



Gaia Variability Studies: case for Postgres-XC.

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*Gaia Data Processing Centre in Geneva,
Gaia Coordination Unit 7*

PgCon

Ottawa 23rd May 2014



**UNIVERSITÉ
DE GENÈVE**



Includes slides courtesy of Berry Holl and Laurent Eyer

Krzysztof Nienartowicz Gaia DPAC, PgCon, Ottawa, 2014/05

Structure

- My story
- Gaia mission
- Gaia science at CU7, Geneva
- Data model and processing model
- Hardware
- XC role
- Collaboration

Bio

- Corporate software lab; Poland, USA, UK,...
 - Primark Corp-> Thomson Financial -> IHS (4.5 years)
 - The biggest economical timeseries database
 - Global systems' integration
- CERN DB group (6.5 years); Geneva, Switzerland
 - Largest data migration at the time (2002):
 - 400TB moved from Objectivity to hybrid Oracle+in-house platform
 - Largest relational scientific database running at CERN (*Compass, Harp*)
 - Biomed secure middleware, Grid
- Gaia Geneva group (5 years); UNIGE/ISDC, Geneva
 - Coordination Unit 7 (CU7) Data Architect
 - Data Processing Centre for Geneva (DPCG) deputy
- XLDB, timeseries, distributed systems, science, Literature, art, history, politics, basketball, paragliding, architecture, volleyball, sailing, biking,....

Structure

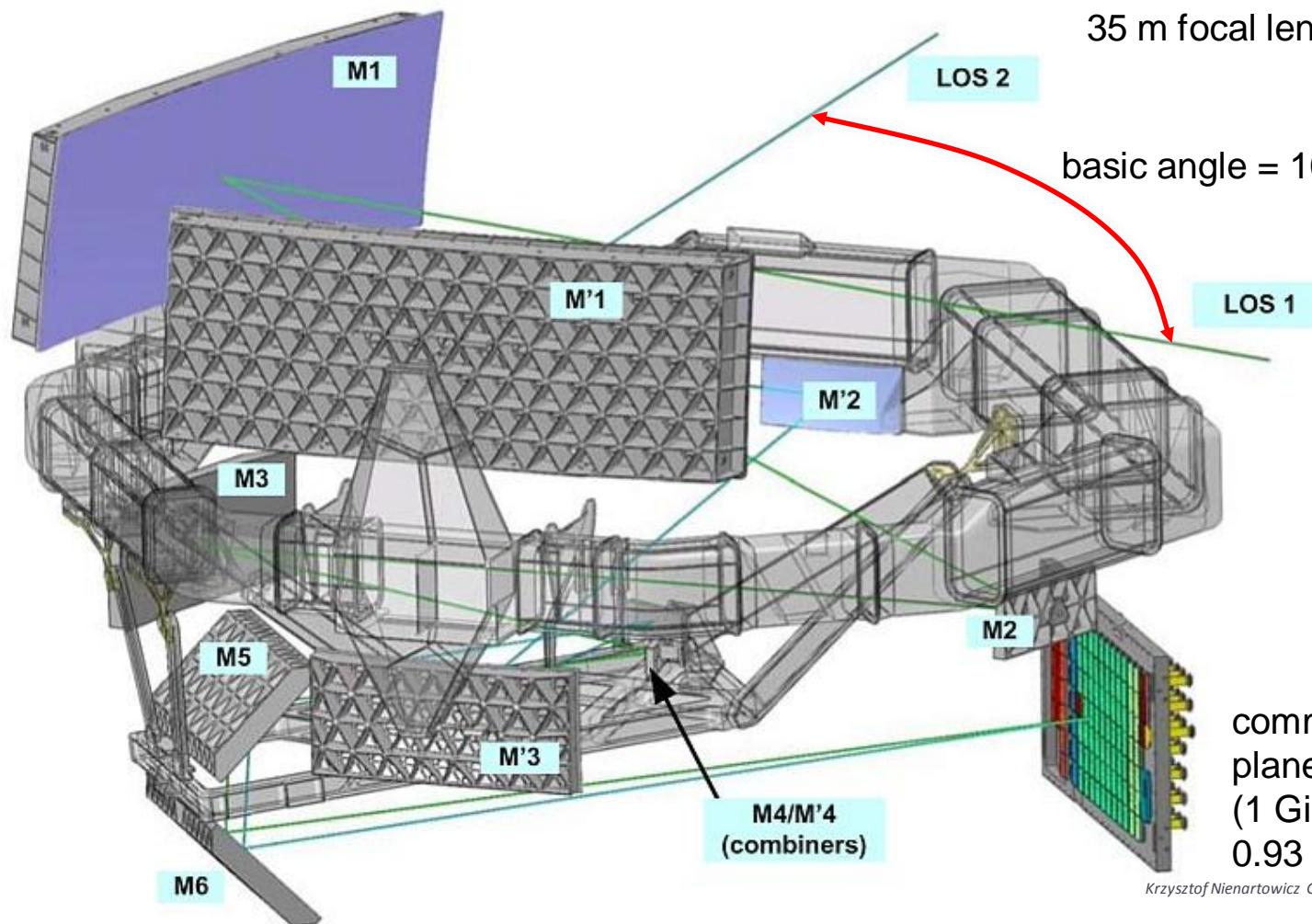
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What is special about Gaia?

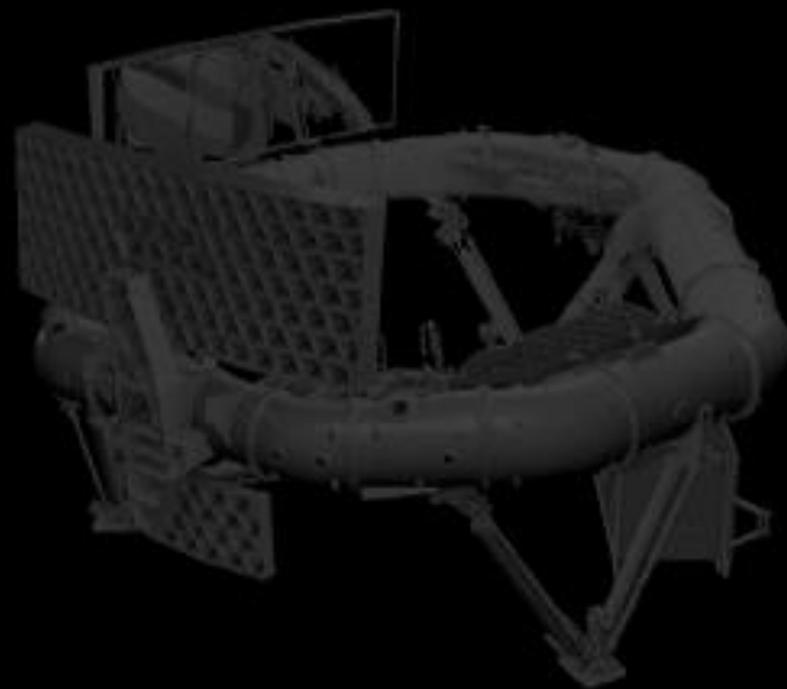
- ▶ European Space Agency cornerstone mission
 - ▶ No equivalent mission for 20-30+ years...
- ▶ Census of our Galaxy:
 - ▶ All objects between **6 and 20th magnitude** (~1.000.000.000 stars, asteroids, quasars, extragalactic supernovae, etc)
 - ▶ On average **80 times during its 5 year mission**
 - ▶ positions and parallax with a precision of **20 μasec** (at V= 15 mag)
 - ▶ Proper motions with a precision of **20 μasec/year** (at V= 15 mag)
 - ▶ Radial velocities with a precision of **2-10 km/s** (for star V<17)
 - ▶ Low resolution spectrum of each star:
 - ▶ allows to determine many stellar properties
 - e.g. temperature, surface gravity, metalicity, age, ...
 - ▶ Can potentially discover as many as 10.000 exo-planets
 - ▶ Estimated 10-20% of all population are variables



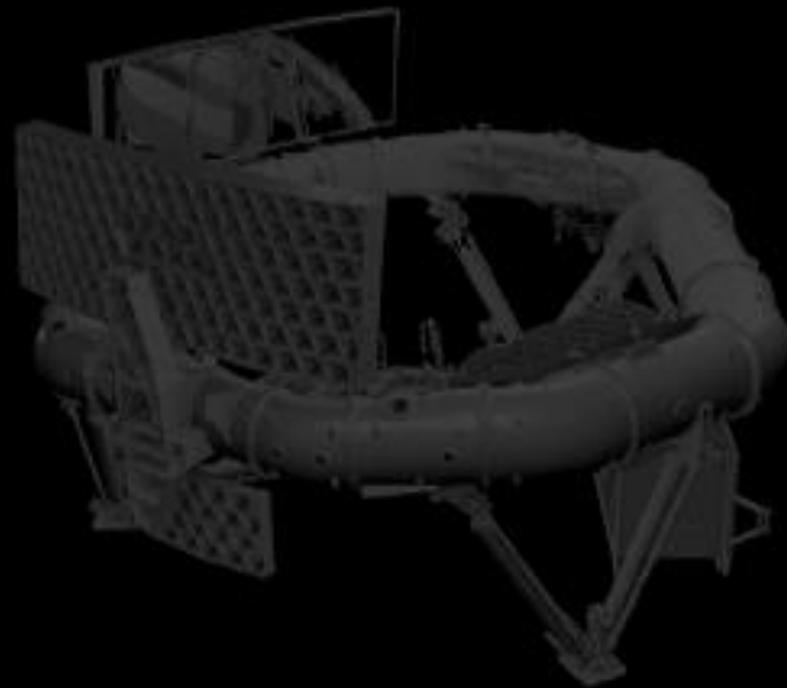
The Gaia instruments



The Gaia instruments



The Gaia instruments

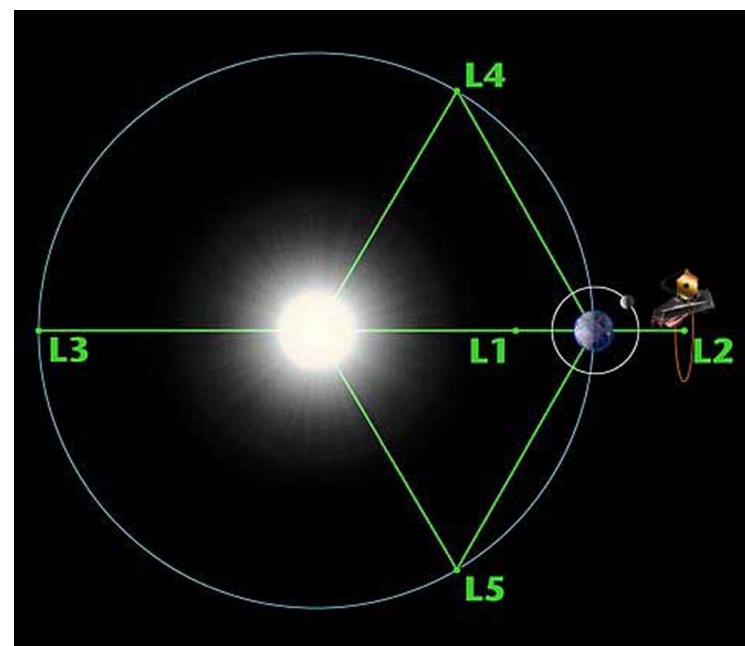
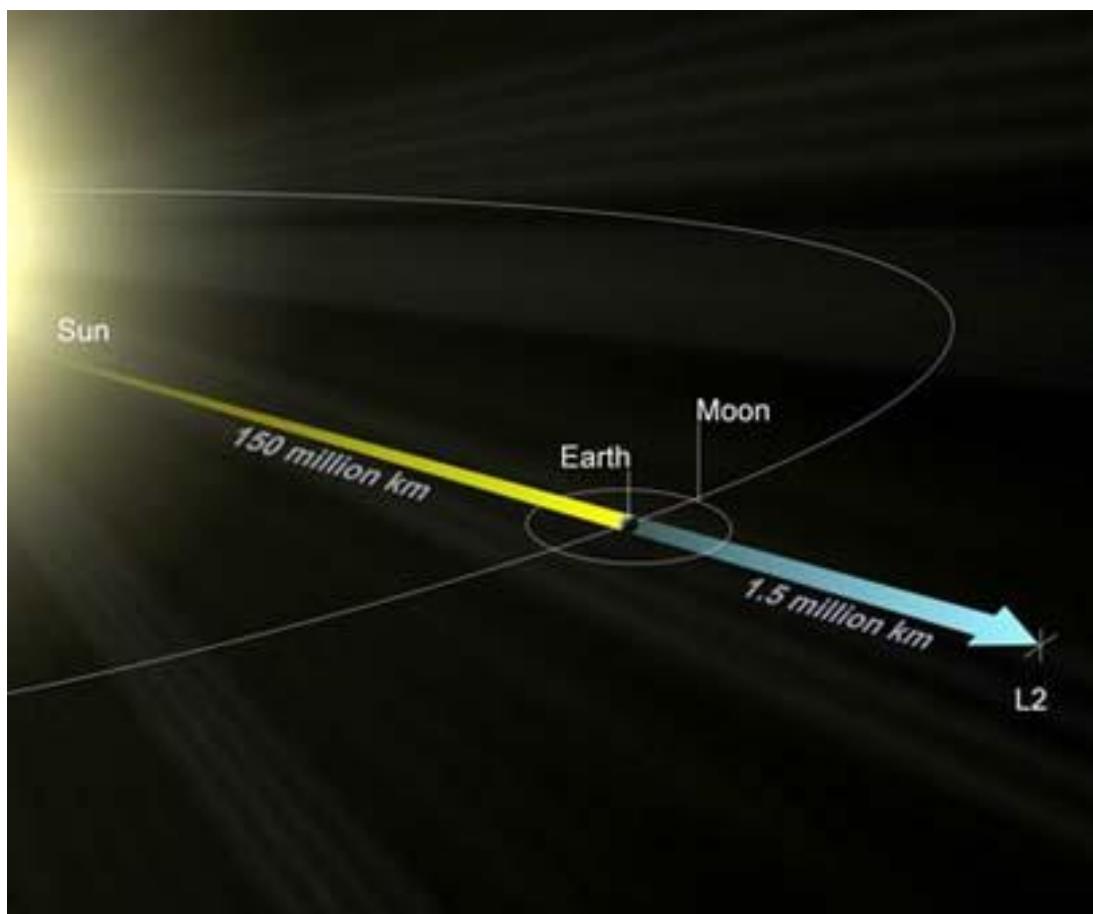


One of the two primary mirrors



The Gaia satellite

- Location: Lagrange point 2
- Commissioning phase, first calibrated data: Q2/2015



Gaia scanning: Motion of viewing directions over 4 days

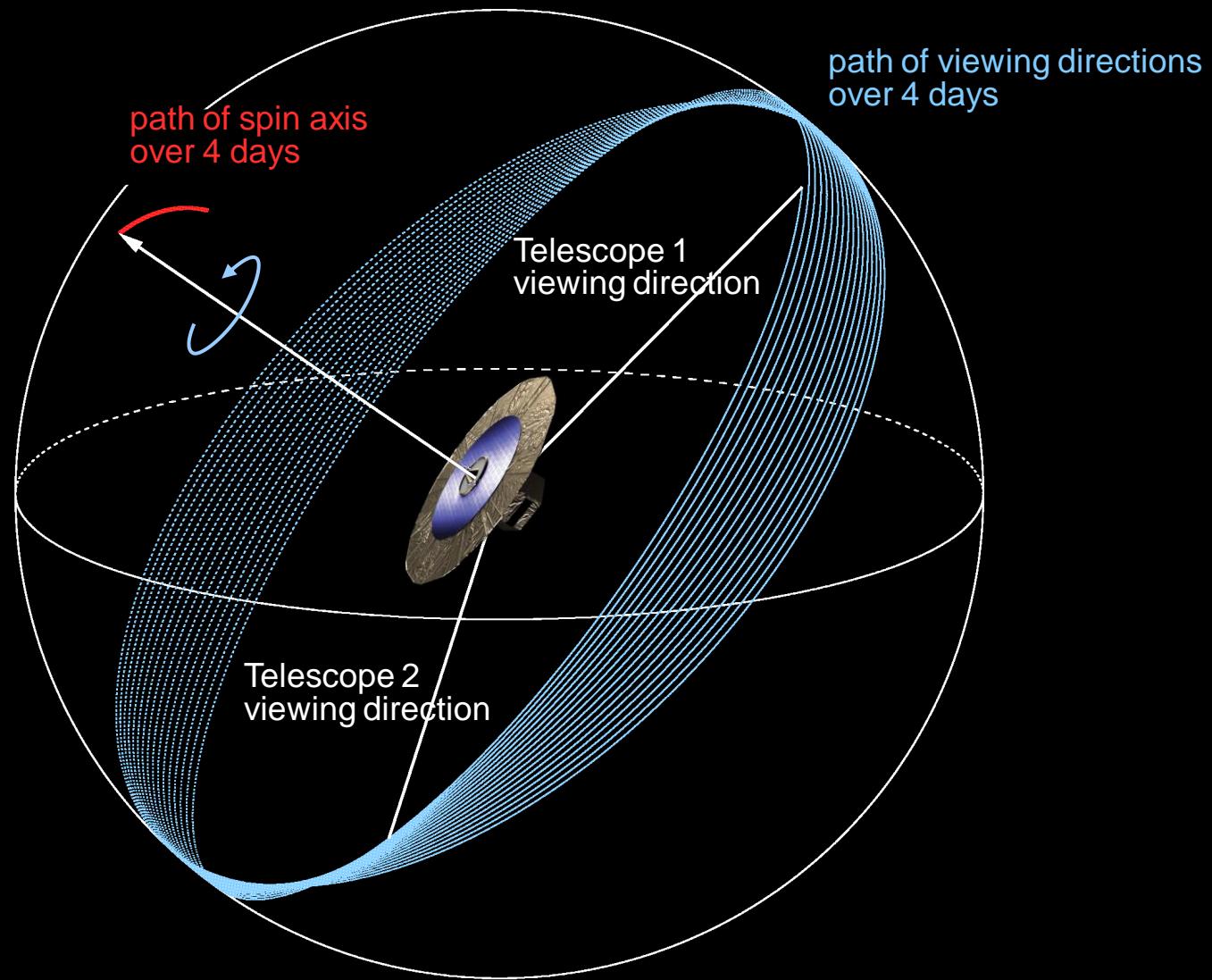
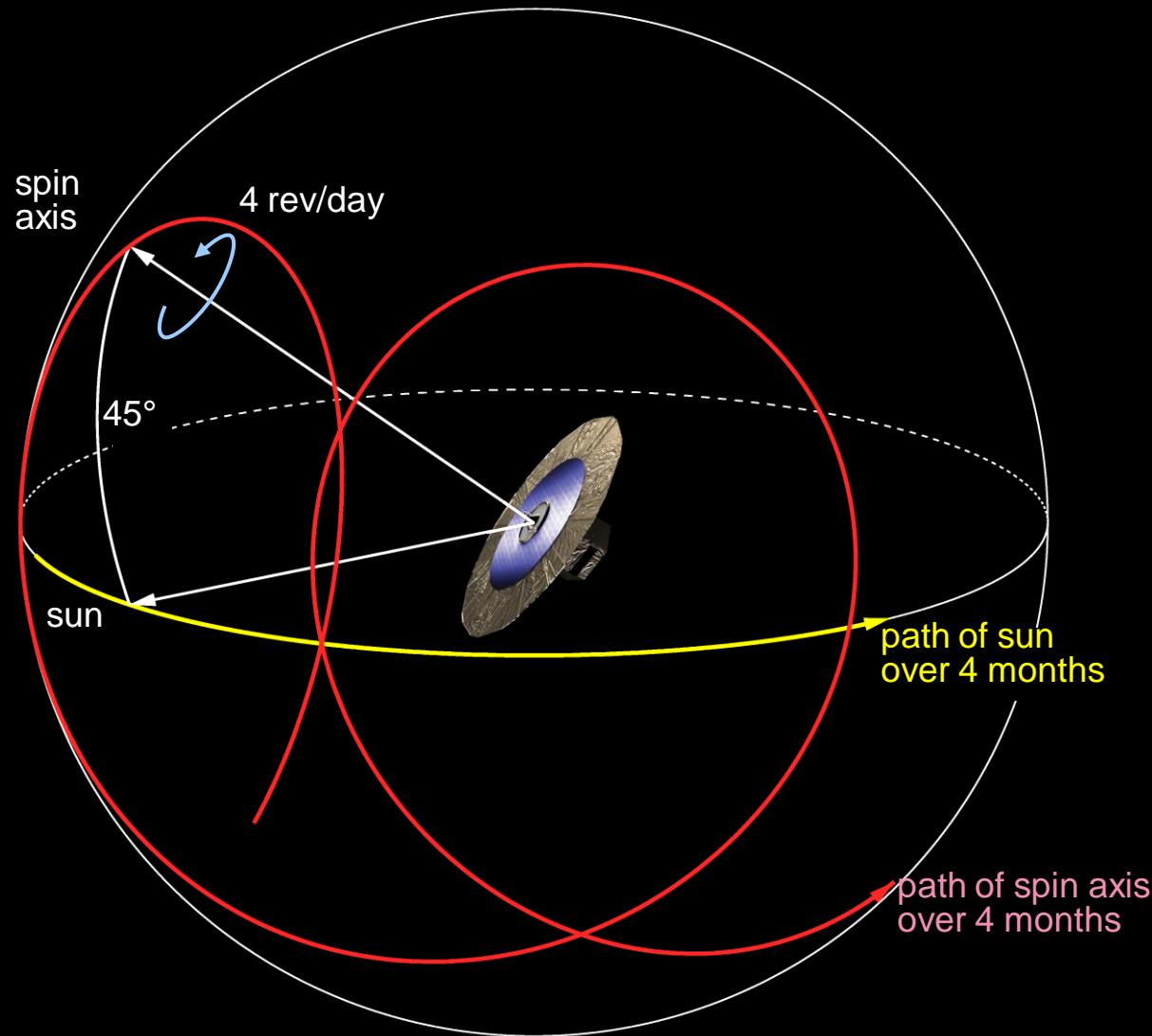
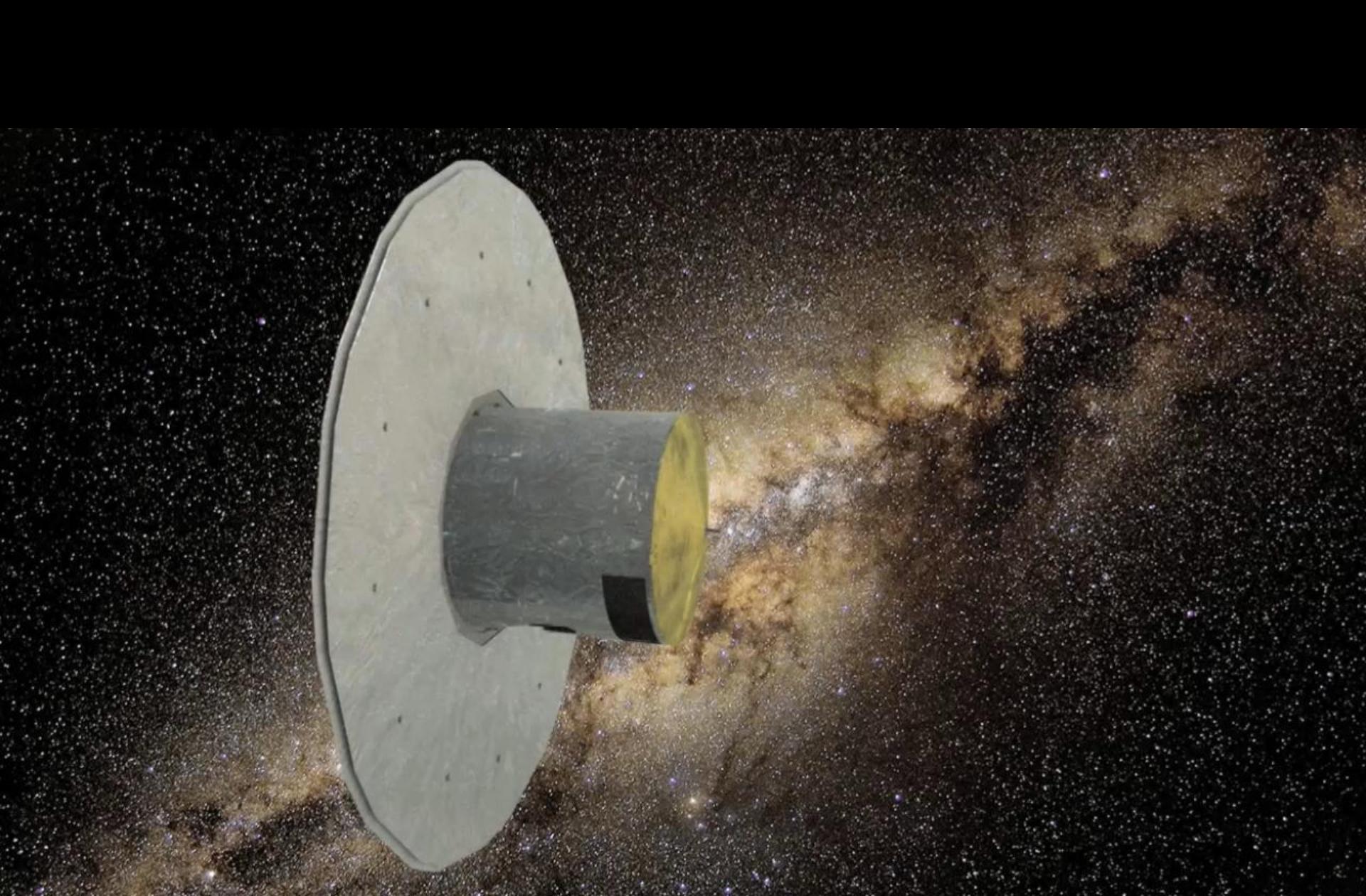


image credit: Lennart Lindegren

Gaia scanning: Motion of the spin axis over 4 months



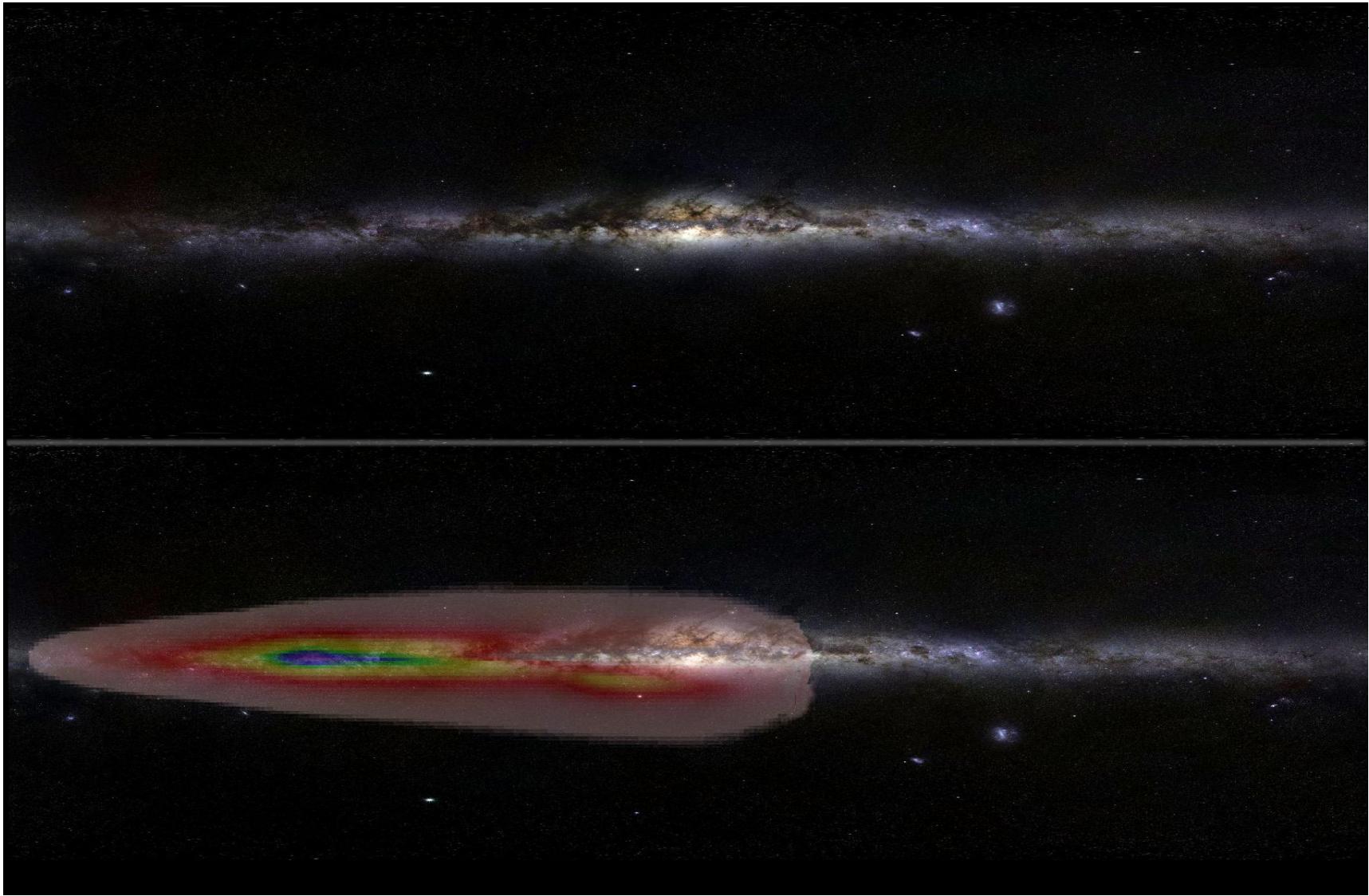


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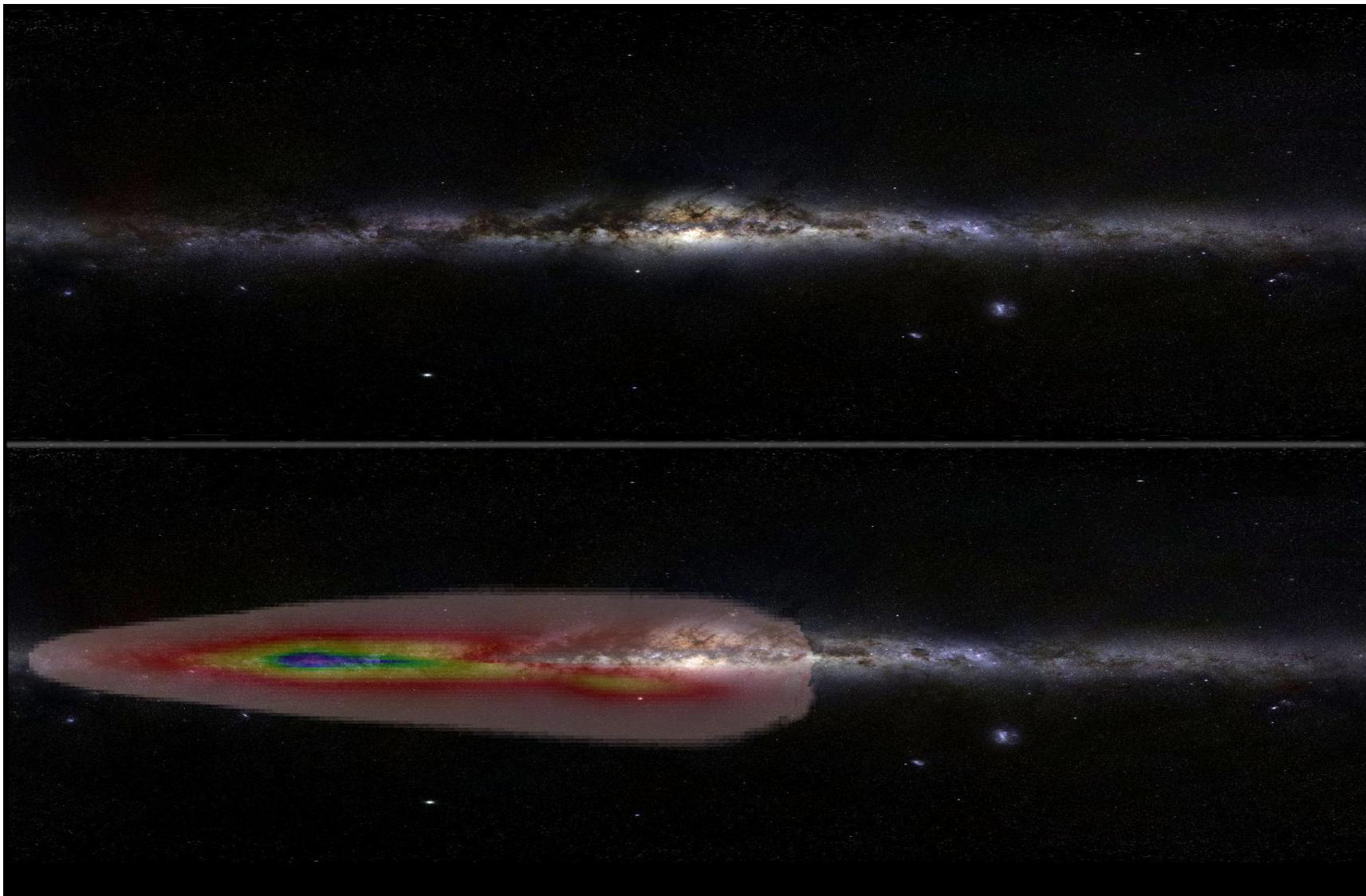
Gaia Science

Simulated coverage



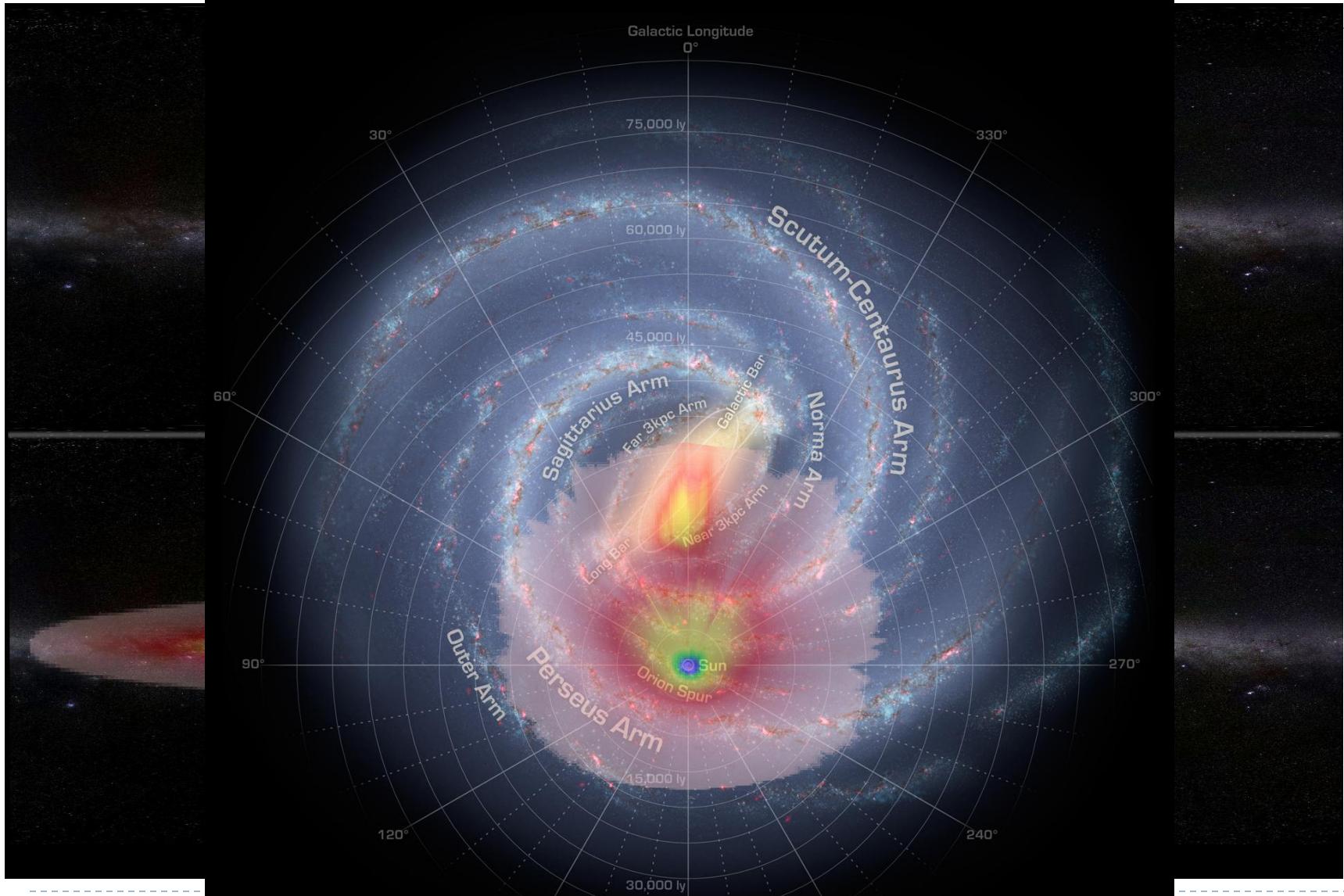
Gaia Science

Simulated coverage



Gaia Science

Simulated coverage



Gaia Science

Parallax



Gaia Science

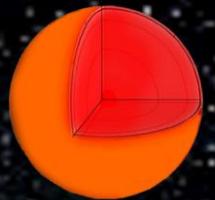
3D Galaxy structure, Galaxy dynamics thanks to parallax, Radial Velocity



Gaia Science



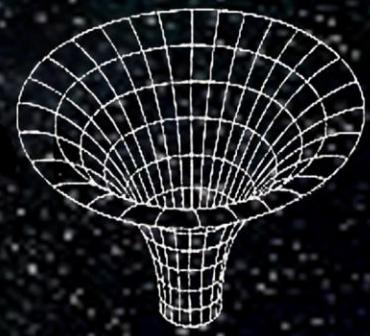
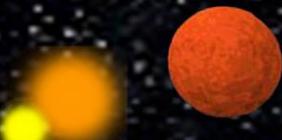
Stellar
Astrophysics



Star Formation
History of the
Milky Way

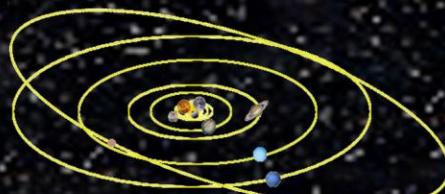
Galactic
Structure

Binaries and
Brown Dwarfs



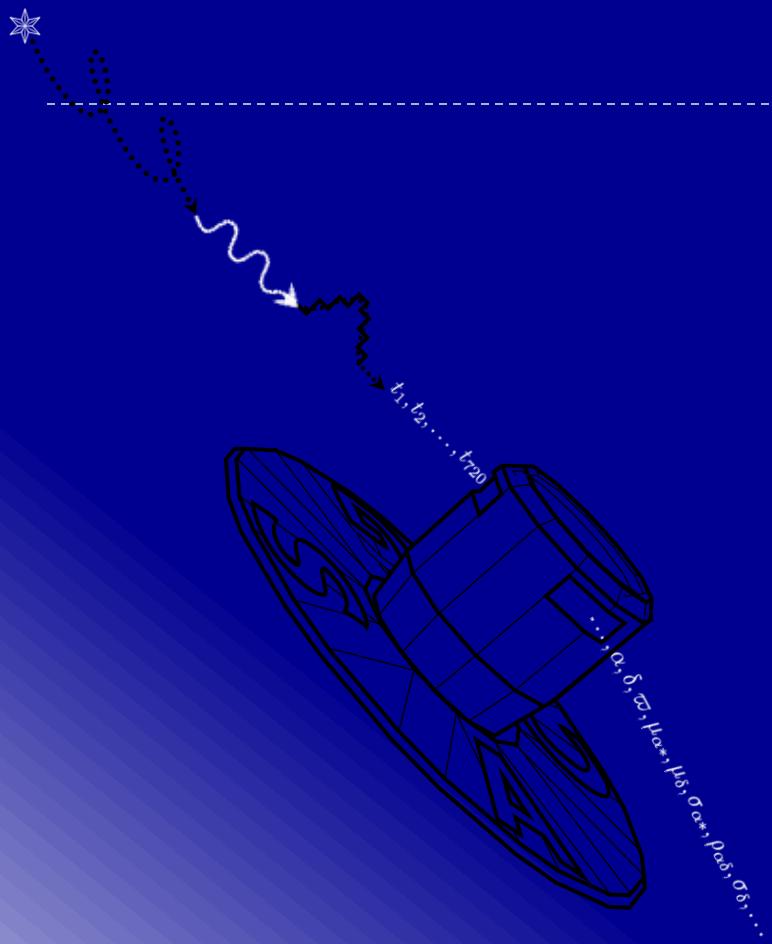
Fundamental
Physics

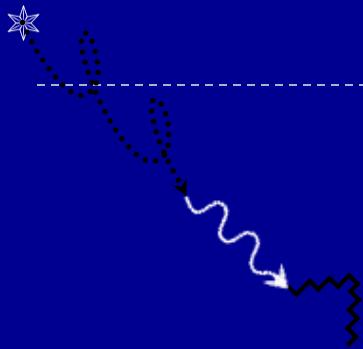
Extrasolar
Planets



Solar
System

Reference
Frame

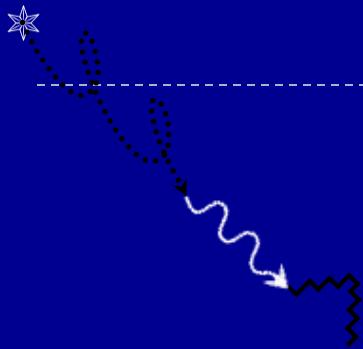




Observing process:

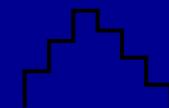
- ▶ Apparent source motion on the sky,
- ▶ propagation of light to Gaia,
- ▶ Astrometric CCDs readout,
typically 6x1 binned counting profile

$$\times 720 \times 10^9 = \mathbf{10^{12}}$$



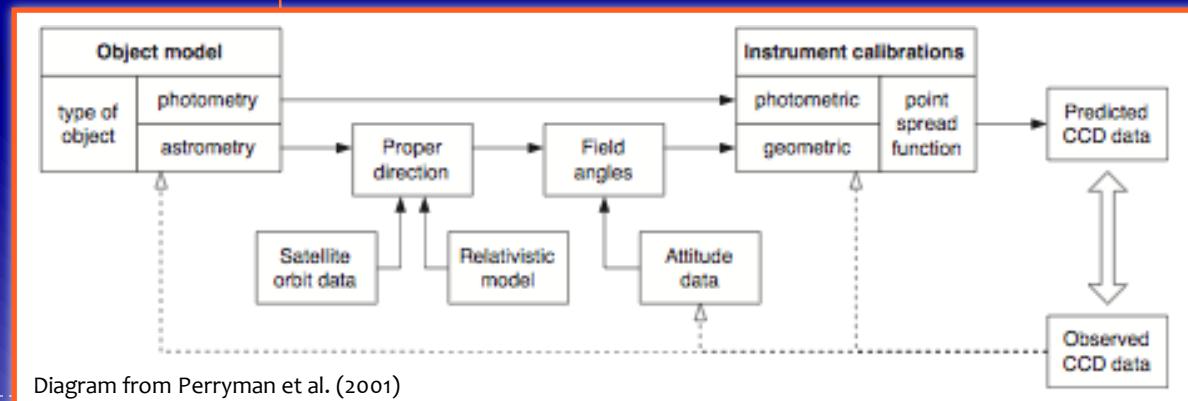
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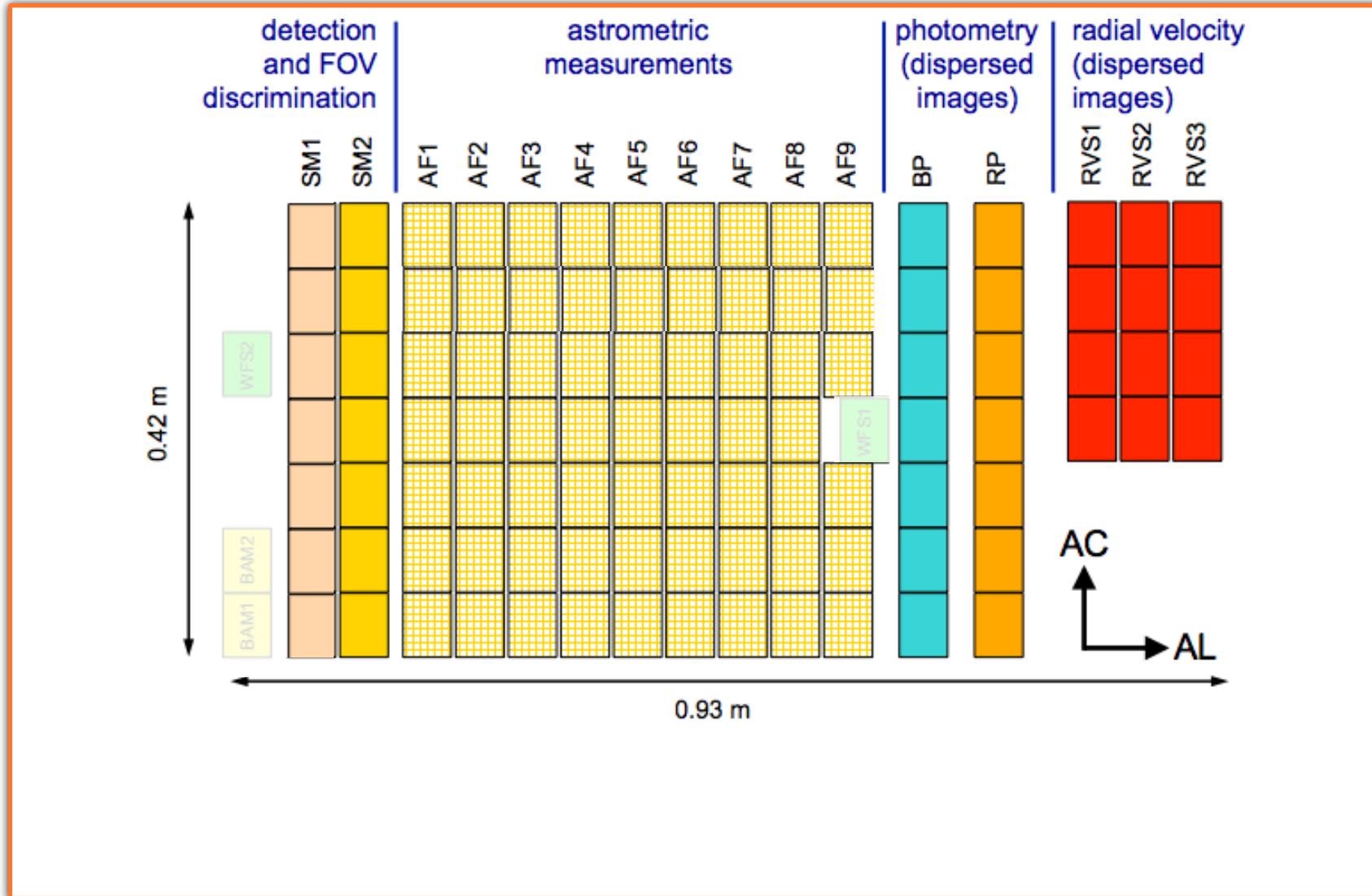
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Forward modelling:



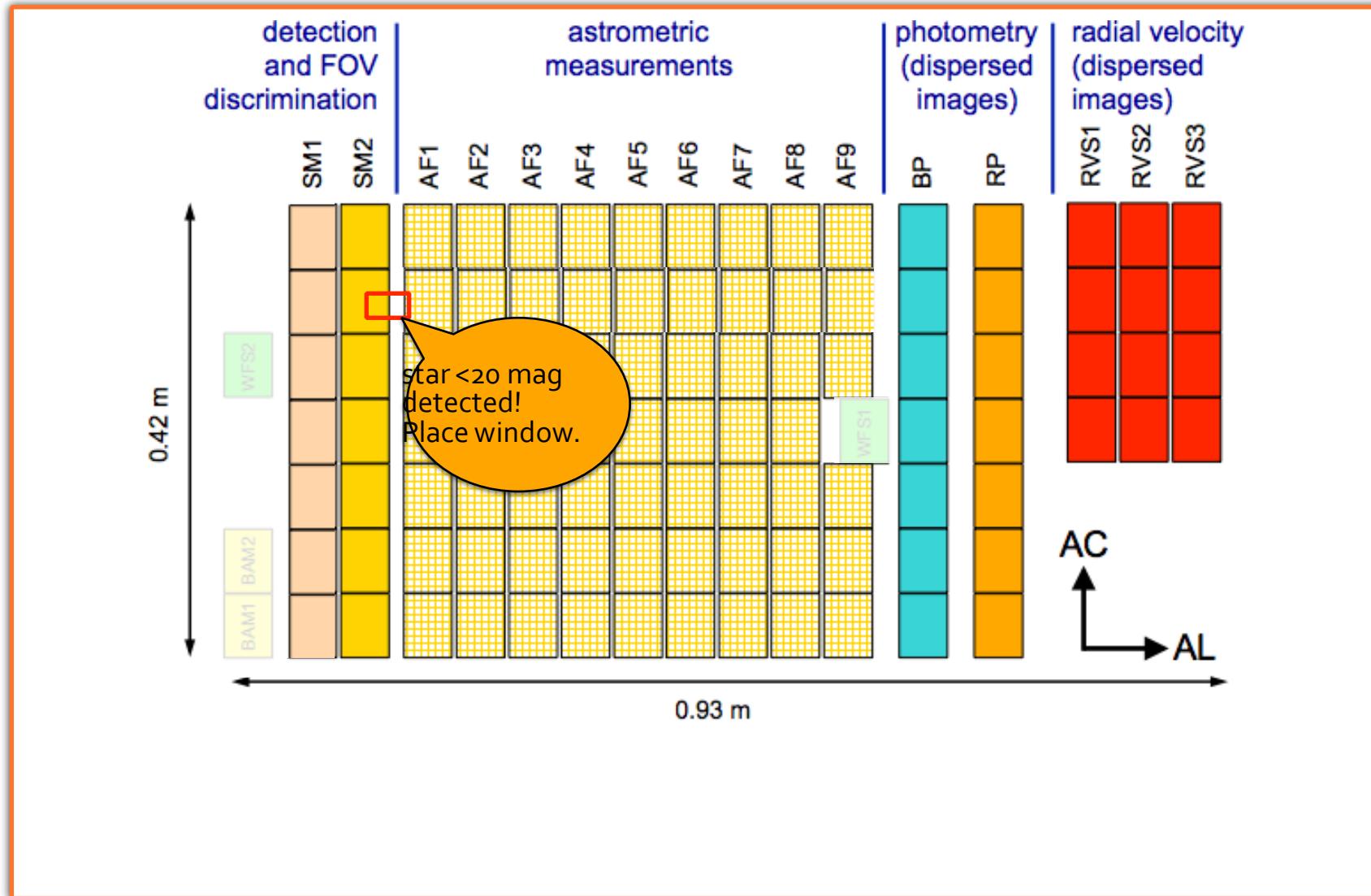
Gaia focal plane: CDD, BP RP, RVS observations

938 million pixel camera



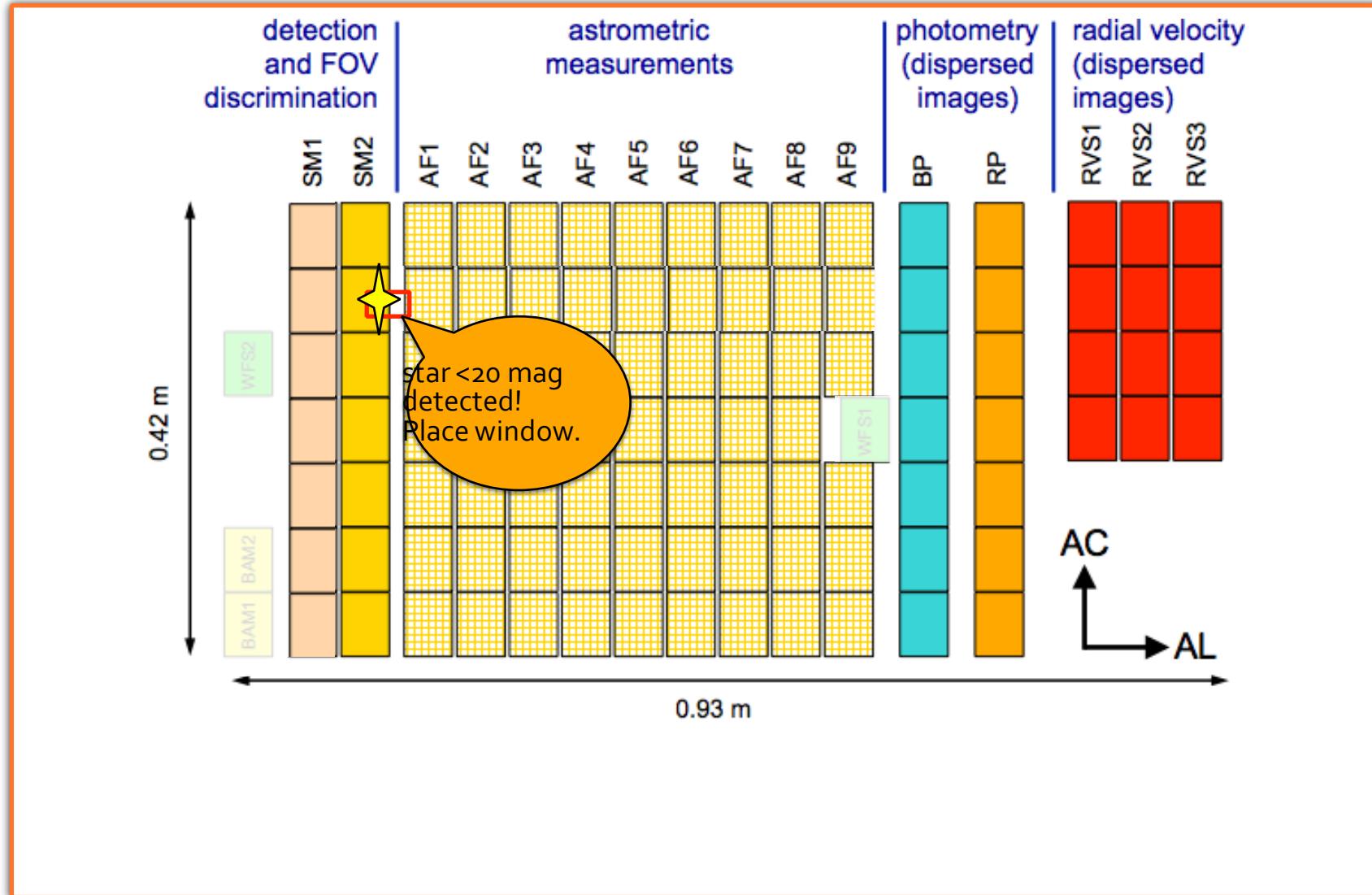
Gaia focal plane: CDD, BP RP, RVS observations

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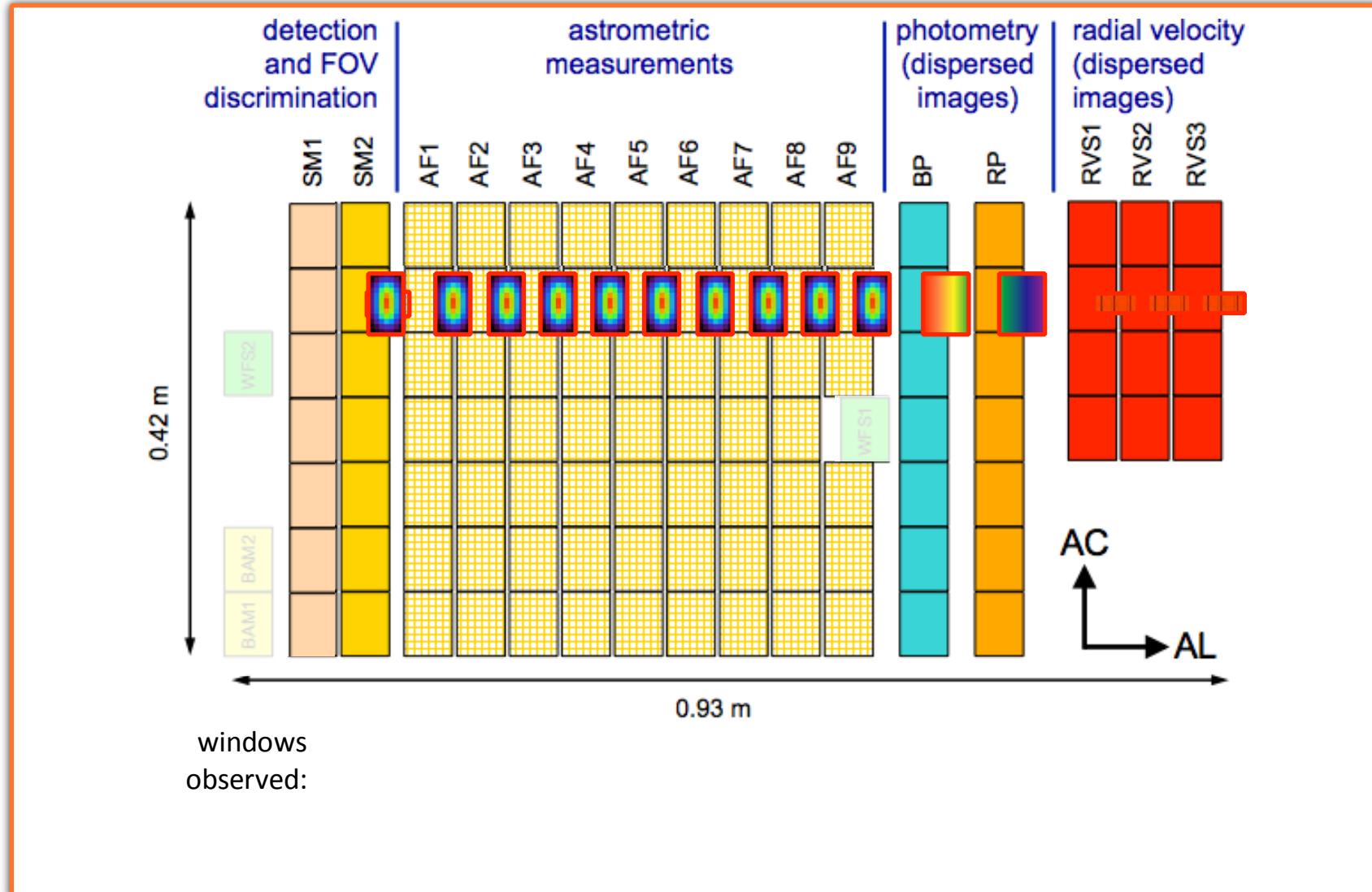
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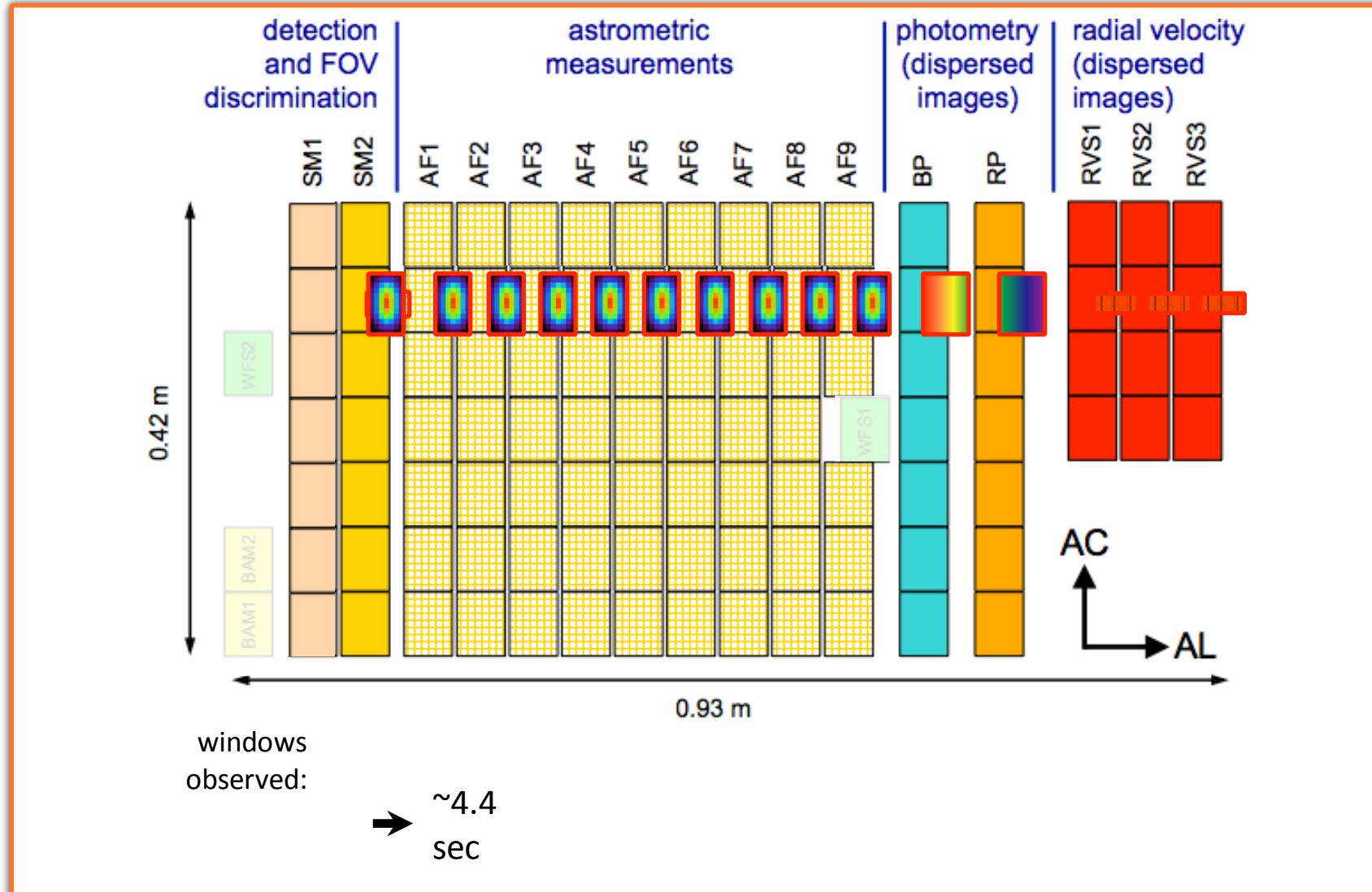
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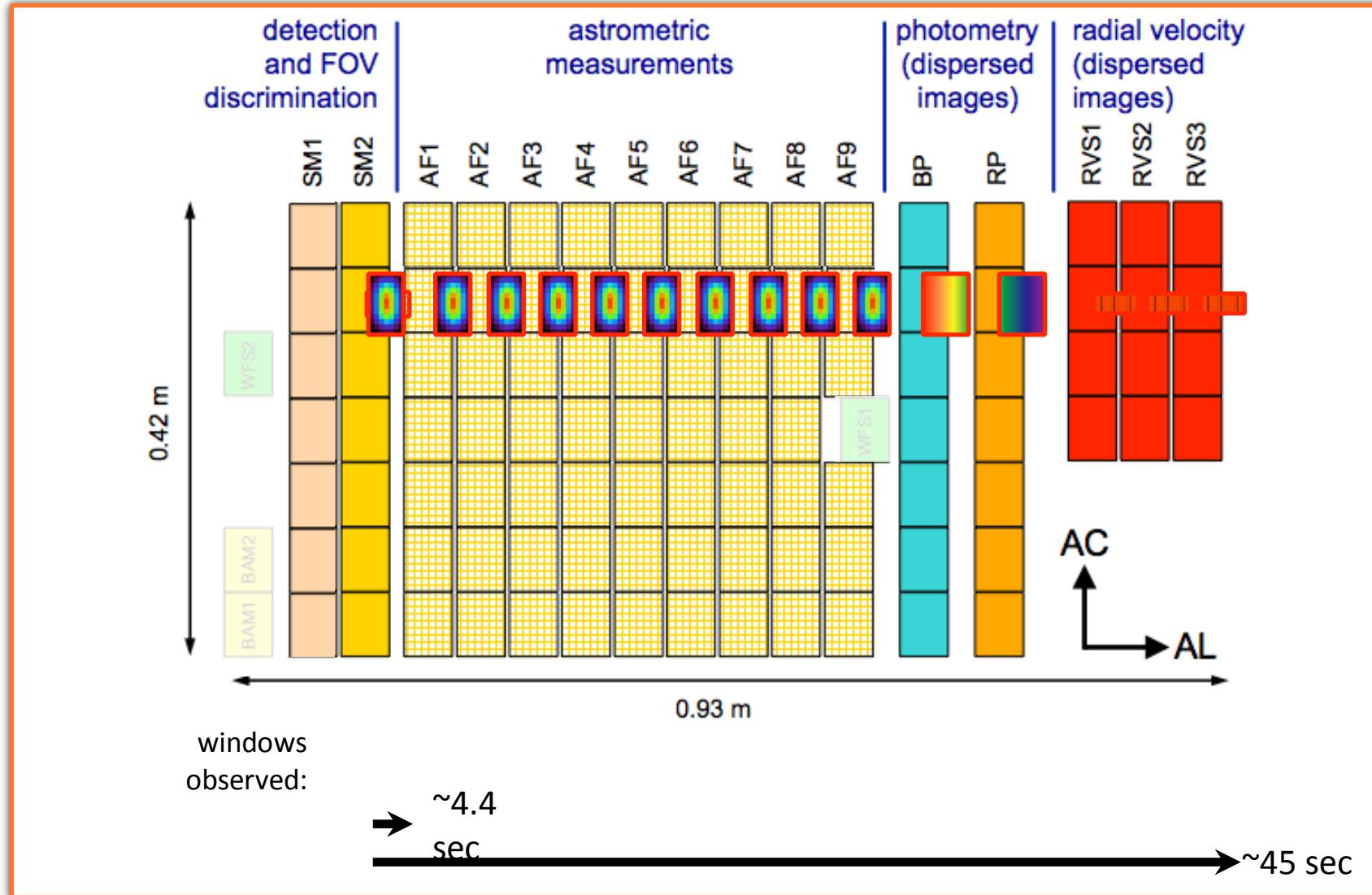
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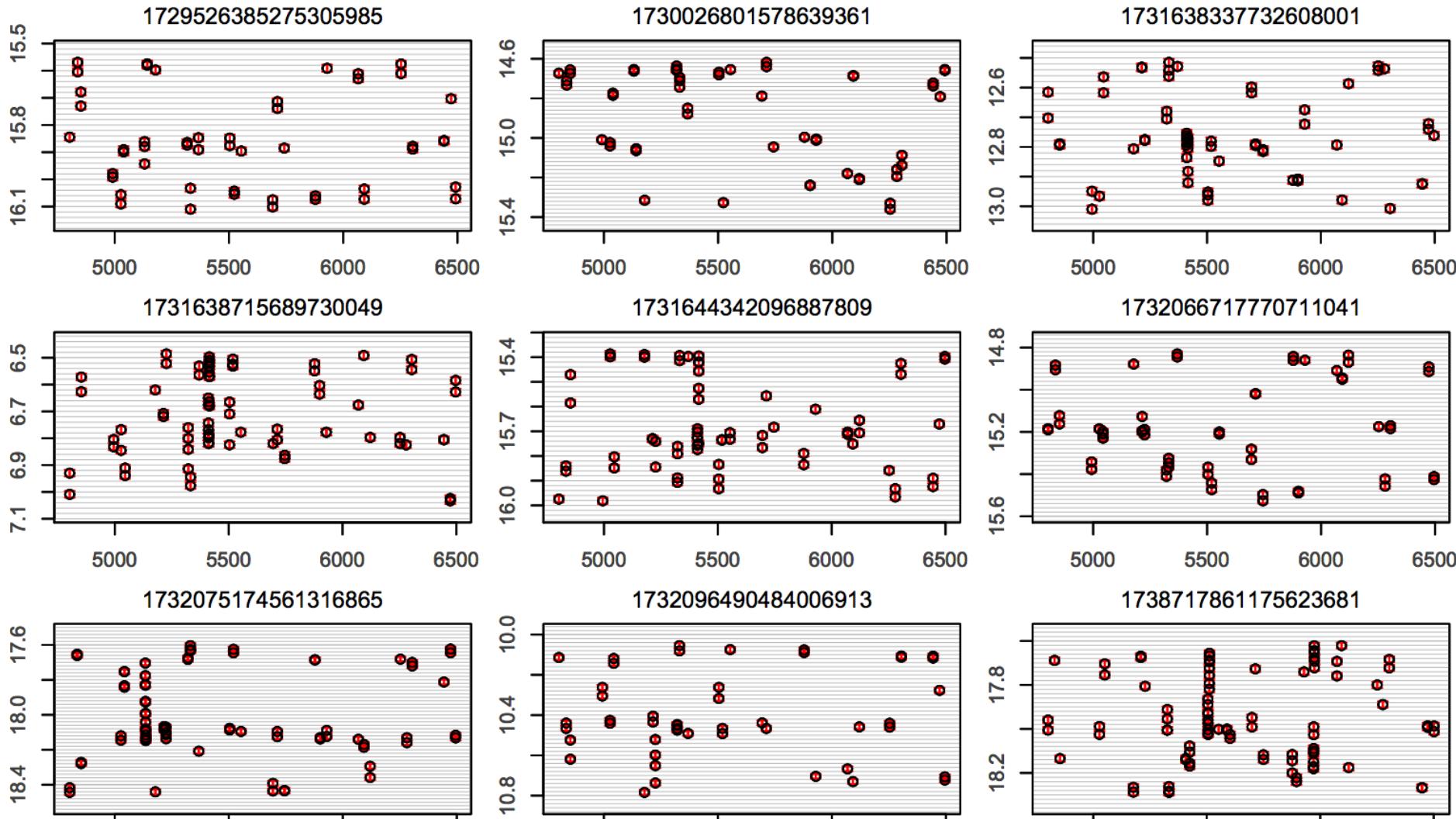
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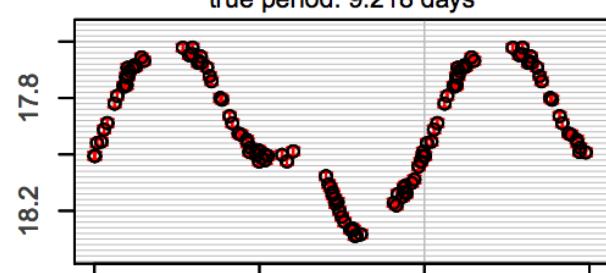
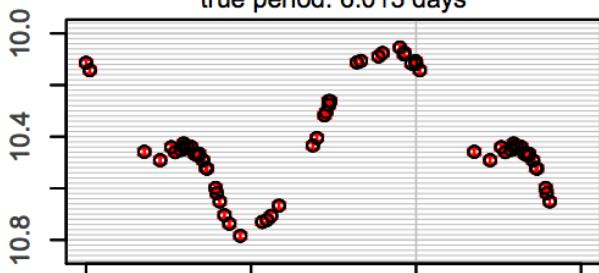
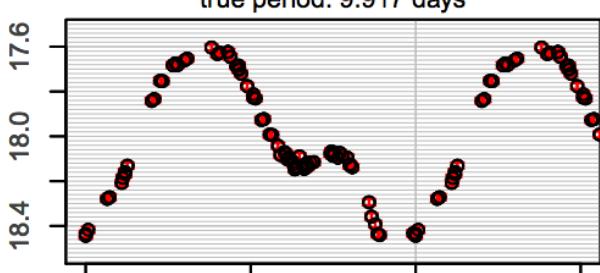
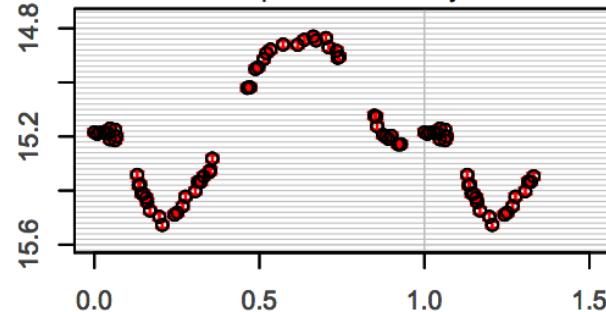
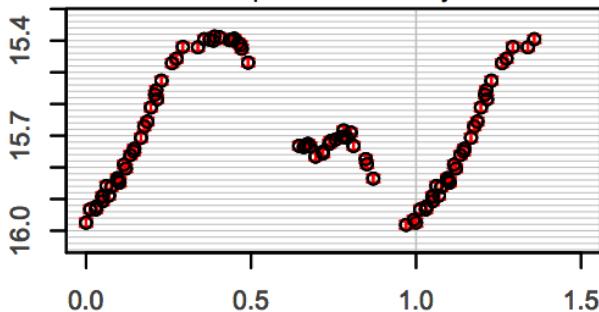
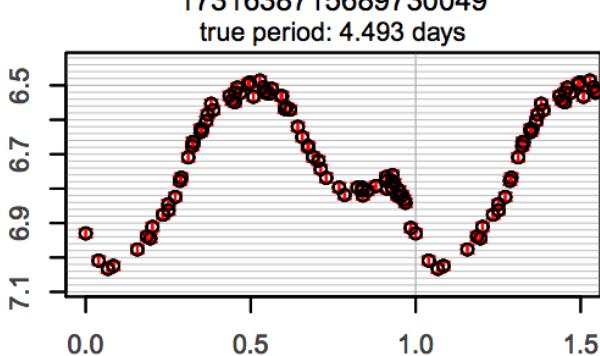
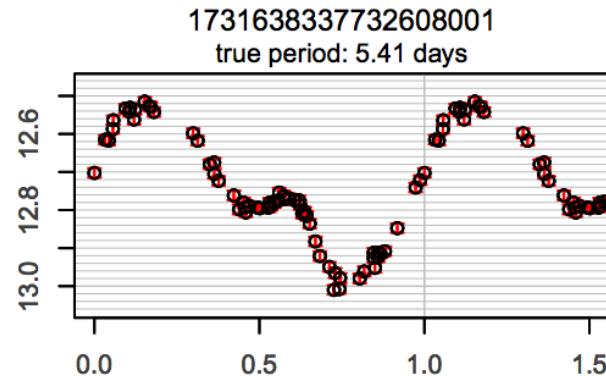
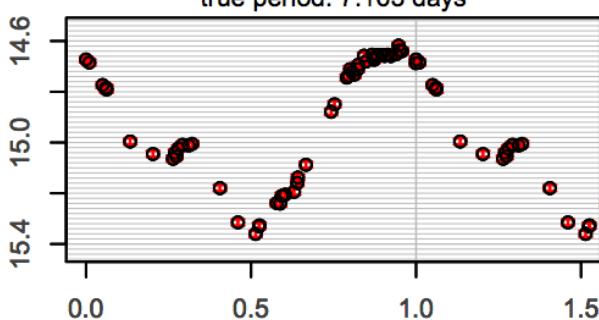
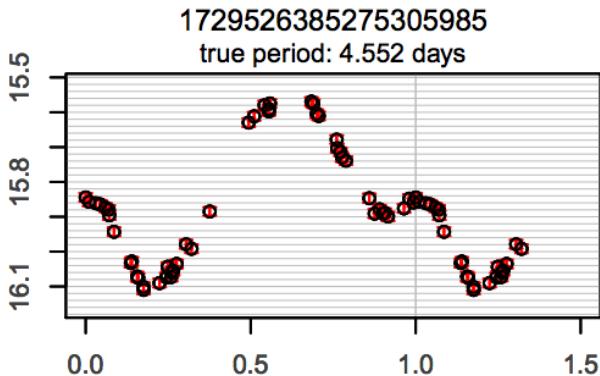
Lightcurves == Timeseries

GOG_RDS_10_B_TSX_XMATCH_cephied - G [mag] vs BJD [day]



Folded Lightcurves == Timeseries in phase

GOG_RDS_10_B_TSR_XMATCH_cephid - G [mag] vs phase



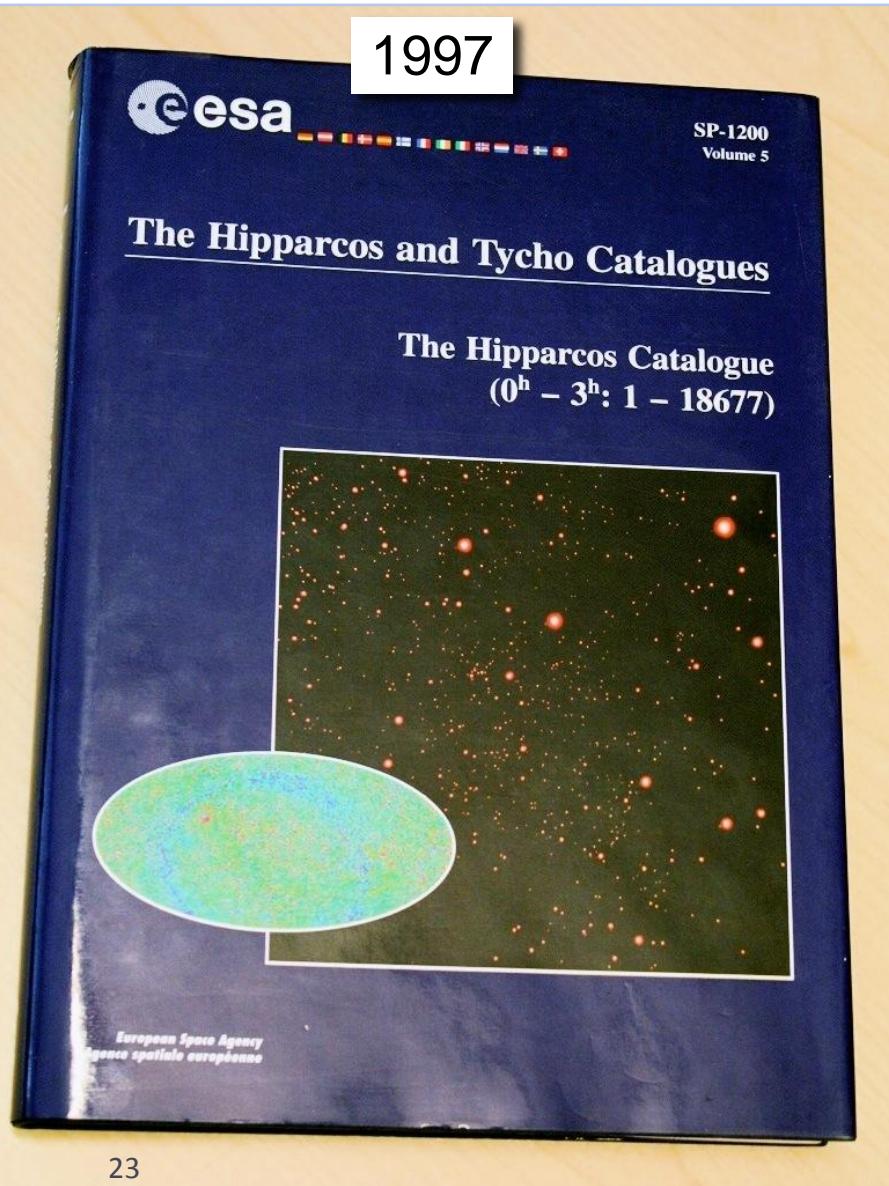
Hipparcos vs Gaia catalogue

Ultimate goal

Hipparcos vs Gaia catalogue

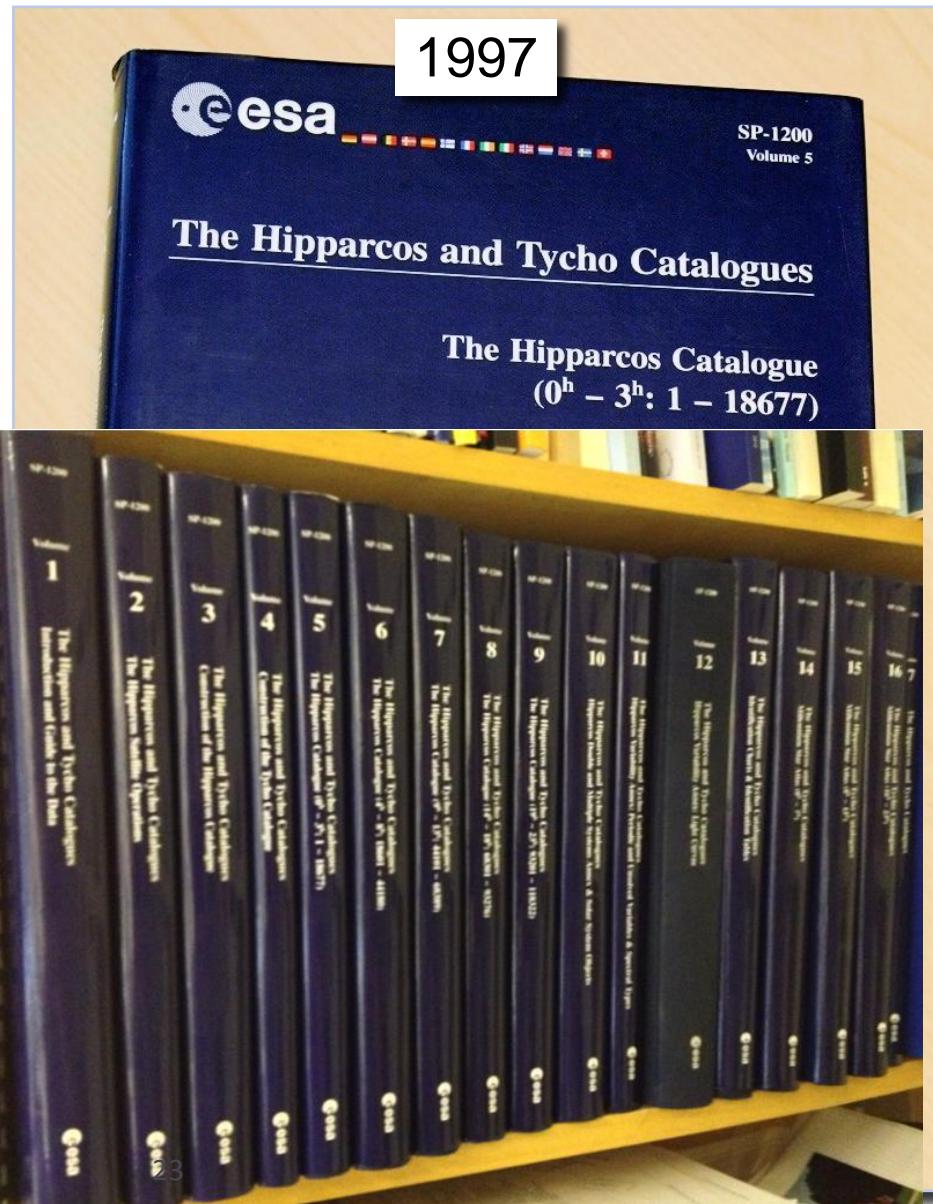
Ultimate goal

1997



Hipparcos vs Gaia catalogue

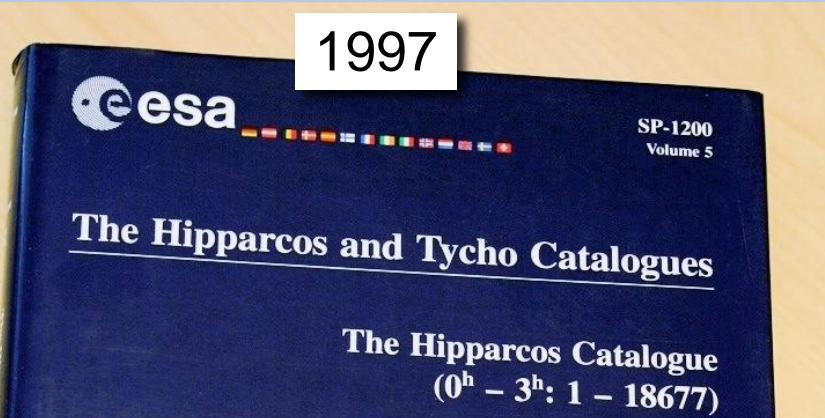
Ultimate goal



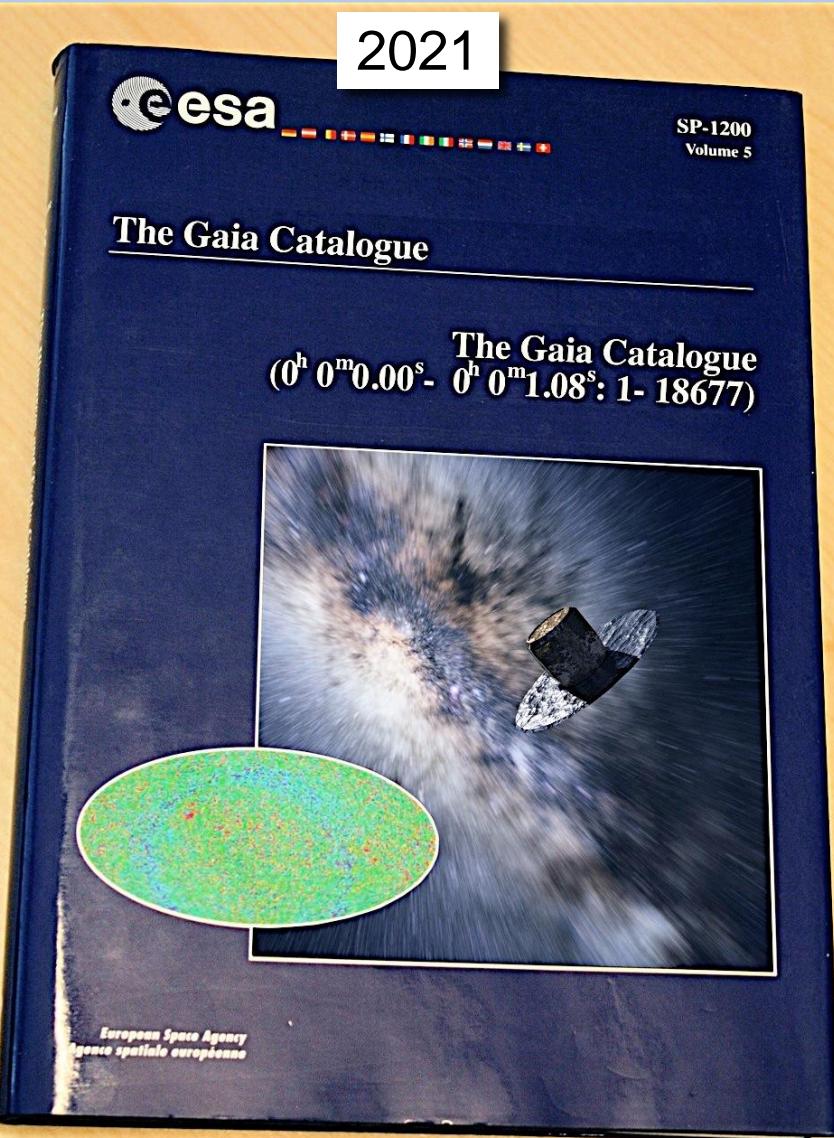
Hipparcos vs Gaia catalogue

Ultimate goal

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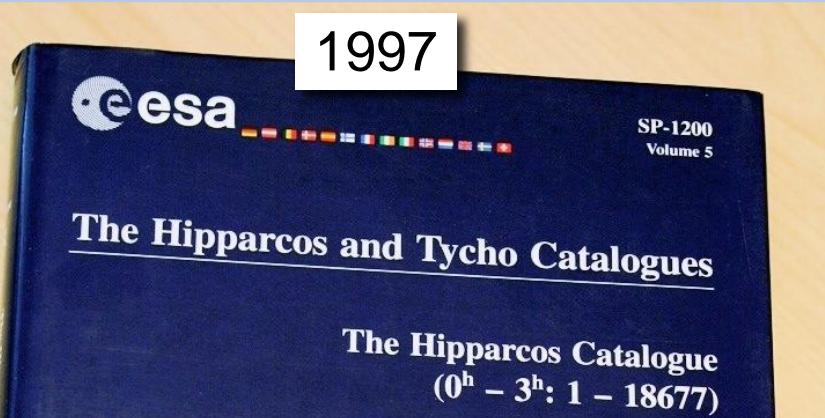
2021



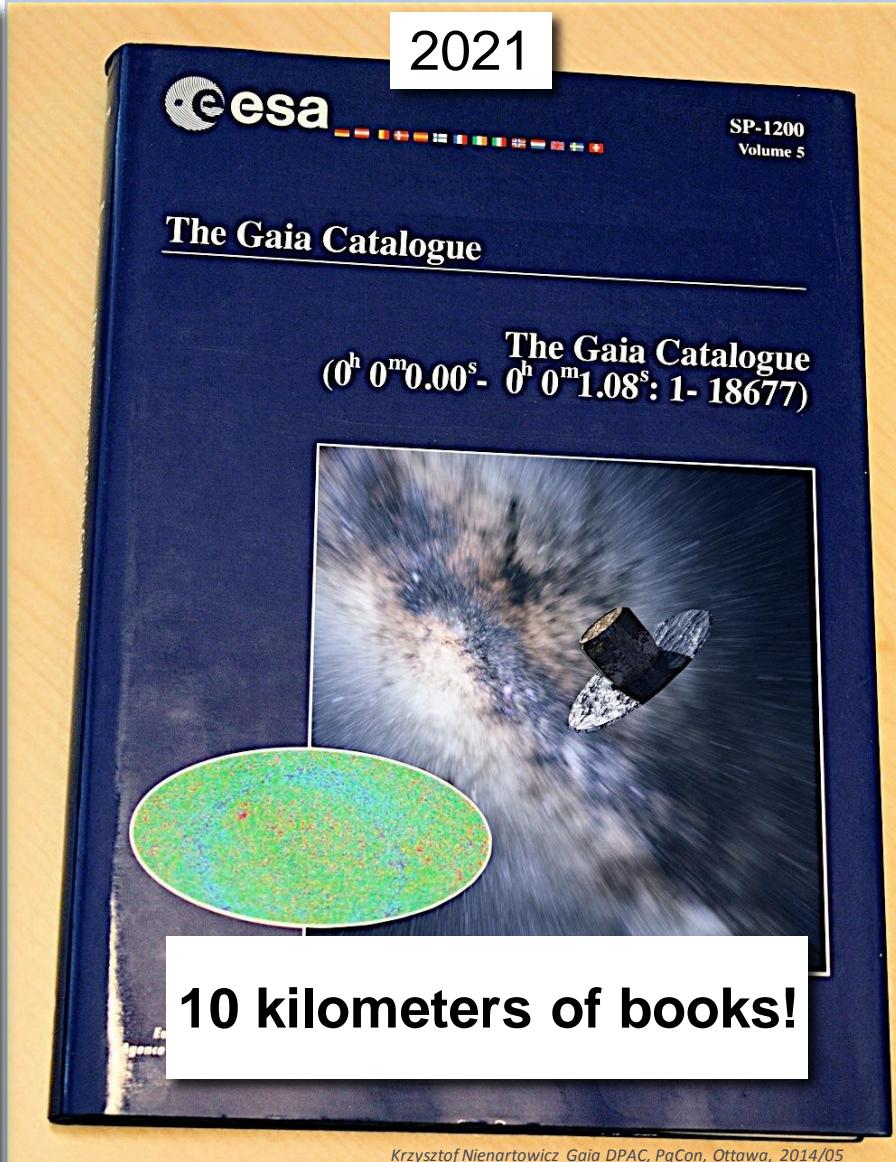
Hipparcos vs Gaia catalogue

Ultimate goal

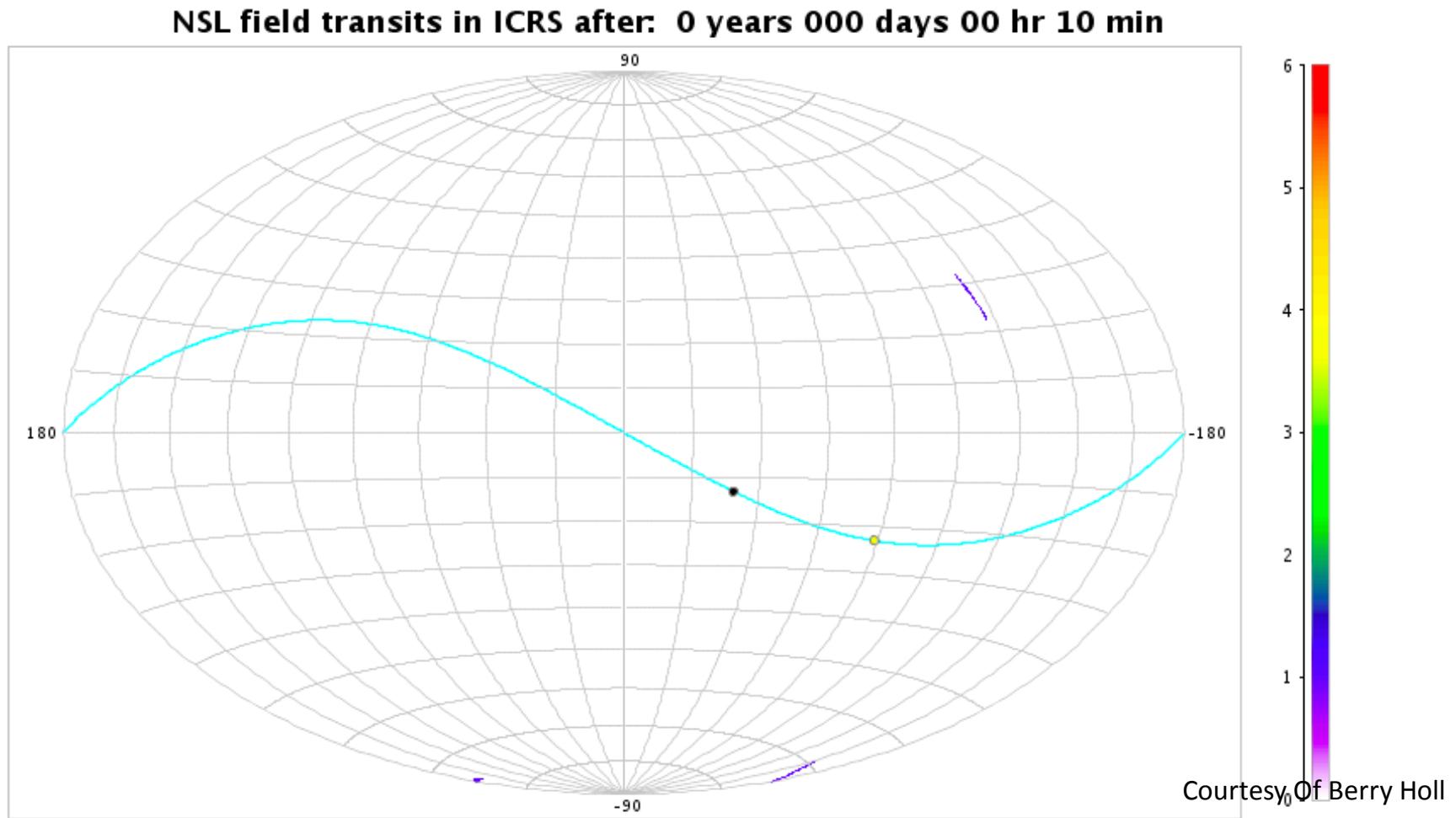
1997



2021



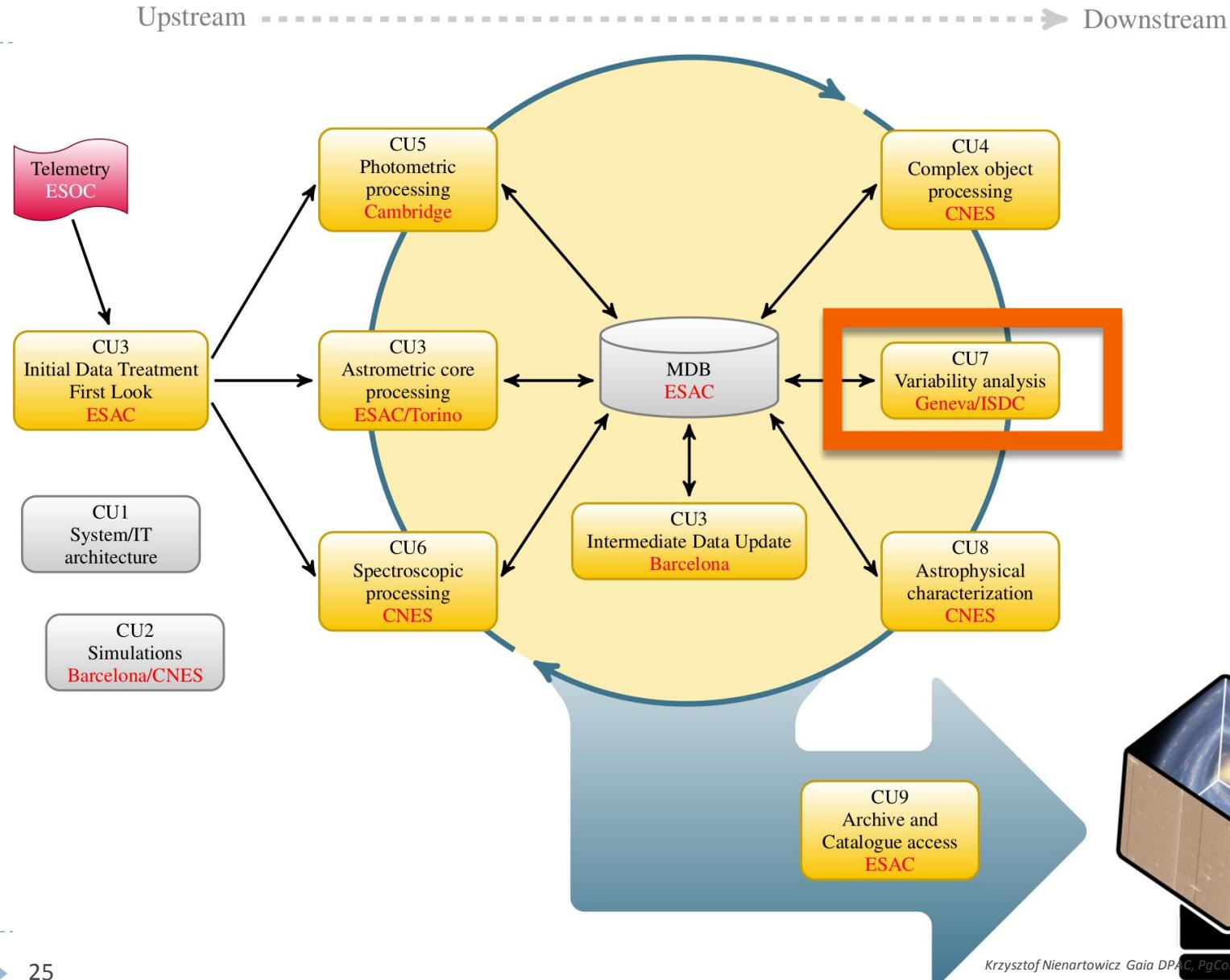
The Gaia scanning law



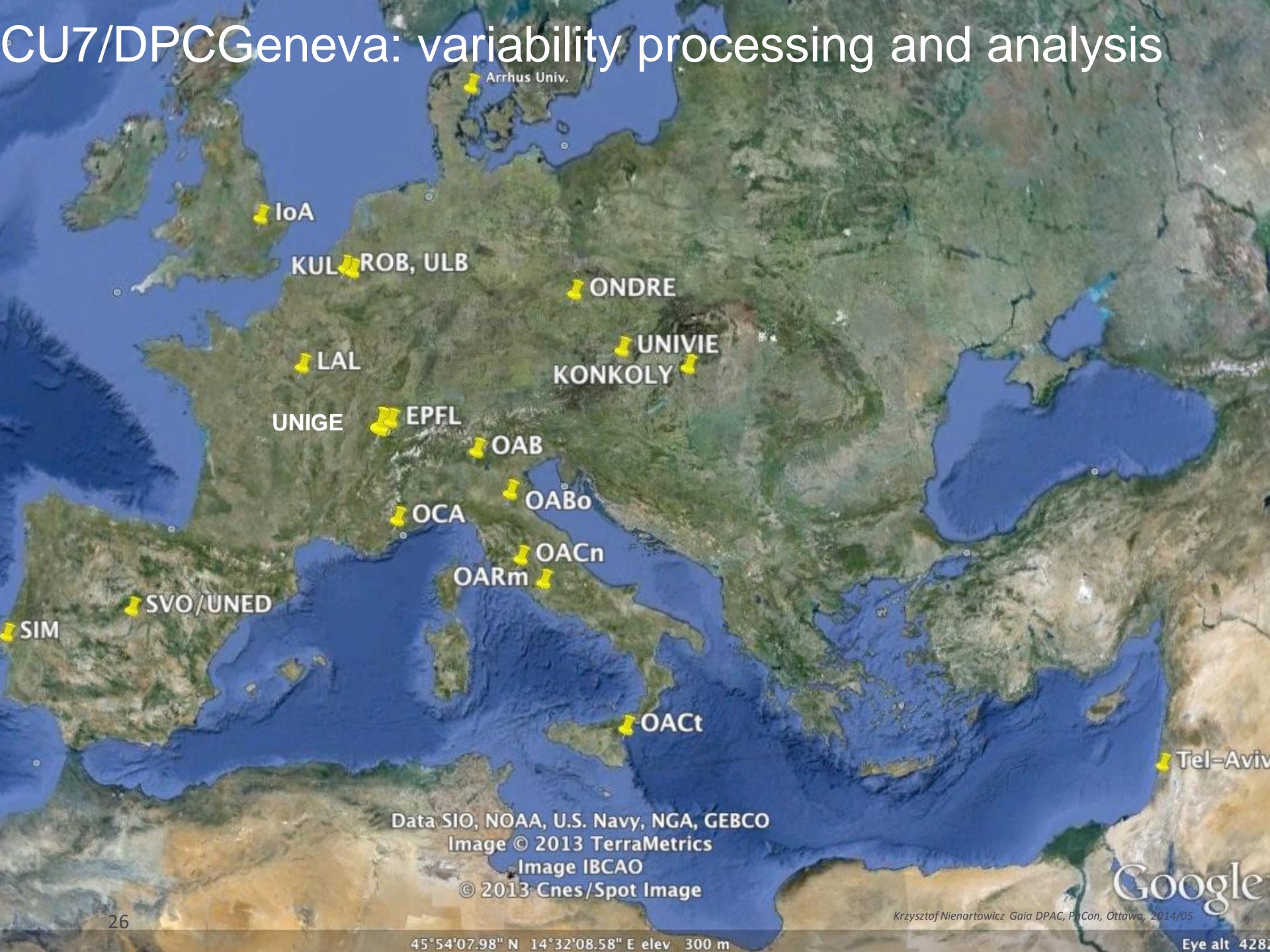
Mean of 70 G-band per-transit observations (40 - 250)

Gaia scientific responsibilities

Global dataflow



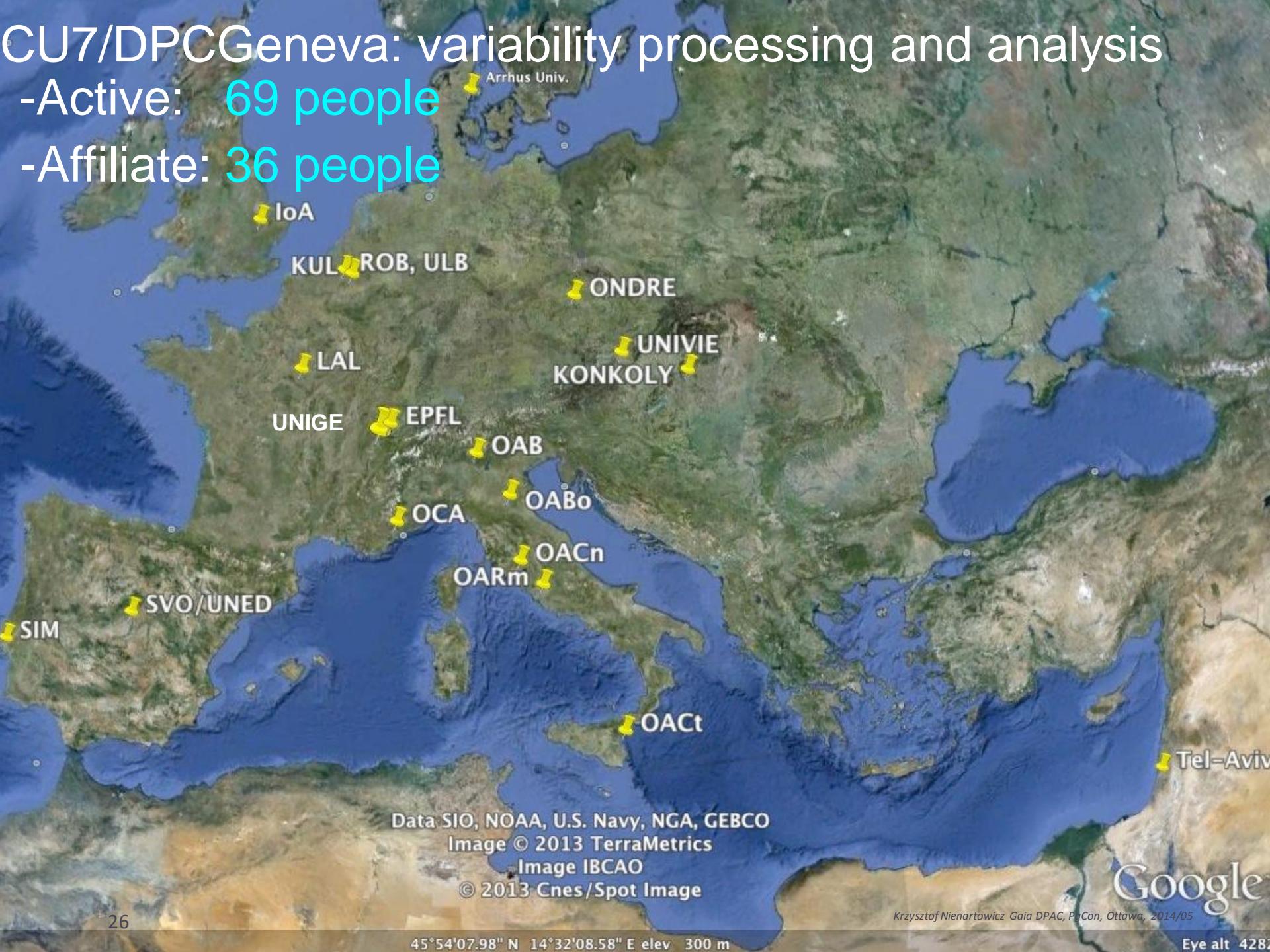
CU7/DPCGeneva: variability processing and analysis



CU7/DPCGeneva: variability processing and analysis

-Active: 69 people

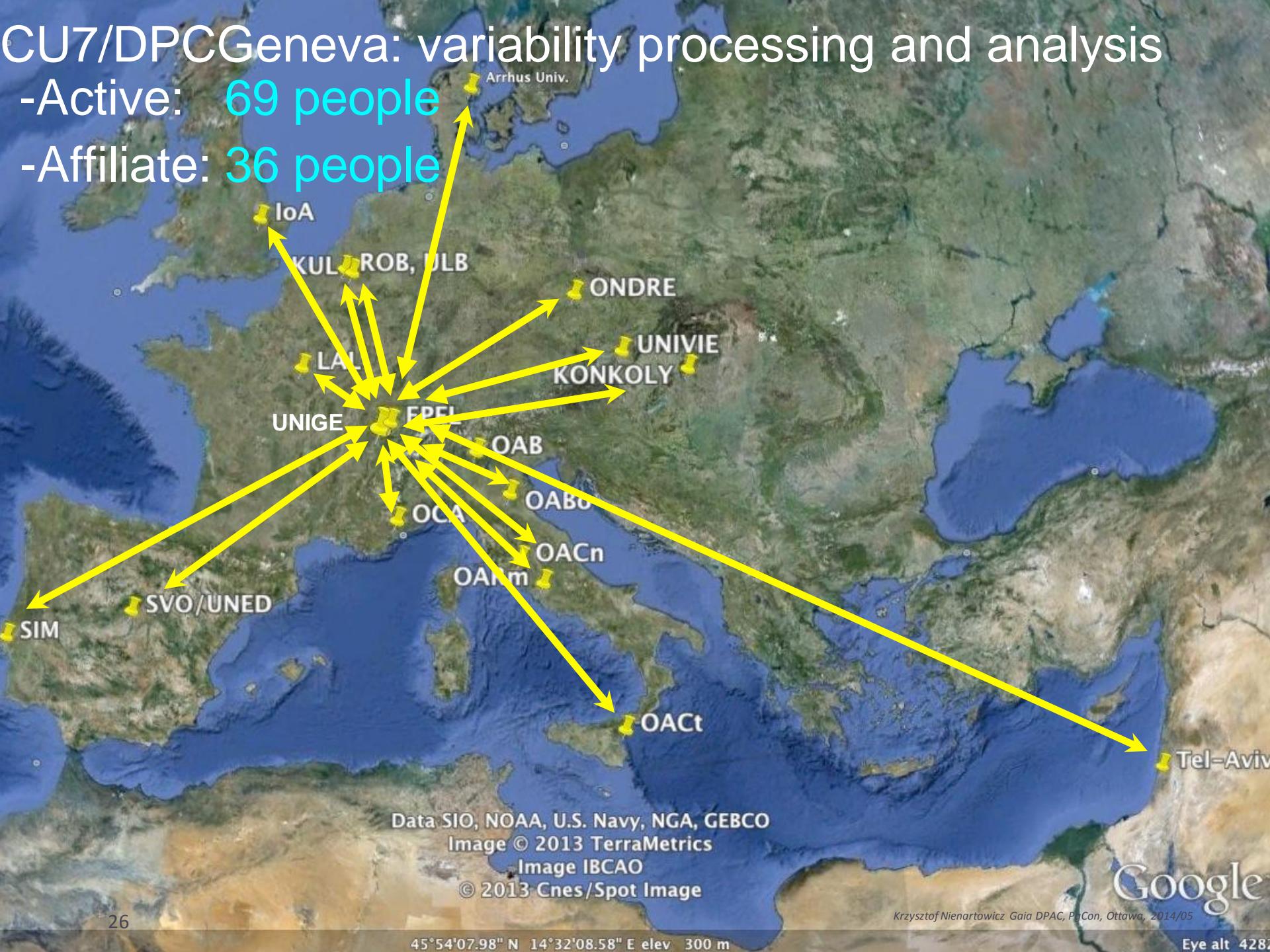
-Affiliate: 36 people



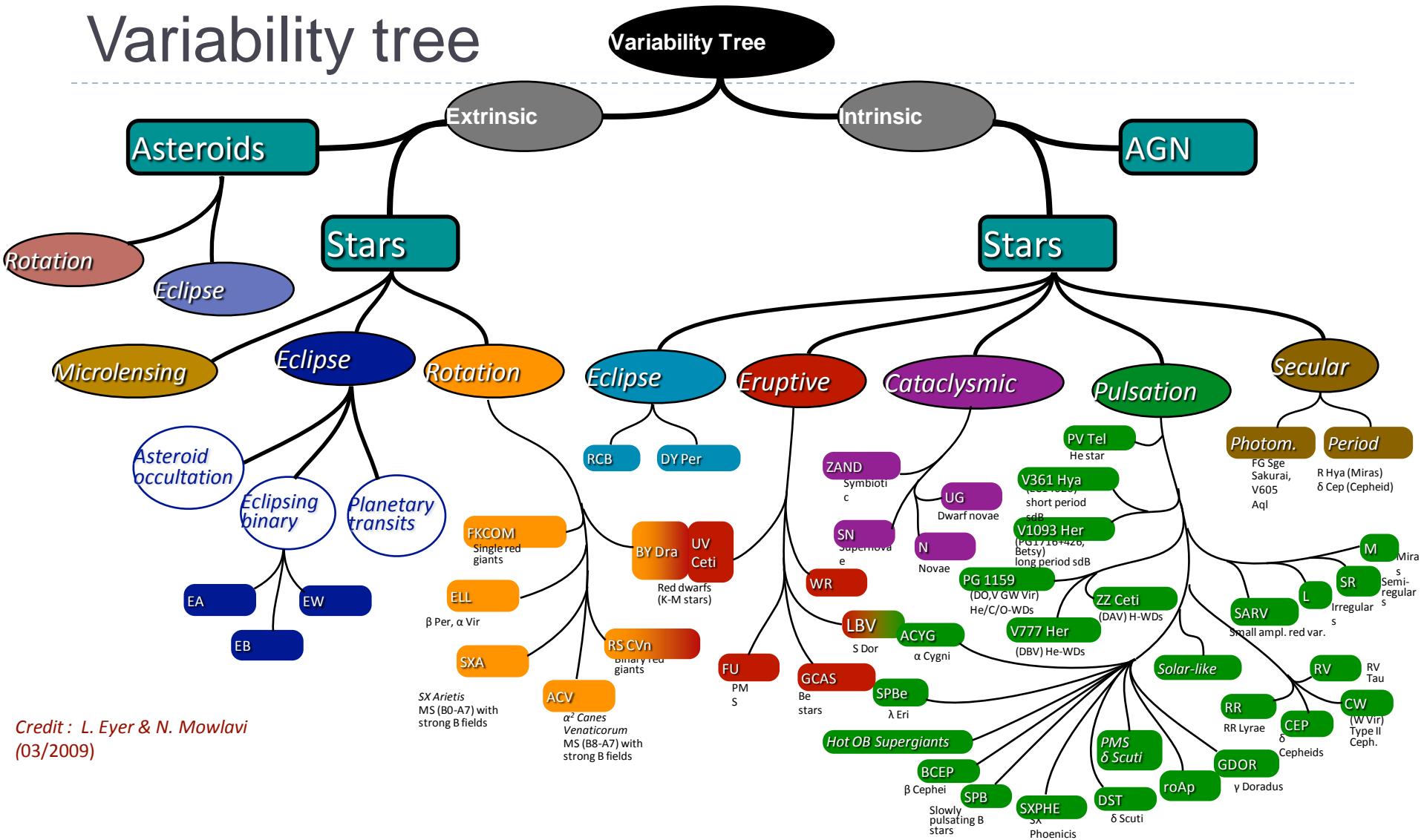
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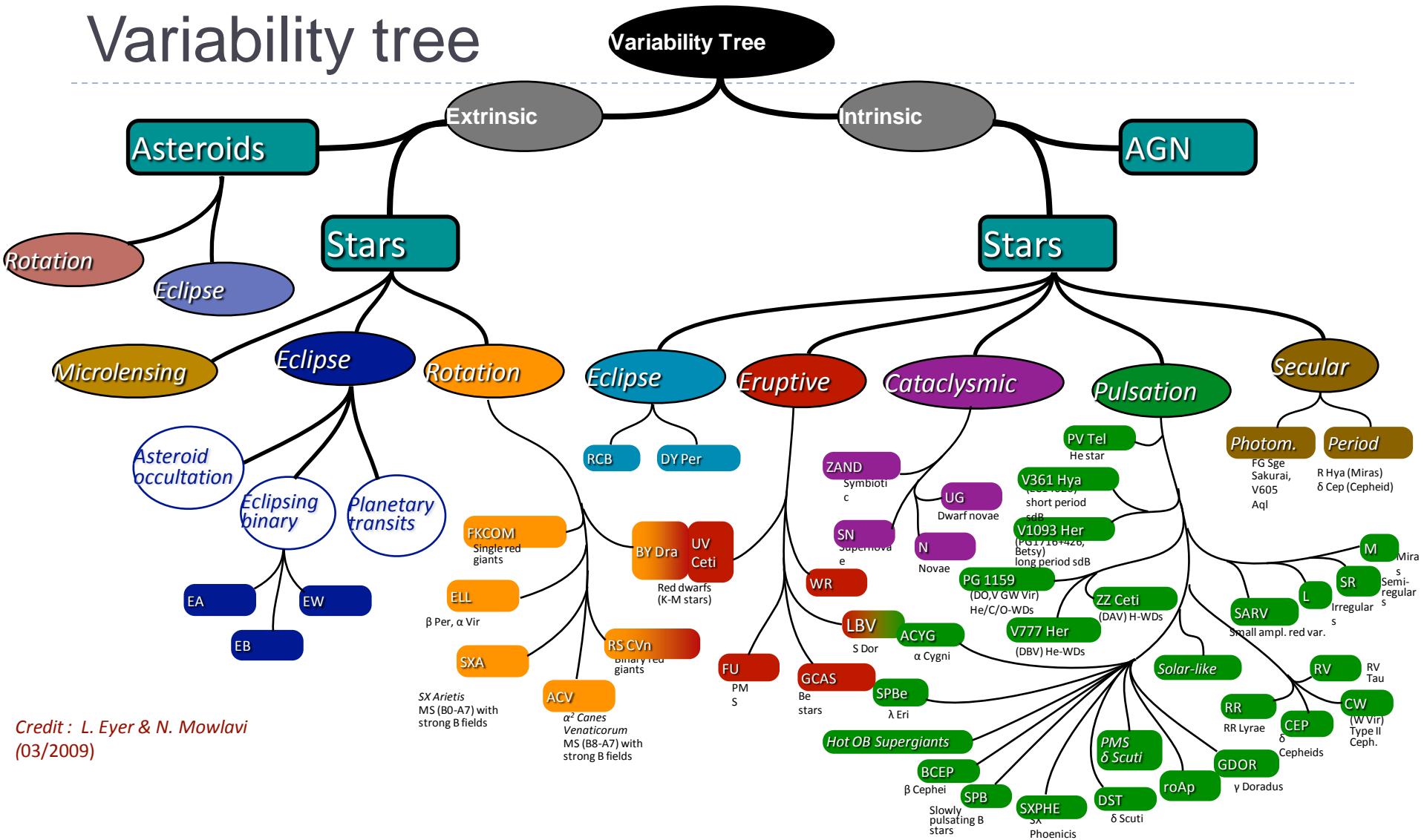
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Variability tree



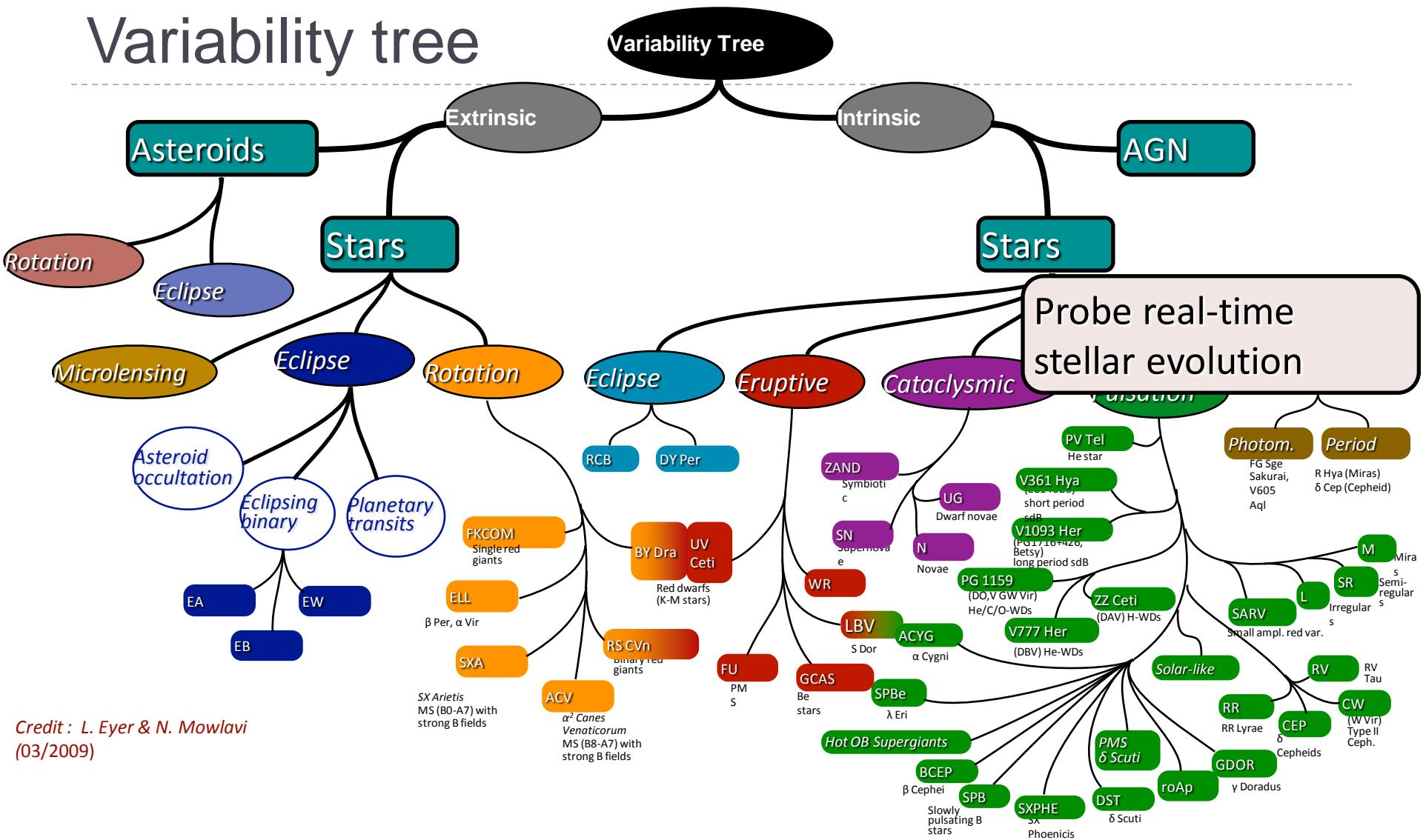
Variability tree



Credit : L. Eyer & N. Mowlavi
(03/2009)

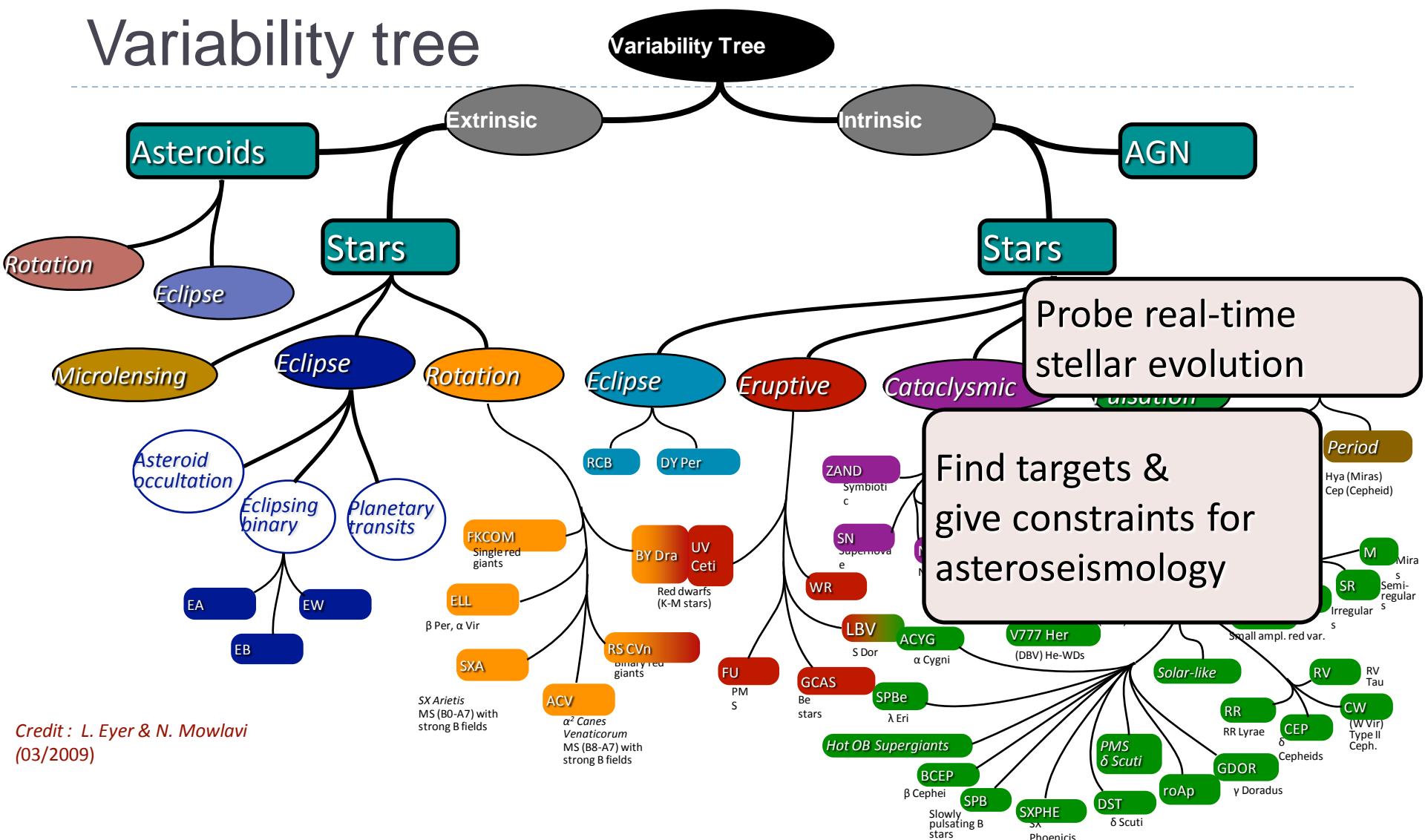
Gaia will detect most variable types on this tree

Variability tree



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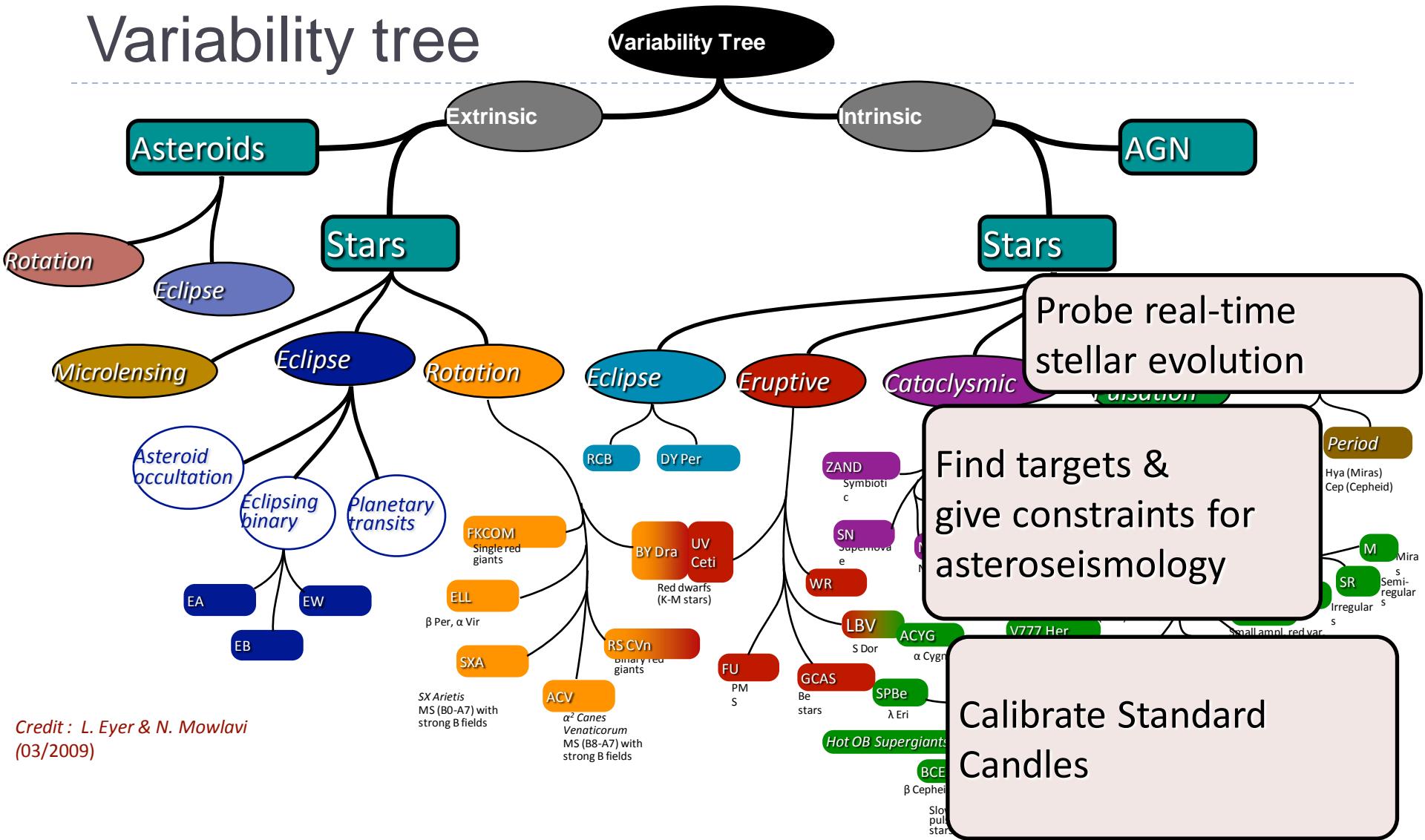
Variability tree



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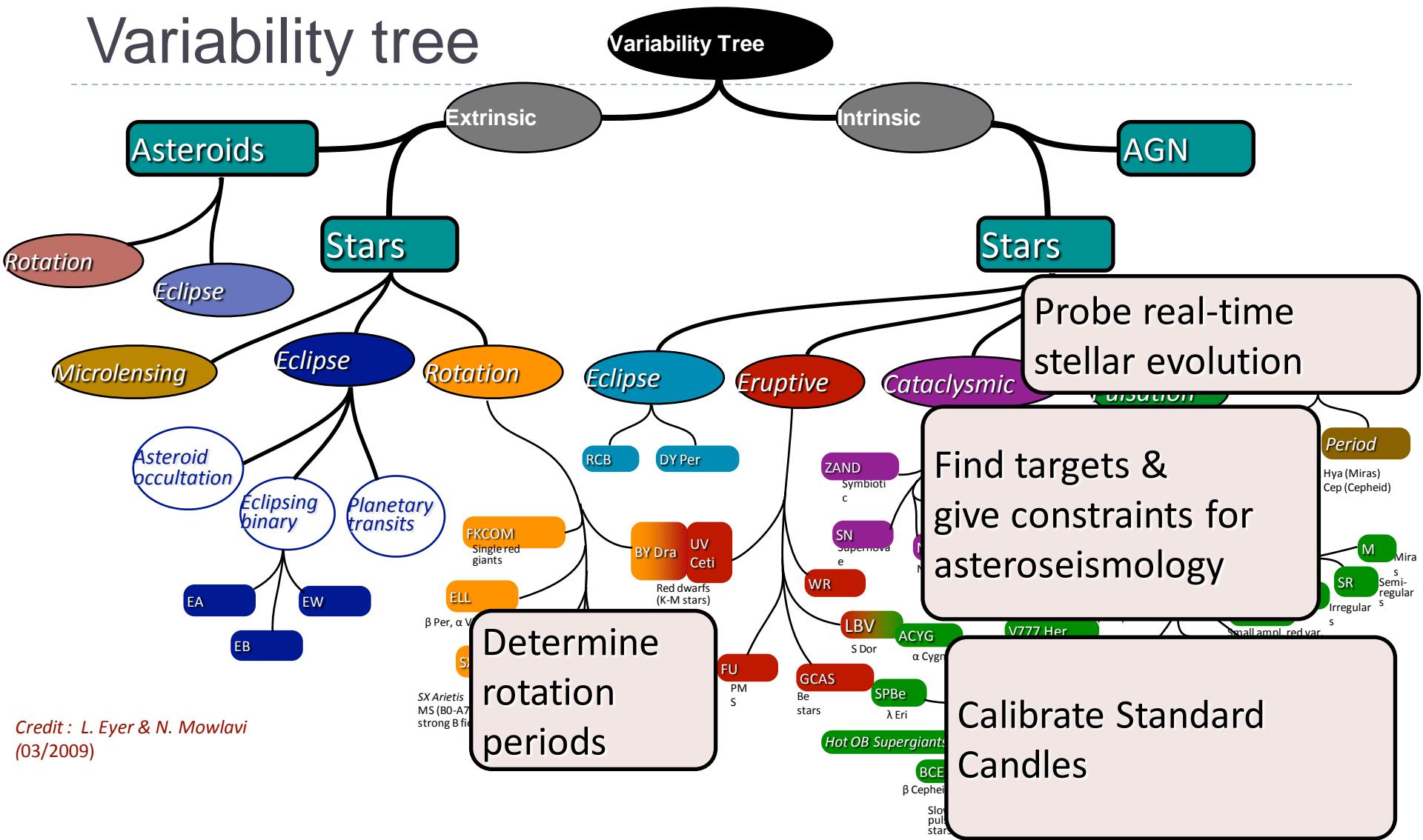
Variability tree



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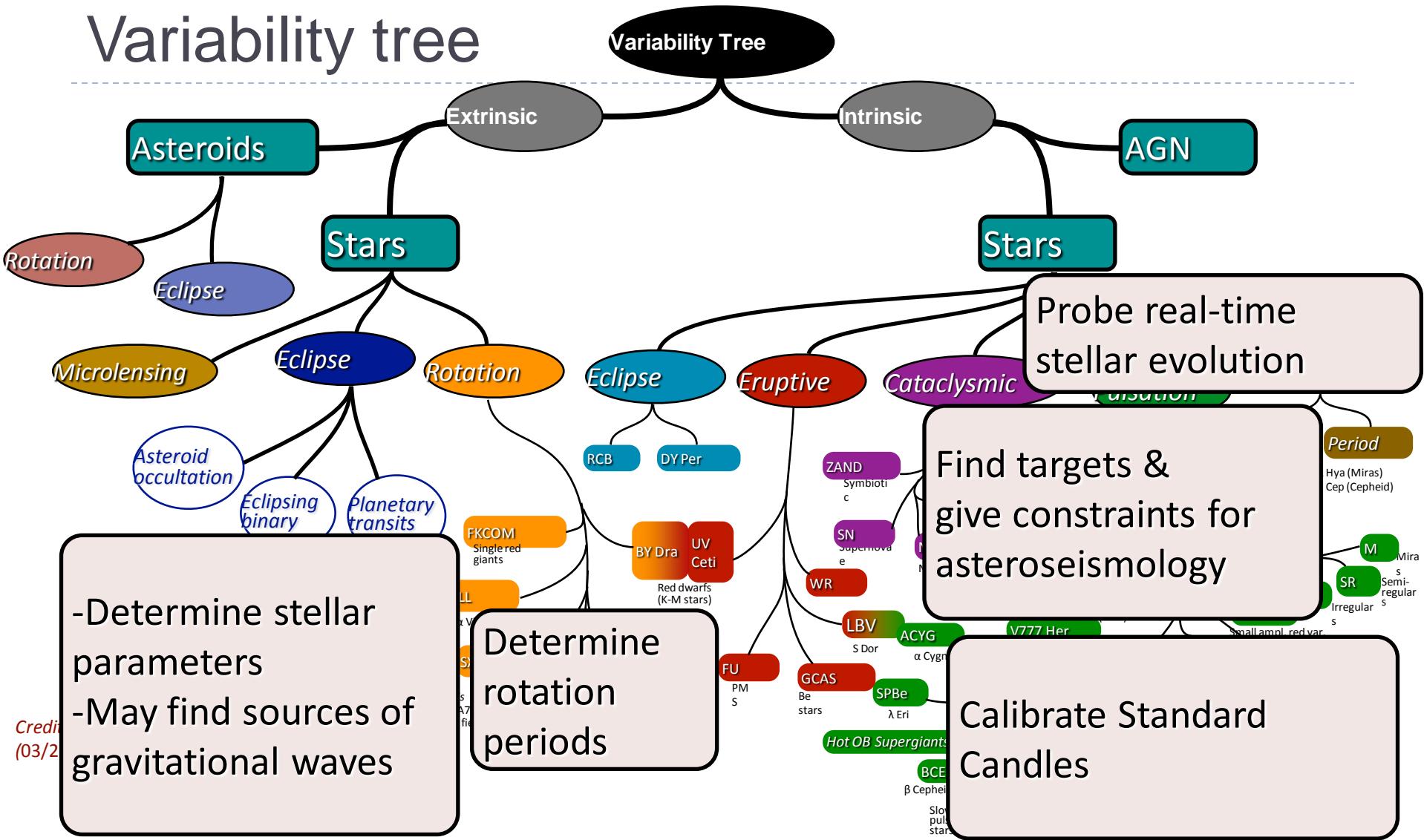
Variability tree



Credit : L. Eyer & N. Mowlavi
(03/2009)

Gaia will detect most variable types on this tree

Variability tree



Gaia will detect most variable types on this tree

Classification of variable objects

Random
Forest

Dubath et al.
2011

Similar study by Richards
et al. 2011

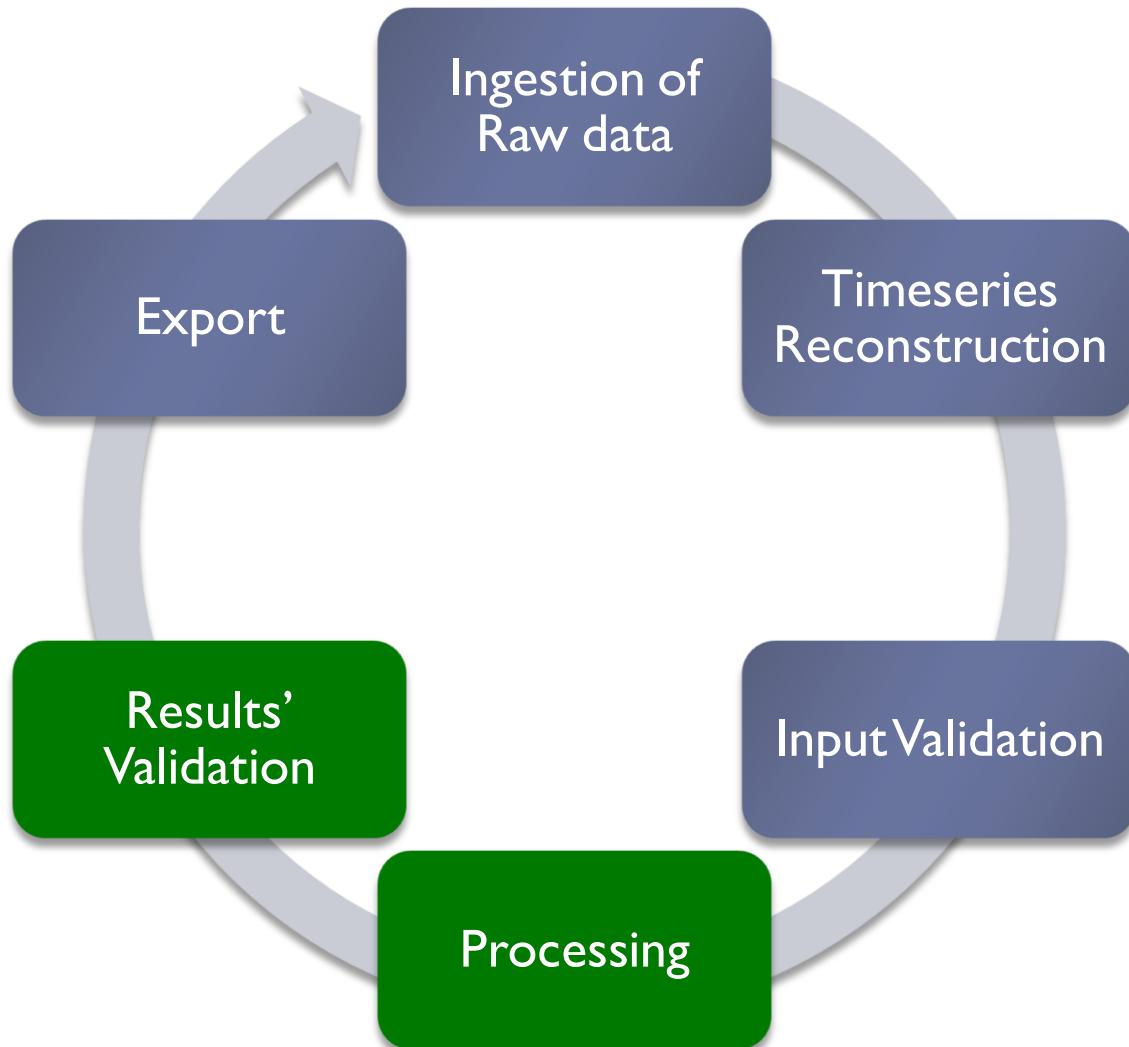
		Predicted Class																				True Class		
		EA	EB	EW	ELL	LPV	RV	CWA	CWB	DCEP	DCEPS	CEP(B)	RRAB	RRC	GDOR	DSCT	DSCTC	BCEP	SPB	BE+GCAS	ACYG	ACV	SXARI	BY+RS
214	13											1											EA	
19	191	28	2	1							2								1	4	3	2	2	EB
30	76											1											EW	
14			1															1	1	3	5	2	ELL	
				285																			LPV	
1					1					2	1												RV	
2						1				5													1	
1							2	2	1														CWA	
										183	5	1											CWB	
1										11	17												DCEP	
1										4	6												2	
												69	1										CEP(B)	
1												1	12										RRAB	
2	4																						RRC	
1													27										GDOR	
1	1											1		32	12								DSCT	
1													1	77									DSCTC	
1	1													1	26	1							BCEP	
																	1	74	1	4		SPB		
1																	5	2	4			BE+GCAS		
																	1	13	2	1		ACYG		
1																							ACV	
3												1					6			66		SXARI		
2																	2			3		BY+RS		
1													1										33	

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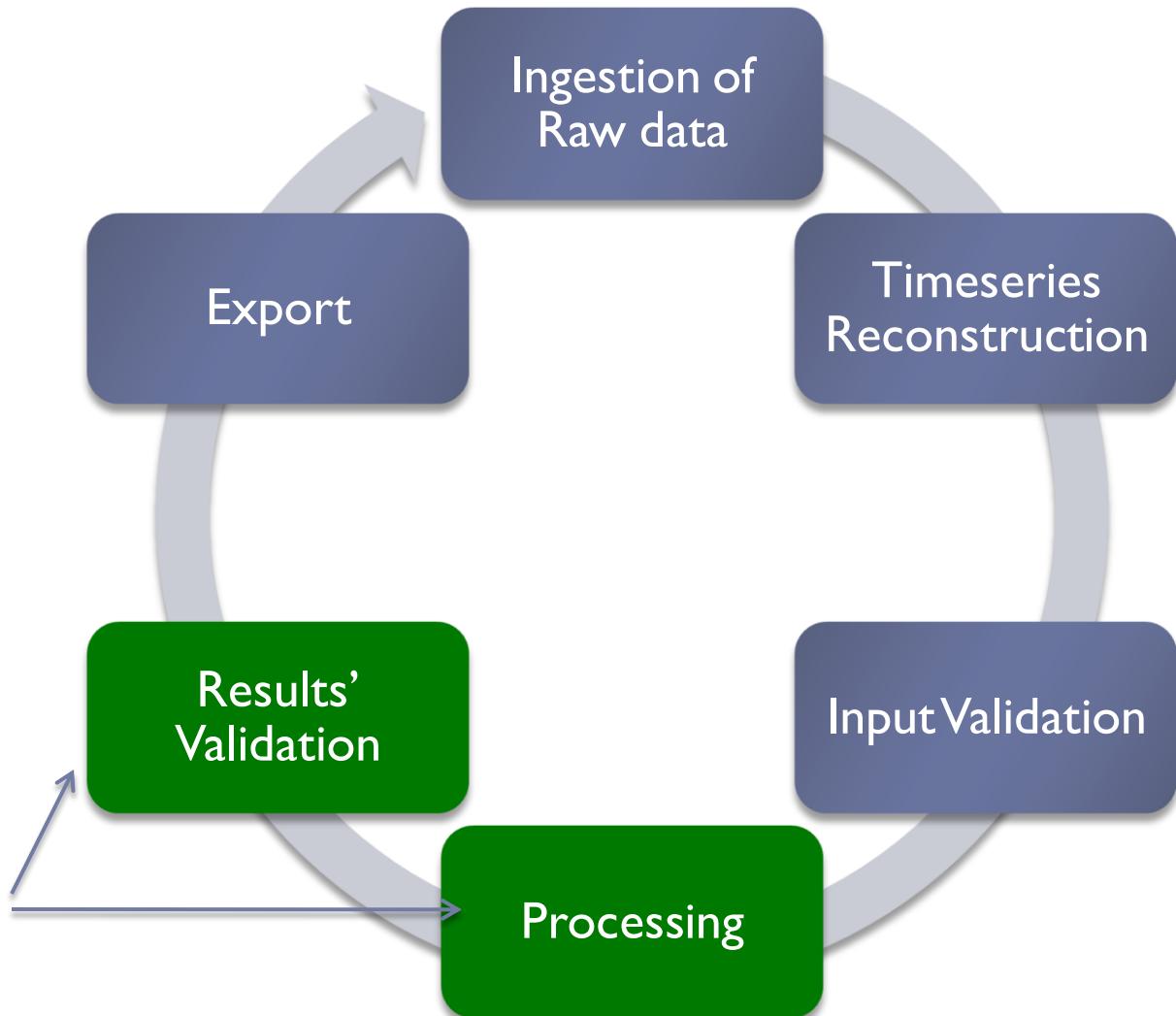
Cyclic Processing model

six months windows



Cyclic Processing model

six months windows

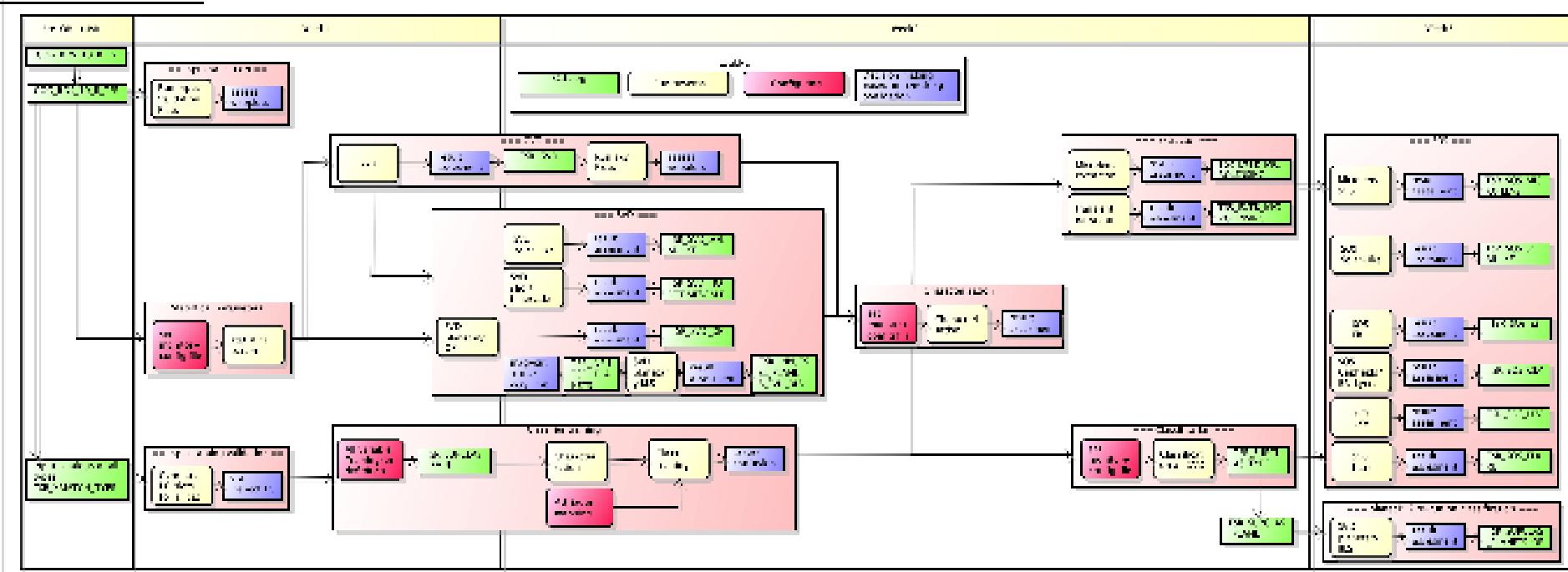


Cyclic Processing model

one month processing sub-cycle

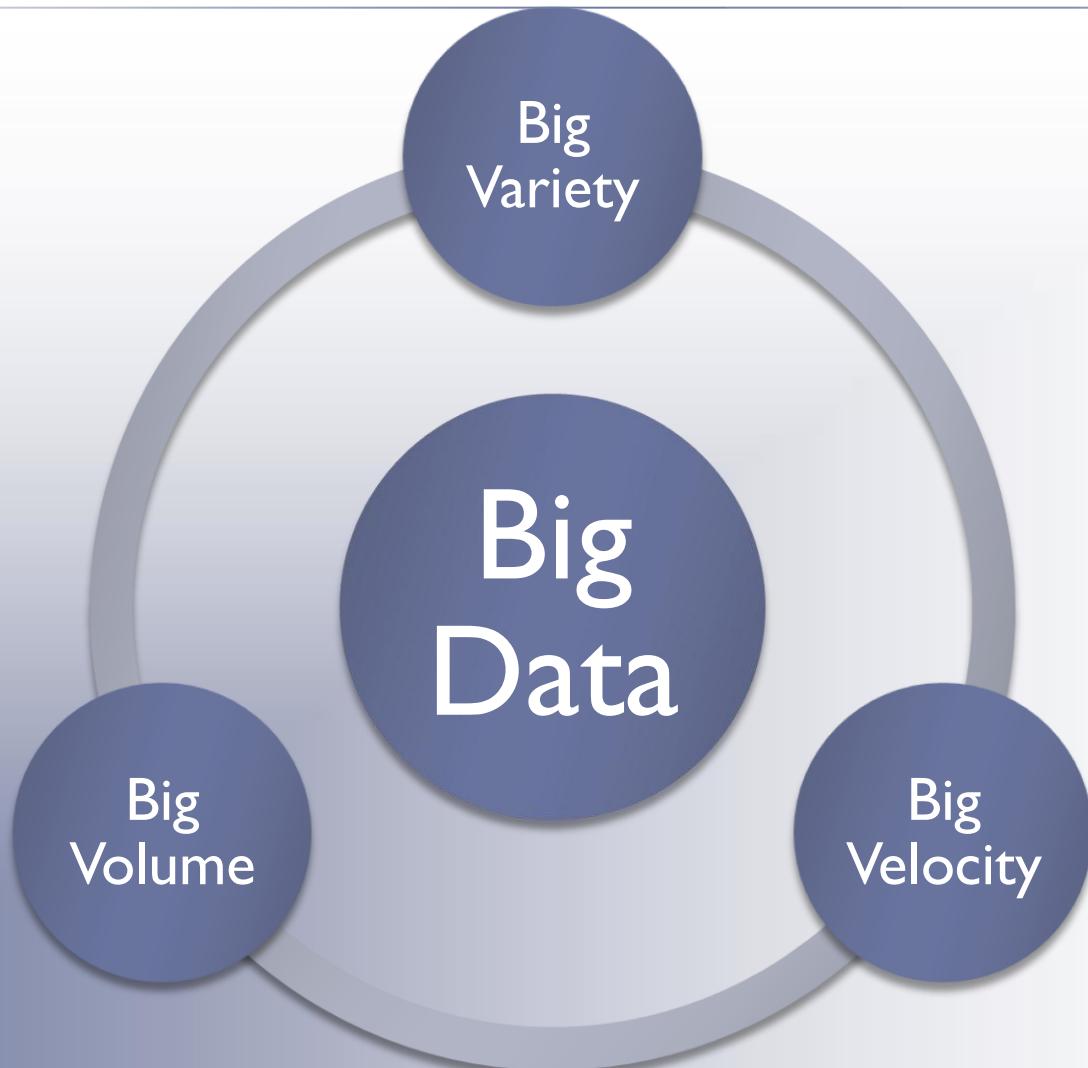
GOCIB-B OR activity diagram (3 Feb 2014)

2014-02-03



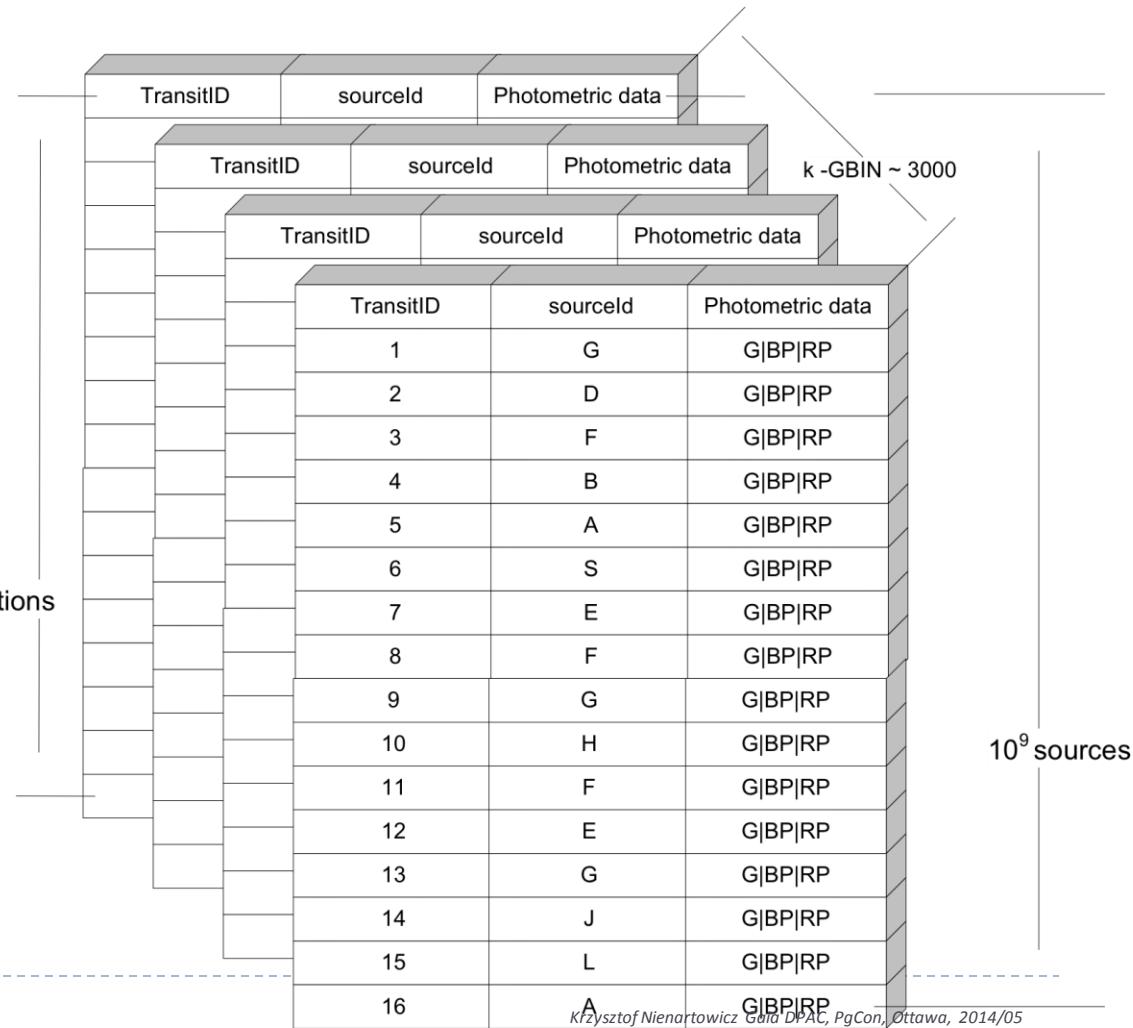
Big Data triangle

by M. Stonebreaker



Big Velocity i.e. Ingestion

- All AstroElementaries distributed over multiple files.
 - ▶ We do not know how exactly
- ▶ GBINs are slow. CPU bound, not IO bound. <1MB/s
- ▶ 900 sec/1GB
- ▶ ~ 500h just to read $10^9 \times 80$ entries (single threaded)
- ▶ ~ 3-7TB of FovTransits (depends on the compression, we have 1/3 of fields now => G band only) observations
 10^{11}
- ▶ ~3000 – 1GB compressed files to process for $10^9 \times 80$ tuples
- ▶ **Solution: Load into intermediate partitioned (distributed) table and run aggregating SQL reconstructing the timeseries**

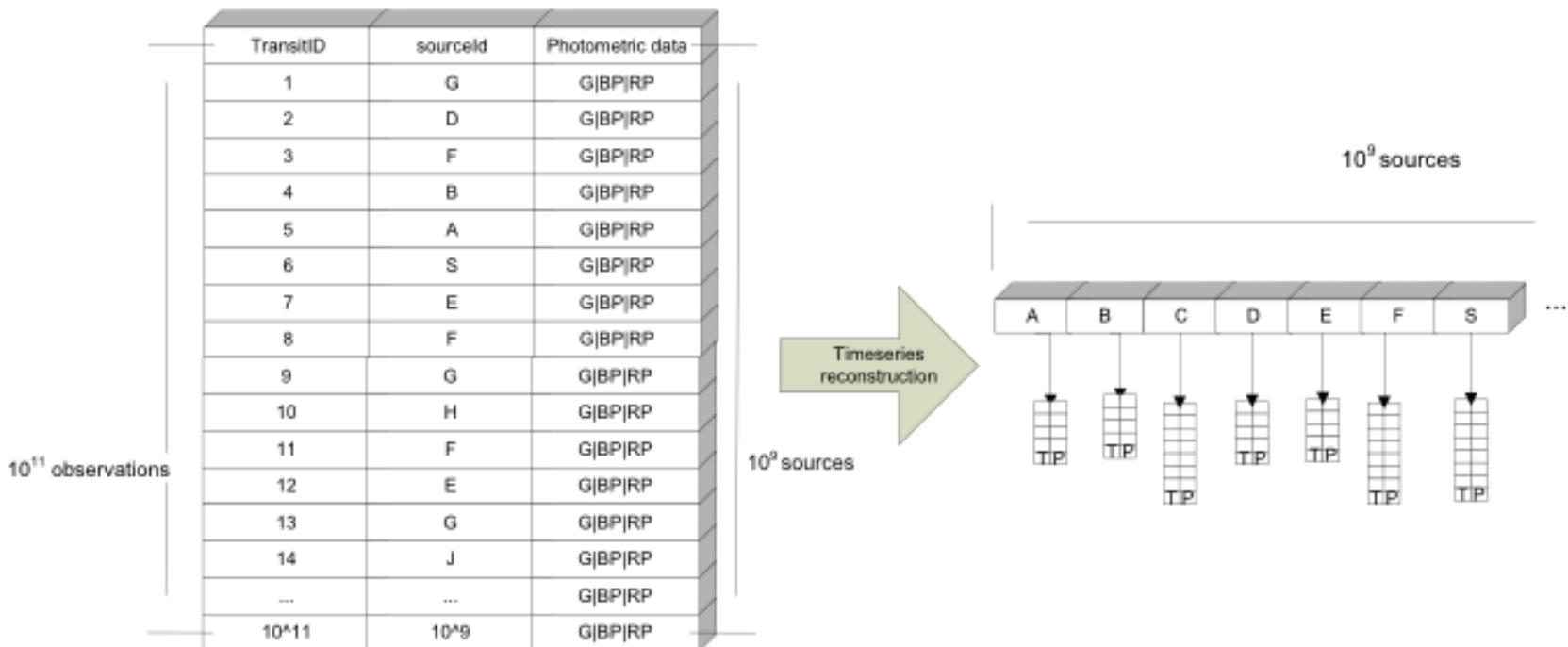


Timeseries reconstruction

```
insert into gog_rds_10_c.ts(catalogid,sourceid,fvaluetype,obstimes,ftimeseriestype,vals,valserr,flags)
    -- convert and pivot data
    select
        gog_rds_10_c.getcatalogId('GOG_RDS_10_C') catalogid,
        sourceid,
        0 fvaluetype, -- flux type
        obs,
        unnest(v).*,
        StatusFlag from (
            select
                sourceid, converttobyte(a(array_agg(convertedTransitid))) obs,
                array[
                    (getTsTypeId('GOG_RDS_10_C','GAIA_PHOT_G')), converttobyte(a(array_agg(gflux))), converttobyte(a(array_agg(GFLuxError))) )::ts_buckets_bin
                    (getTsTypeId('GAIA','BP')), converttobyte(a(array_agg(BPFlux))), converttobyte(a(array_agg(BPFluxError))) )::ts_buckets_bin ,
                    (getTsTypeId('GAIA','RP')), converttobyte(a(array_agg(RpFlux))), converttobyte(a(array_agg(RpFluxError))) )::ts_buckets_bin
                ] v
                ,convertinttobyte(a(array_agg(StatusFlag))) StatusFlag
            from (select ((transitid >> 5) & CAST(x'003FFFFFFF000' AS bigint))::bigint * 50 / 10^9 / 60 / 60/ 24 convertedTransitid, calphot.* 
                from gog_rds_10_C.calphotfovtransitimpl calphot join source s on (calphot.sourceid = s.sourceid) order by calphot.sourceid,1 ) a
                group by sourceid
        ) pivoted
    ;
```

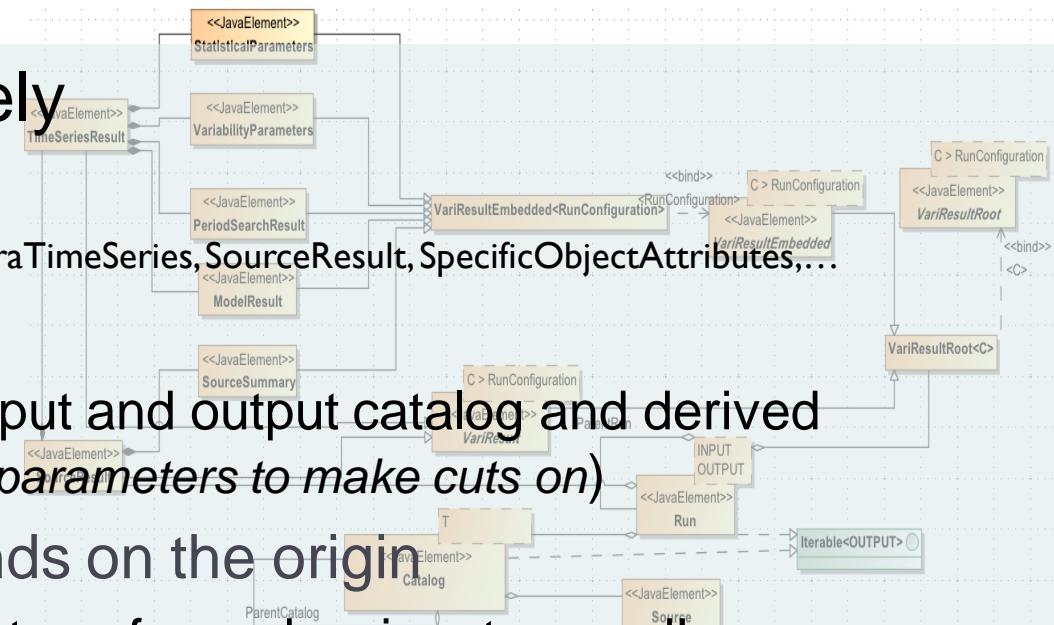


Timeseries reconstruction



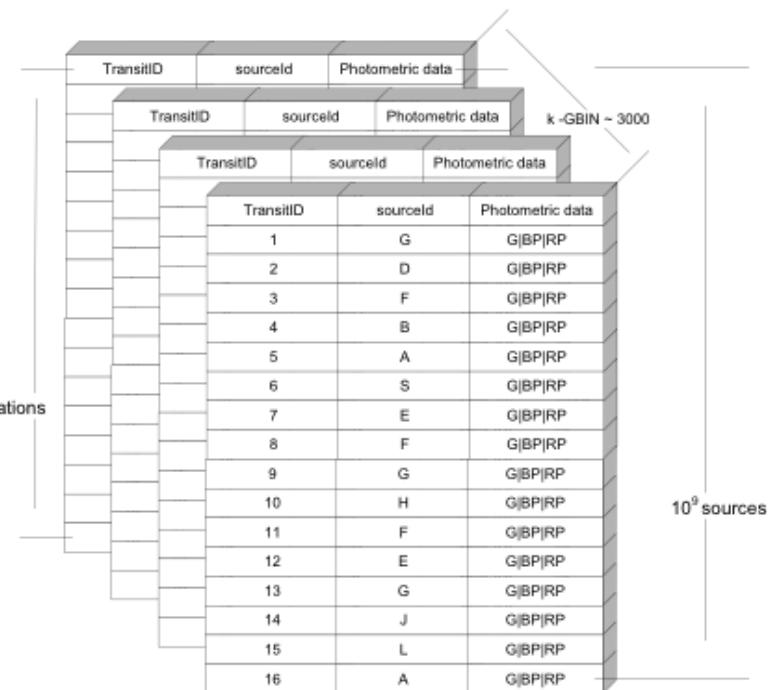
Big Variety

- ▶ CU7 OM has approximately
 - ▶ ~ 70 domain classes
 - ▶ Source, Timeseries, SpectraTimeSeries, SourceResult, SpecificObjectAttributes,...
 - ▶ Attributes
 - ▶ Possibly tens to hundreds input and output catalog and derived attributes used in analytics (*parameters to make cuts on*)
 - ▶ Input transformation depends on the origin
 - ▶ Gaia ~ 5-10 MDB tables are transformed on input – good!
 - ▶ Other surveys
 - From semi/quasi structured to structured formats -EAV
 - ▶ Production of the output is rather simple
 - ▶ Analyzing it: Not!



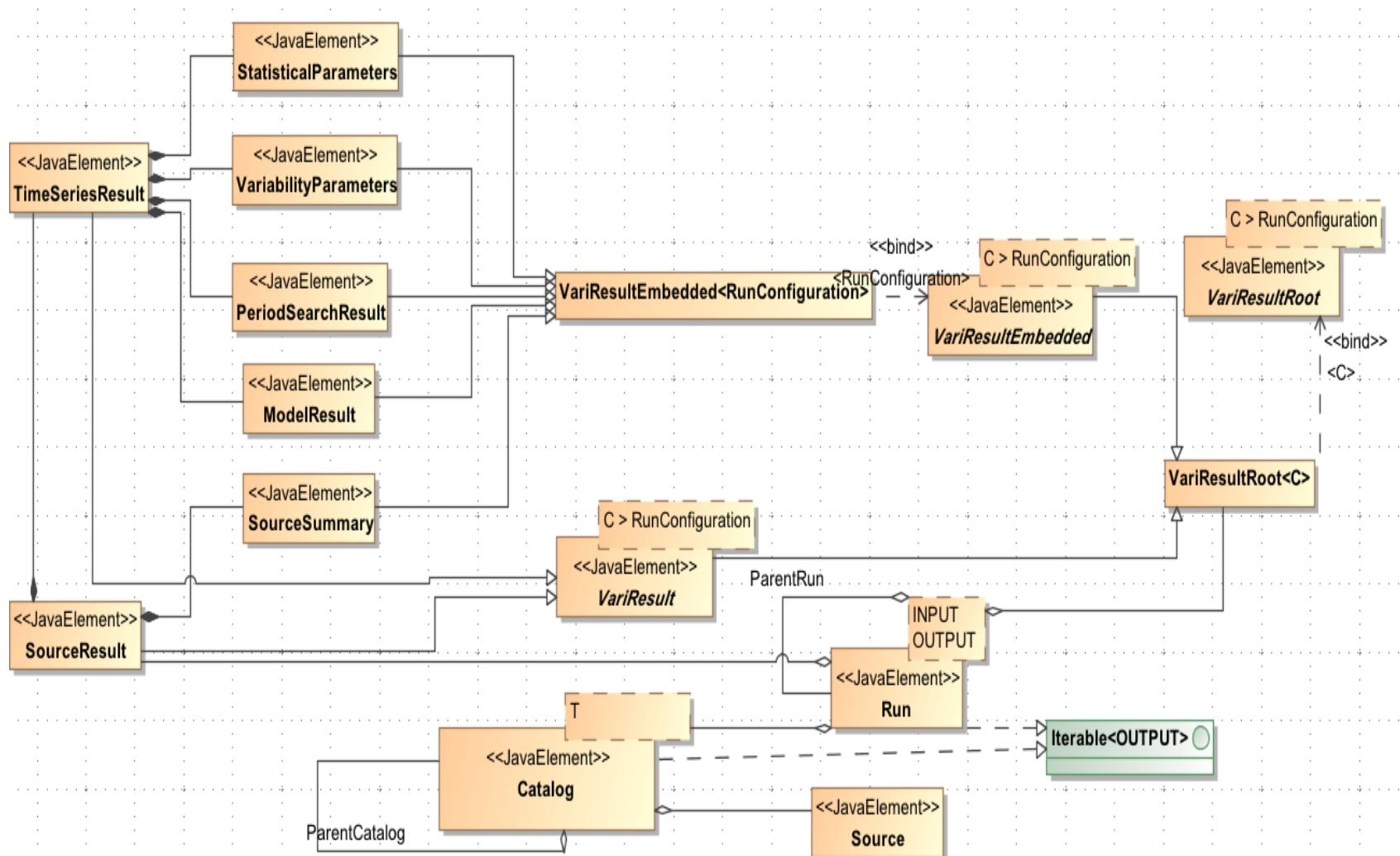
Big Volume

- ▶ ~50TB ... 800TB
- ▶ Input
 - ▶ Hundreds catalogs, 10^9 Sources, 5×10^9 Timeseries
 - ▶ Existing relatively large surveys
 - ▶ EROS, SuperWASP
 - ▶ Gaia input via GBINs
 - ▶ Deserialization
 - ▶ Reconstruction
 - ▶ Analysis of the input to find outliers,
 - ▶ Finding bugs in data in minutes – possible scanning 10^{11} observations to entities in 10's of seconds
- ▶ Output
 - ▶ k-iterations on input: 10^9 source results, 5×10^9 TimeseriesResults
 - ▶ Results on all processed Sources/Timeseries
 - Re-run multiple times
 - ▶ Intermediate analytical results
 - ▶ Ad-hoc analytical results
 - ▶ Export of data into compressed GBINs



Data model

Java Persistence API, custom PG mappings



Data model

Java Persistence API, custom PG mappings

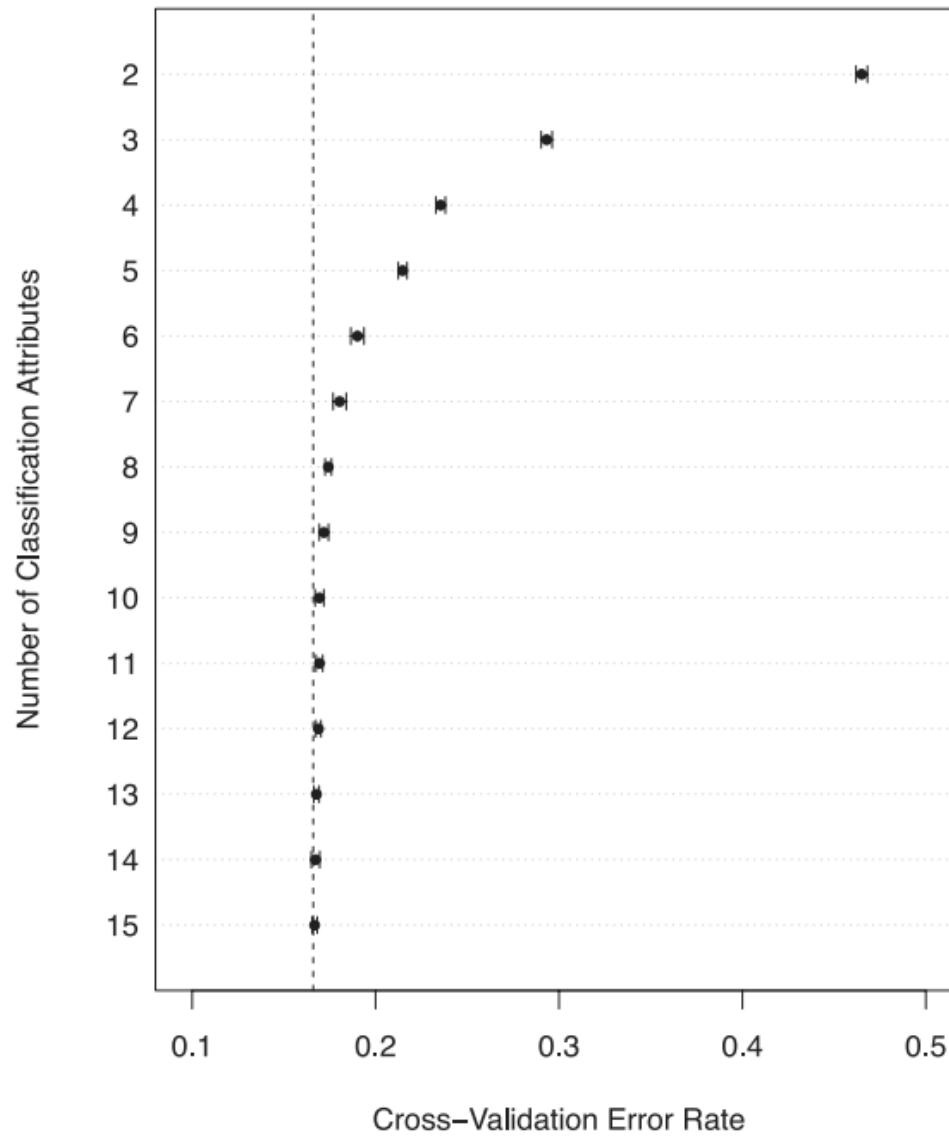
- Native ORM mappings:

- 1-> *
- 1-1:
 - Embedded

- Custom OO mappings:

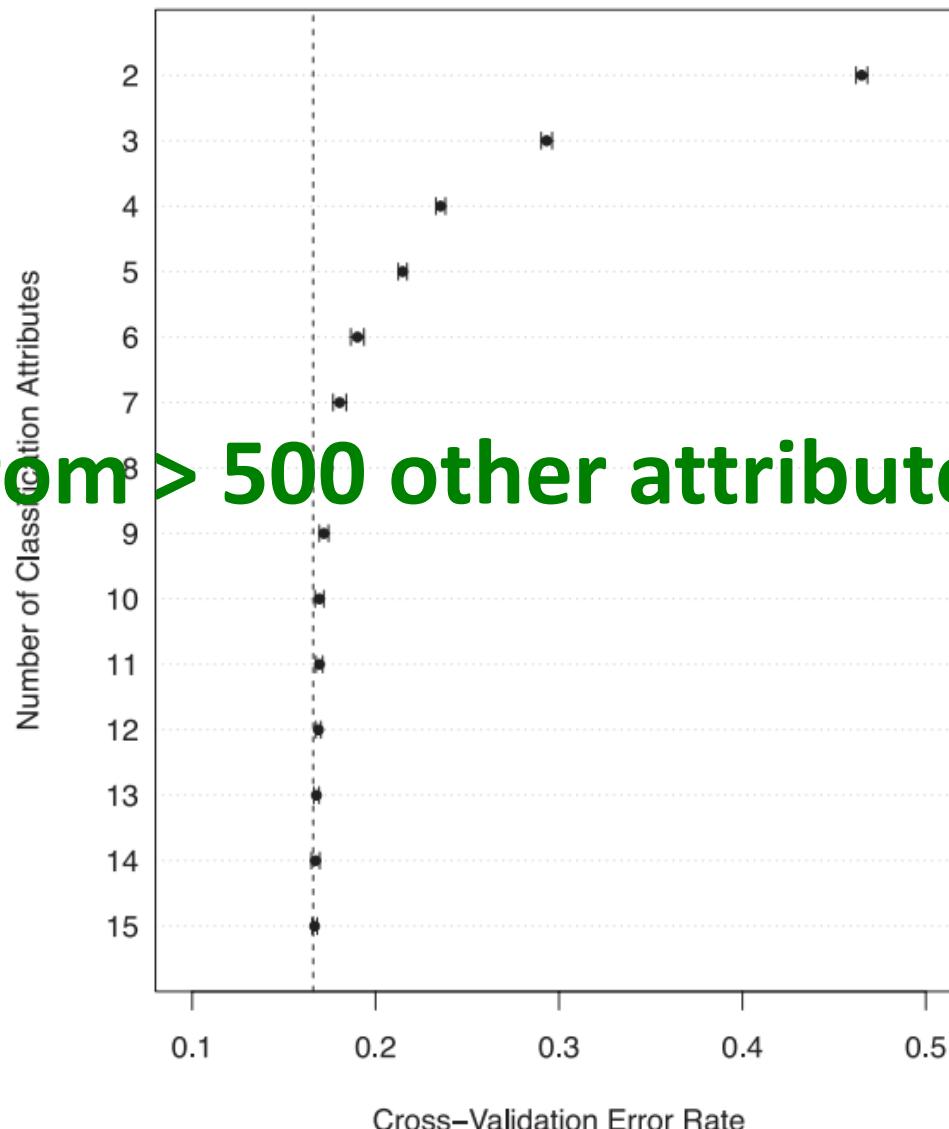
- hstore + metadata: EAV
- PG objects <compositeType>
- Arrays of PgObjects
- Arrays of Arrays of Arrays of ... PG Objects

Attributes



L. Rimoldini et al 2012

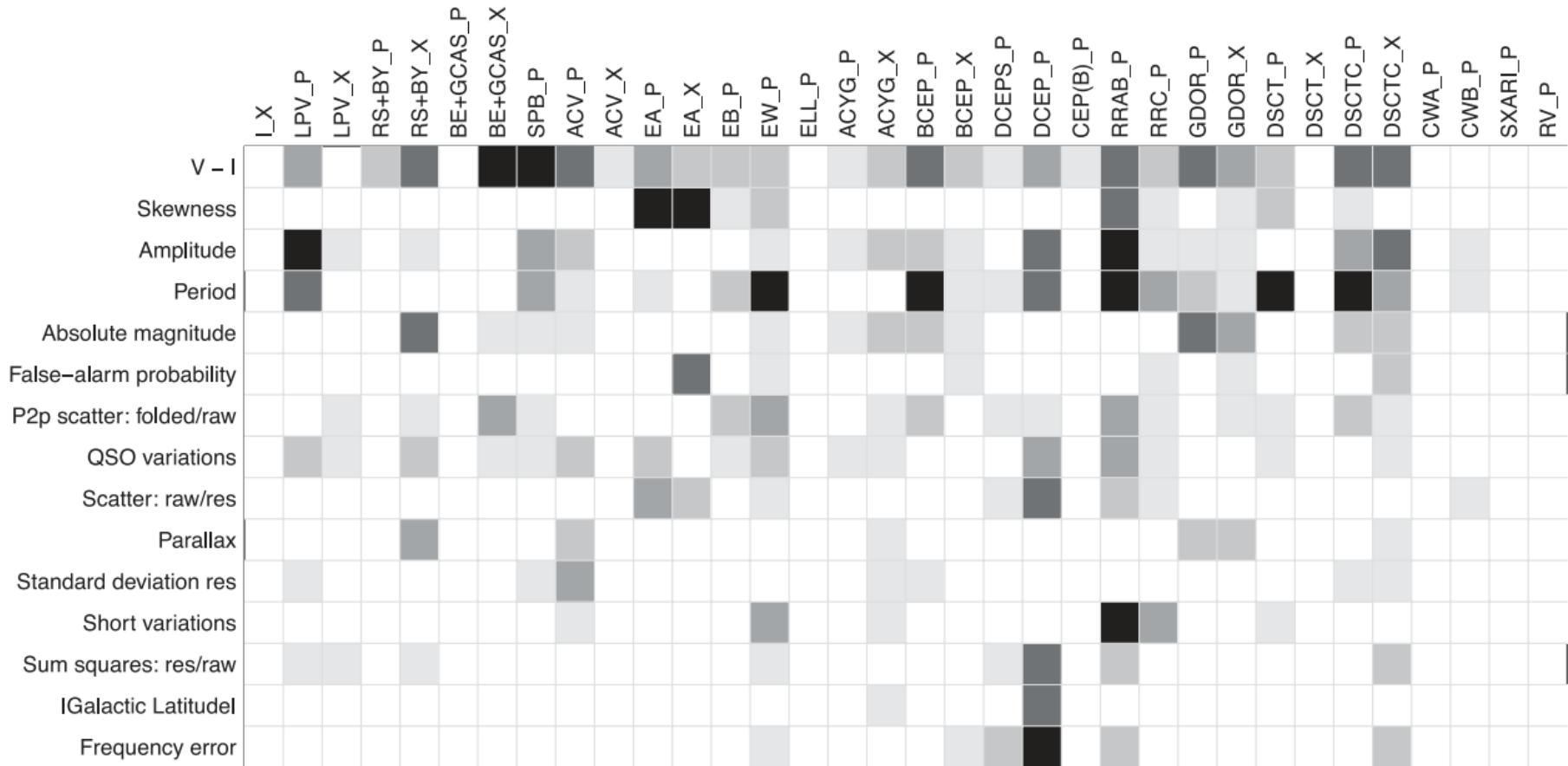
Attributes



From > 500 other attributes....

Attributes

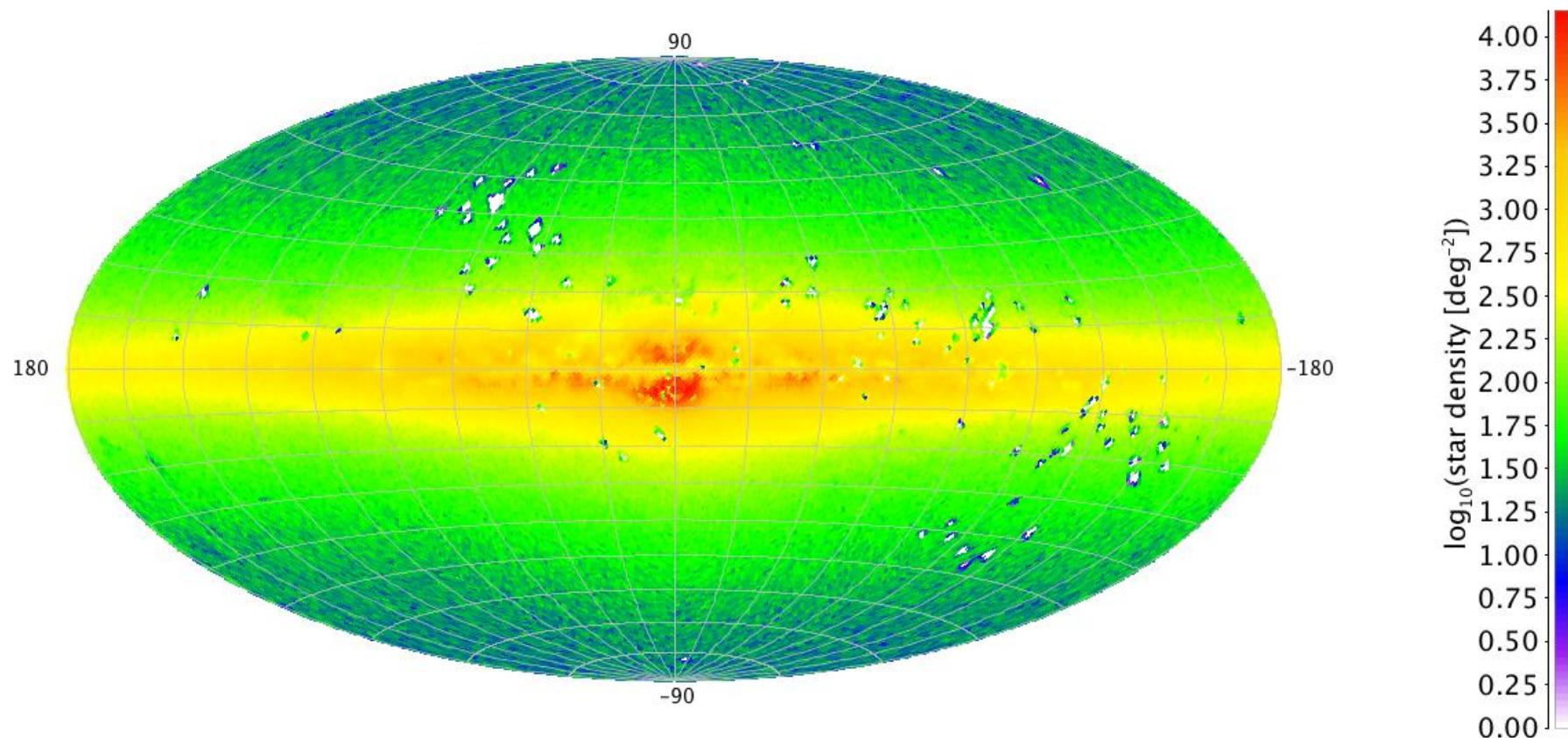
(columnX, array[i], (pgType[j]).type2[i]...)



L. Rimoldini et al 2012

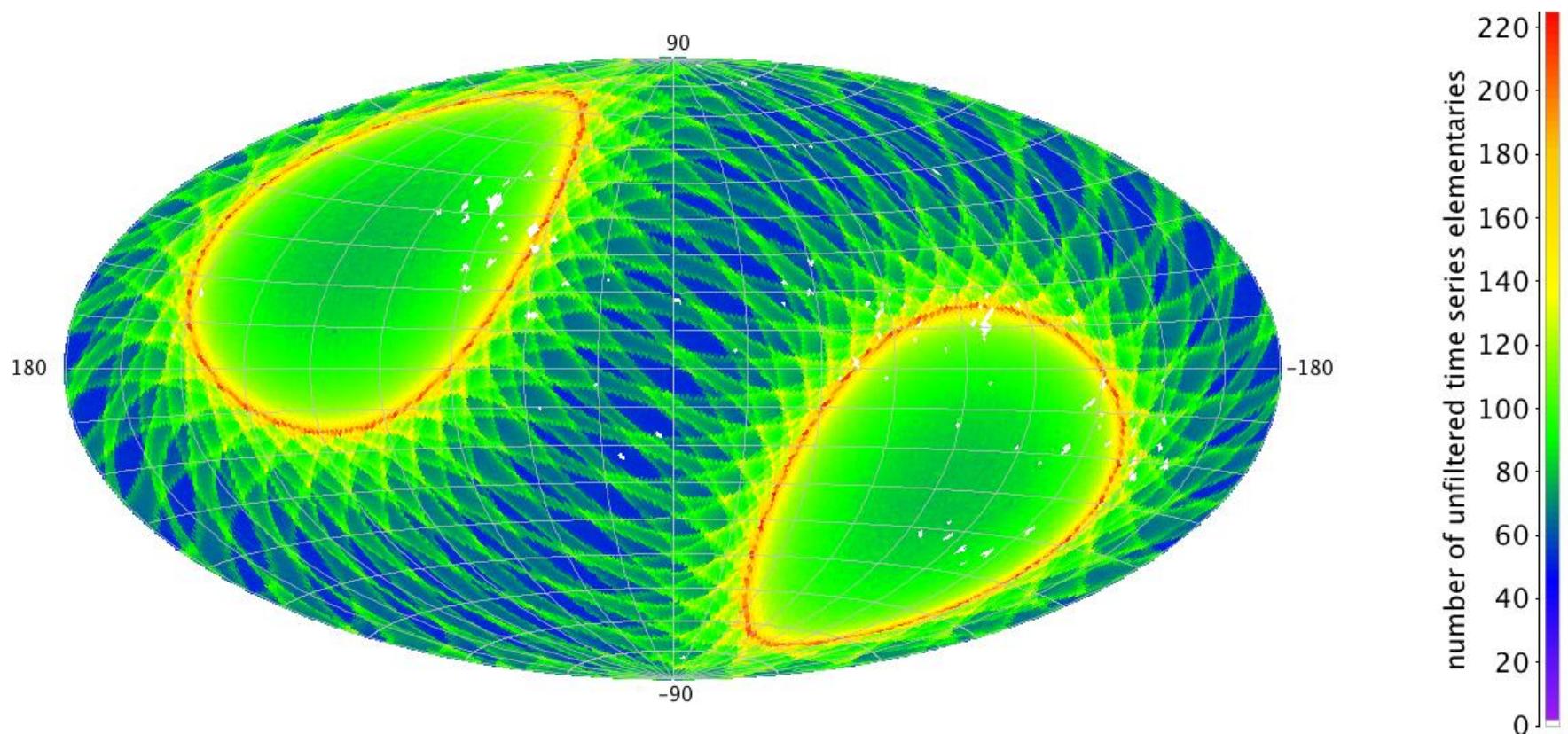
Analytics via SQL

Map of star density (galactic coordinates, 1pix = 0.84 deg²)
Catalog GOG-RDS-10-B-TSR, band GAIA-PHOT-G

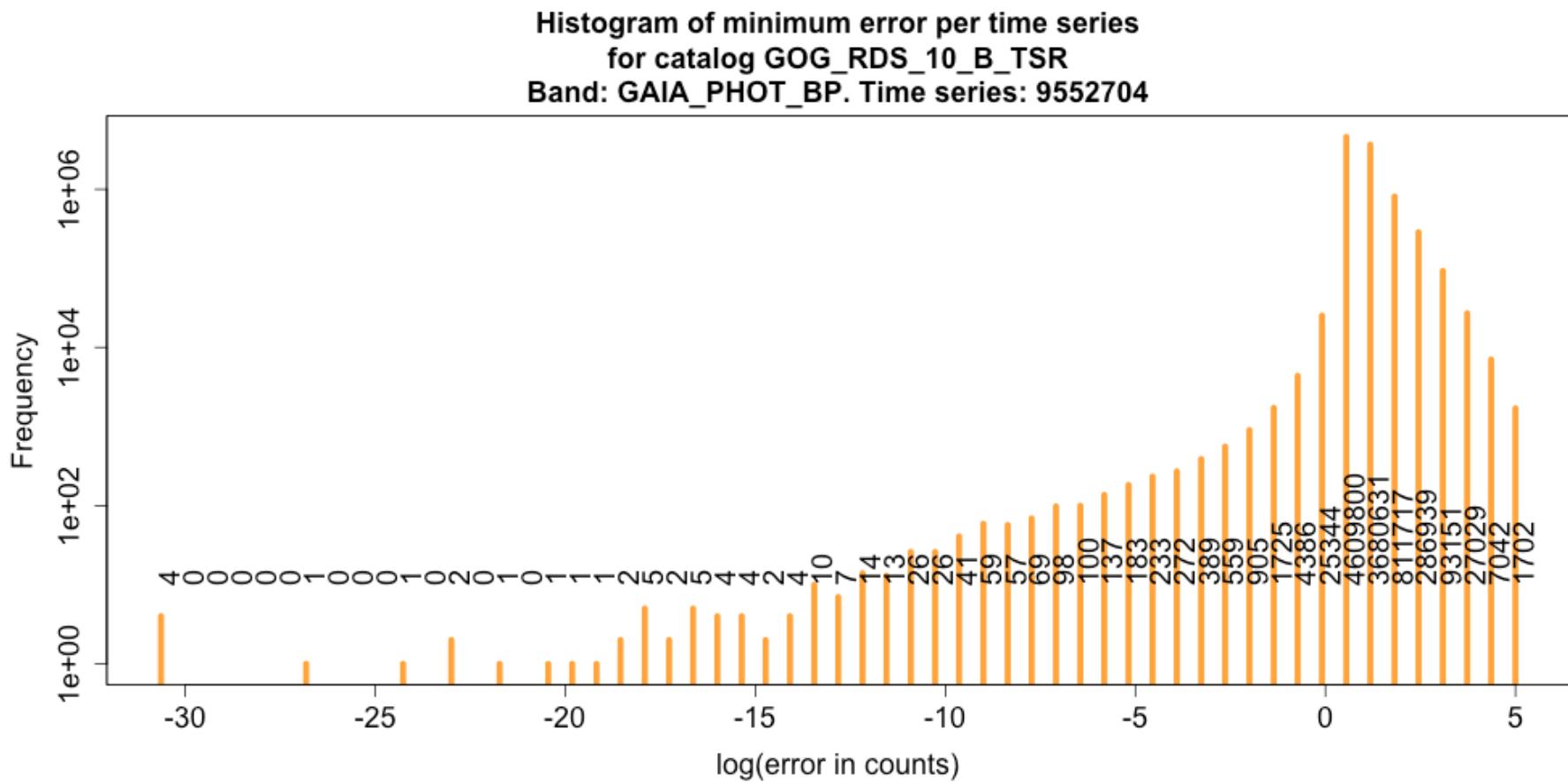


Analytics via SQL

Map of number of unfiltered time series elementaries (galactic coordinates, 1pix = 0.84 deg²)
Catalog GOG-RDS-10-B-TSR, band GAIA-PHOT-G

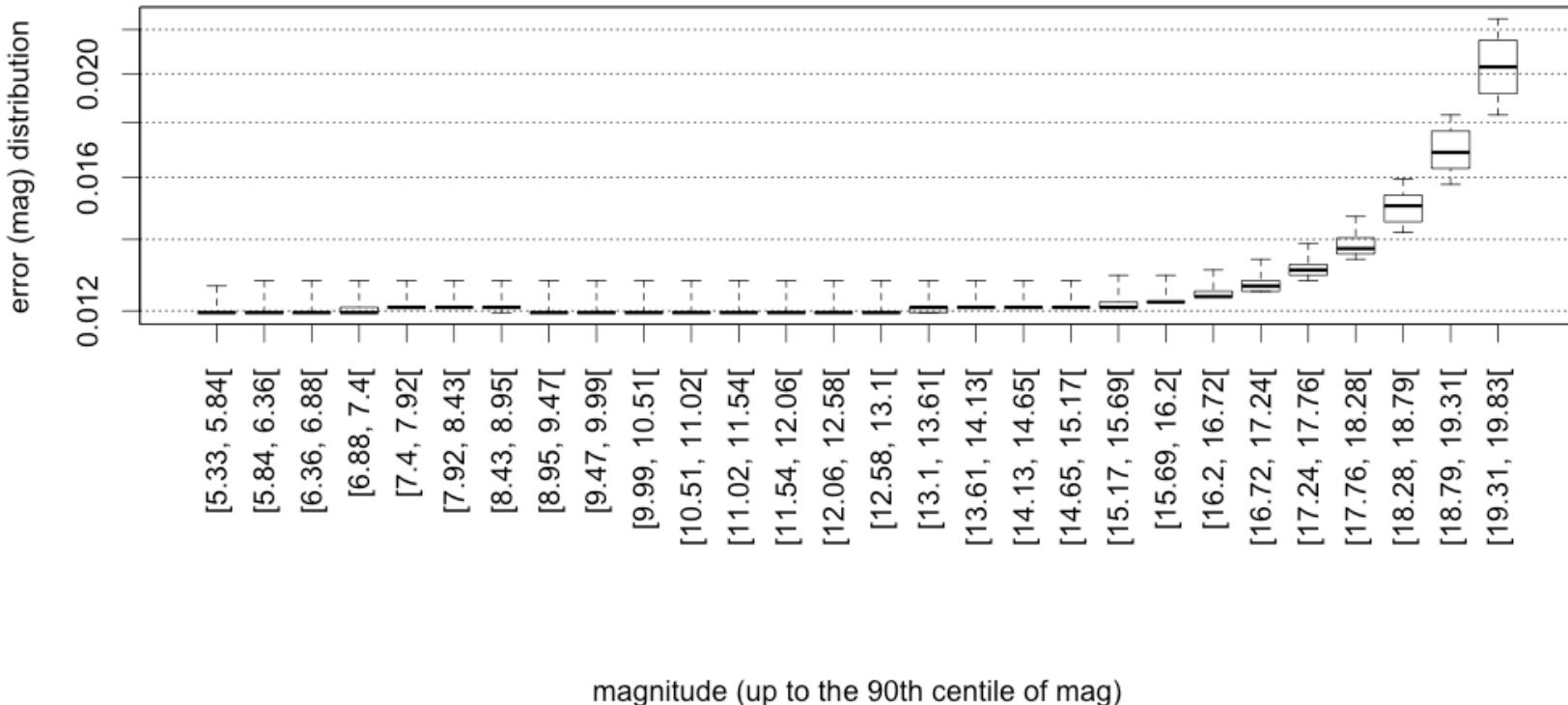


Analytics via SQL

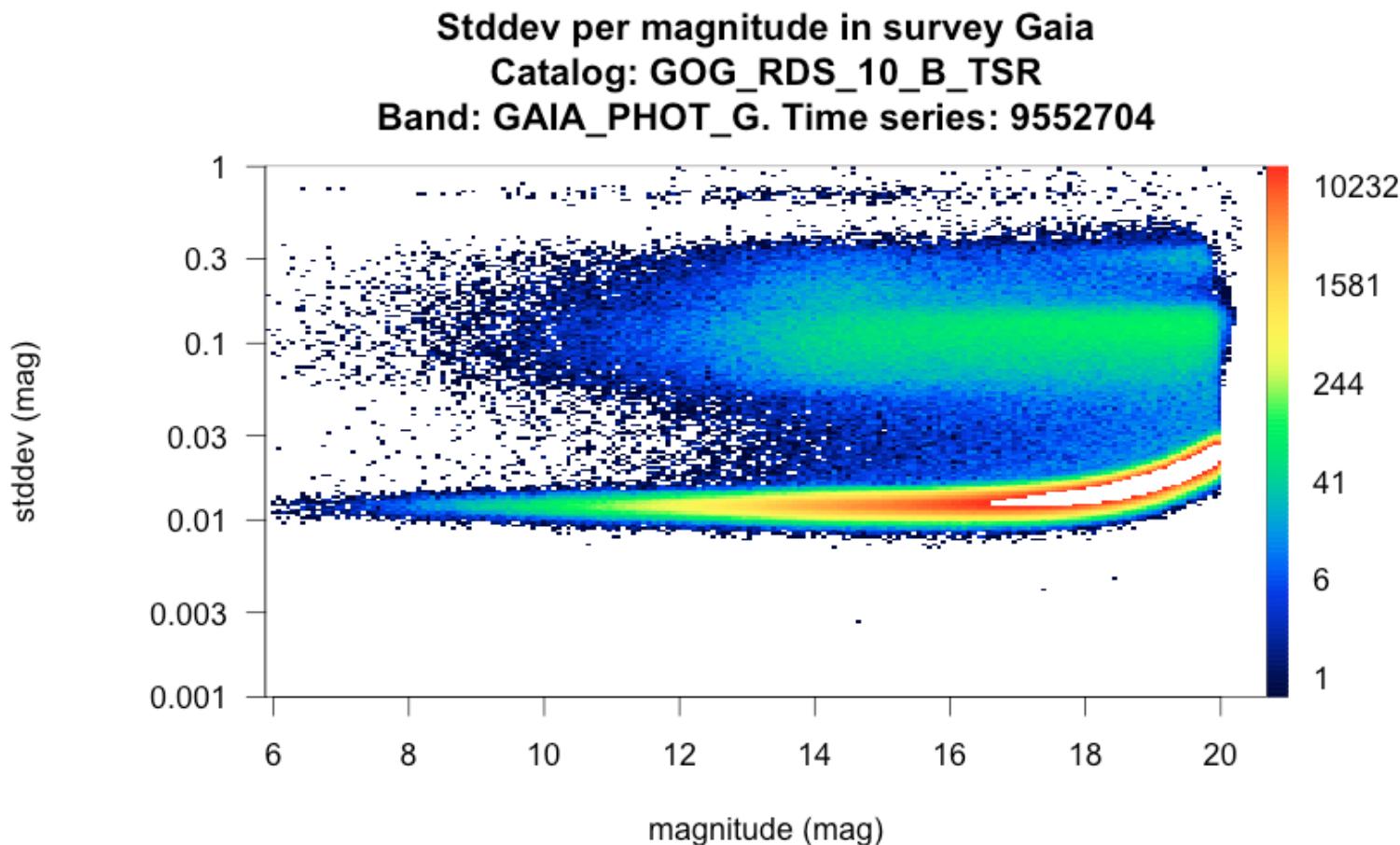


Analytics via SQL

**Distribution of errors on individual measurements
per magnitude bin
for survey Gaia**
Catalog: GOG_RDS_10_B_TSR
Band: GAIA_PHOT_G



Analytics via SQL



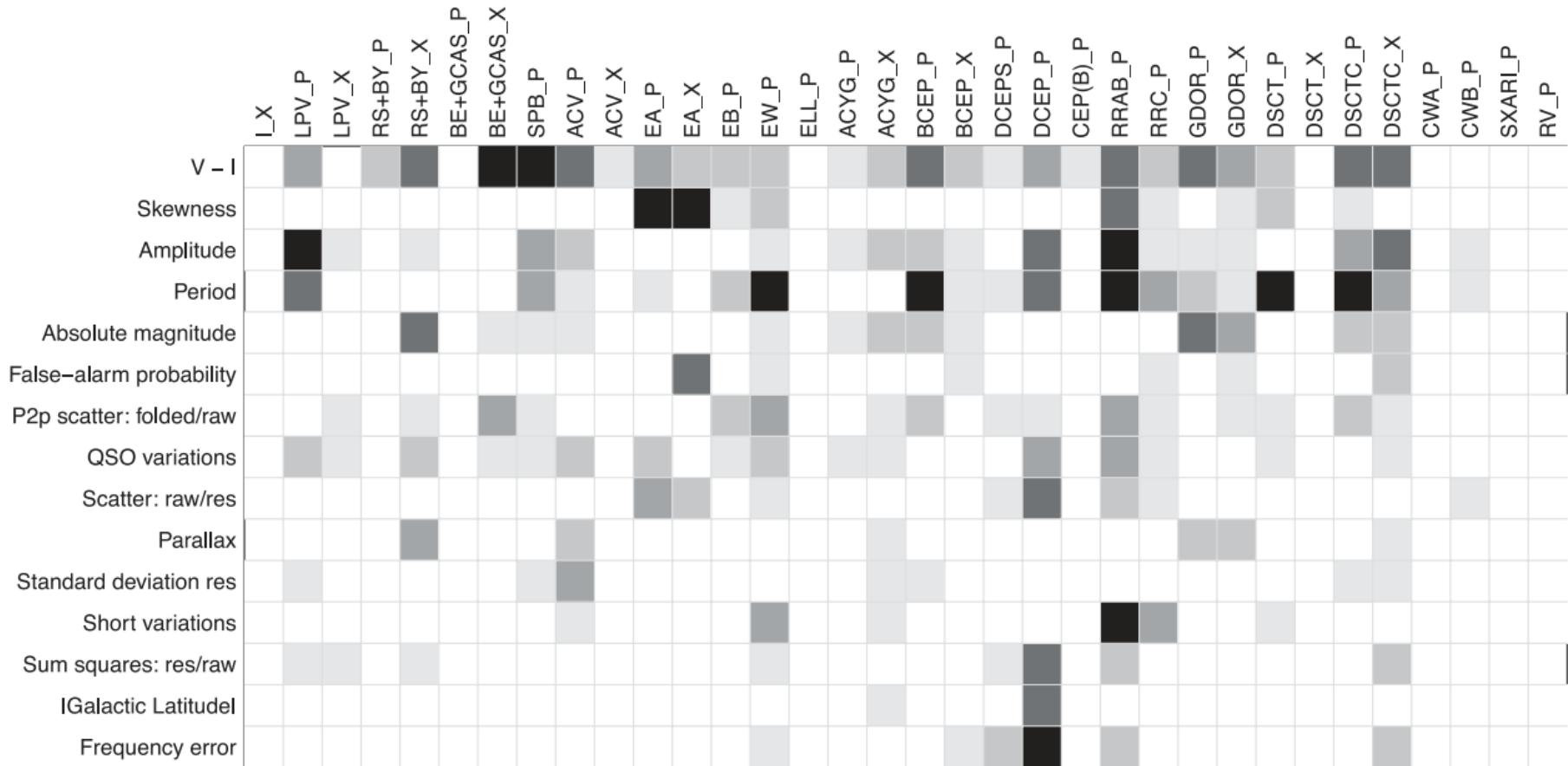
Some empty bins at all the plot borders have been discarded.

In black, median of the stddev per magnitude bin.

Bin size: 0.074 mag x 0.015 log10(stddev in mag).

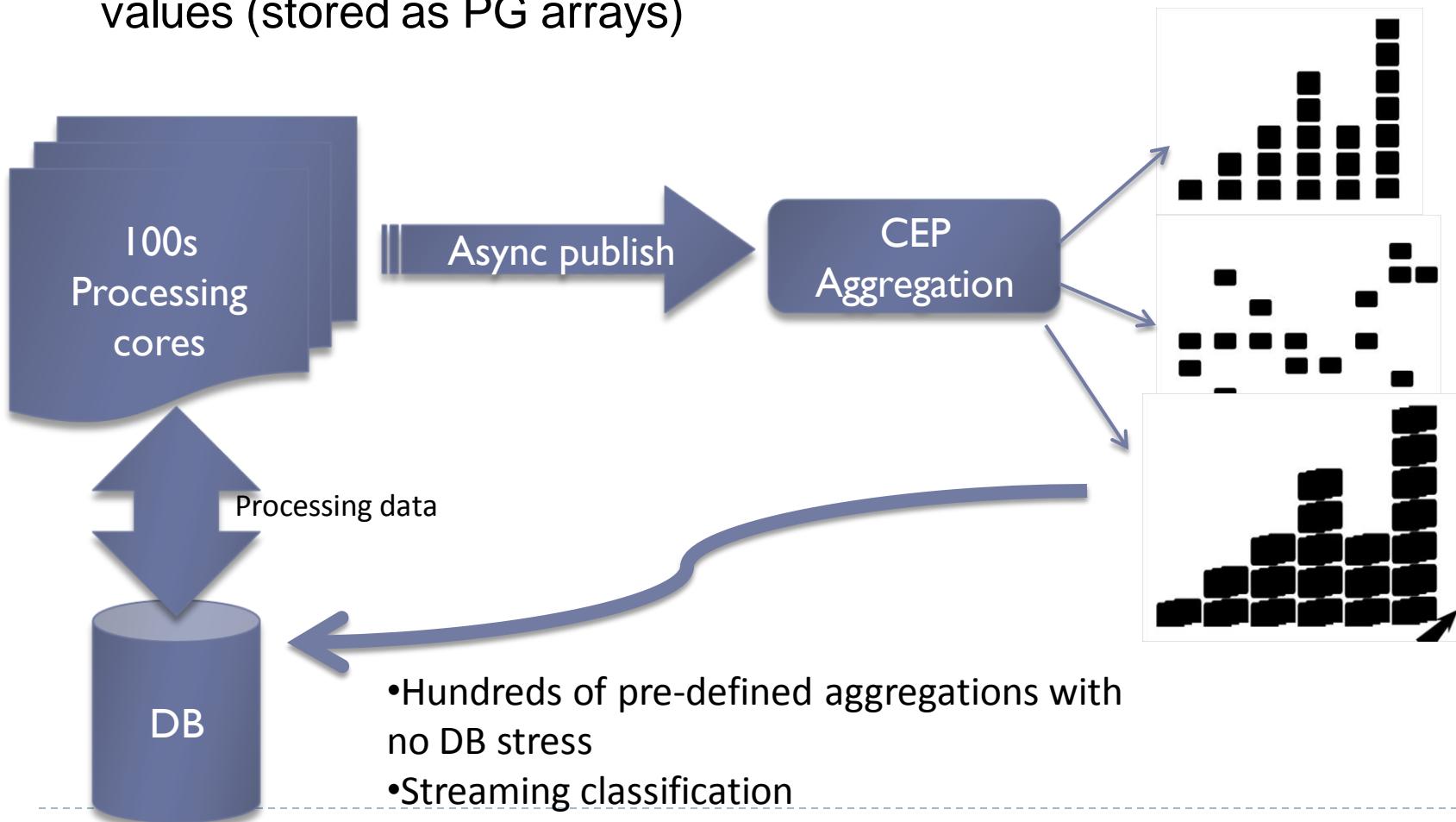
Attributes

(columnX, array[i], (pgType[j]).type2[i]...)



Complex Event Processing

- Stream of results is continuously aggregated externally via subpackage based on Camel/Esper and stored as scalar, 1D, 2D values (stored as PG arrays)



Complex Event Processing

EQL with Apache Camel

```
from("esper://sourceresult?eql=insert into PeriodSearchResultList select run.runId as runid, " +
    "hist('skewness', -5.0, 5.0, 0.5, " +
    "+ ((timeSeriesResult('HIPPARCOS')).getStatisticalParameters()).getSkewness()) as histogram " +
    "from SourceResult.win:time_batch(10 sec) " +
    "where ((timeSeriesResult('HIPPARCOS')).getStatisticalParameters()).getSkewness() > 0 " +
    "group by run.runId")|
    .process(new Processor() {
        @SuppressWarnings("unchecked")
        public void process(Exchange exchange) throws Exception {
            com.espertech.esper.event.map.MapEventBean ev = (com.espertech.esper.event.map.MapEventBean) exchange
                .getIn().getBody();
            Map map = (Map) ev.getUnderlying();
            exchange.getOut().setHeaders(exchange.getIn().getHeaders());
            exchange.getOut().setHeader("runid", map.get("runid"));
            exchange.getOut().setBody(map.get("histogram"));
        }
    }).log("${body}").to("activemq:varisystem.monitoring.histogram");
```

Complex Event Processing

real time monitoring

Run name: OR5_S1_Statistical_and_Variability_Parameters_Sample_272 Type part of the description to get all compatible runs Run created: 08-05-2014 Run ended: 08-05-2014

Runs

ID	NAME	INPUT CATALOG	SIZE	CREATION DATE	TAKERS	PERIOD METHODS	Metrics
1,298	ShortPeriods_1298	SIMULATED_ZZCETI_MUKADAM_MIHALY	0	2014-05-05 06:38:05.518021	gala.cu7.algo.specialdetection.shorttimescale.ShortTimeScale		
272	OR5_S1_Statistical	GOG_RDS_10_B_TSR_Sample	957,561	2014-01-30 12:47:29.583384	gala.cu7.algo.character.Character gala.cu7.algo.variabilityDet	METHOD_LEAST_S	

Selected Metrics:

- Skewness_BP_Mag
- Skewness_RP_Mag
- MeanObsTime_G_Flux
- Trimmed_Weighted_Range_BP_M
- Trimmed_Weighted_Range_RP_M
- Weighted_Standard_Deviation_G_Flux
- Robust_Weighted_Normalized_P2l
- Standard_Deviation_G_Flux
- Standard_Deviation_BP_Flux
- Standard_Deviation_RP_Flux
- Standard_Deviation_BP_Mag
- Standard_Deviation_RP_Mag
- Standard_Deviation_BP_Mag
- Standard_Deviation_RP_Mag

Run 272: Trimmed_Weighted_Range_BP_Mag Download chart

Run 272: Trimmed_Weighted_Range_RP_Mag Download chart

Run 272: Weighted_Standard_Deviation_G_Flux Download chart

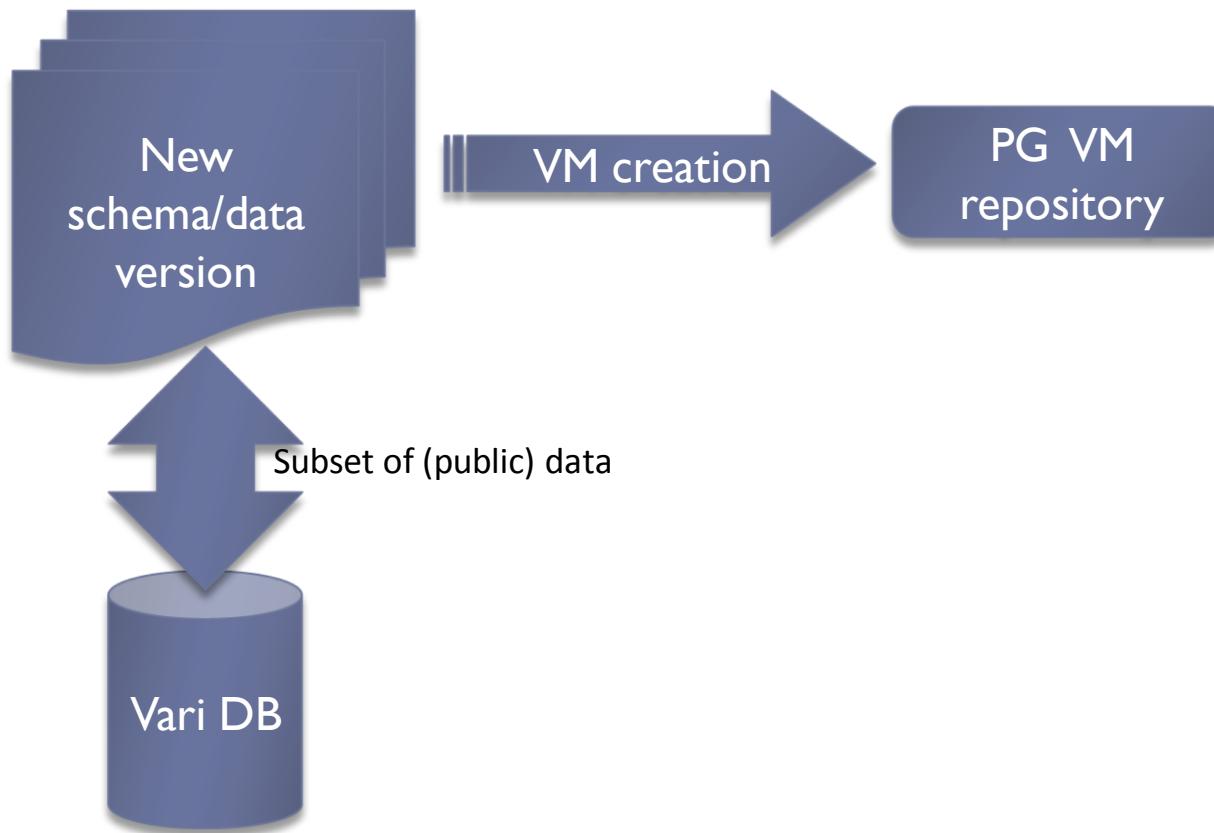
Run 272: Trimmed_Weighted_Range_BP_Mag Download chart

Run 272: Trimmed_Weighted_Range_RP_Mag Download chart

Run 272: Weighted_Standard_Deviation_G_Flux Download chart

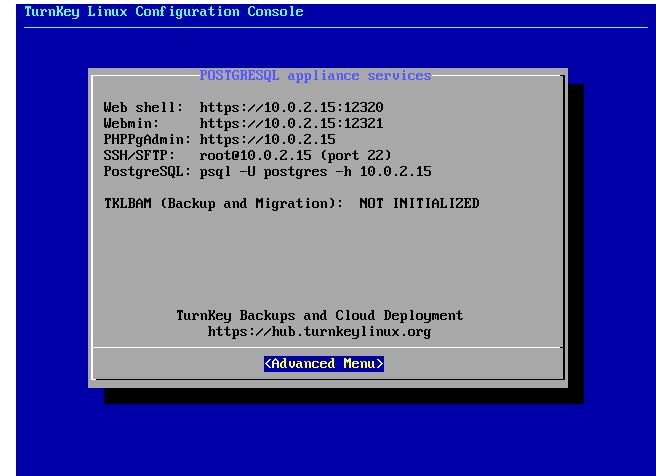
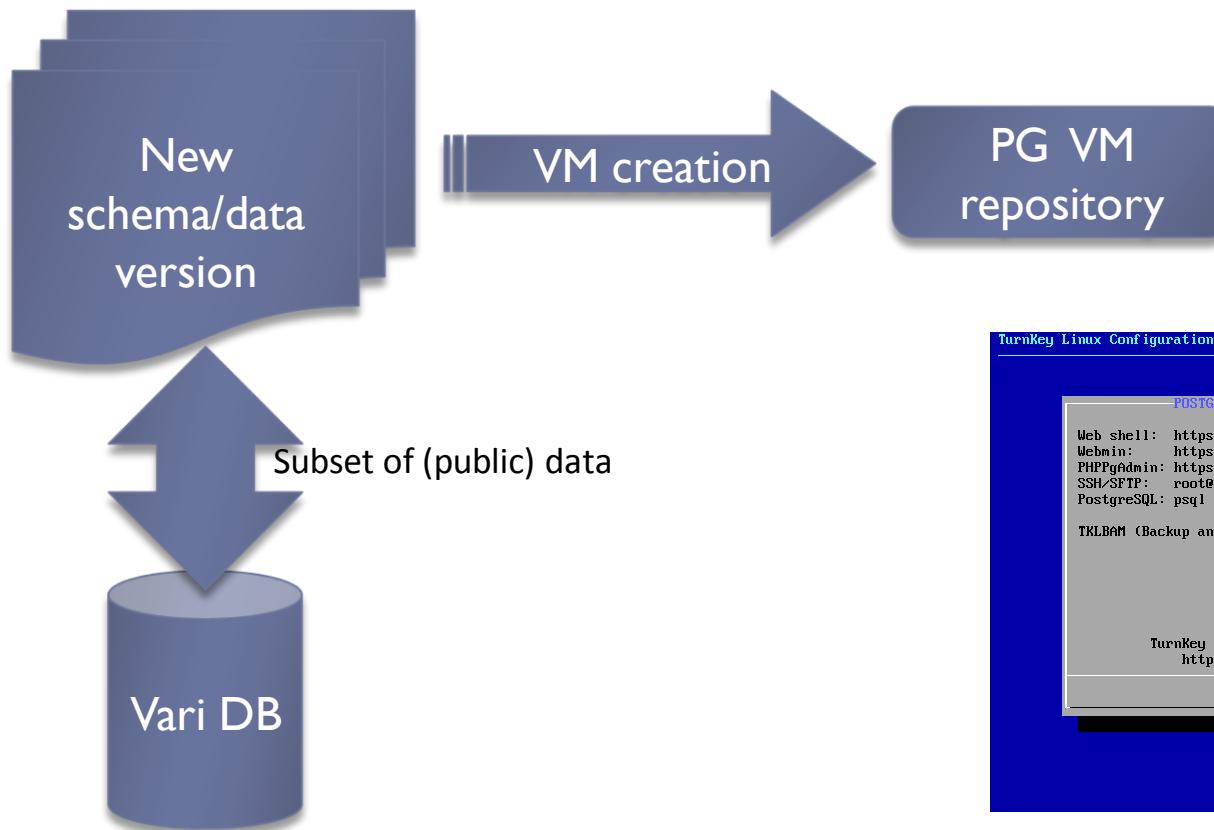
Data distribution for development

- Development, public data is distributed via PG Appliances
 - 5-15GB
 - ~0.5-5M sources



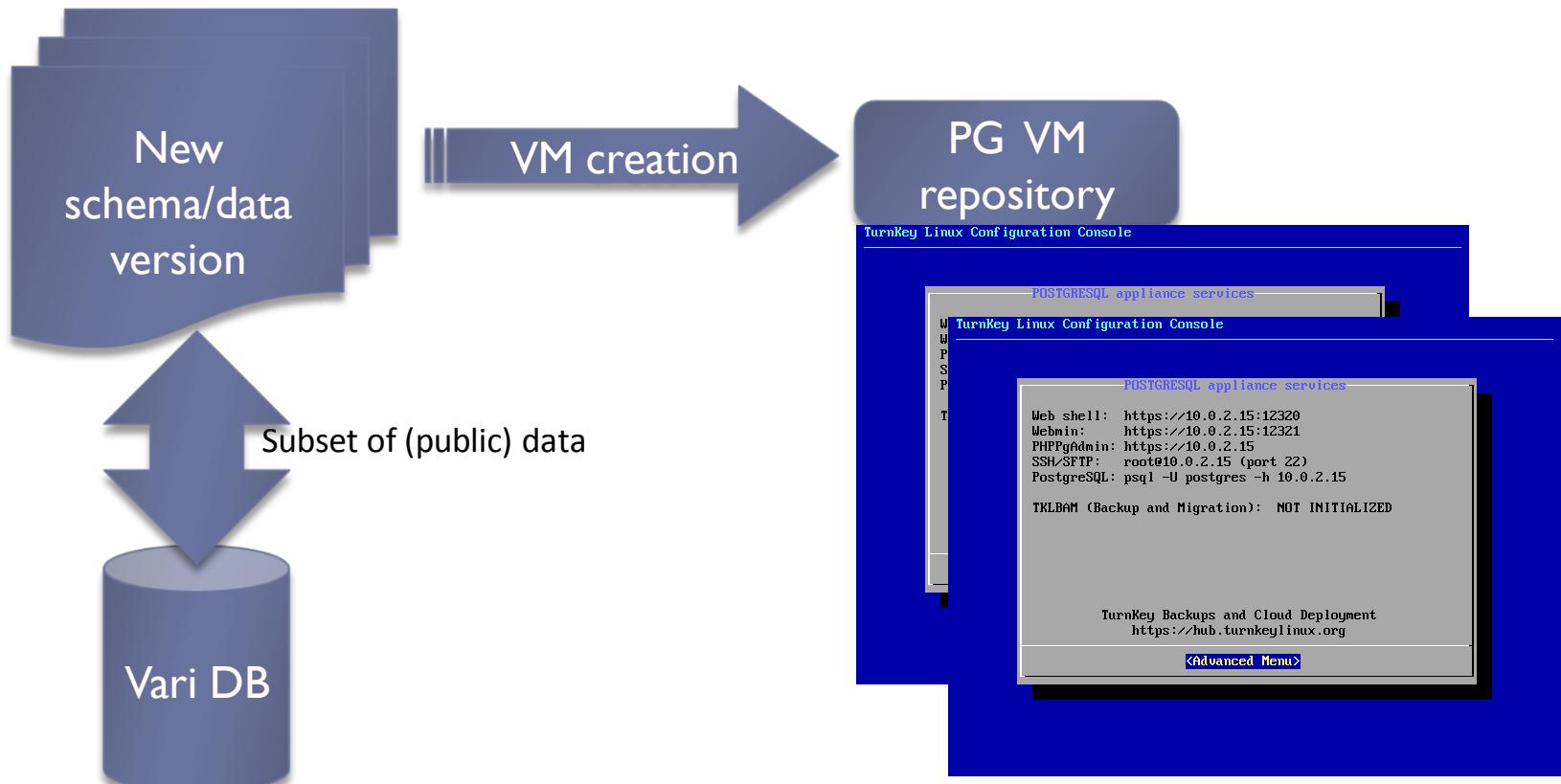
Data distribution for development

- Development, public data is distributed via PG Appliances
 - 5-15GB
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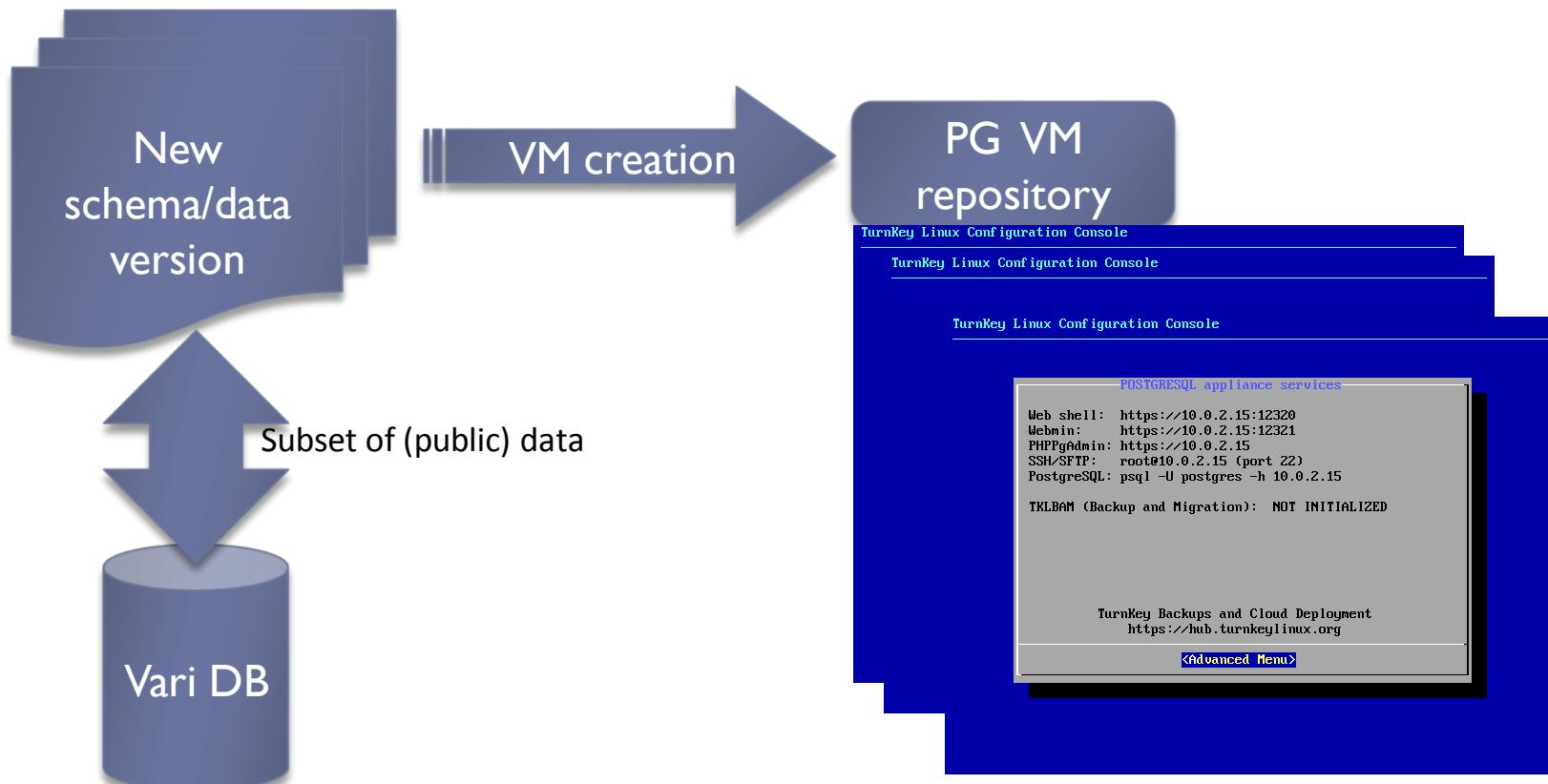
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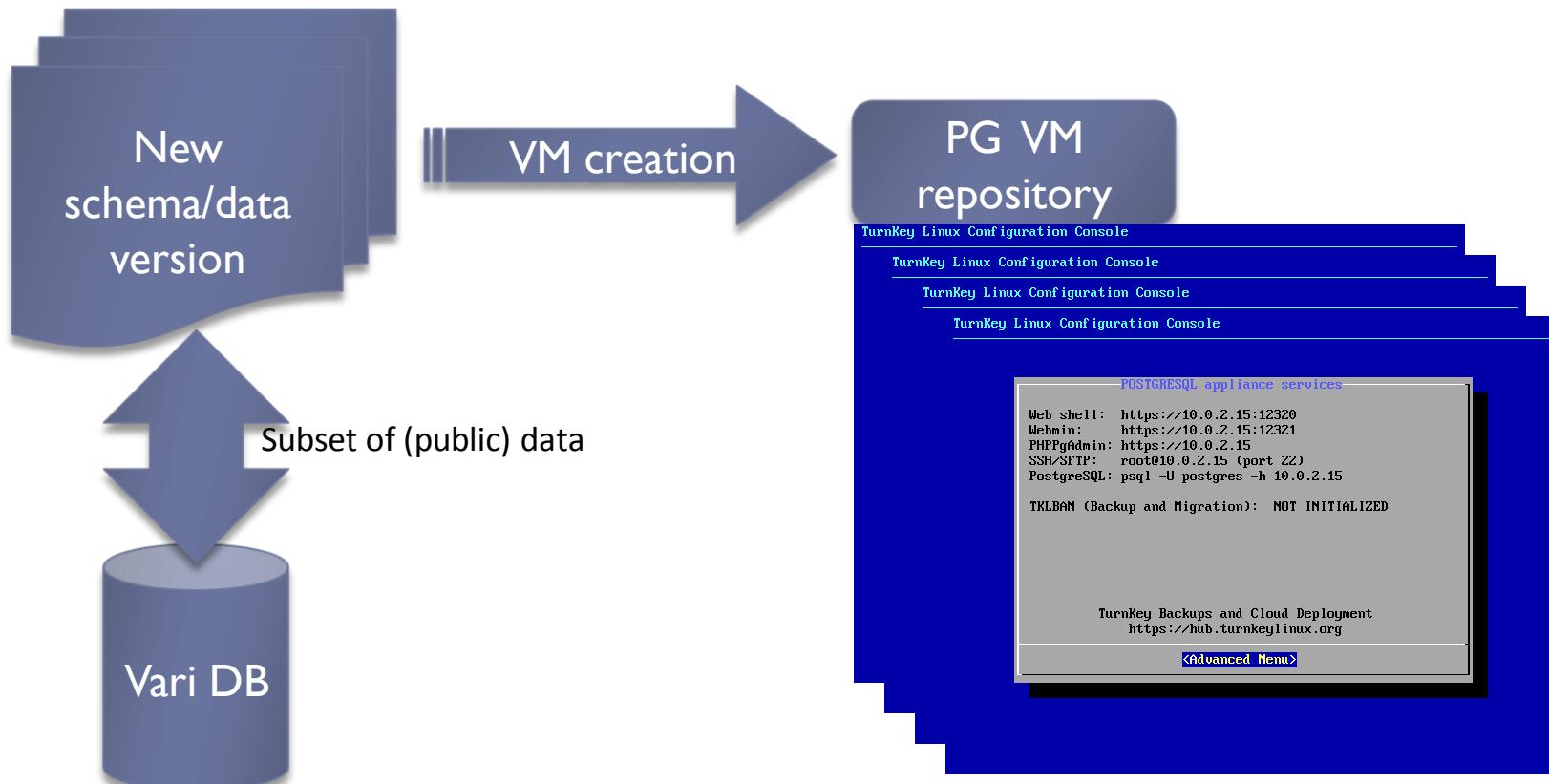
Data distribution for development

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Data distribution for development

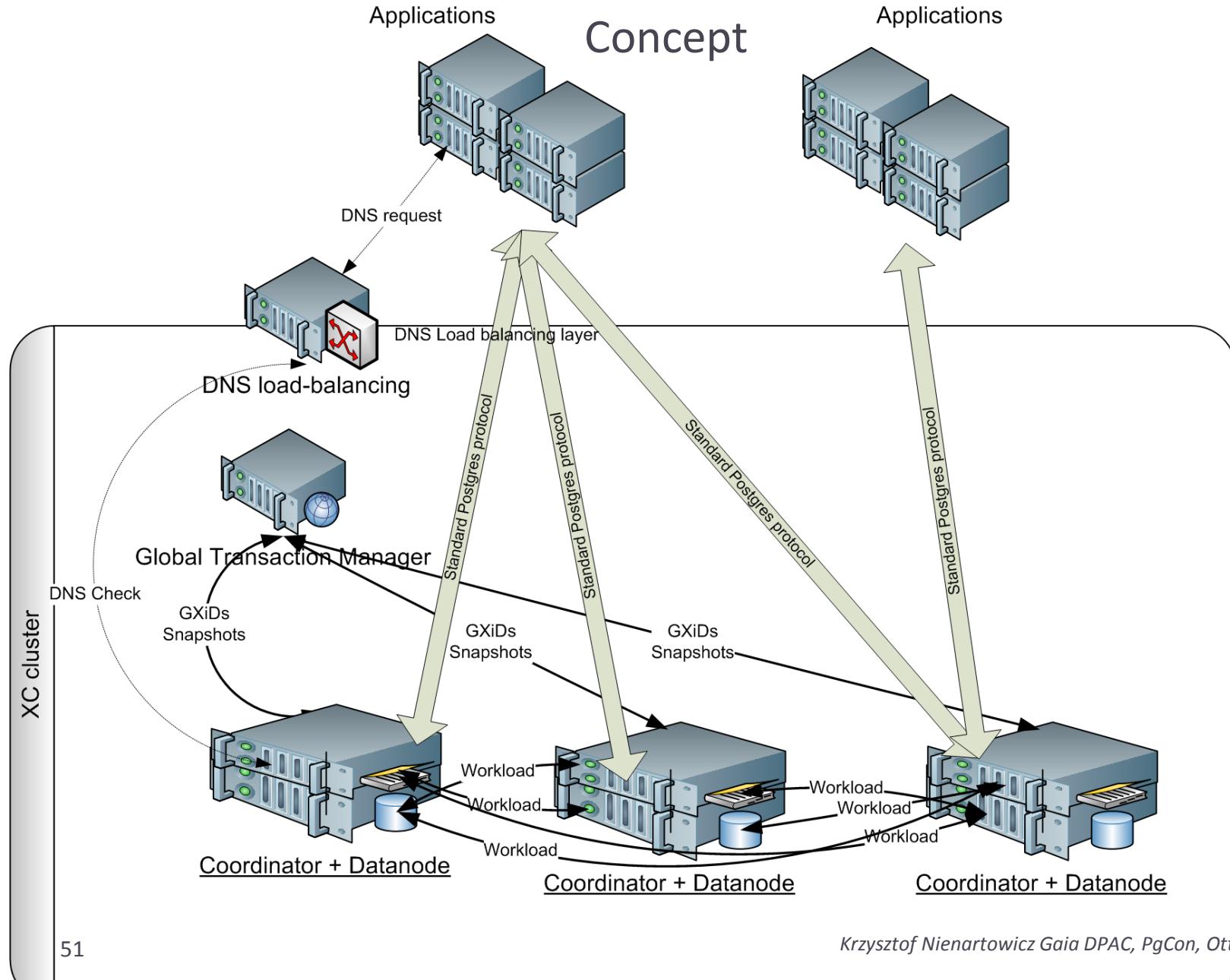
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 - ~0.5-5M sources



Structure

- My story
- Gaia mission
- Gaia science at CU7, Geneva
- Processing model
- Data model
- **XC role**
- Hardware
- Collaboration

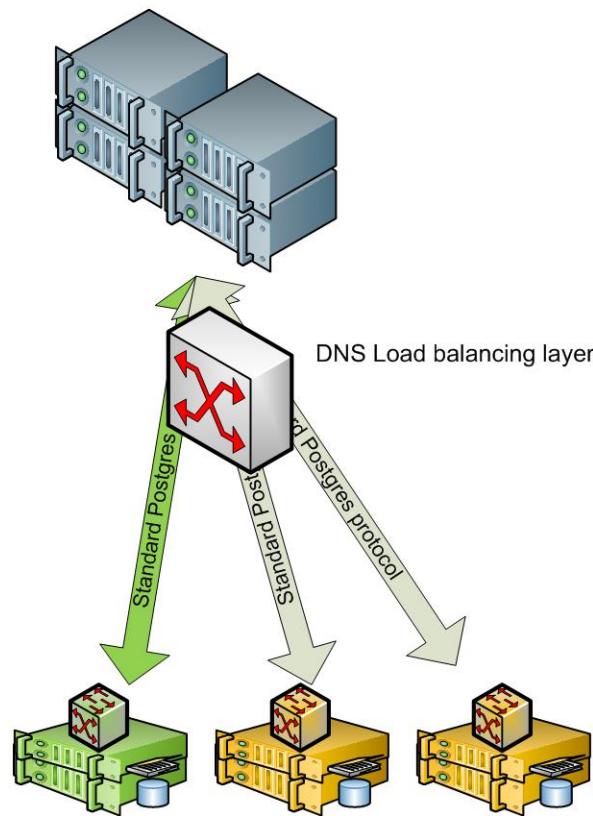
Data platform: Postgres – XC/XL



Postgres XC/XL

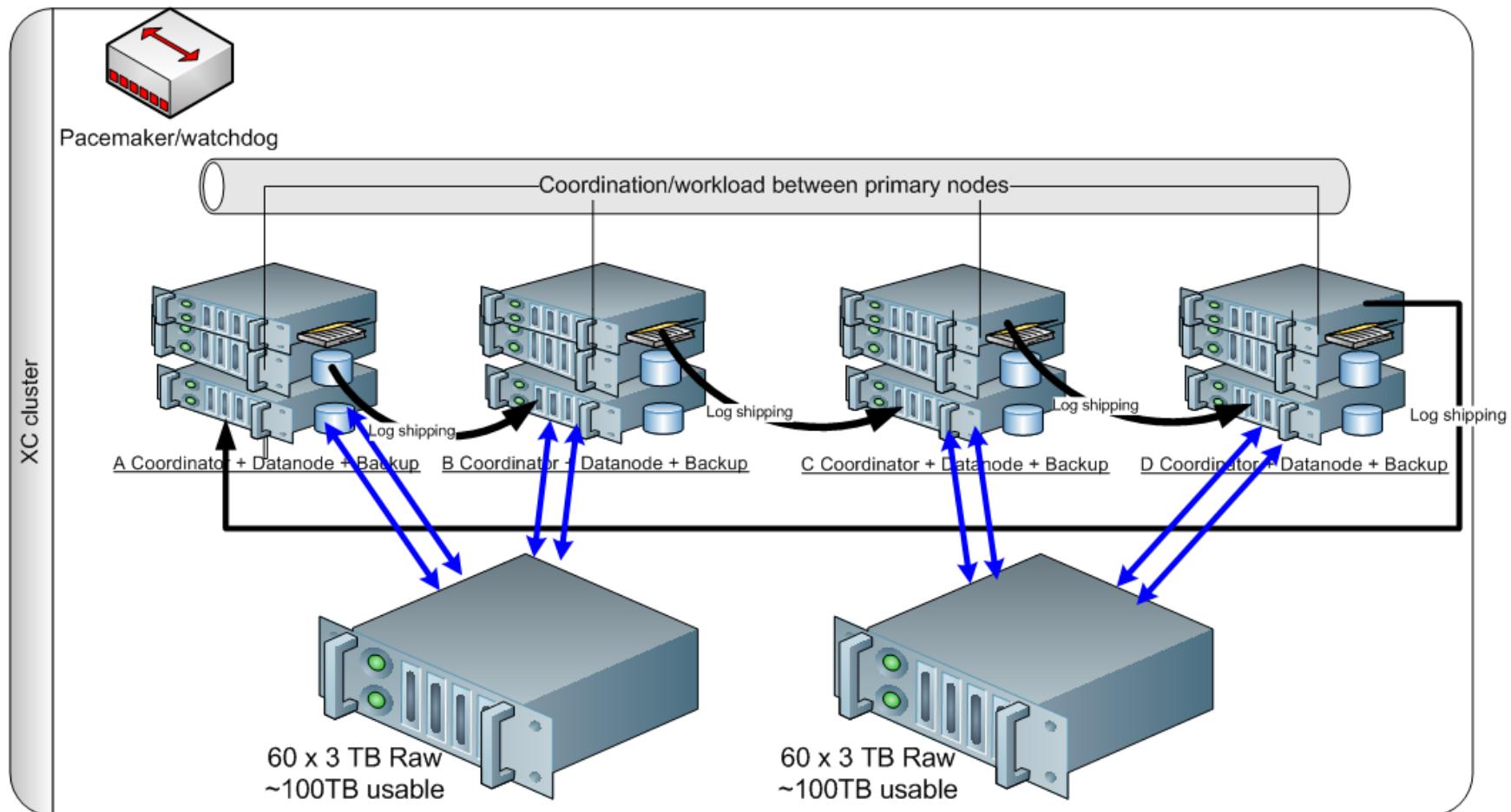
Load balancing – Jim Mlogdenski

Applications



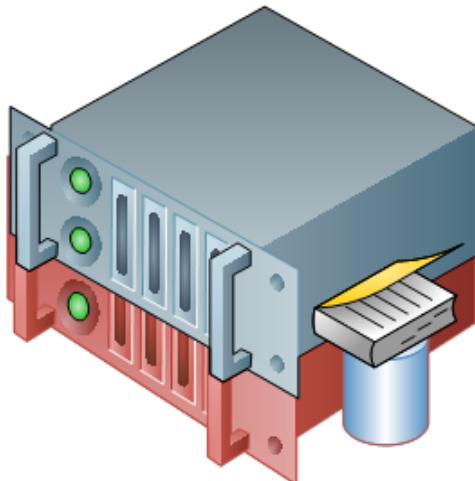
Postgres XC/XL (Kolchi)

RAID1E

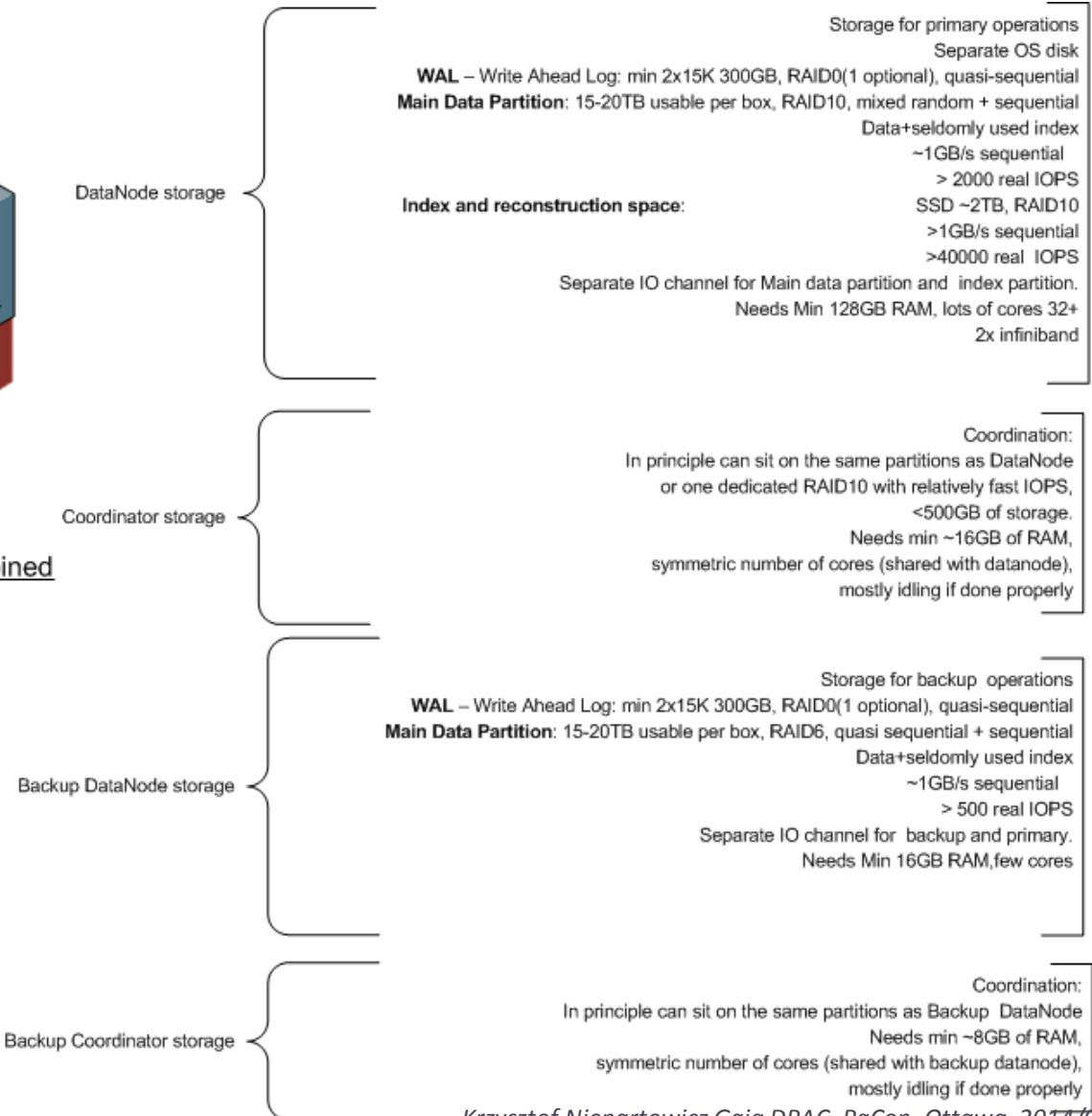


Postgres XC/XL

DB node

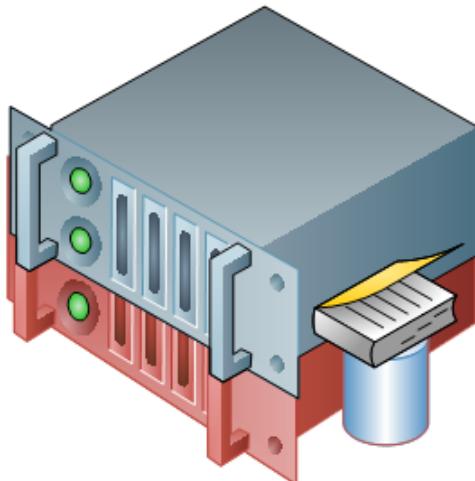


Coordinator + Datanode+Backup combined



Postgres XC/XL

DB node

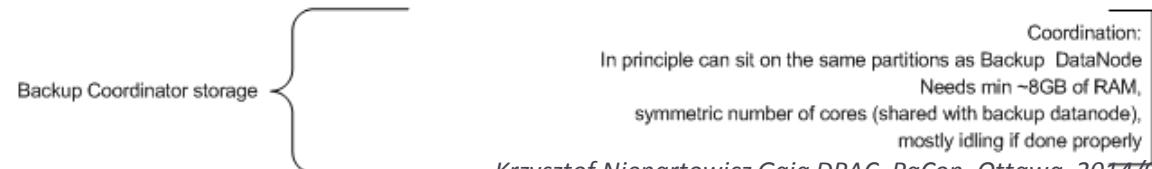
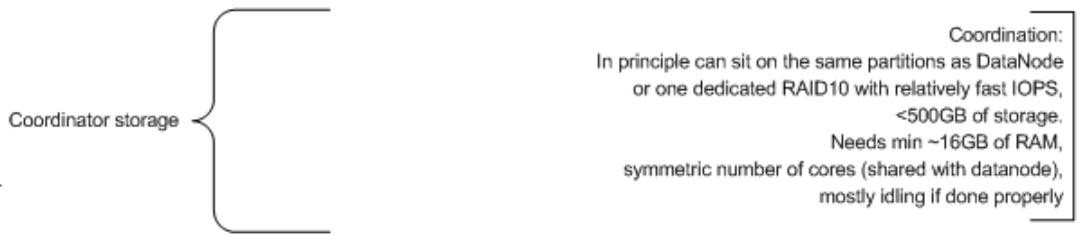
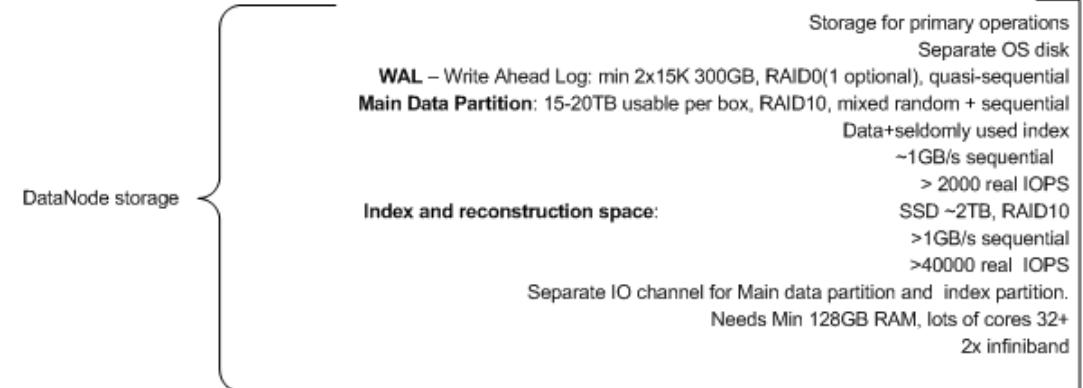


Coordinator + Datanode+Backup combined

Primary storage Primary coordinator

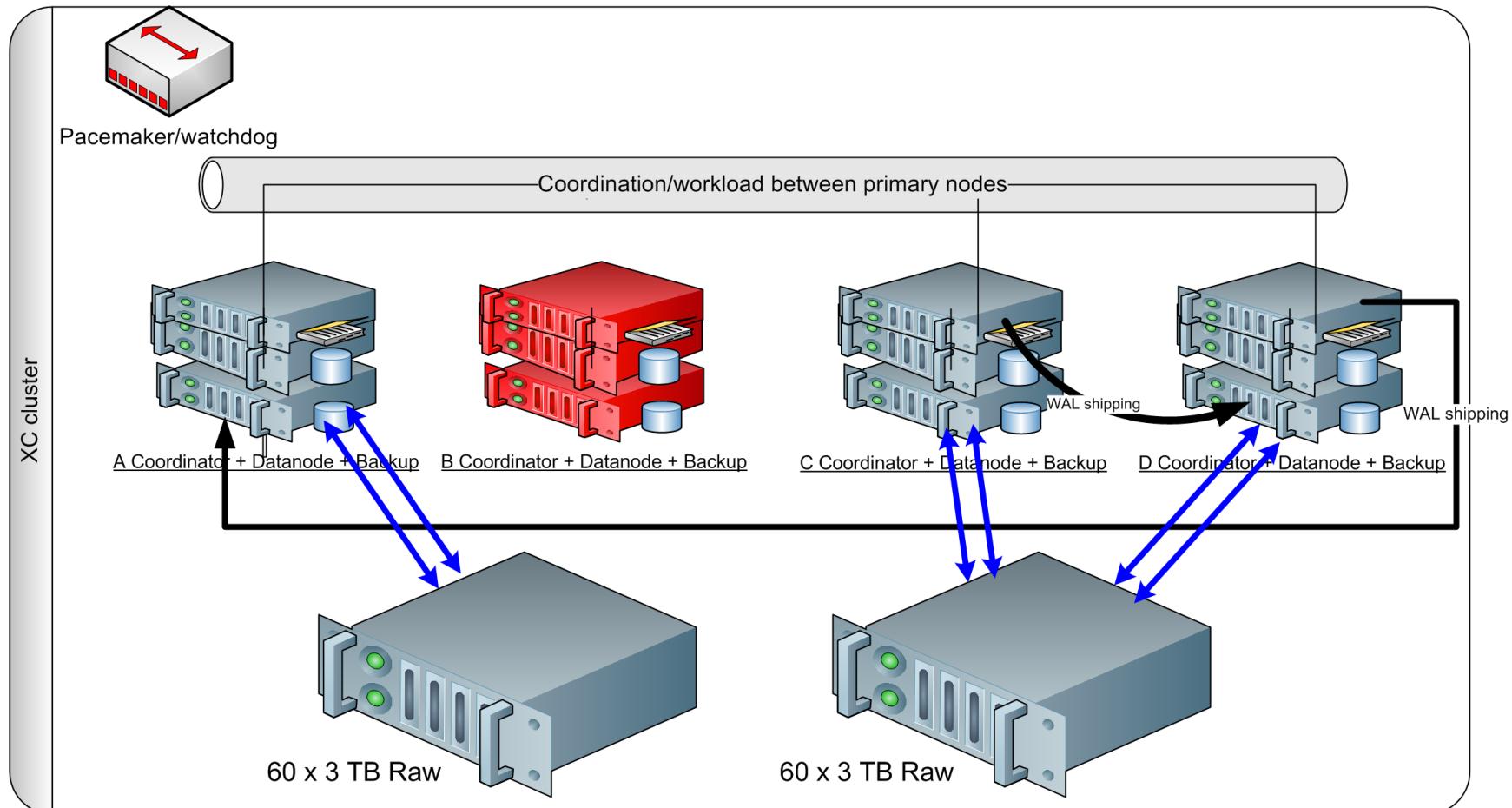
Backup storage

Backup coordinator



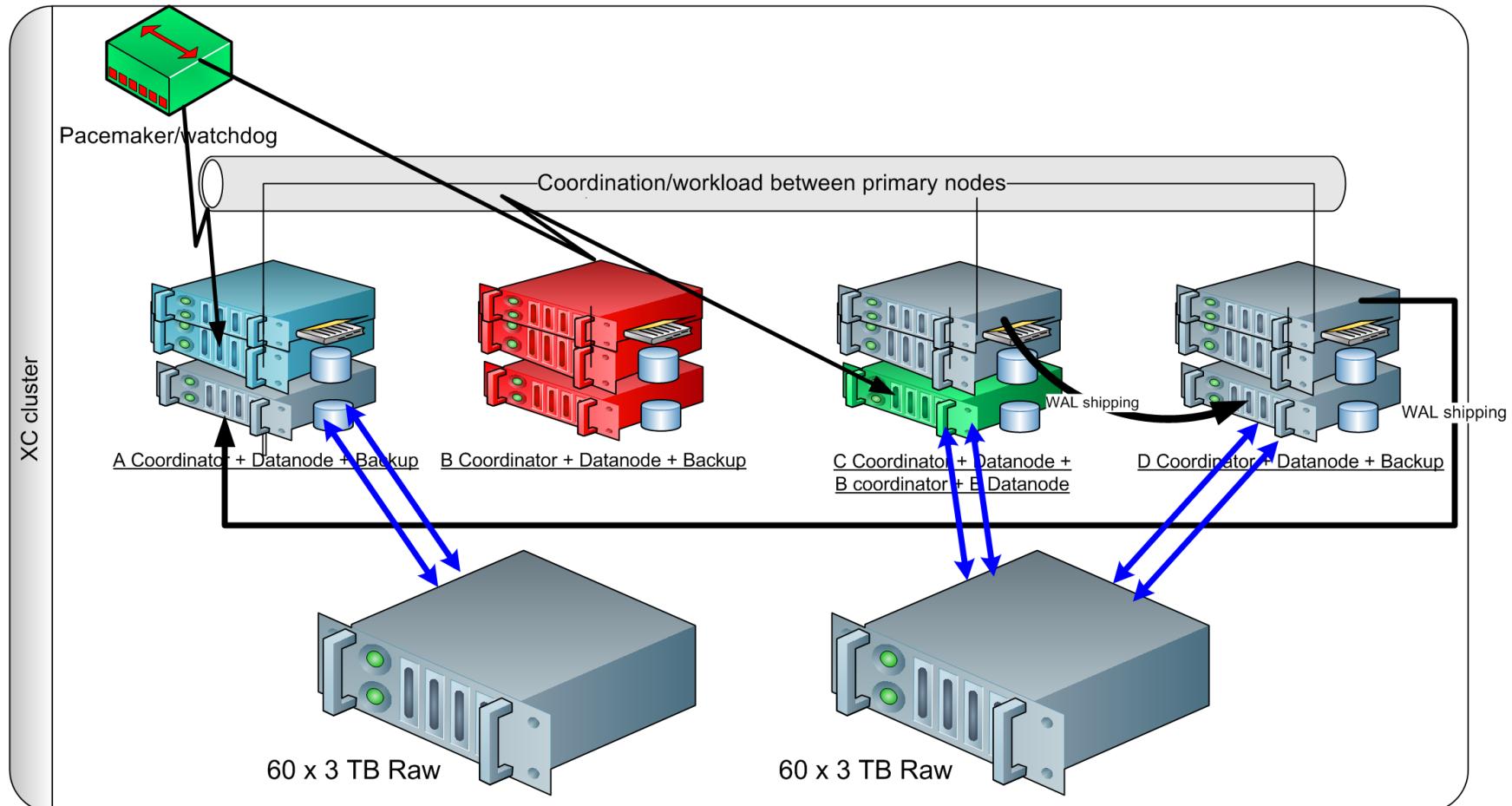
Postgres XC/XL

High availability - Failure



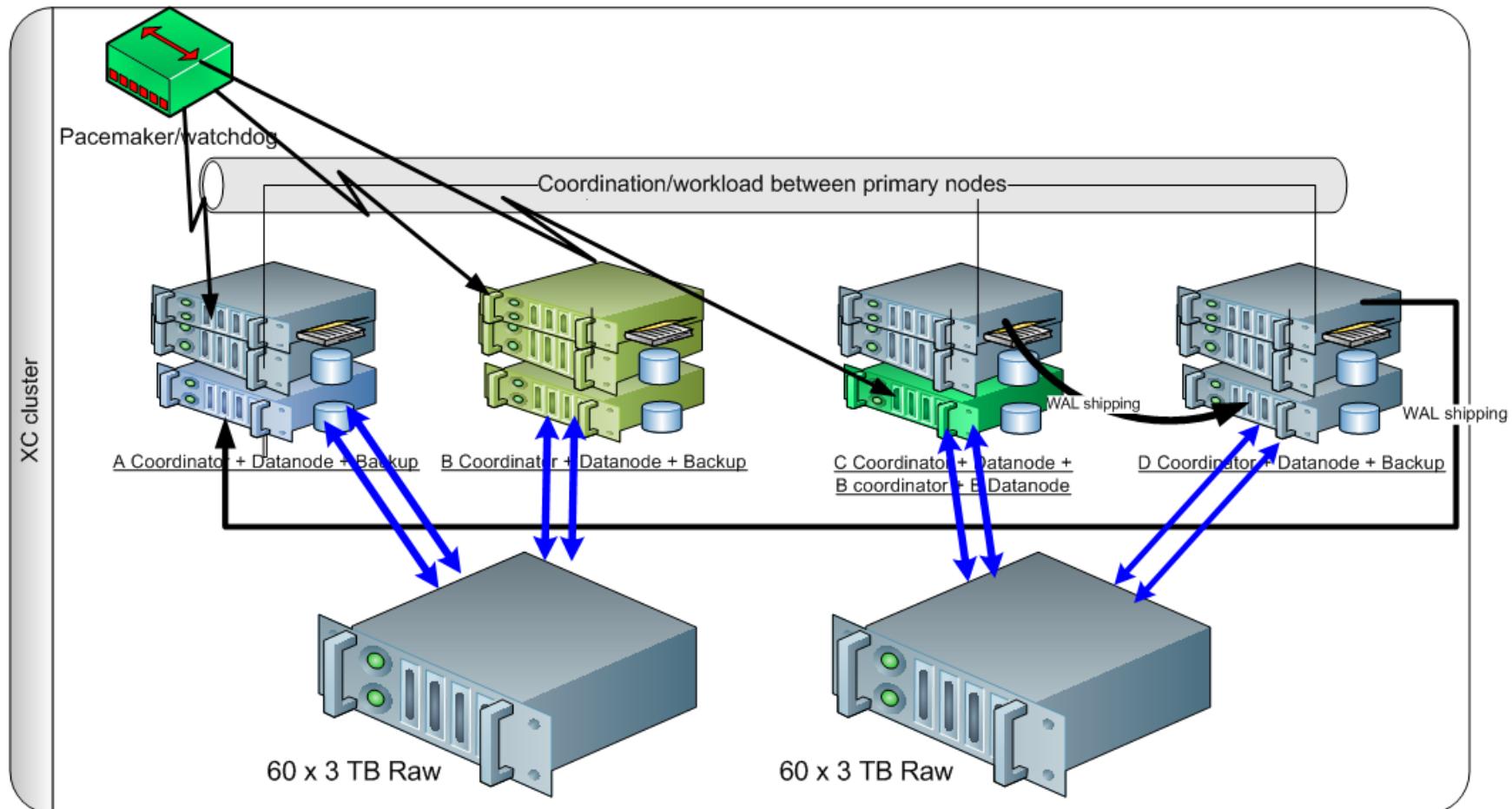
Postgres XC/XL

HA – Backup promotion



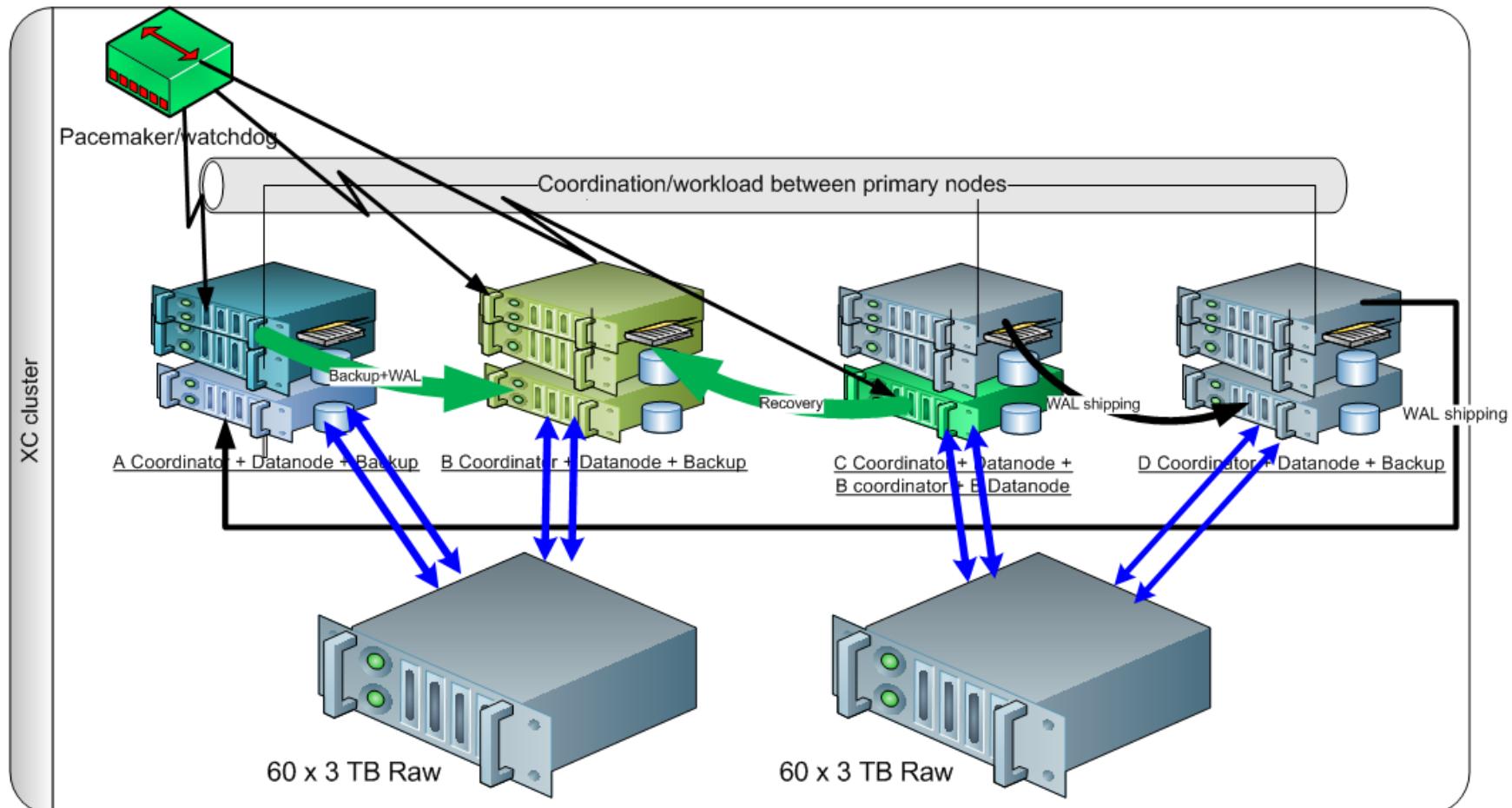
Postgres XC/XL

HA: recovery and backup demotion



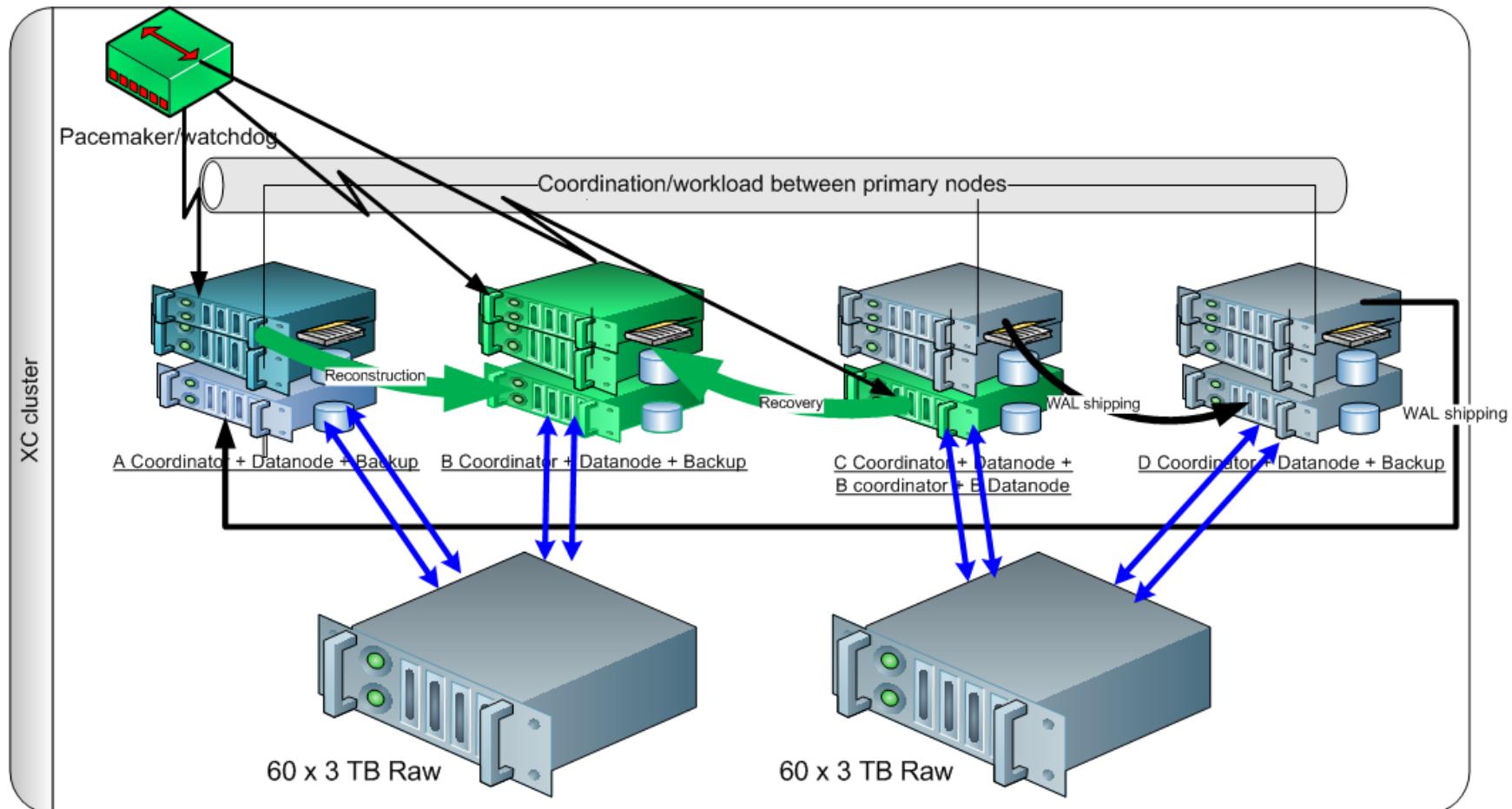
Postgres XC/XL

HA: recovery and backup demotion



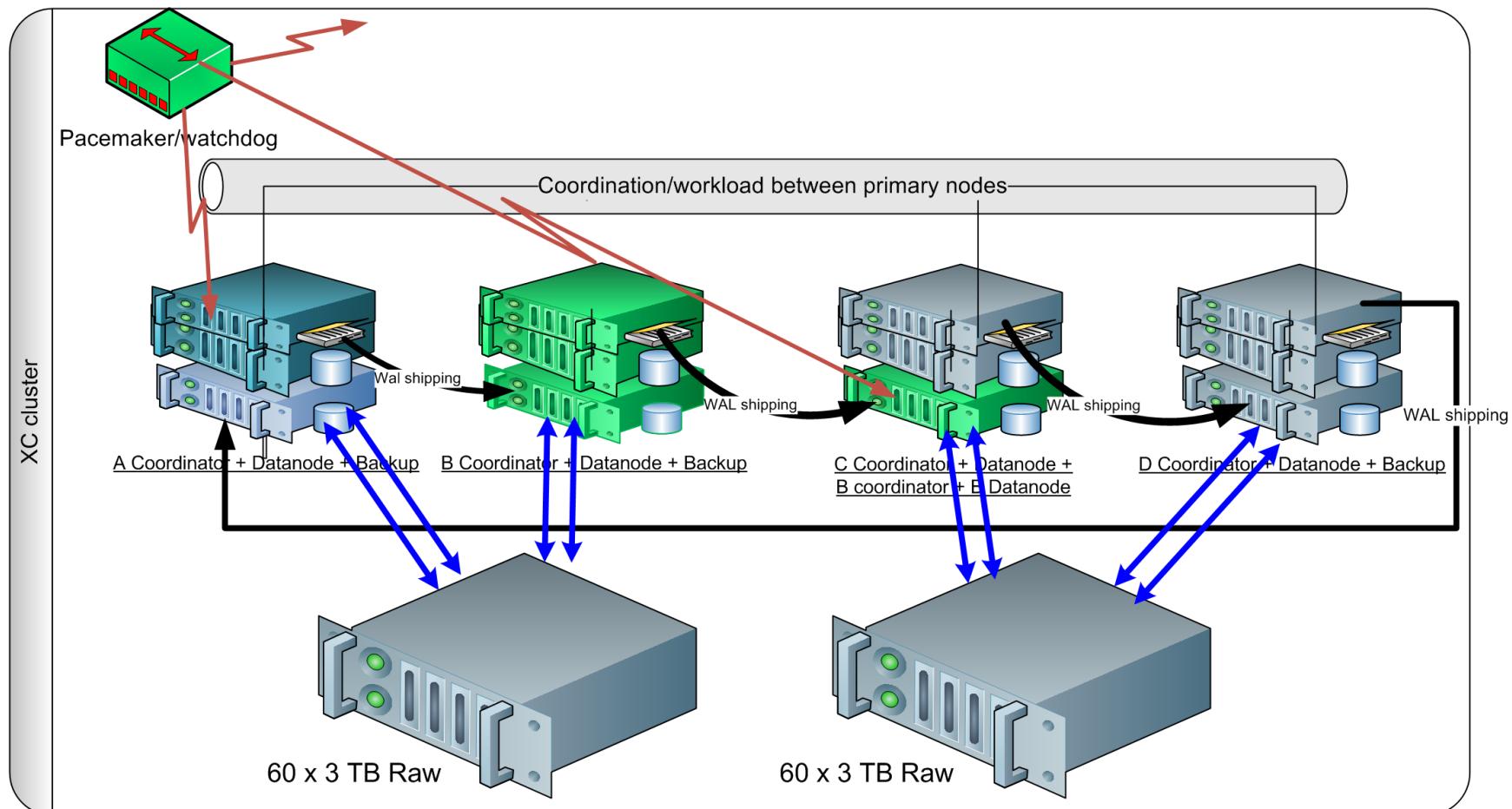
Postgres XC/XL

HA: recovery and backup demotion



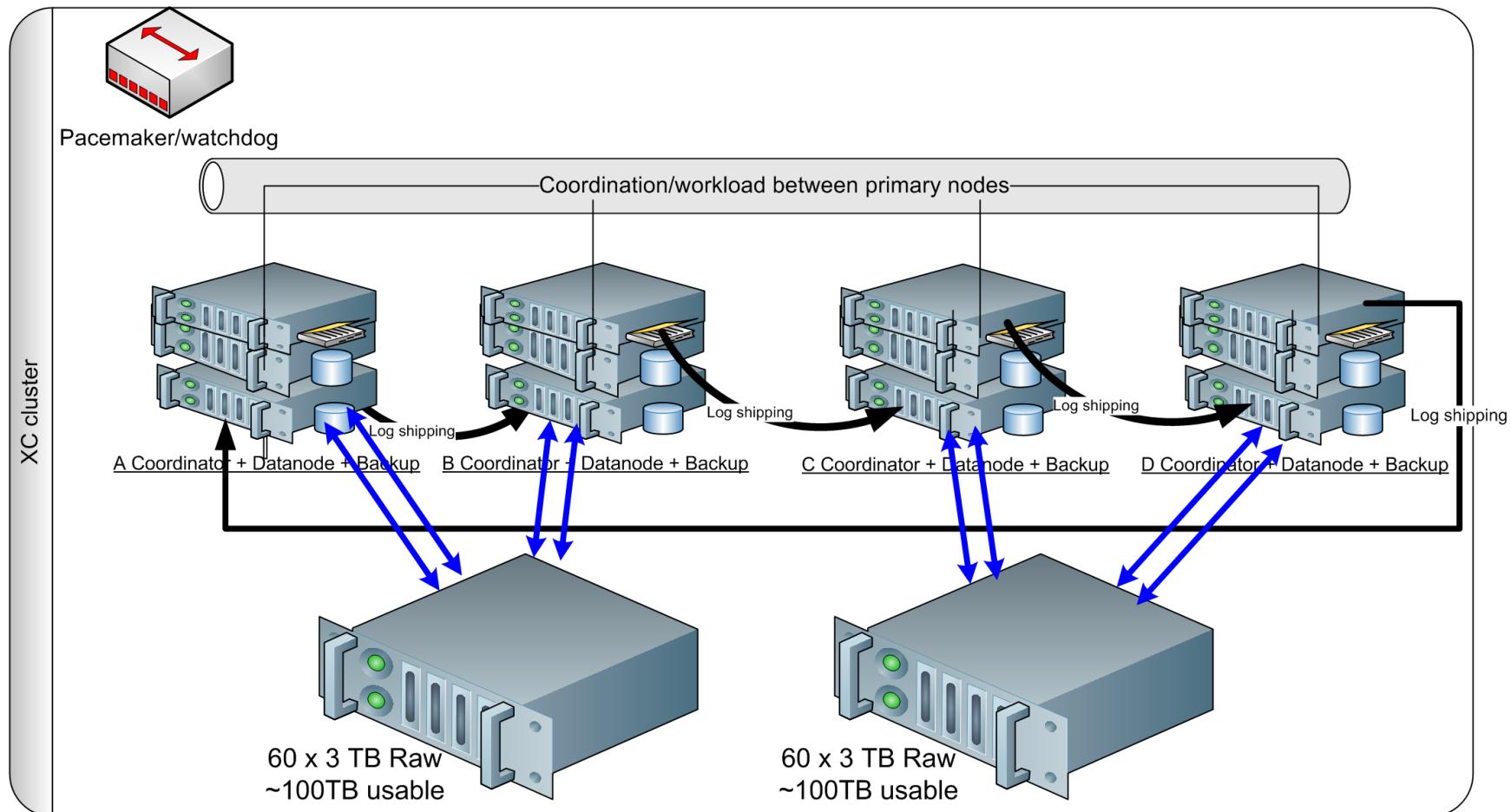
Postgres XC/XL

HA: recovery and backup demotion



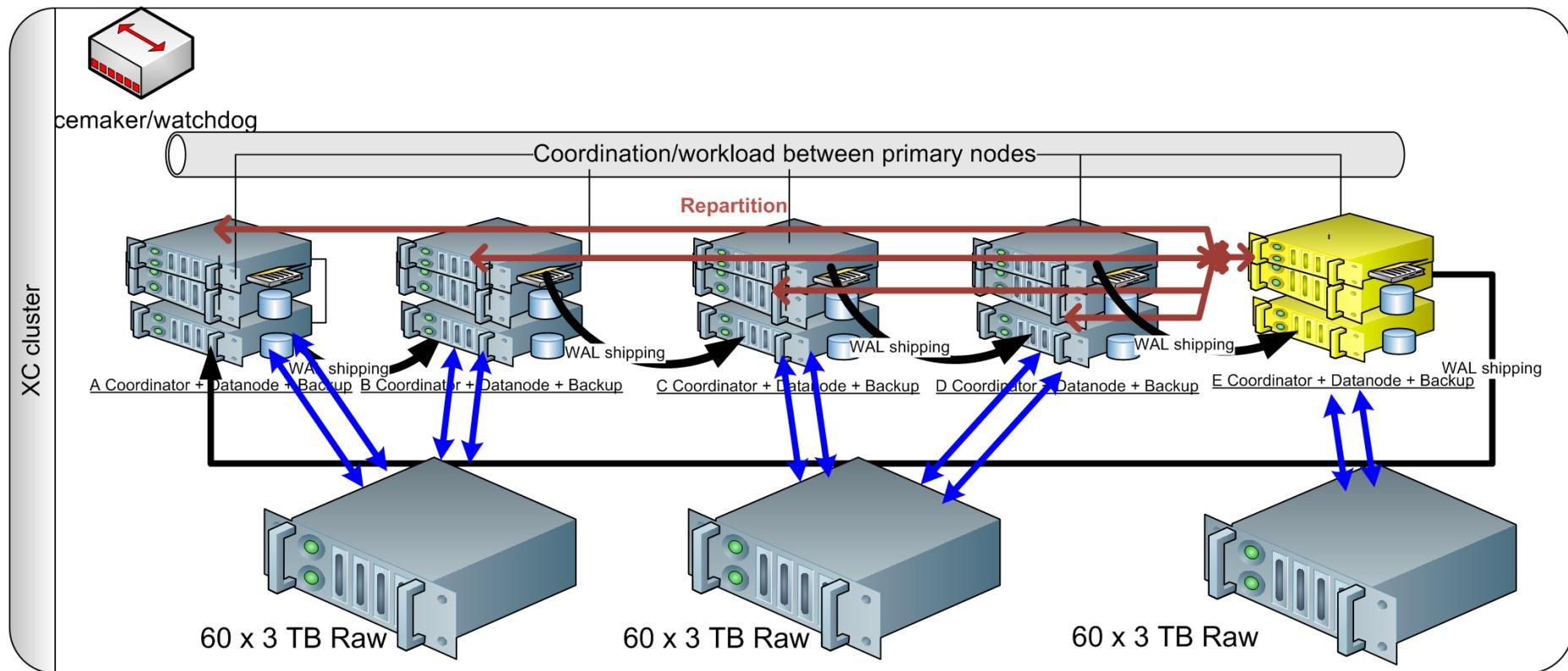
Postgres XC/XL

HA: recovery and backup demotion



Postgres XC/XL

Scalability: expansion, repartitioning



Postgres XC/XL role

- ▶ Postgres-XC integration seamlessness
 - ▶ Postgres compatible
 - ▶ PG SQL (psql, pgAdmin, JPA, hstore, object types, spatial indices, n-dimensional knn-searches)
 - ▶ R: RPostgreSQL
 - ▶ CU7 Framework compatible
 - ▶ OpenJPA
 - ▶ Java (JDBC, PG copy protocol)
 - ▶ Scalability
 - ▶ Horizontal + vertical - 50TB ~ 1PB, 10^{12} entities
 - ▶ Timeseries reconstruction
 - ▶ Batch processing, source oriented
 - ▶ Analytical processing, ad hoc
 - ▶ High Availability

Postgres XC/XL role – what do we need

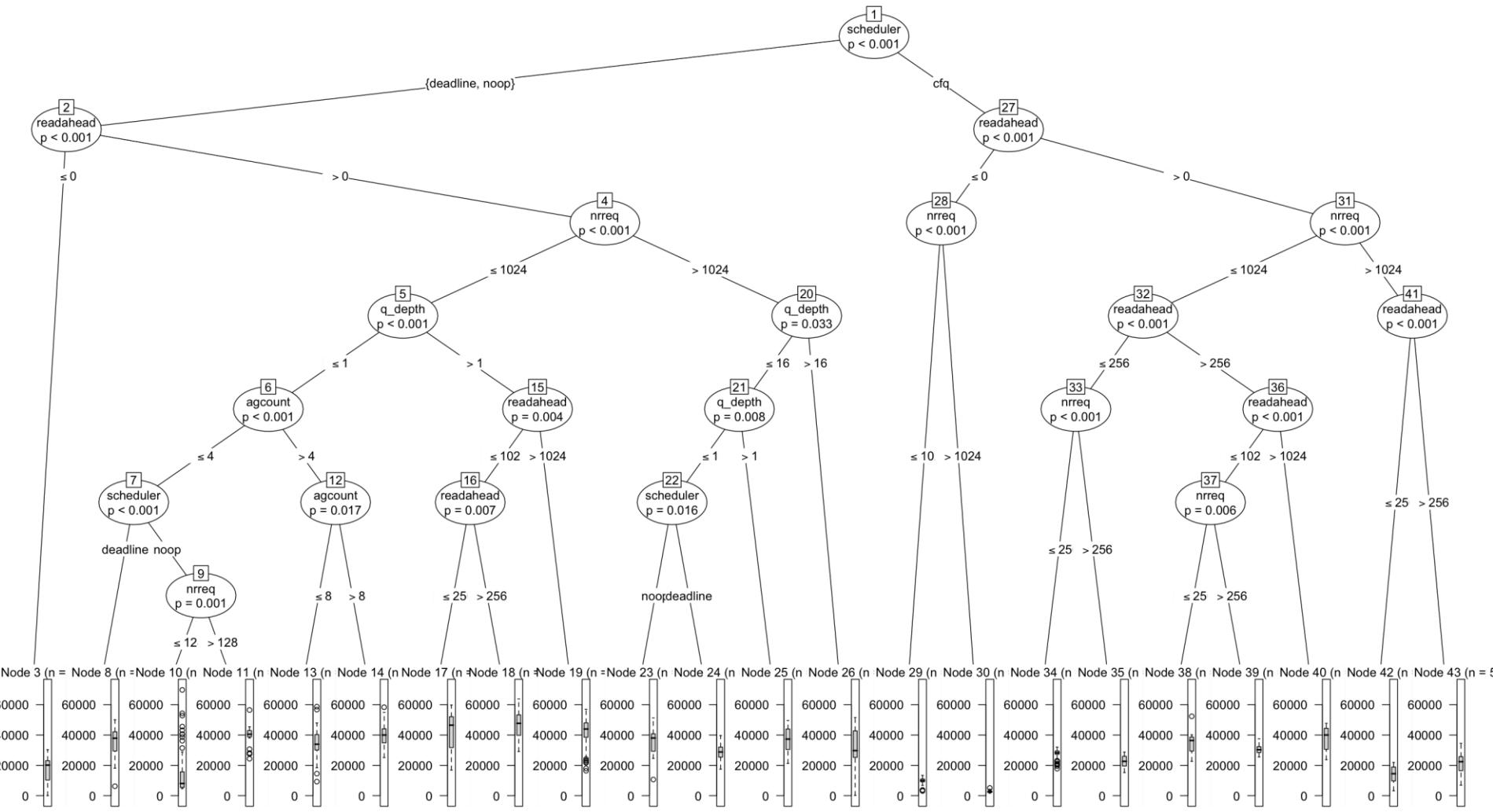
- ▶ Very High priority
 - Stability
 - Performance
 - Partitioning
 - PG type model (objects, arrays of objects)
 - JDBC working (pooling)
 - R working
 - Parallel loading into **partitions** of XC distributed tables
 - Support for COPY (via JDBC or other Java driver)
 - UDF for custom distribution logic (or as external API)
 - Custom aggregates
 - Load balancing
 - Support for existing index extensions
 - PLJava, plR working
- ▶ High priority
 - ▶ Query estimates available on the coordinator
 - ▶ OLAP features:
 - In-node query parallelization
 - Index organized tables
 - Working Bitmap, Bloom indicies
 - Column store
 - Estimators
 - Effective knn-searches
 - Compression
 - Read-only tables(paces)

Structure

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- Data model
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- **Hardware**
- Collaboration

OS IO tuning

SSD: correlation tree of random IO for read-write for single, 4 and 8 threads for the throughput in IO/s



Big Volume vs Constraints

Big Volume vs Constraints

- Growing number of cores

Big Volume vs Constraints

- Growing number of cores
- Growing number of users

Big Volume vs Constraints

- Growing number of cores

Procurement Plan

	Today	2013	2014	2018
Cores	O(100)	O(100)	O(300)	O(1000+)
DB Nodes	1	3+2	4 +1	8+2
Storage	24TB	50TB	75-315 TB	200-950 TB

Launch | IDR^(*1) | FDR^(*2)

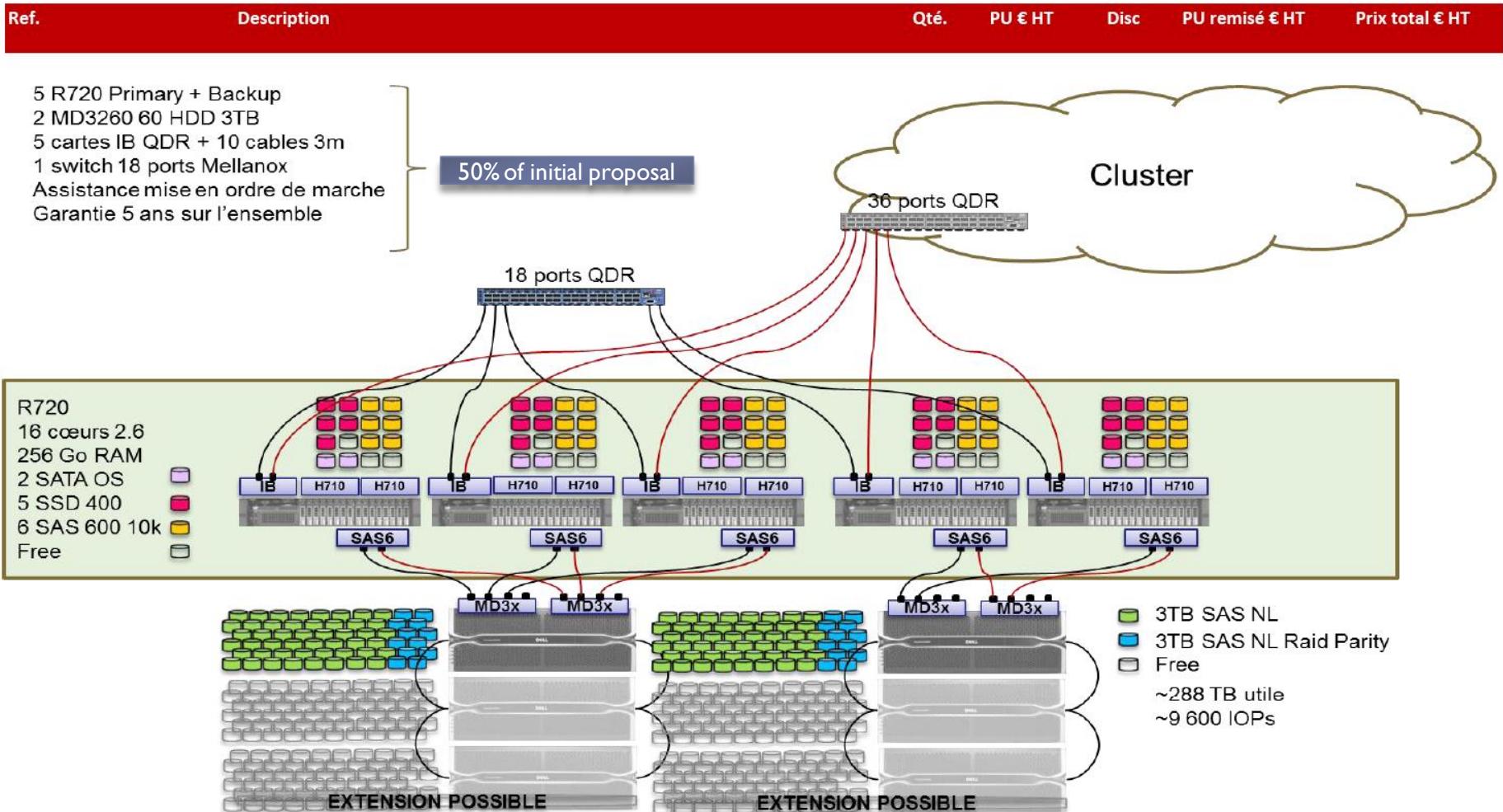
(*1) IDR: Intermediate Data Reduction

(*2) FDR: Final Data Reduction

- Growing number of users

Hardware

Dell, 180 disks, 540TB raw WAL space, SSDs: 2TB per node...



Collaboration - Conclusion

- ▶ We are few of milestone astronomical experiments
 - ▶ Relying on Postgres already
 - ▶ Made few strategic choices because of XC existence
 - ▶ Willing to invest:
 - ▶ time in Postgres XC/XL
 - ▶ **Hoping XC/XL will merge their efforts into a holistic solution!!!**
 - ▶ Encouraging Tokyo meeting in 2014/03
- ▶ Invested into:
 - ▶ testing and
 - ▶ into relevant hardware already
 - ▶ ported some extensions, i.e. plJava, tested many more..
- ▶ Visible in the Gaia consortium
 - ▶ Linked to the final Gaia catalogue, possibly influencing their choice
- ▶ Veeeery long term user
 - ▶ **production starts in mid 2015! – we will be deploying it next weeks!**



QA...

