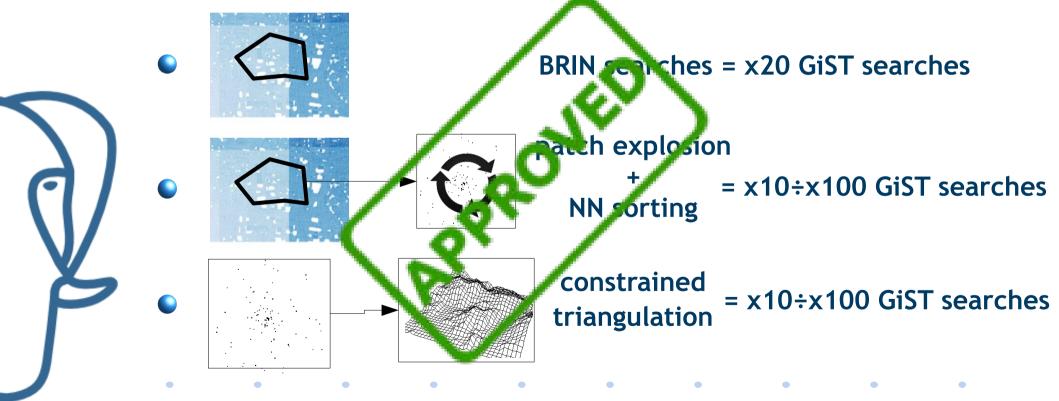




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# is the drop in performance acceptable?





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### Conclusions

Can be the relational approach to LiDAR data valid with PostgreSQL?



- GiST indexes are fast, but can manage just a real small portion of the dataset
- BRINs are quite slower, but generally do not represent a real bottleneck
  - Make sure that data has the same sequentiality of .las





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### ~\$ whoami



2ndQuadrant + Professional PostgreSQL

Giuseppe Broccolo, PhD

PostgreSQL & PostGIS consultant











giuseppe.broccolo@2ndquadrant.it



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