



# Do you need a Full-Text Search in PostgreSQL ?

Oleg Bartunov

Postgres Professional, Moscow University  
obartunov@postgrespro.ru

PGConf.eu, Oct 26, 2018, Lisbon



# Oleg Bartunov, major PostgreSQL contributor since Postgres95



# What is a Full Text Search ?

- Full text search
  - Find documents, which match a query
  - Sort them in some order (optionally)
- Typical Search
  - Find documents with **all words** from the query
  - Return them sorted by relevance

# What is a document ?

- Arbitrary text attribute
- Combination of text attributes from the same or different tables (result of join)

```
msg (id, lid, subject, body);  
lists (lid, list);
```

```
SELECT l.list || m.subject || m.body_plain as doc
```

Don't forget about COALESCE (text, '')

- ```
'postgresql "open source * database" -die +most'
```

# Why FTS in PostgreSQL ?

- Feed database content to external search engines
  - They are fast !

## **BUT**

- They can't index all documents - could be totally virtual
- They don't have access to attributes - no complex queries
- They have to be maintained — headache for DBA
- Sometimes they need to be certified
- They don't provide instant search (need time to download new data and reindex)
- They don't provide consistency — search results can be already deleted from database

# Your system may look like this



- **FTS requirements**
  - **Full integration with database engine**
    - Transactions
    - Concurrent access
    - Recovery
    - Online index
  - Configurability (parser, dictionary...)
  - Scalability



- Traditional text search operators  
( TEXT op TEXT, op - ~, ~\*, LIKE, ILIKE)

```
=# select title from apod where title ~* 'x-ray' limit 5;  
title
```

```
-----  
The X-Ray Moon  
Vela Supernova Remnant in X-ray  
Tycho's Supernova Remnant in X-ray  
ASCA X-Ray Observatory  
Unexpected X-rays from Comet Hyakutake  
(5 rows)
```

```
=# select title from apod where title ilike '%x-ray%' limit 5;  
title
```

```
-----  
The Crab Nebula in X-Rays  
X-Ray Jet From Centaurus A  
The X-Ray Moon  
Vela Supernova Remnant in X-ray  
Tycho's Supernova Remnant in X-ray  
(5 rows)
```

# Text Search Operators

- Traditional text search operators  
( TEXT op TEXT, op - ~, ~\*, LIKE, ILIKE)
- No linguistic support
  - What is a word ?
  - What to index ?
  - Word «normalization» ?
  - Stop-words (noise-words)
- No ranking - all documents are equally similar to query
- Slow, documents should be seq. scanned
- 9.3+ index support of ~\* (pg\_trgm)

```
select * from man_lines where man_line ~* '(?:  
(?:p(?:ostgres(?:ql)?|g?sql)|sql)) (?:((?:mak|us)e|do|is));
```

One of (postgresql,sql,postgres,pgsql,psql) space One of (do,is,use,make)

# FTS in PostgreSQL

- OpenFTS — 2000, Pg as a storage
- GiST index — 2000, thanks Rambler
- Tsearch — 2001, contrib:no ranking
- Tsearch2 — 2003, contrib:config
- GIN — 2006, thanks, JFG Networks
- FTS — 2006, in-core, thanks, EnterpriseDB
- RUM — 2016, extension, Postgres Pro

Team:

Teodor Sigaev, Oleg Bartunov, Alexander Korotkov, Arthur Zakirov

# FTS data types and operators

- **tsvector** – data type for document optimized for search
  - Sorted array of lexems
  - Positional information
  - Structural information (importance)
- **tsquery** – textual data type for query with boolean operators & | ! ()
- **Full text search operator:** tsvector @@ tsquery

```
=# SELECT 'a fat cat sat on a mat and ate a fat rat':tsvector  
        @  
        'cat & rat': tsquery;
```

# FTS configuration

- 1) Parser breaks text on to (token, type) pairs
  - 2) Tokens converted to the lexems using dictionaries specific for token type
- Extendability:
    - Pluggable parser and dictionaries
    - FTS configuration defines parser and dictionaries
    - FTS configurations used for document and query processing
  - `\dF{,p,d}[+] [pattern]` — psql FTS
  - SQL interface:

```
{CREATE | ALTER | DROP} TEXT SEARCH {CONFIGURATION | DICTIONARY | PARSER}
```



- Document to tsvector:
  - `to_tsvector([cfg], text|json|jsonb)`  
cfg — FTS configuration,  
GUC `default_text_search_config`

```
select to_tsvector('It is a very long story about true and false');
       to_tsvector
```

```
-----
'fals':10 'long':5 'stori':6 'true':8
(1 row)
```

```
select to_tsvector('simple', 'It is a very long story about true and false');
       to_tsvector
```

```
-----
'a':3 'about':7 'and':9 'false':10 'is':2 'it':1 'long':5 'story':6 'true':8 'very':4
(1 row)
```

- JSON[b] to tsvector:
  - Notice, results are different for json and jsonb !  
Jsonb: keys are sorted, Json: spaces are preserved
  - Phrases are preserved

```
select to_tsvector(jb) from (values ('
```

```
{  
  "abstract": "It is a very long story about true and false",  
  "title": "Peace and War",  
  "publisher": "Moscow International house"  
}
```

```
:::json[b])) foo(jb) as tsvector_json[b]  
                        tsvector_json
```

---

```
'fals':10 'hous':18 'intern':17 'long':5 'moscow':16 'peac':12 'stori':6 'true':8 'war':14  
(1 row)
```

```
                        tsvector_jsonb
```

---

```
'fals':14 'hous':18 'intern':17 'long':9 'moscow':16 'peac':1 'stori':10 'true':12 'war':3  
(1 row)
```

# Tsvector editing functions

- Different parts of document can be marked to use for ranking at search time.

`setweight(tsvector, «char», text[]` - add label to lexemes from `text[]`

```
select setweight( to_tsvector('english', '20-th anniversary of PostgreSQL'),
'A',    '{postgresql,20}');
           setweight
-----
'20':1A 'anniversari':3 'postgresql':5A 'th':2
(1 row)
```

- `ts_delete(tsvector, text[])` - delete lexemes from tsvector

```
select ts_delete( to_tsvector('english', '20-th anniversary of PostgreSQL'),
'{20,postgresql}'::text[]);
           ts_delete
-----
'anniversari':3 'th':2
(1 row)
```

# Tsvector editing functions

- `unnest(tsvector)`

```
select * from unnest( setweight( to_tsvector('english',
'20-th anniversary of PostgreSQL'), 'A',  '{postgresql,20}'));
lexeme      | positions | weights
-----+-----+-----
20           | {1}       | {A}
anniversari  | {3}       | {D}
postgresql   | {5}       | {A}
th           | {2}       | {D}
(4 rows)
```

- `tsvector_to_array(tsvector)` — tsvector to text[]  
`array_to_tsvector(text[])`

```
select tsvector_to_array( to_tsvector('english',
'20-th anniversary of PostgreSQL'));
tsvector_to_array
-----
{20,anniversari,postgresql,th}
(1 row)
```

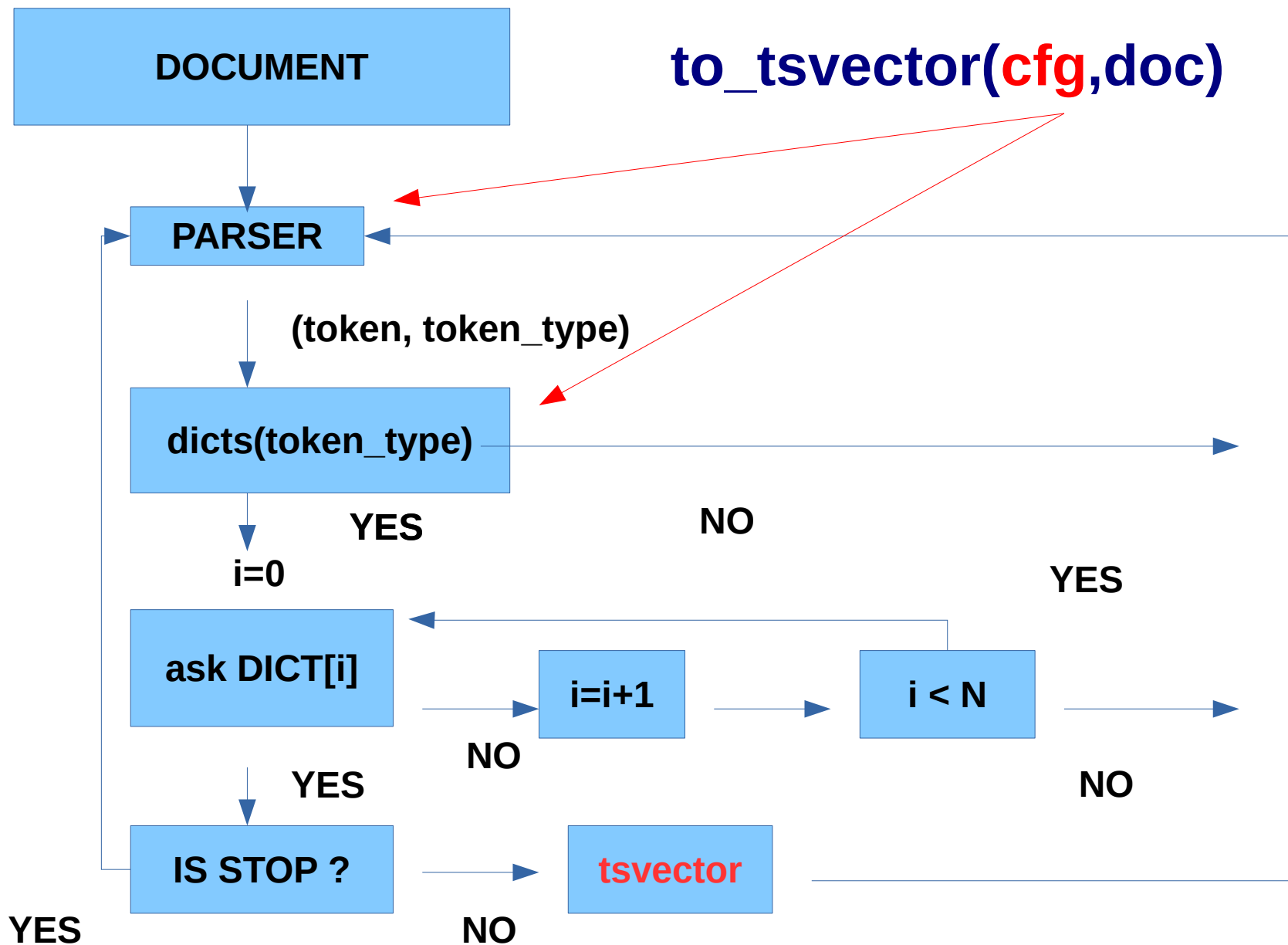
# Tsvector editing functions

- `ts_filter(tsvector, text[])` - fetch lexemes with specific label{s}

```
select ts_filter($$('20':2A 'anniversari':4C 'postgresql':1A,6A 'th':3$$)::tsvector,  
'{C}');  
          ts_filter  
-----  
 'anniversari':4C  
(1 row)  
  
select ts_filter($$('20':2A 'anniversari':4C 'postgresql':1A,6A 'th':3$$)::tsvector,  
'{C,A}');  
          ts_filter  
-----  
 '20':2A 'anniversari':4C 'postgresql':1A,6A  
(1 row)
```



# FTS PostgreSQL



- Parser breaks document into tokens

parser

```
=# select * from ts_token_type('default');
```

| tokid | alias           | description                              |
|-------|-----------------|------------------------------------------|
| 1     | asciiword       | Word, all ASCII                          |
| 2     | word            | Word, all letters                        |
| 3     | numword         | Word, letters and digits                 |
| 4     | email           | Email address                            |
| 5     | url             | URL                                      |
| 6     | host            | Host                                     |
| 7     | sfloat          | Scientific notation                      |
| 8     | version         | Version number                           |
| 9     | hword_numpart   | Hyphenated word part, letters and digits |
| 10    | hword_part      | Hyphenated word part, all letters        |
| 11    | hword_asciipart | Hyphenated word part, all ASCII          |
| 12    | blank           | Space symbols                            |
| 13    | tag             | XML tag                                  |
| 14    | protocol        | Protocol head                            |
| 15    | numhword        | Hyphenated word, letters and digits      |
| 16    | asciihword      | Hyphenated word, all ASCII               |
| 17    | hword           | Hyphenated word, all letters             |
| 18    | url_path        | URL path                                 |
| 19    | file            | File or path name                        |
| 20    | float           | Decimal notation                         |
| 21    | int             | Signed integer                           |
| 22    | uint            | Unsigned integer                         |
| 23    | entity          | XML entity                               |

(23 rows)

- **Dictionary** – is a **program**, which accepts token on input and returns an array of lexems, NULL if token doesn't recognized and empty array for stop-word.
- `ts_lexize(dictionary)`

```
SELECT ts_lexize('english_hunspell','a') as stop,
ts_lexize('english_hunspell','elephants') AS elephants,
ts_lexize('english_hunspell','elephantus') AS unknown;
  stop | elephants | unknown
-----+-----+-----
  {}   | {elephant} | (null)
(1 row)
```

- Dictionary API allows to develop any custom dictionaries
  - Truncate too long numbers
  - Convert colors
  - Convert URLs to canonical way

<http://a.in/a/./index.html> → <http://a.in/a/index.html>

- Dictionary — is a program !

```
=# select ts_lexize('intdict', 11234567890);  
ts_lexize
```

```
-----
```

```
{112345}
```

```
=# select ts_lexize('roman', 'XIX');  
ts_lexize
```

```
-----
```

```
{19}
```

```
=# select ts_lexize('colours', '#FFFFFF');  
ts_lexize
```

```
-----
```

```
{white}
```

## Dictionary with regexp support (pcre library)

```
# Messier objects
(M|Messier)(\s|-)?((\d){1,3}) M$3
# catalogs
(NGC|Abell|MKN|IC|H[DHR]|UGC|SAO|MWC)(\s|-)?((\d){1,6}[ABC]?) $1$3
(PSR|PKS)(\s|-)?([JB]?)(\d\d\d\d)\s?([+-]\d\d)\d? $1$4$5
# Surveys
OGLE(\s|-)?((l){1,3}) ogle
2MASS twomass
# Spectral lines
H(\s|-)?(alpha|beta|gamma) h$2
(Fe|Mg|Si|He|Ni)(\s|-)?((\d)|([IXV])+ ) $1$3
# GRBs
gamma\s?ray\s?burst(s?) GRB
GRB\s?(\d\d\d\d\d\d)([abcd]?) GRB$1$2
```

```
SELECT ts_lexize('regex', 'ngc 1234');
```

```
ts_lexize
```

```
-----
```

```
{ngc1234}
```

```
(1 row)
```



## Dictionary templates:

### 1. Simple

- convert the input token to lower case
- exclude stop words

### 2. Synonym (also, contrib/xsyn)

- replace word with a synonym

Example of .syn file:

```
postgres    pgsql
postgresql pgsql
postgre     pgsql
```

## 3. Thesaurus

- replace phrase by indexed phrase

Example of .ths file:

```
booking tickets : order invitation cards
```

```
booking ? tickets : order invitation Cards
```

## 4. Snowball stemmer

- reduce words by stemming algorithms
- recognizes everything
- exclude stop words

```
SELECT ts_lexize('portuguese_stem','responsáveis');
```

```
ts_lexize
```

```
-----
```

```
{respons}
```

```
(1 row)
```

- Portuguese snowball stemmer dictionary

```
viva  | vivo  | viver
-----+-----+-----
{viv} | {viv} | {viv}
```

```
select ts_lexize('portuguese_stem','responsáveis');
ts_lexize
-----
{respons}
(1 row)
```

- Available as a part of PostgreSQL core

## 5. Ispell

- normalize different linguistic forms of a word into the same lexeme. Try to reduce an input word to its infinitive form
- support dictionary file formats: Ispell, MySpell, Hunspell
- exclude stop words

|                   |  |              |  |         |
|-------------------|--|--------------|--|---------|
| viva              |  | vivo         |  | viver   |
| -----+-----+----- |  |              |  |         |
| {viva,vivo,viver} |  | {vivo,viver} |  | {viver} |

# Filter dictionary – unaccent

contrib/unaccent - unaccent text search dictionary  
and function to remove accents (suffix tree, ~ 25x  
faster *translate()* solution)

1. Unaccent dictionary does nothing and returns NULL.  
(lexeme 'Hotels' will be passed to the next dictionary if any)

```
=# select ts_lexize('unaccent','Hotels') is NULL;  
?column?  
-----  
t
```

2. Unaccent dictionary removes accent and returns 'Hotel'.  
(lexeme 'Hotel' will be passed to the next dictionary if any)

```
=# select ts_lexize('unaccent','Hôtel');  
ts_lexize  
-----  
{Hotel}
```



# Filter dictionary - unaccent

```
CREATE TEXT SEARCH CONFIGURATION fr ( COPY = french );  
ALTER TEXT SEARCH CONFIGURATION fr ALTER MAPPING FOR hword, hword_part, word  
    WITH unaccent, french_stem;
```

```
=# select to_tsvector('fr','Hôtel de la Mer') @@ to_tsquery('fr','Hotels');  
?column?  
-----  
t
```

```
=# select ts_headline('fr','Hôtel de la Mer',to_tsquery('fr','Hotels'));  
      ts_headline  
-----  
<b>Hôtel</b> de la Mer
```

# FTS in PostgreSQL

- Each token processed by a set of dictionaries

```
=# \dF+ russian
Text search configuration "pg_catalog.russian"
Parser: "pg_catalog.default"
```

| Token           | Dictionaries |
|-----------------|--------------|
| asciihword      | english_stem |
| asciword        | english_stem |
| email           | simple       |
| file            | simple       |
| float           | simple       |
| host            | simple       |
| hword           | russian_stem |
| hword_asciipart | english_stem |
| hword_numpart   | simple       |
| hword_part      | russian_stem |
| int             | simple       |
| numhword        | simple       |
| numword         | simple       |
| sfloat          | simple       |
| uint            | simple       |
| url             | simple       |
| url_path        | simple       |
| version         | simple       |
| word            | russian_stem |

ts\_lexize('english\_stem','stars')

---

star

# FTS in PostgreSQL

- Token processed by dictionaries until it recognized
- It is discarded, if it's not recognized

**Rule: from «specific» dictionary to a «common» dictionary**

=# \dF+ pg

Configuration "public.pg"

Parser name: "pg\_catalog.default"

Locale: 'ru\_RU.UTF-8' (default)

| Token        | Dictionaries                                                                |
|--------------|-----------------------------------------------------------------------------|
| file         | pg_catalog. <b>simple</b>                                                   |
| host         | pg_catalog.simple                                                           |
| hword        | pg_catalog.simple                                                           |
| int          | pg_catalog.simple                                                           |
| lhword       | public.pg_dict,public.en_ispell,pg_catalog.en_stem                          |
| lpart_hword  | public.pg_dict,public.en_ispell,pg_catalog.en_stem                          |
| Lword        | <b>public.pg_dict</b> , <b>public.en_ispell</b> , <b>pg_catalog.en_stem</b> |
| nlhword      | pg_catalog.simple                                                           |
| nlpart_hword | pg_catalog.simple                                                           |

**lowercase**

**Stemmer recognizes everything**

## What is the benefit ?

Document processed only once when inserting to table,  
no overhead in search

- Document parsed into tokens using pluggable parser
- Tokens converted to lexems using pluggable dictionaries
- Words positions and importance are stored and used for ranking
- Stop-words ignored

- Query to tsquery:
  - `to_tsquery([cfg], text)`

• Better, always specify *cfg* (immutable vs stable) !

```
select to_tsquery('supernovae & stars');
       to_tsquery
-----
'supernova' & 'star'
(1 row)
```

- `plainto_tsquery([cfg],text)` – words are AND-ed

```
select plainto_tsquery('supernovae stars');
       plainto_tsquery
-----
'supernova' & 'star'
(1 row)
```

# Query processing

- Queries 'A & B'::tsquery and 'B & A'::tsquery are equivalent

```
select 'a:1 b:2'::tsvector @@ 'a & b'::tsquery,
       'a:1 b:2'::tsvector @@ 'b & a'::tsquery;
?column? | ?column?
-----+-----
t         | t
```

- Phrase query: FOLLOWED BY operators <n>,<->
- Guarantee an order (and distance) of operands
- Precedence of tsquery operators - '!' <-> & |'

```
select 'a:1 b:2'::tsvector @@ 'a <-> b'::tsquery,
       'a:1 b:2'::tsvector @@ 'b <-> a'::tsquery;
?column? | ?column?
-----+-----
t         | f
```

- Precedence of tsquery operators - '!' <-> & |'

Use parenthesis to control nesting in tsquery

```
select 'a & b <-> c'::tsquery;  
      tsquery
```

```
-----  
'a' & 'b' <-> 'c'
```

```
select 'b <-> c & a'::tsquery;  
      tsquery
```

```
-----  
'b' <-> 'c' & 'a'
```

```
select 'b <-> (c & a)'::tsquery;  
      tsquery
```

```
-----  
'b' <-> 'c' & 'b' <-> 'a'
```

# Phrase search - example

- `phraseto_tsquery([CFG,] TEXT)`

```
select phraseto_tsquery('english','PostgreSQL can be extended  
by the user in many ways');
```

```
          phraseto_tsquery
```

```
-----  
'postgresql' <3> 'extend' <3> 'user' <2> 'mani' <-> 'way'  
(1 row)
```

Stop words are taken into account !

- It's possible to combine tsquery's

```
select phraseto_tsquery('PostgreSQL can be extended by the user in many ways') ||  
       to_tsquery('oho<->ho & ik');  
          ?column?
```

```
-----  
'postgresql' <3> 'extend' <3> 'user' <2> 'mani' <-> 'way' | 'oho' <-> 'ho' & 'ik'  
(1 row)
```



# Query processing

- `websearch_to_tsquery([cfg], text)`
  - Recognizes “phrases”, AND, OR, \*, +word, -word

```
select websearch_to_tsquery('english','postgresql "open source *  
database" -die +most');
```

```
websearch_to_tsquery
```

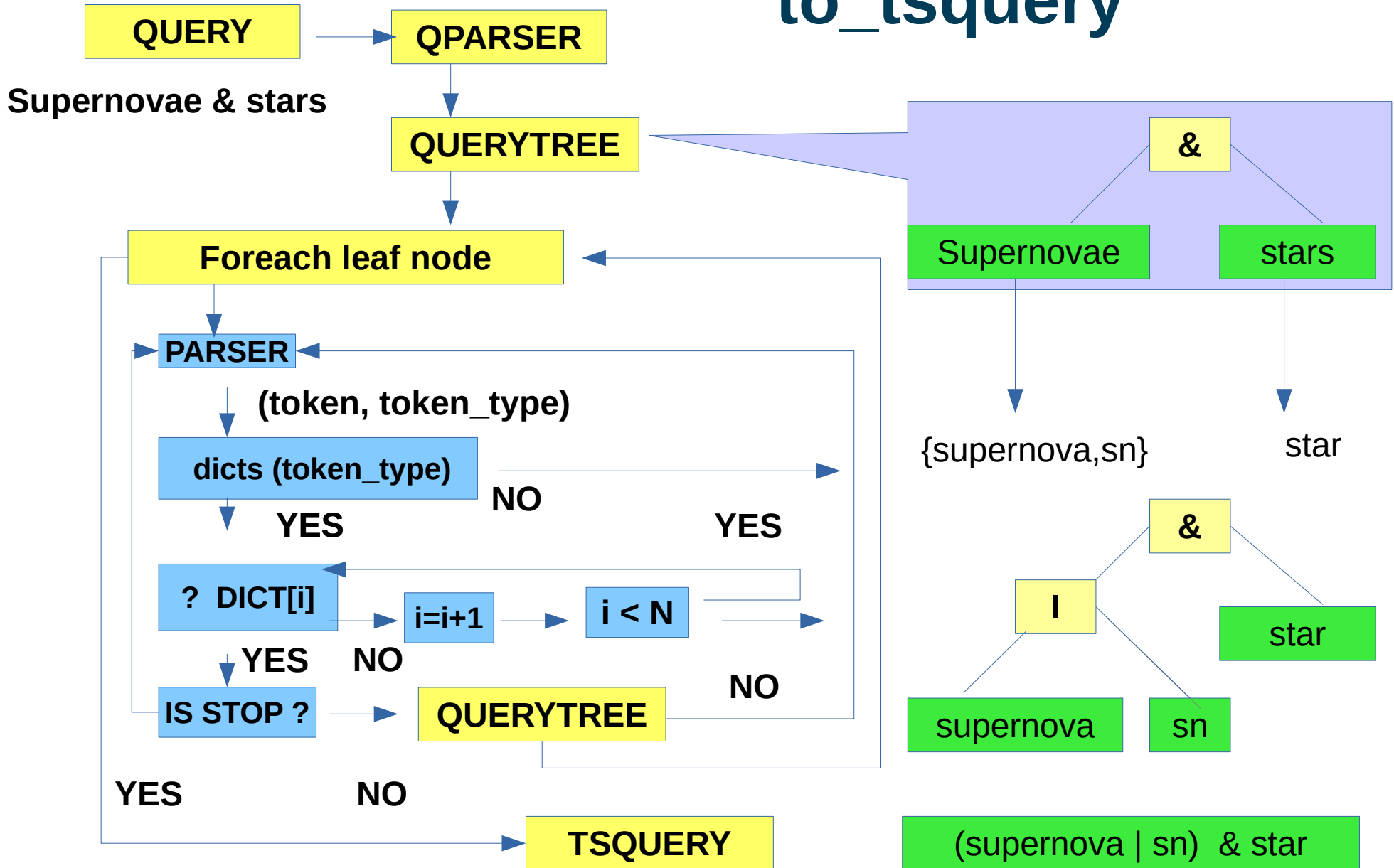
```
-----  
'postgresql' & 'open' <-> 'sourc' <2> 'databas' & !'die'  
(1 row)
```

```
select to_tsvector('english', 'PostgreSQL: The Worlds Most Advanced  
Open Source Relational Database') @@  
websearch_to_tsquery('english','postgresql "open source * database" -  
die +most');
```

```
?column?
```

```
-----  
t  
(1 row)
```

# FTS PostgreSQL to\_tsquery



## FTS: additional functions

- `ts_debug(cfg, text)` – good for debugging FTS configuration
- `ts_stat` – word frequencies
- `ts_parse(parser, text)` – produces (token\_type, token) from a text
- `ts_rewrite` – rewrite query online, no reindexing needed
- `ts_headline` – pieces of documents with words from query
- Ordering result of FTS:
  - `ts_rank` – the more occurrences of words, the bigger rank  
good for OR queries, no query language
  - `ts_rank_cd` – the closer words, the bigger rank  
good for AND queries, supports query language
  - `rum_ts_score` (requires RUM extension) – combination of the above, the best (NIST TREC, AD-HOC coll.)

## FTS summary

- FTS in PostgreSQL is a flexible search engine,
- It is a «collection of bricks» you can build your search engine using
  - Custom parser
  - Custom dictionaries
  - + All power of SQL (FTS+Spatial+Temporal)

## Index — silver bullet !

the only weapon that is effective against a werewolf, witch, or other monsters.



# Indexes !

- Index is a search tree with tuple pointers in the leaves
- Index has no visibility information (MVCC !)
- Indexes used only for accelerations:  
Index scan should produce the same results as sequence scan with filtering
- Indexes can be: **partial** (where price > 0.0), **functional** (to\_tsvector(text)), **multicolumn** (timestamp, tsvector)
- Indexes not always useful !
  - Low selectivity
  - Maintenance overhead

- CREATE INDEX ... USING GIST/GIN/RUM (tsvector)
- GiST — Generalized Search Tree
  - document, query as a signature, documents → signature tree, Bloom filter used for search
- GIN — inverted tree, basically it's a B-tree
  - Optimized for storing a lot of duplicate keys
  - Duplicates are ordered by heap TID
- RUM (extension)
  - GIN with additional information (words positions, timestamp, ...)

# Understanding GiST (array example)

- Intarray -Access Method for array of integers
  - Operators overlap, contains

$S1 = \{1, \mathbf{2}, 3, 5, 6, \mathbf{9}\}$

$S2 = \{1, \mathbf{2}, 5\}$

$S3 = \{0, 5, 6, \mathbf{9}\}$

$S4 = \{1, 4, 5, 8\}$

$S5 = \{0, 9\}$

$S6 = \{3, 5, 6, 7, 8\}$

$S7 = \{4, 7, \mathbf{9}\}$

$Q = \{\mathbf{2}, \mathbf{9}\}$

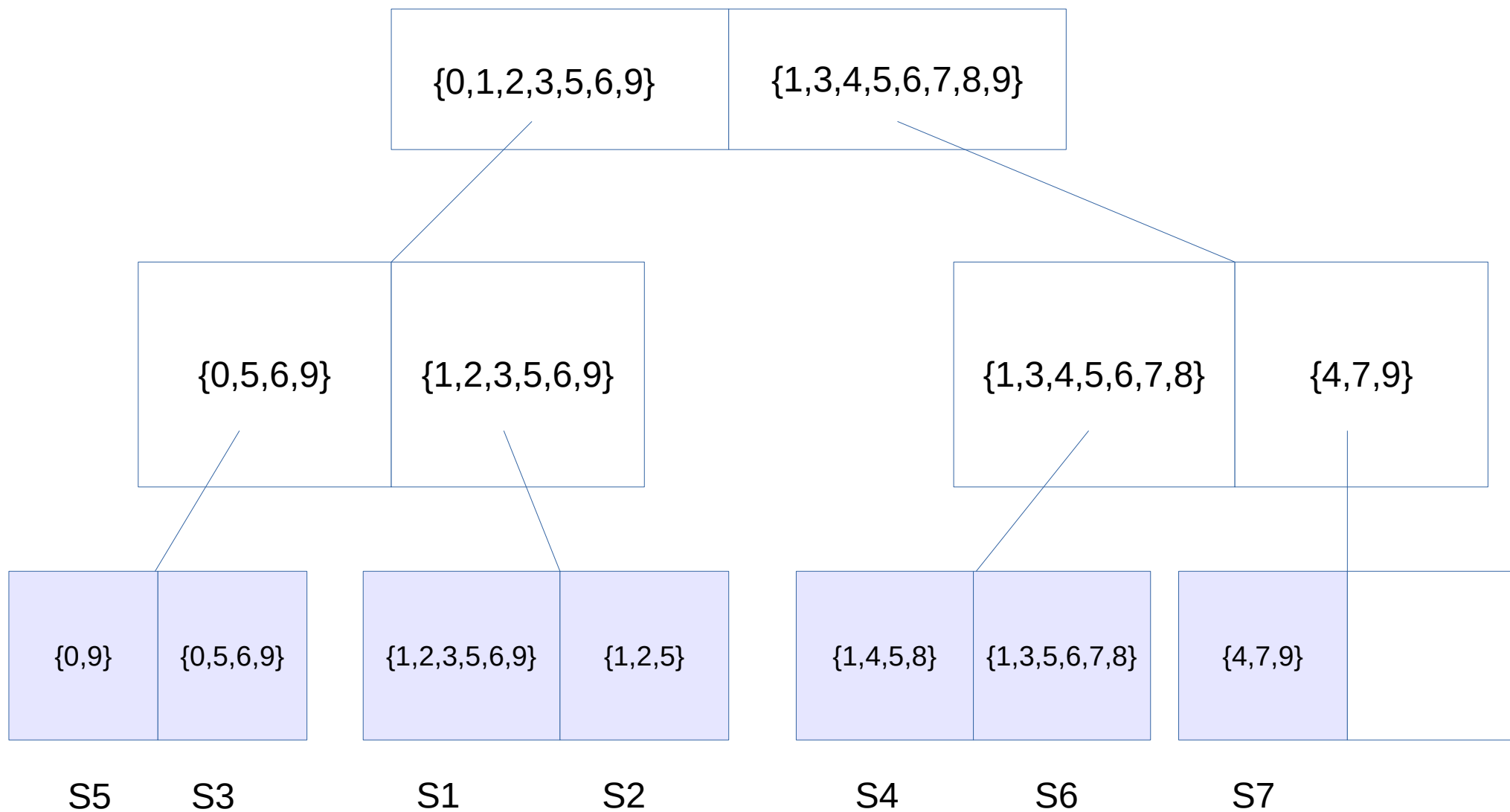


# Russian Doll Tree

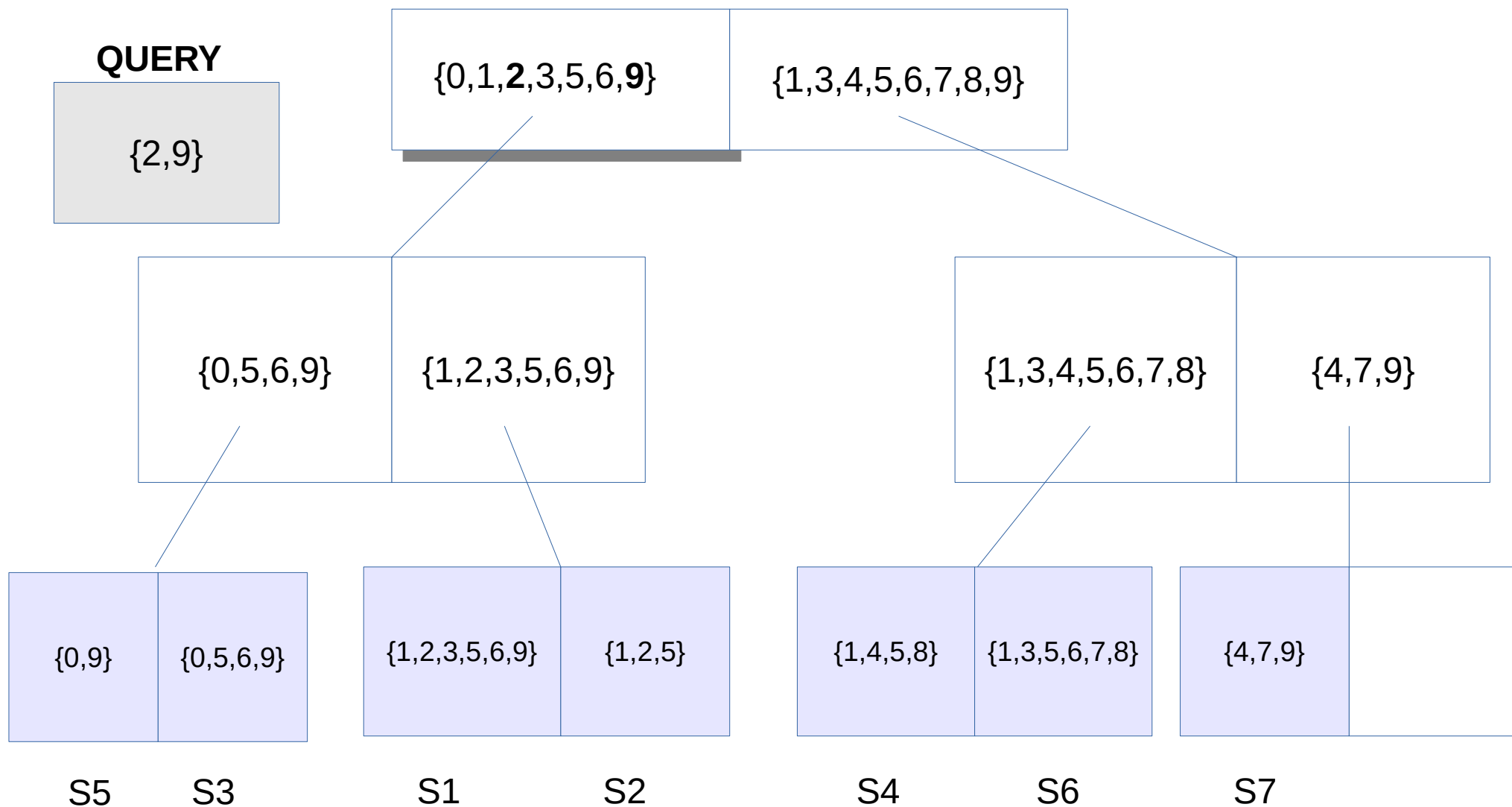


"THE RD-TREE: AN INDEX STRUCTURE FOR SETS", Joseph M. Hellerstein

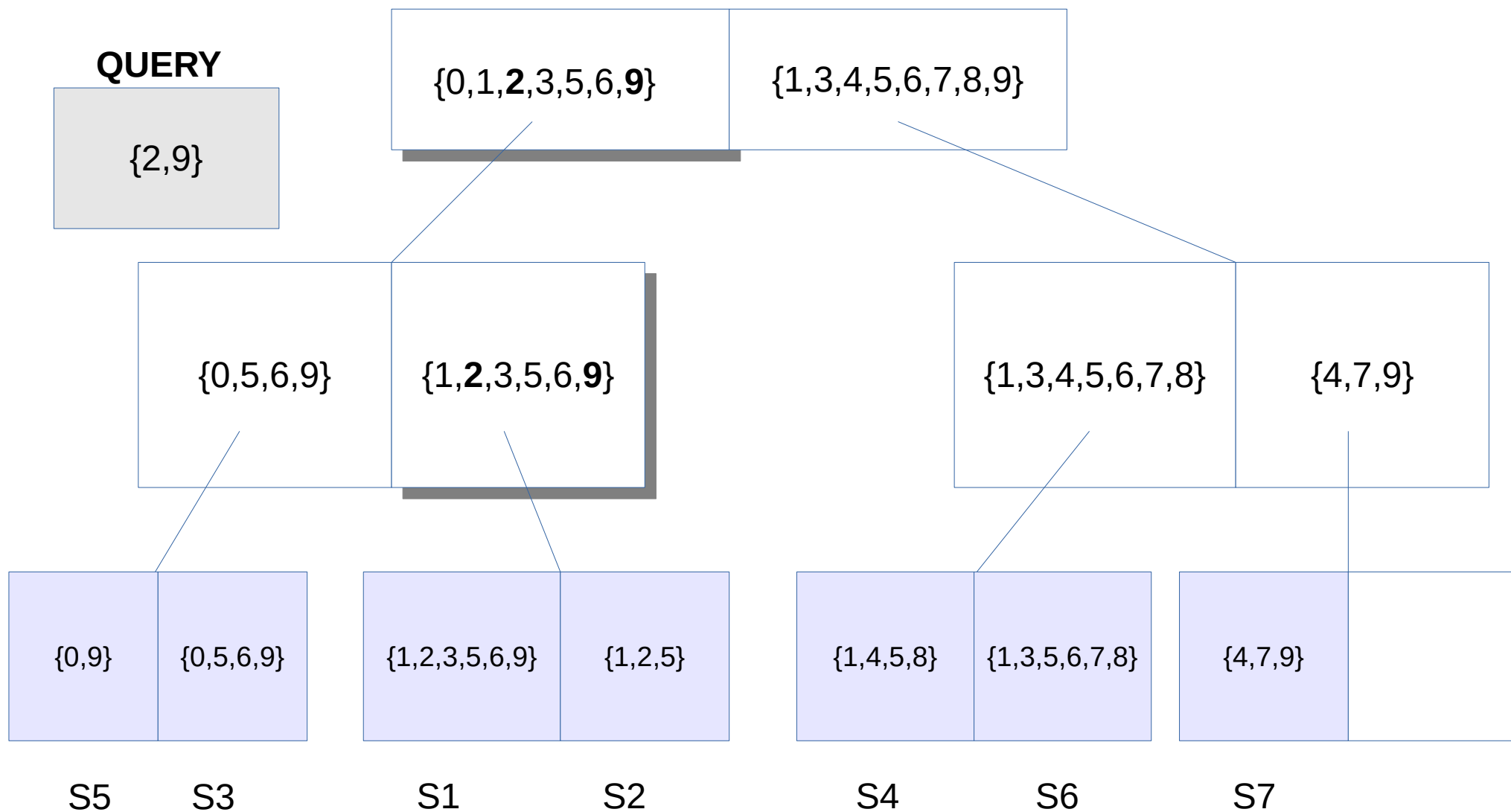
## Containment Hierarchy



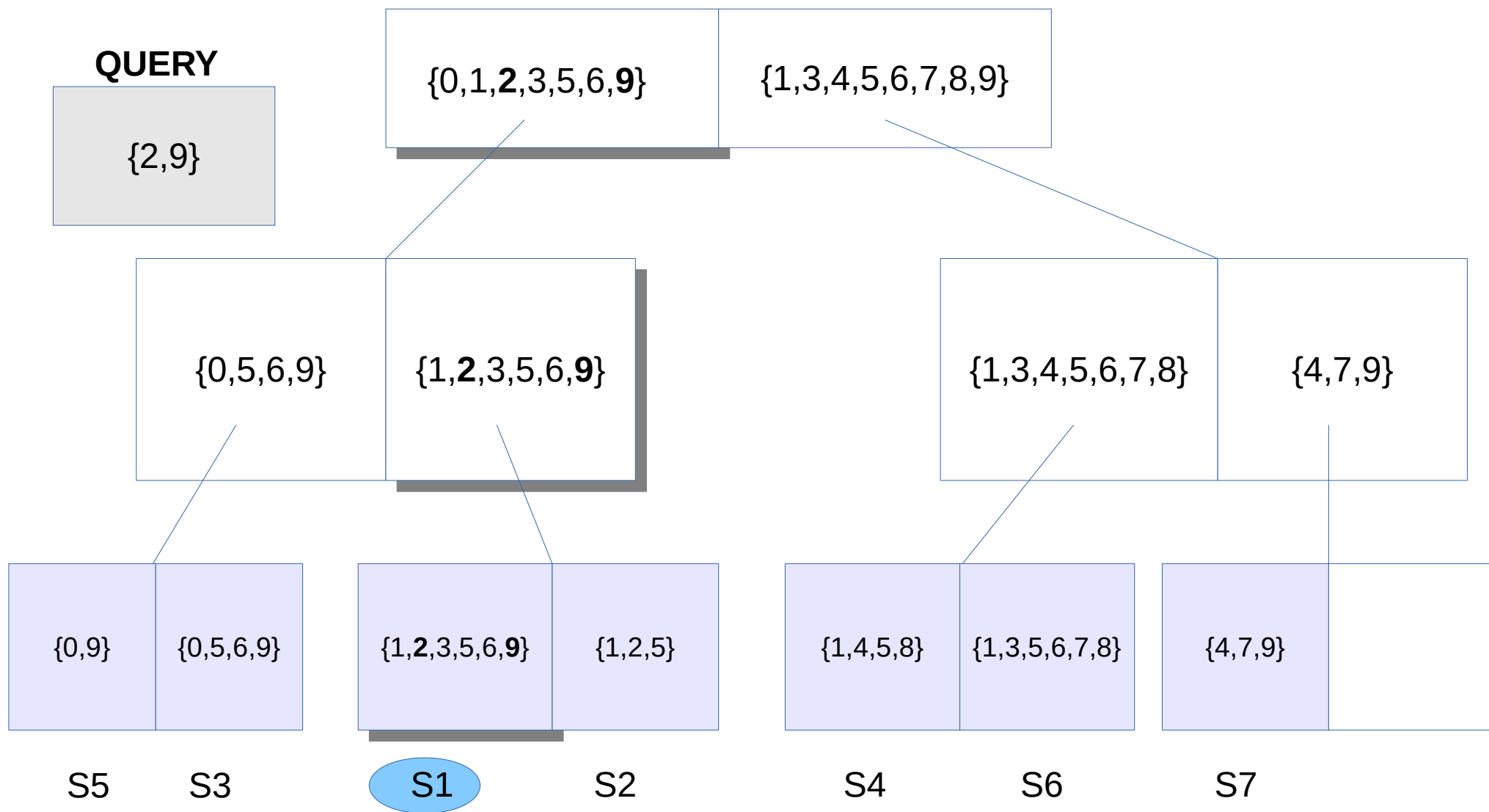
# RD-Tree



# RD-Tree



# RD-Tree



# FTS Index (GiST): RD-Tree

- Word signature — words hashed to the specific position of '1'

w1 -> S1: 01000000      Document: w1 w2 w3

w2 -> S2: 00010000

w3 -> S3: 10000000

- Document (query) signature — superposition (bit-wise OR) of signatures

S: 11010000

- Bloom filter

Q1: 00000001 — exact not

Q2: 01010000 - may be contained in the document, **false drop**

- Signature is a lossy representation of document
  - + fixed length, compact, + fast bit operations
  - - lossy (false drops), - saturation with #words grows

# FTS Index (GiST): RD-Tree

- Latin proverbs

| id | verb                   |
|----|------------------------|
| 1  | Ars longa, vita brevis |
| 2  | Ars vitae              |
| 3  | Jus vitae ac necis     |
| 4  | Jus generis humani     |
| 5  | Vita nostra brevis     |

# FTS Index (GiST): RD-Tree

| word       | signature       |
|------------|-----------------|
| ac         | 00000011        |
| <b>ars</b> | <b>11000000</b> |
| brevis     | 00001010        |
| generis    | 01000100        |
| humani     | 00110000        |
| jus        | 00010001        |
| longa      | 00100100        |
| necis      | 01001000        |
| nostra     | 10000001        |
| vita       | 01000001        |
| vitae      | 00011000        |

QUERY

Root

11011011

11011001

10010011

Internal nodes

1101000

11010001

11011000

10010010

10010001

Leaf nodes



# RD-Tree (GiST)

| id | proverb                | signature |
|----|------------------------|-----------|
| 1  | Ars longa, vita brevis | 11101111  |
| 2  | Ars vitae              | 11011000  |
| 3  | Jus vitae ac necis     | 01011011  |
| 4  | Jus generis humani     | 01110101  |
| 5  | Vita nostra brevis     | 11001011  |

False drop

# RD-Tree (GiST)

- Problems
  - Not good scalability with increasing of cardinality of words and records.
  - Index is lossy, need check for false drops  
(Recheck B EXPLAIN ANALYZE)

---

## Report Index

### A

abrasives, 27  
acceleration measurement, 58  
accelerometers, 5, 10, 25, 28, 30, 36, 58, 59, 61, 73, 74  
actuators, 4, 37, 46, 49  
adaptive Kalman filters, 60, 61  
adhesion, 63, 64  
adhesive bonding, 15  
adsorption, 44  
aerodynamics, 29  
aerospace instrumentation, 61  
aerospace propulsion, 52  
aerospace robotics, 68  
aluminium, 17  
amorphous state, 67  
angular velocity measurement, 58  
antenna phased arrays, 41, 46, 66  
argon, 21  
assembling, 22  
atomic force microscopy, 13, 27, 35  
atomic layer deposition, 15  
attitude control, 60, 61  
attitude measurement, 59, 61  
automatic test equipment, 71  
automatic testing, 24

### B

backward wave oscillators, 45

compensation, 30, 68  
compressive strength, 54  
compressors, 29  
computational fluid dynamics, 23, 29  
computer games, 56  
concurrent engineering, 14  
contact resistance, 47, 66  
convertors, 22  
coplanar waveguide components, 40  
Couette flow, 21  
creep, 17  
crystallisation, 64  
current density, 13, 16

### D

design for manufacture, 25  
design for testability, 25  
diamond, 3, 27, 43, 54, 67  
dielectric losses, 31, 42  
dielectric polarisation, 31  
dielectric relaxation, 64  
dielectric thin films, 16  
differential amplifiers, 28  
diffraction gratings, 68  
discrete wavelet transforms, 72  
displacement measurement, 11  
display devices, 56  
distributed feedback lasers, 38

### E

## Report Index

### A

abrasives, 27  
 acceleration measurement, 58  
 accelerometers, 5, 10, 25, 28, 30, 36, 58, 59, 61, 73, 74  
 actuators, 4, 37, 46, 49  
 adaptive Kalman filters, 60, 61  
 adhesion, 63, 64  
 adhesive bonding, 15  
 adsorption, 44  
 aerodynamics, 29

compensation, 30, 68  
 compressive strength, 54  
 compressors, 29  
 computational fluid dynamics, 23, 29  
 computer games, 56  
 concurrent engineering, 14  
 contact resistance, 47, 66  
 convertors, 22  
 coplanar waveguide components, 40  
 Couette flow, 21  
 creep, 17  
 crystallisation, 64  
 current density, 13, 16

QUERY: compensation accelerometers

INDEX: accelerometers                      compensation  
           5,10,25,28,**30**,36,58,59,61,73,74    **30**,68

RESULT: **30**

attitude measurement, 59, 61  
 automatic test equipment, 71  
 automatic testing, 24

### B

backward wave oscillators, 45

discrete wavelet transforms, 72  
 displacement measurement, 11  
 display devices, 56  
 distributed feedback lasers, 38

### E

# Inverted Index in PostgreSQL

## Report Index

ENTRY  
TREE

**A**

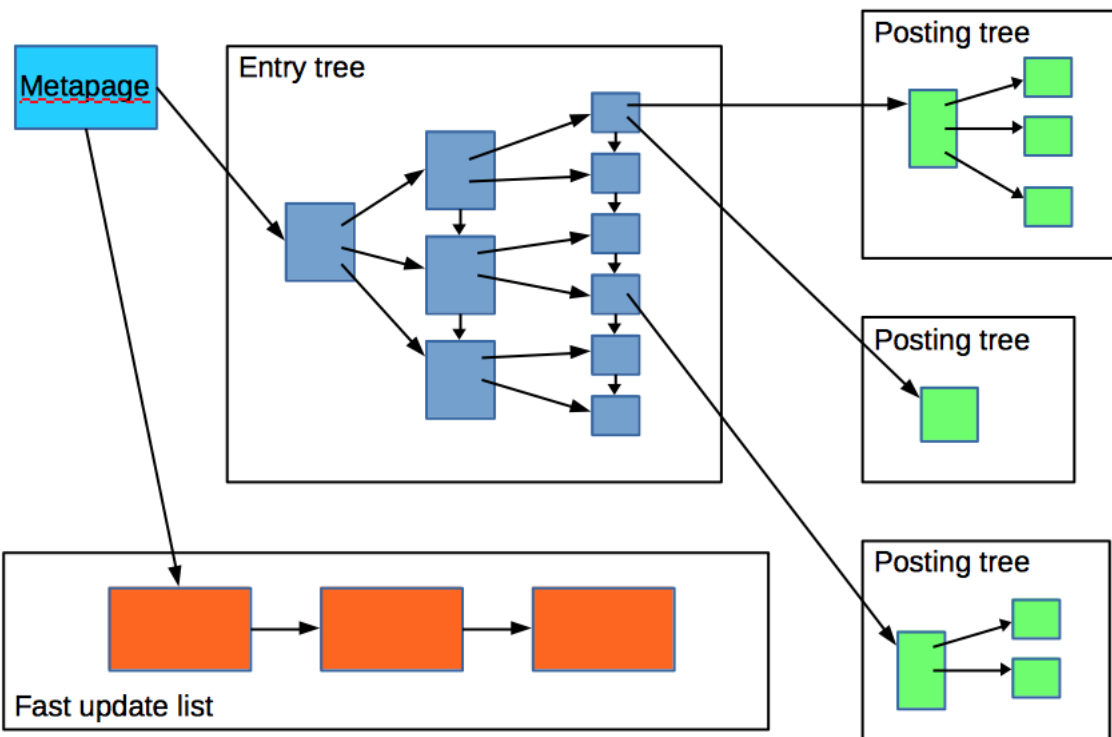
abrasives, 27  
 acceleration measurement, 58  
 accelerometers, 5, 10, 25, 28, 30, 36, 58, 59, 61, 73, 74  
 actuators, 4, 37, 46, 49  
 adaptive Kalman filters, 60, 61  
 adhesion, 63, 64  
 adhesive bonding, 15  
 adsorption, 44  
 aerodynamics, 29  
 aerospace instrumentation, 61  
 aerospace propulsion, 52  
 aerospace robotics, 68  
 aluminium, 17  
 amorphous state, 67  
 angular velocity measurement, 58  
 antenna phased arrays, 41, 46, 66  
 argon, 21  
 assembling, 22  
 atomic force microscopy, 13, 27, 35  
 atomic layer deposition, 15  
 attitude control, 60, 61  
 attitude measurement, 59, 61  
 automatic test equipment, 71  
 automatic testing, 24

Posting list  
Posting tree

compensation, 30, 68  
 compressive strength, 54  
 compressors, 29  
 computational fluid dynamics, 23, 29  
 computer games, 56  
 concurrent engineering, 14  
 contact resistance, 47, 66  
 convertors, 22  
 coplanar waveguide components, 40  
 Couette flow, 21  
 creep, 17  
 crystallisation, 64

**B**

backward wave oscillators, 45



- Internal structure is basically just a B-tree
  - Optimized for storing a lot of duplicate keys
  - Duplicates are ordered by heap TID
- Interface supports indexing more than one key per indexed value
  - Full text search: “foo bar” → “foo”, “bar”
- Bitmap scans only

## Demo collections – latin proverbs

| id | proverb                |
|----|------------------------|
| 1  | Ars longa, vita brevis |
| 2  | Ars vitae              |
| 3  | Jus vitae ac necis     |
| 4  | Jus generis humani     |
| 5  | Vita nostra brevis     |

## Inverted Index

Entry tree

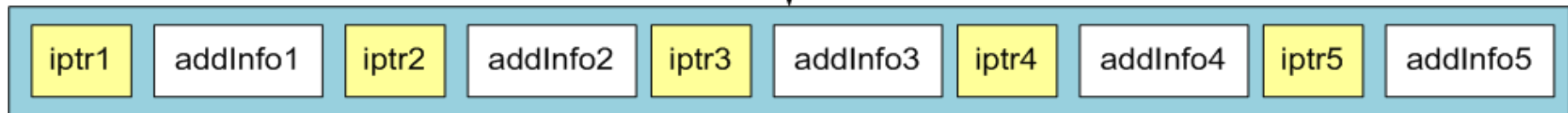
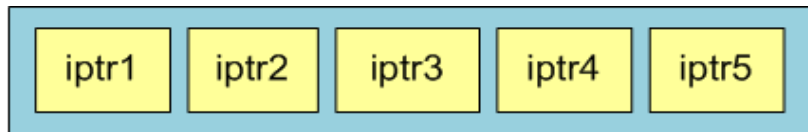
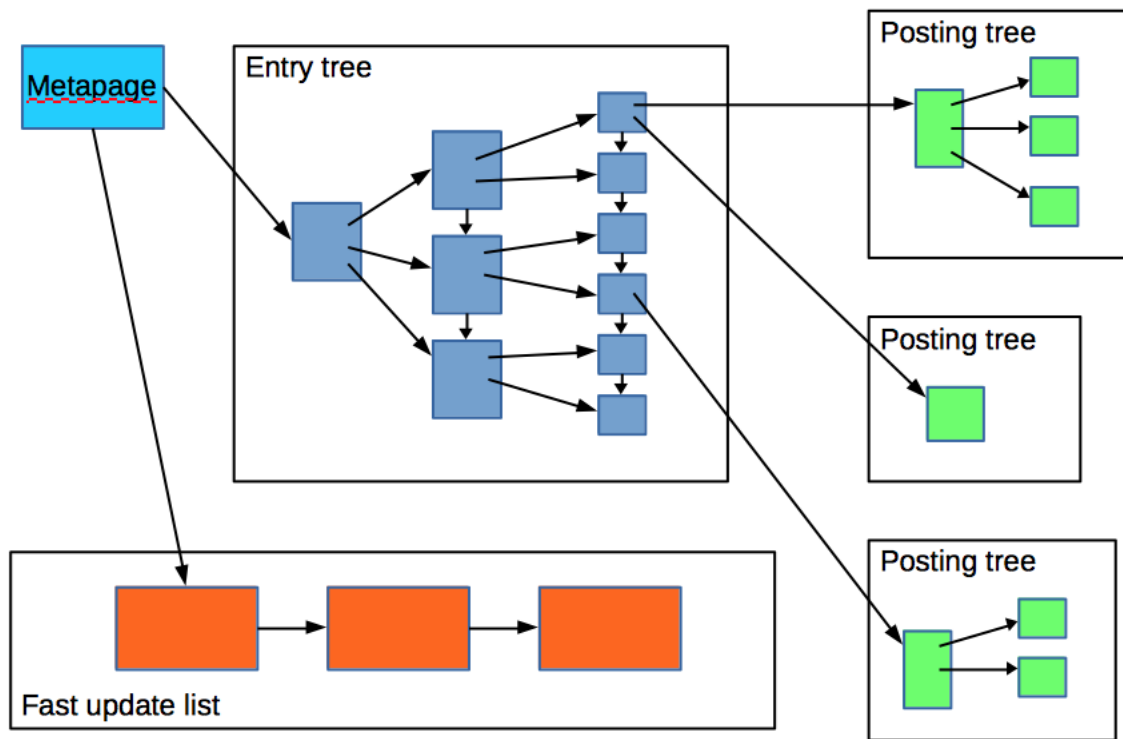
| word    | posting |
|---------|---------|
| ac      | {3}     |
| ars     | {1, 2}  |
| breviſ  | {1, 5}  |
| generiſ | {4}     |
| humani  | {4}     |
| jus     | {3, 4}  |
| longa   | {1}     |
| neciſ   | {3}     |
| noſtra  | {5}     |
| vita    | {1, 5}  |
| vitae   | {2, 3}  |

Posting tree

- Fast ſearch
- Slow update



# RUM index (GIN ++)



- Solve problem of slow ranking

```
postgres=# explain analyze
SELECT docid, ts_rank(text_vector, to_tsquery('english', 'title')) AS rank
FROM ti2
WHERE text_vector @@ to_tsquery('english', 'title')
ORDER BY rank DESC
LIMIT 3;
```

**HEAP IS SLOW  
400 ms !**

```
Limit  (cost=8087.40..8087.41 rows=3 width=282)  (actual time=433.752 rows=3 loops=1)
  -> Sort  (cost=8087.40..8206.63 rows=47692 width=282)
    (actual time=433.749..433.749 rows=3 loops=1)
      Sort Key: (ts_rank(text_vector, ''titl''::tsquery))
      Sort Method: top-N heapsort  Memory: 25kB
      -> Bitmap Heap Scan on ti2  (cost=529.61..7470.99 rows=47692 width=282)
        (actual time=15.094..423.452 rows=47855 loops=1)
          Recheck Cond: (text_vector @@ ''titl''::tsquery)
          -> Bitmap Index Scan on ti2_index  (cost=0.00..517.69 rows=47692 width=0)
            (actual time=13.736..13.736 rows=47855 loops=1)
              Index Cond: (text_vector @@ ''titl''::tsquery)
Total runtime: 433.787 ms
```

# Improve ranking performance

- Store positions in RUM to calculate rank and order results
- Introduce distance operator `tsvector <-> tsquery`

```
CREATE INDEX ti2_rum_fts_idx ON ti2 USING rum(text_vector rum_tsvector_ops);
```

```
SELECT docid, ts_rank(text_vector, to_tsquery('english', 'title')) AS rank  
FROM ti2
```

```
WHERE text_vector @@ to_tsquery('english', 'title')
```

```
ORDER BY
```

```
text_vector <-> plainto_tsquery('english','title') LIMIT 3;
```

```
QUERY PLAN
```

```
-----  
Limit (actual time=13.843..13.884 rows=3 loops=1)
```

```
  -> Index Scan using ti2_rum_fts_idx on ti2 (actual time=13.841..13.881 rows=3 loops=1)
```

```
    Index Cond: (text_vector @@ '''titl'''::tsquery)
```

```
    Order By: (text_vector <-> '''titl'''::tsquery)
```

```
Planning time: 0.134 ms
```

```
Execution time: 14.030 ms vs 433 ms !
```

```
(6 rows)
```

## Search for «fresh» documents

```
select date, subject from msg
where tsvector @@ to_tsquery('server & crashed')
order by date <=| '2000-01-01'::timestamp limit 5;

Limit (actual time=12.089..12.091 rows=5 loops=1)
  -> Sort (actual time=12.088..12.089 rows=5 loops=1)
        Sort Key: ((date < '2000-01-01 00:00:00'::timestamp without time zone))
        Sort Method: top-N heapsort  Memory: 25kB
        -> Bitmap Heap Scan on msg (actual time=5.285..10.784 rows=7467 loops=1)
              Recheck Cond: (tsvector @@ to_tsquery('server & crashed'::text))
              Heap Blocks: exact=6927
              -> Bitmap Index Scan on msg_gin_idx (actual time=4.196..4.196 rows=7467
loops=1)
                    Index Cond: (tsvector @@ to_tsquery('server & crashed'::text))
Planning Time: 0.153 ms
Execution Time: 12.121 ms
(11 rows)
```

# Combine FTS with ordering by timestamp

- Combine FTS with ordering by timestamp
  - Store timestamps in additional information
  - Order posting tree/list by timestamp

```
create index msg_date_rum_idx on msg using rum(tsvector  
rum_tsvector_timestamp_ops, date) WITH  
(attach=date, "to"=tsvector, order_by_attach='t');
```

```
select date, subject from msg  
where tsvector @@ to_tsquery('server & crashed')  
order by date <=| '2000-01-01'::timestamp limit 5;
```

```
Limit (actual time=0.048..0.071 rows=5 loops=1)  
-> Index Scan using msg_date_rum_idx on msg (actual  
time=0.047..0.069 rows=5 loops=1)  
    Index Cond: (tsvector @@ to_tsquery('server &  
crashed'::text))  
    Order By: (date <=| '2000-01-01 00:00:00'::timestamp without  
time zone)  
Planning Time: 0.196 ms  
Execution Time: 0.095 ms vs 12.21 !  
(6 rows)
```

- 1.1 mln postings

Overhead of phrase search for seqscan is not big

```
select count(*) from pglist where fts @@ to_tsquery('english', 'tom <-> lane');
count
```

```
-----
222777
(1 row)
```

**Sequential Scan: phrase 1.7 s vs 1.6 s (&)**

```
select count(*) from pglist where fts @@ to_tsquery('english', 'tom <-> lane');
QUERY PLAN
```

```
-----
Finalize Aggregate (actual time=1700.280..1700.280 rows=1 loops=1)
-> Gather (actual time=1700.228..1700.277 rows=3 loops=1)
    Workers Planned: 2
    Workers Launched: 2
    -> Partial Aggregate (actual time=1696.119..1696.119 rows=1 loops=3)
        -> Parallel Seq Scan on pglist (actual time=2.356..1683.499 rows=74259
loops=3)
            Filter: (fts @@ '''tom''' <-> '''lane'''::tsquery)
            Rows Removed by Filter: 263664
Planning time: 0.270 ms
Execution time: 1709.092 ms
(10 rows)
```

# RUM improves phrase search

- 1.1 mln postings

Overhead of phrase search for index scan is big !

**GIN index** (1.1 s (<->) vs 0.48 s (&) ): Use recheck, phrase is slow vs fts

```
select count(*) from pglist where fts @@ to_tsquery('english', 'tom <-> lane');
                                QUERY PLAN
```

```
-----
Aggregate (actual time=1074.983..1074.984 rows=1 loops=1)
  -> Bitmap Heap Scan on pglist (actual time=84.424..1055.770 rows=222777 loops=1)
        Recheck Cond: (fts @@ '''tom''' <-> '''lane'''::tsquery)
        Rows Removed by Index Recheck: 36
        Heap Blocks: exact=105992
        -> Bitmap Index Scan on pglist_gin_idx (actual time=53.628..53.628 rows=222813
loops=1)
                Index Cond: (fts @@ '''tom''' <-> '''lane'''::tsquery)
Planning time: 0.329 ms
Execution time: 1075.157 ms
(9 rows)
```

# RUM improves phrase search

- 1.1 mln postings

RUM decreases the overhead of phrase search !

**RUM index** (0.5 s (<-> vs 0.48 s (&)): Use positions in addinfo, no overhead of phrase search !

```
select count(*) from pglist where fts @@ to_tsquery('english', tom <-> lane');  
                                QUERY PLAN
```

```
-----  
Aggregate (actual time=513.517..513.517 rows=1 loops=1)  
  -> Bitmap Heap Scan on pglist (actual time=134.109..497.814 rows=221919 loops=1)  
        Recheck Cond: (fts @@ to_tsquery('tom <-> lane'::text))  
        Heap Blocks: exact=105509  
        -> Bitmap Index Scan on pglist_rum_fts_idx (actual time=98.746..98.746  
rows=221919 loops=1)  
                Index Cond: (fts @@ to_tsquery('tom <-> lane'::text))  
Planning time: 0.223 ms  
Execution time: 515.004 ms  
(8 rows)
```



# Inverse FTS (FQS)

- Find queries, which match given document
- Automatic text classification, subscription service

```
SELECT * FROM queries;
```

| q                                 | tag   |
|-----------------------------------|-------|
| 'supernova' & 'star'              | sn    |
| 'black'                           | color |
| 'big' & 'bang' & 'black' & 'hole' | bang  |
| 'spiral' & 'galaxi'               | shape |
| 'black' & 'hole'                  | color |

(5 rows)

```
SELECT * FROM queries WHERE
```

```
to_tsvector('black holes never exists before we think about them')  
@@ q;
```

| q                | tag   |
|------------------|-------|
| 'black'          | color |
| 'black' & 'hole' | color |

(2 rows)

# Inverse FTS (FQS)

- RUM index – store branches of query tree in addinfo

Find queries for the first message in postgres mailing lists

```
\d pg_query
      Table "public.pg_query"
  Column |      Type      | Modifiers
  -----+-----+-----
    q    | tsquery         |
  count | integer        |
Indexes:
    "pg_query_rum_idx" rum (q)              33818 queries

select q from pg_query pgq, pglist where q @@ pglist.fts and pglist.id=1;
      q
  -----
 'one' & 'one'
 'postgresql' & 'freebsd'
(2 rows)
```

# Inverse FTS (FQS)

- RUM index support – store branches of query tree in addinfo

Find queries for the first message in postgres mailing lists

```
create index pg_query_rum_idx on pg_query using rum(q);
select q from pg_query pgq, pglist where q @@ pglist.fts and pglist.id=1;
                                QUERY PLAN
```

```
-----
Nested Loop (actual time=0.719..0.721 rows=2 loops=1)
```

```
  -> Index Scan using pglist_id_idx on pglist
```

```
(actual time=0.013..0.013 rows=1 loops=1)
```

```
    Index Cond: (id = 1)
```

```
  -> Bitmap Heap Scan on pg_query pgq
```

```
(actual time=0.702..0.704 rows=2 loops=1)
```

```
    Recheck Cond: (q @@ pglist.fts)
```

```
    Heap Blocks: exact=2
```

```
      -> Bitmap Index Scan on pg_query_rum_idx
```

```
(actual time=0.699..0.699 rows=2 loops=1)
```

```
        Index Cond: (q @@ pglist.fts)
```

```
Planning time: 0.212 ms
```

```
Execution time: 0.759 ms
```

```
(10 rows)
```

# Inverse FTS (FQS)

- RUM index supported – store branches of query tree in addinfo

## Monstrous postings

```
select id, t.subject, count(*) as cnt into pglis_t_q  from pg_query,  
(select id, fts, subject from pglis) t where t.fts @@ q  
group by id, subject order by cnt desc limit 1000;
```

```
select * from pglis_t_q  order by cnt desc limit 5;
```

| id     | subject                                       | cnt  |
|--------|-----------------------------------------------|------|
| 248443 | Packages patch                                | 4472 |
| 282668 | Re: release.sgml, minor pg_autovacuum changes | 4184 |
| 282512 | Re: release.sgml, minor pg_autovacuum changes | 4151 |
| 282481 | release.sgml, minor pg_autovacuum changes     | 4104 |
| 243465 | Re: [HACKERS] Re: Release notes               | 3989 |

(5 rows)

# RUM size, create index

- 1.1 mln posts

msg (id, list, subject, author, body, tsvector, date)

GiST: create index msg\_gist\_idx on msg using gist(tsvector);

GIN: create index msg\_gin\_idx on msg using gin(tsvector);

RUM: create index msg\_rum\_idx on msg using rum(tsvector);

RUM: create index msg\_rum\_date\_idx on msg using rum(tsvector  
rum\_tsvector\_timestamp\_ops, date) WITH (attach=date, "to"=tsvector);

RUM: create index msg\_date\_rum\_idx on msg using rum(tsvector  
rum\_tsvector\_timestamp\_ops, date) WITH  
(attach=date, "to"=tsvector, order\_by\_attach='t');

# RUM size, create index

- 1.1 mln posts
  - Size and create index (sec)

```
select pg_size_pretty(pg_table_size('msg')) as msg,
       pg_size_pretty(sum(pg_column_size(tsvector))) as fts,
       pg_size_pretty(pg_table_size('msg_gist_idx')) as gist,
       pg_size_pretty(pg_table_size('msg_gin_idx')) as gin,
       pg_size_pretty(pg_table_size('msg_rum_idx')) as rum,
       pg_size_pretty(pg_table_size('msg_rum_date_idx')) as rum_date,
       pg_size_pretty(pg_table_size('msg_date_rum_idx')) as date_rum from msg;
```

| msg     | tsvector | gist   | gin    | rum     | rum_date | date_rum |       |
|---------|----------|--------|--------|---------|----------|----------|-------|
| 3178 MB | 1558 MB  | 394 MB | 462 MB | 1130 MB | 1812 MB  | 2596 MB  |       |
| (1 row) |          |        |        |         |          |          |       |
| 318     |          | 49     | 112    | 215     | 229      | 706      | (sec) |

- GiST
  - document, query as a signature, documents → signature tree, Bloom filter used for search
  - Fast insert, small size, good for small collections
- GIN — inverted tree, basically it's a B-tree
  - Optimized for storing a lot of duplicate keys
  - Duplicates are ordered by heap TID
  - Not as fast as GiST for updates, good performance and scalability
- RUM (extension) — GIN++
  - Slow for updating, big size, high WAL traffic, best for mostly read workload, very fast for ranking, good for phrase search, no need tsvector column

# IsPELL shared dictionaries

- Working with dictionaries can be difficult and slow
  - Installing dictionaries can be complicated
  - Dictionaries are loaded into memory for every session (slow first query symptom) and eat memory.

```
time for i in {1..10}; do echo $i; psql postgres -c "select  
ts_lexize('english_hunspell', 'evening')" > /dev/null; done
```

```
1  
2  
3  
4  
5  
6  
7  
8  
9  
10
```

```
real    0m0.656s  
user    0m0.015s  
sys 0m0.031s
```

For russian hunspell dictionary:

```
real 0m3.809s  
user 0m0.015s  
sys 0m0.029s
```

Each session «eats» 20MB !



- Easy installation of hunspell dictionaries

```
CREATE EXTENSION hunspell_ru_ru; -- creates russian_hunspell dictionary
CREATE EXTENSION hunspell_en_us; -- creates english_hunspell dictionary
CREATE EXTENSION hunspell_nn_no; -- creates norwegian_hunspell dictionary
SELECT ts_lexize('english_hunspell', 'evening');
      ts_lexize
```

```
-----
{evening,even}
(1 row)
```

Time: 57.612 ms

```
SELECT ts_lexize('russian_hunspell', 'туши');
      ts_lexize
```

```
-----
{туша,тушь,тушить,туш}
(1 row)
```

Time: 382.221 ms

```
SELECT ts_lexize('norwegian_hunspell','fotballklubber');
      ts_lexize
```

```
-----
{fotball,klubb,fot,ball,klubb}
(1 row)
```

Time: 323.046 ms

Slow first query syndrom



# Dictionaries in shared memory

```
CREATE EXTENSION shared_ispell;  
CREATE TEXT SEARCH DICTIONARY english_shared (  
    TEMPLATE = shared_ispell,  
    DictFile = en_us,  
    AffFile = en_us,  
    StopWords = english  
);  
CREATE TEXT SEARCH DICTIONARY russian_shared (  
    TEMPLATE = shared_ispell,  
    DictFile = ru_ru,  
    AffFile = ru_ru,  
    StopWords = russian  
);  
time for i in {1..10}; do echo $i; psql postgres -c "select ts_lexize('russian_shared', 'туши')" > /dev/null; done  
1  
2  
.....  
10  
  
real 0m0.170s      real 0m3.809s  
user 0m0.015s      user 0m0.015s  
sys 0m0.027s      sys 0m0.029s
```

# Search Mailing list archive

- <https://postgrespro.com/list>
- Custom parser — fixes several problems in default parser

```
select * from ts_parse('default','1914-1999');  
tokid | token
```

```
-----+-----  
    22 | 1914  
    21 | -1999  
(2 rows)
```

```
select * from ts_parse('default','pg_catalog');  
tokid | token
```

```
-----+-----  
     1 | pg  
    12 | _  
     1 | catalog  
(3 rows)
```

```
select * from ts_parse('tsparser','1914-1999');  
tokid | token
```

```
-----+-----  
    15 | 1914-1999  
     9 | 1914  
    12 | -  
     9 | 1999  
(4 rows)
```

```
select * from ts_parse('tsparser','pg_catalog');  
tokid | token
```

```
-----+-----  
    16 | pg_catalog  
    11 | pg  
    12 | _  
    11 | catalog  
(4 rows)
```

# Search Mailing list archive

- <https://postgrespro.com/list>
- Faceted search - grouping search results by lists
- Strip citation from posts
- Uses pg\_trgm for suggestions
- Advanced query language
  - Support «phrase» search

# Search Mailing list archive

Mailing lists ▾

Search

server crash  
server crashes  
server crashing  
server crashed  
server crashme

server crash - Search results in mailing lists

List

All lists ▾

Post date

anytime ▾

Sort by

Date ▾

Search

pgsql-general (1037)

2018-10-16 21:25:54 | [postgres server process crashes when using odbc\\_fdw](#) (Ravi Krishna)

**server**. I also created foreign table. When I run a sql 'select \* from odbctest' postgres **crashes**  
[Thread](#) >> [Search in thread](#) (12)

2018-09-26 14:46:10 | [Re: Setting up continuous archiving](#) (Stephen Frost)

**server crashes** or there's some kind of issue with it after the rsync finishes  
[Thread](#)

2018-08-29 04:02:45 | [WAL replay issue from 9.6.8 to 9.6.10](#) (Dave Peticolas)

**server** to 9.6.8 and I was able to replay WAL past the point where 9.6.10 would PANIC and **crash**  
[Thread](#)

2018-08-24 19:07:41 | [Re: unorthodox use of PG for a customer](#) (David Gauthier)

**crash** them. Of course any DB running would die too and have to be restarted/recovered. So the place for the DB is really elsewhere, on an external **server**  
[Thread](#)

pgsql-hackers (1199)

2018-10-23 21:06:49 | [Re: \[HACKERS\] Transactions involving multiple postgres foreignservers, take 2](#) (Masahiko Sawada)

- Slides of this talk  
<http://www.sai.msu.su/~megera/postgres/talks/pgconf.eu-2018-fts.pdf>
- Text search documentation  
<http://www.postgresql.org/docs/current/static/textsearch.html>
- Dictionaries as extensions  
[https://github.com/postgrespro/hunspell\\_dicts](https://github.com/postgrespro/hunspell_dicts)
- Improved text search parser  
[https://github.com/postgrespro/pg\\_tsparser](https://github.com/postgrespro/pg_tsparser)
- RUM access method  
<https://github.com/postgrespro/rum>
- Shared ispell template  
[https://github.com/postgrespro/shared\\_ispell](https://github.com/postgrespro/shared_ispell)
- Full text search example  
[https://github.com/postgrespro/apod\\_fts](https://github.com/postgrespro/apod_fts)
- Dictionary for regular expressions  
[https://github.com/obartunov/dict\\_regex](https://github.com/obartunov/dict_regex)
- Setrank - TF\*IDF ranking  
<https://github.com/obartunov/setrank>

- Dictionary for roman numbers  
[https://github.com/obartunov/dict\\_roman](https://github.com/obartunov/dict_roman)
- Faceted search in one query  
<http://akorotkov.github.io/blog/2016/06/17/faceted-search/>
- FTS real example: Search mailing list archives  
<https://postgrespro.com/list>
- FTS slides with a lot of info  
[http://www.sai.msu.su/~megera/postgres/talks/fts\\_postgres\\_by\\_authors\\_2.pdf](http://www.sai.msu.su/~megera/postgres/talks/fts_postgres_by_authors_2.pdf)
- Pg\_trgm documentation  
<https://www.postgresql.org/docs/11/static/pgtrgm.html>
- My postings about FTS  
<https://obartunov.livejournal.com/tag/fts>





Agradeço a vossa atenção !