


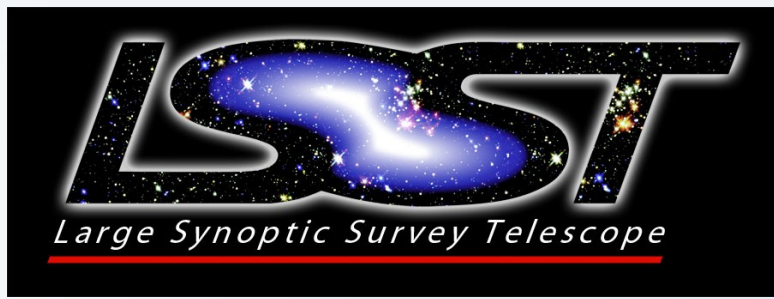
Big Data challenge
posed by the



Large Synoptic Survey Telescope

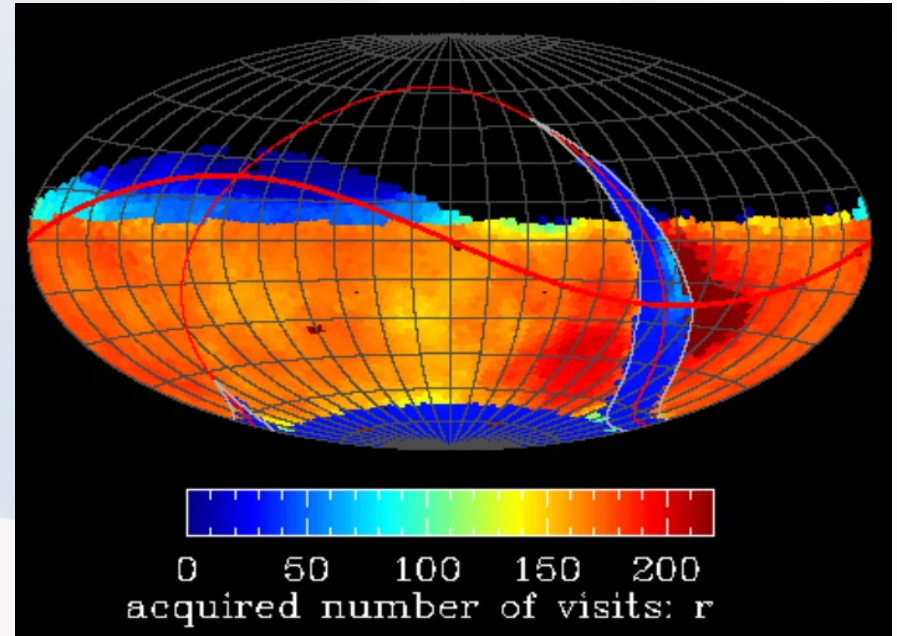
The logo for the Large Synoptic Survey Telescope (LSST) features the letters 'LSST' in a bold, white, sans-serif font. The letters are filled with a vibrant image of a galaxy, showing a bright blue and white core with a spiral structure of stars and gas. The background of the logo is a dark field of stars, similar to the overall background of the slide. Below the letters, the full name 'Large Synoptic Survey Telescope' is written in a smaller, white, italicized font. A thin red horizontal line is positioned directly beneath the text.

Emmanuel Gangler – UBP – Clermont-Ferrand (France)

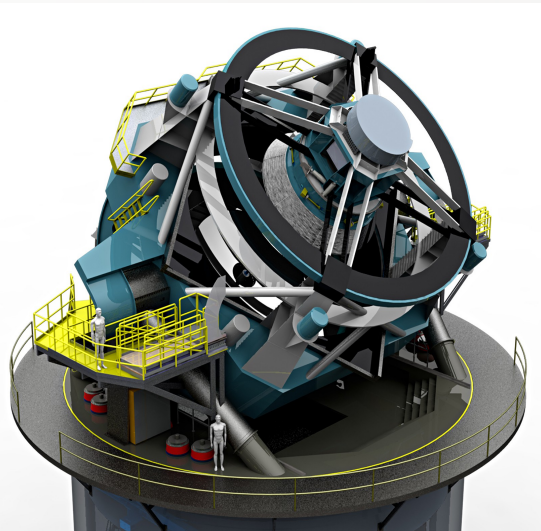


capabilities :

- A stage-IV survey :
 - 8.4 m telescope
 - Cerro Pachon (Chili)
 - 3.2 Gpix 9.6[°] FoV camera
 - 0.2 " pixel
 - First light 2020



- All visible sky in 6 bands (ugrizy) ($\sim 20000^{\circ}$)
- 15 s exposure, 1 visit / 3 days
r ~ 24 / visit
- During 10 years !
 - ~ 200 visits/band
- 30TB/day 100 PB/10 years



LSSTc institutions :

- **Institutional members:**


- Significantly contribute to LSST project and enabling science

- 37 institutions, 5 being non-US:

- Republic of Chile

-  FR (CNRS / IN2P3)

-  UK (Oxford & Portsmouth Universities)

-  CZ (Institute of Physics of the Academy)

- **International Contributors:**

- Support for LSST operations (200 k\$ / PI)

- 25 institutions

- 11 of them come from

- 8 European countries

- All have **full data access rights**

European International contributors

Canary Islands

Instituto de Astrofísica de Canarias (IAC)

Croatia

Ruđer Bošković Institute (RBI)

France

IN2P3

Germany

Ludwig-Maximilians-Universität (LMU)
Max Planck Institute for Astrophysics (MPA)
Max Planck Institute for Astronomy (MPIA)

Hungary

Eotvos Lorand University (ELTE)
Konkoly Observatory

Serbia

Nano Center

Switzerland

Eidgenössische Technische Hochschule Zuerich (Eth Zuerich)

United Kingdom

Science and Technology Facilities Council (STFC) - UK LSST Consortium

+ more coming (IT, ...)

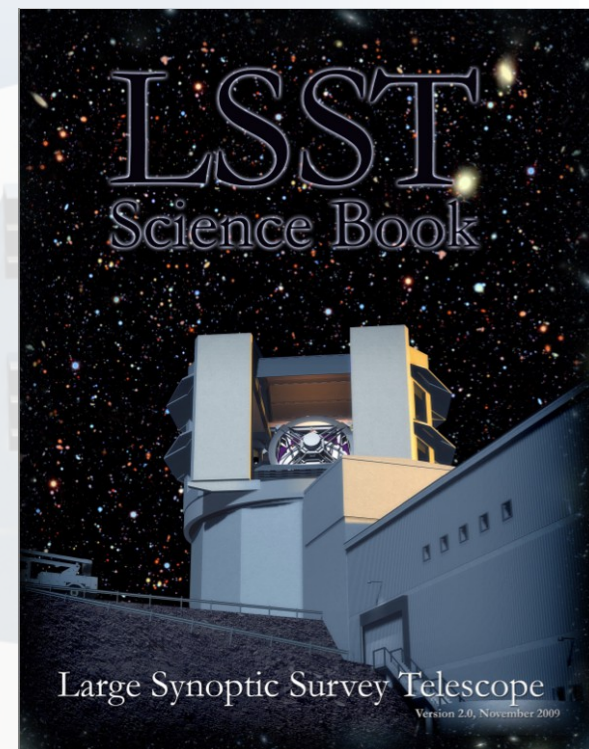
LSST project and Science:



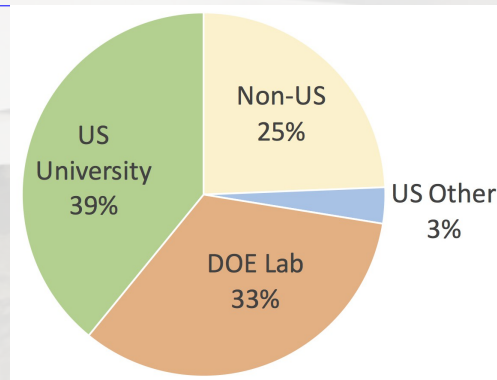
- **LSST covers 4 major scientific themes**
 - Dark Energy, Dark matter
 - Mapping Milky Way
 - Transient optical sky
 - Solar system
- **Scientific analysis is not part of the project**
 - Conducted by independent collaborations (**need data rights**)
 - With the help of LSSTc

LSST science

- **LSST is a world-wide project !**
 - Around 900 scientists expected to have LSST data rights
 - ~450 from US
 - ~300 from Europe (9 countries)
- **9 science collaborations**
 - **Galaxies** (46 members)
1 HR, 3 UK
 - **Stars, Milky Way, and Local Volume** (118 members)
2 DE, 4 UK
 - **Solar System** (N/A)
 - **Dark Energy** (565 members)
2 CZ, 1 ES, **65 FR**, **70 UK**
 - (Large scale structure/baryon oscillations)
 - (Strong lensing)
 - **Active Galactic Nuclei** (36 members)
1 RS, 1 UK
 - **Transient/Variable stars** (>104 members)
> 2 DE, **1 FR**, 1 IL, 1 UK
 - **Informatics and statistics** (60 members)
1UK



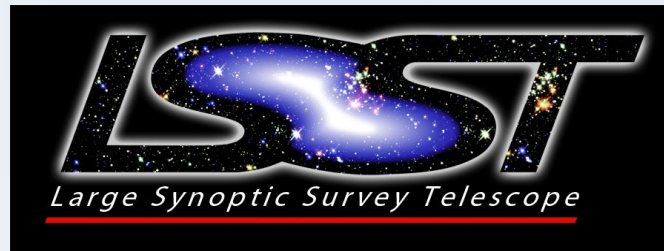
arXiv:09@12.0201



Numbers from 2016

+ ~45 FR joining ;
Those numbers are
steadily growing !

Challenges : building LSST

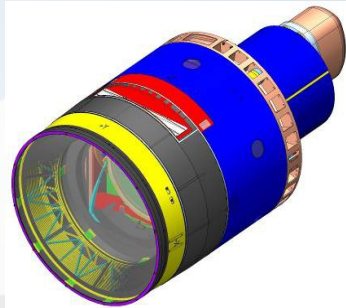


L3

Telescope



Caméra



Data Management

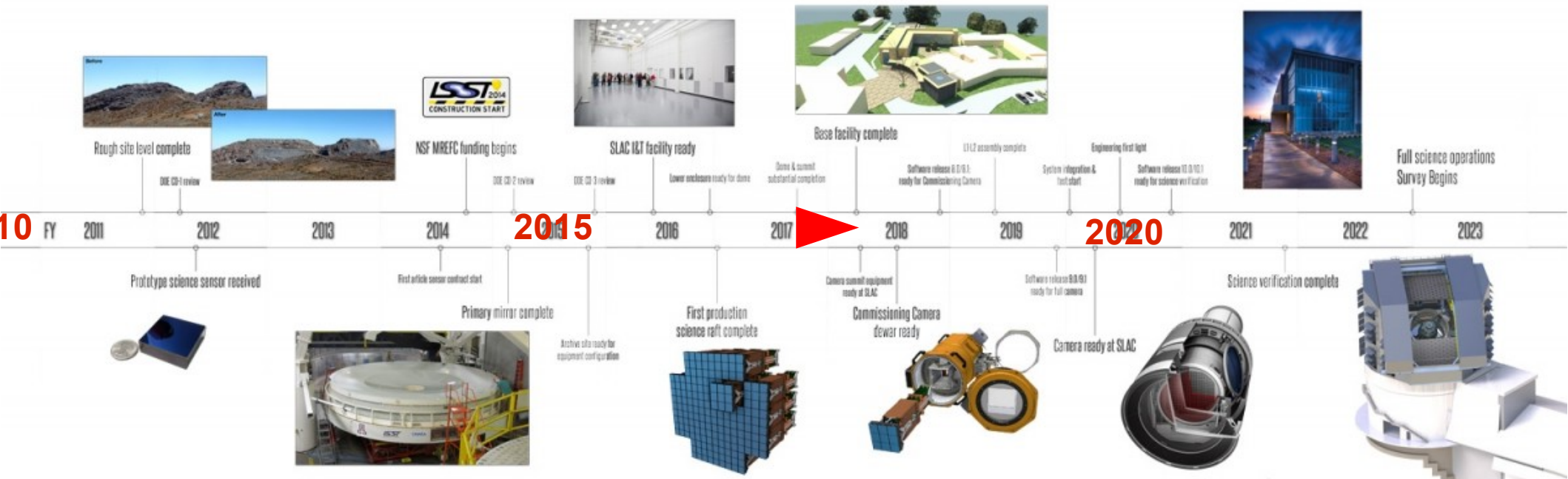


Outreach

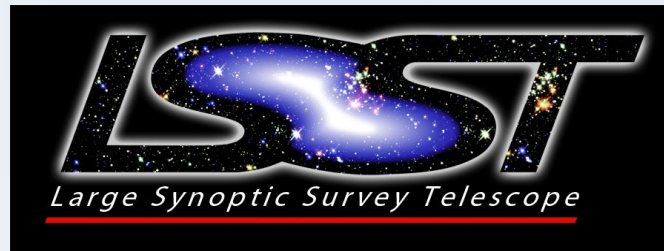


L1 & L2

Challenges : building LSST



Challenges : building LSST

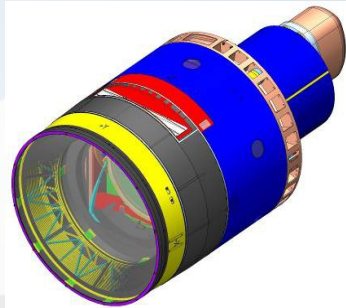


L3

Telescope



Caméra



Data Management



Outreach



L1 & L2

Most Camera Subsystems Have Been Prototyped

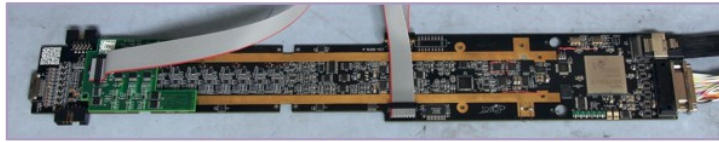


Sensor tests

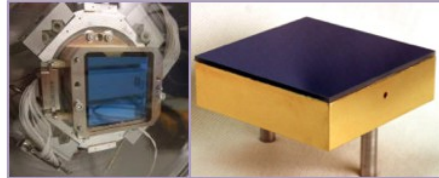
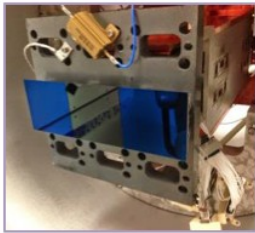


ComCam

Raft Tower



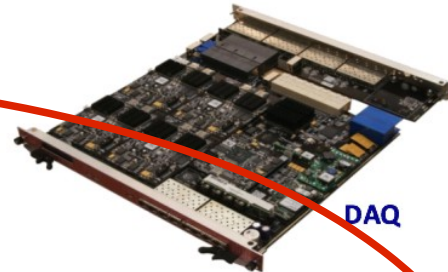
Corner Raft Electronic Board



Prototype sensors

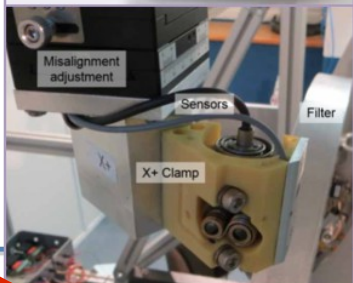
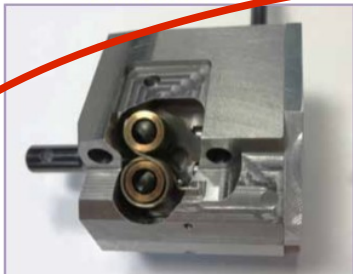


Refrigeration

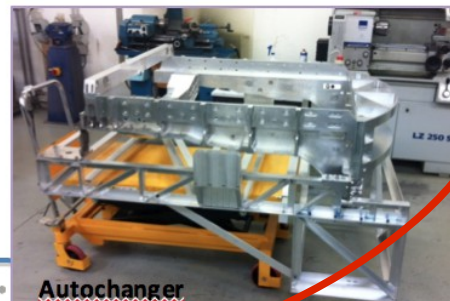


DAQ

Carousel Clamps



Preliminary test bench



Autochanger

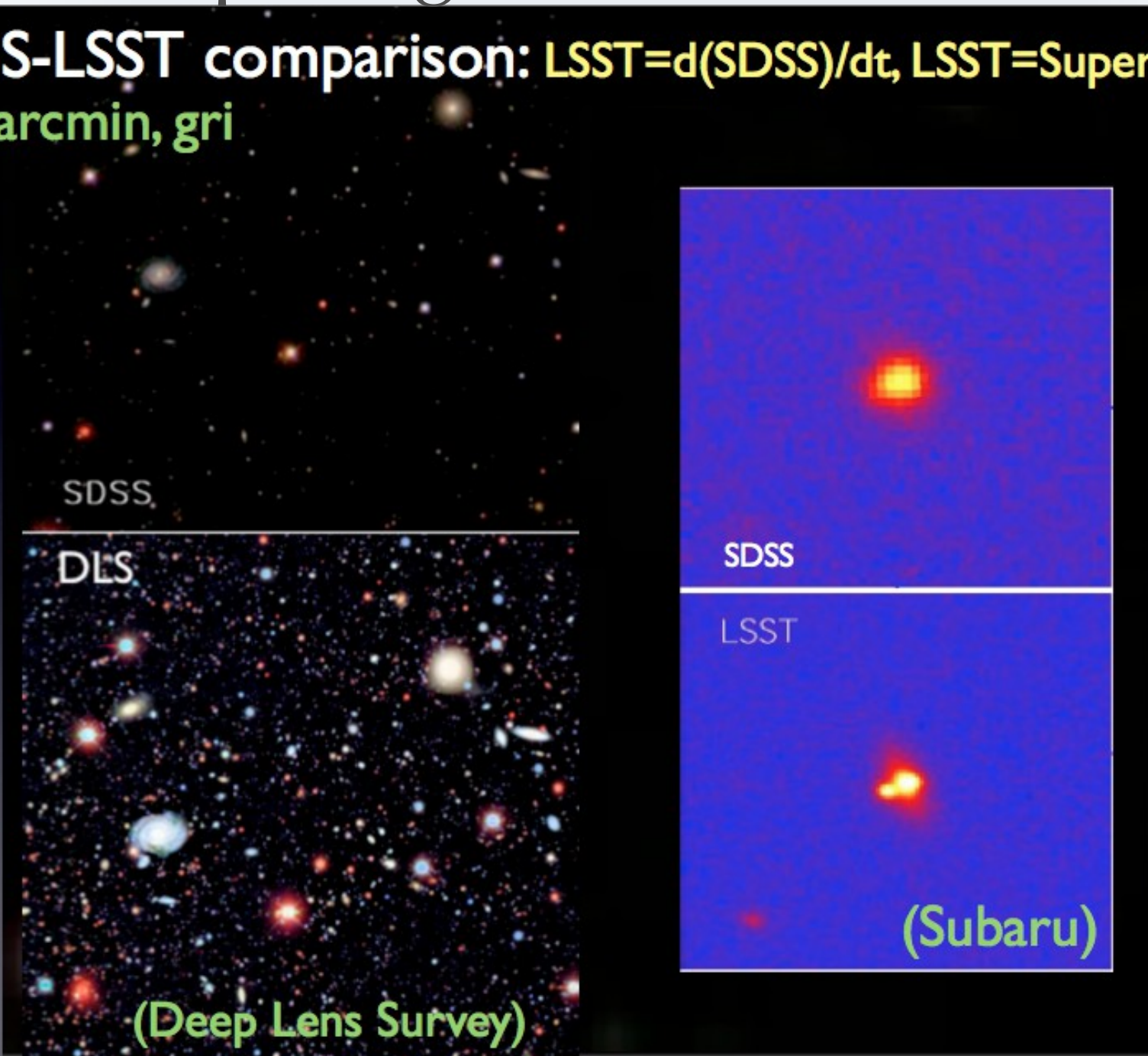


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- **Sizeable hardware investment@ from FR**
 - Partner of LSST project since 2005

Comparing LSST data to SDSS

SDSS-LSST comparison: $LSST = d(SDSS)/dt$, LSST=SuperSDSS
7x7 arcmin, gri

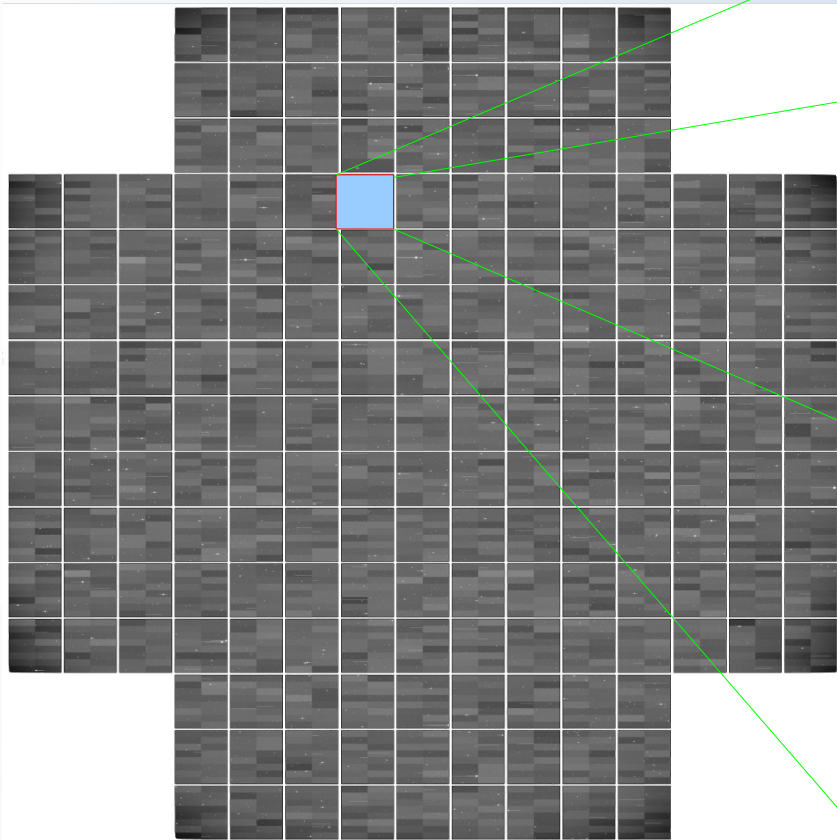


LSST data flow

Camera : 189 CCD (16 Mpix) read in parallel

- 3,2 G pixels !
- ~ 6 Gbyte / 17 seconds
- 15 TB / night

~ 1/1 000 000 000 of LSST data !



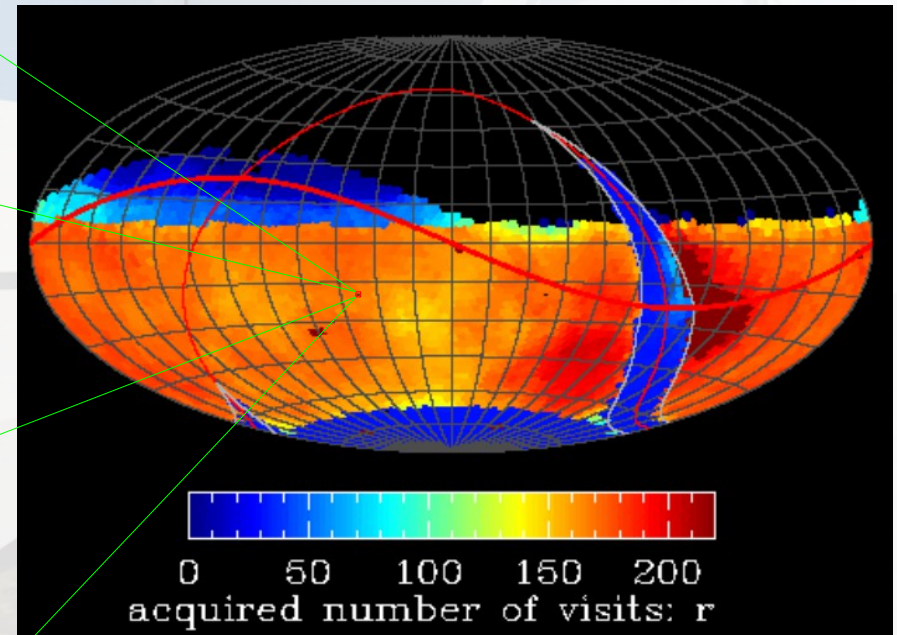
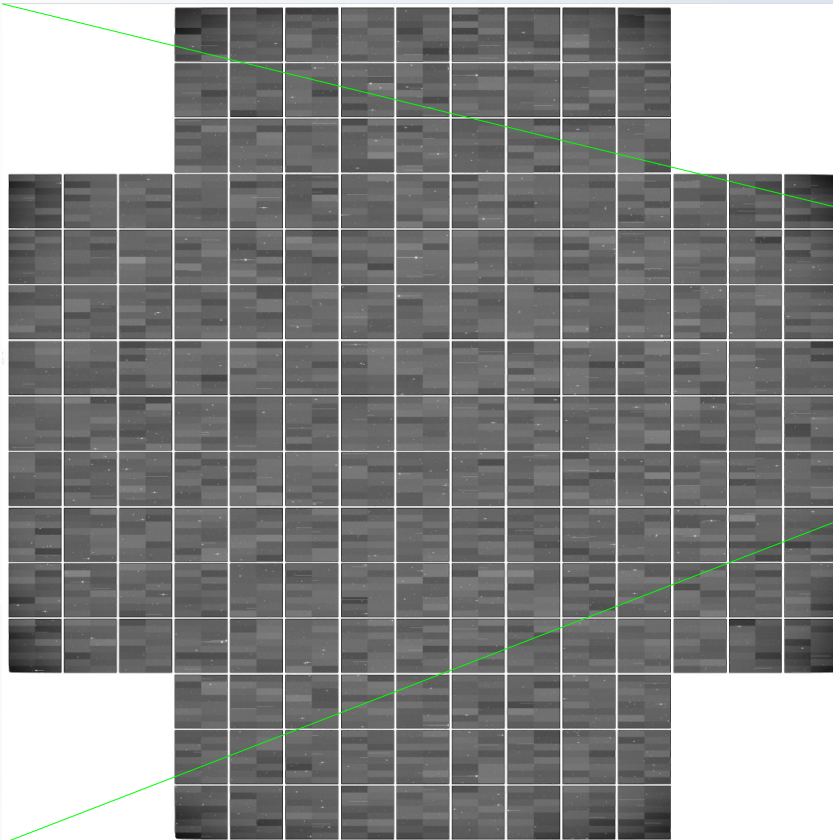
LSST data flow

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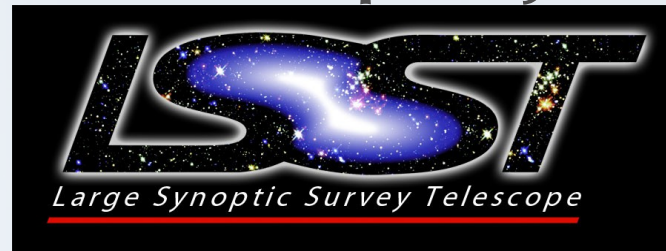
- 3,2 G pixels !
- ~ 6 Gbyte / 17 seconds
- 15 TB / night

During 10 years !

- ~ 1000 visits per field
- opens the time domain



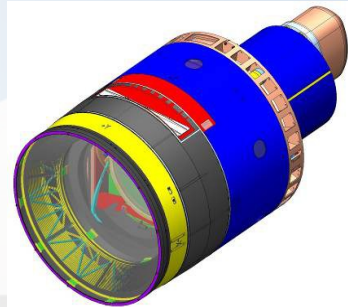
Data management is a pillar of the project :



Telescope



Caméra



Data Management



Outreach



« The data volumes [...] of LSST are so large that **the limitation** on our ability to do science isn't the ability to **collect** the data, **it's the ability to understand** [...] the data »

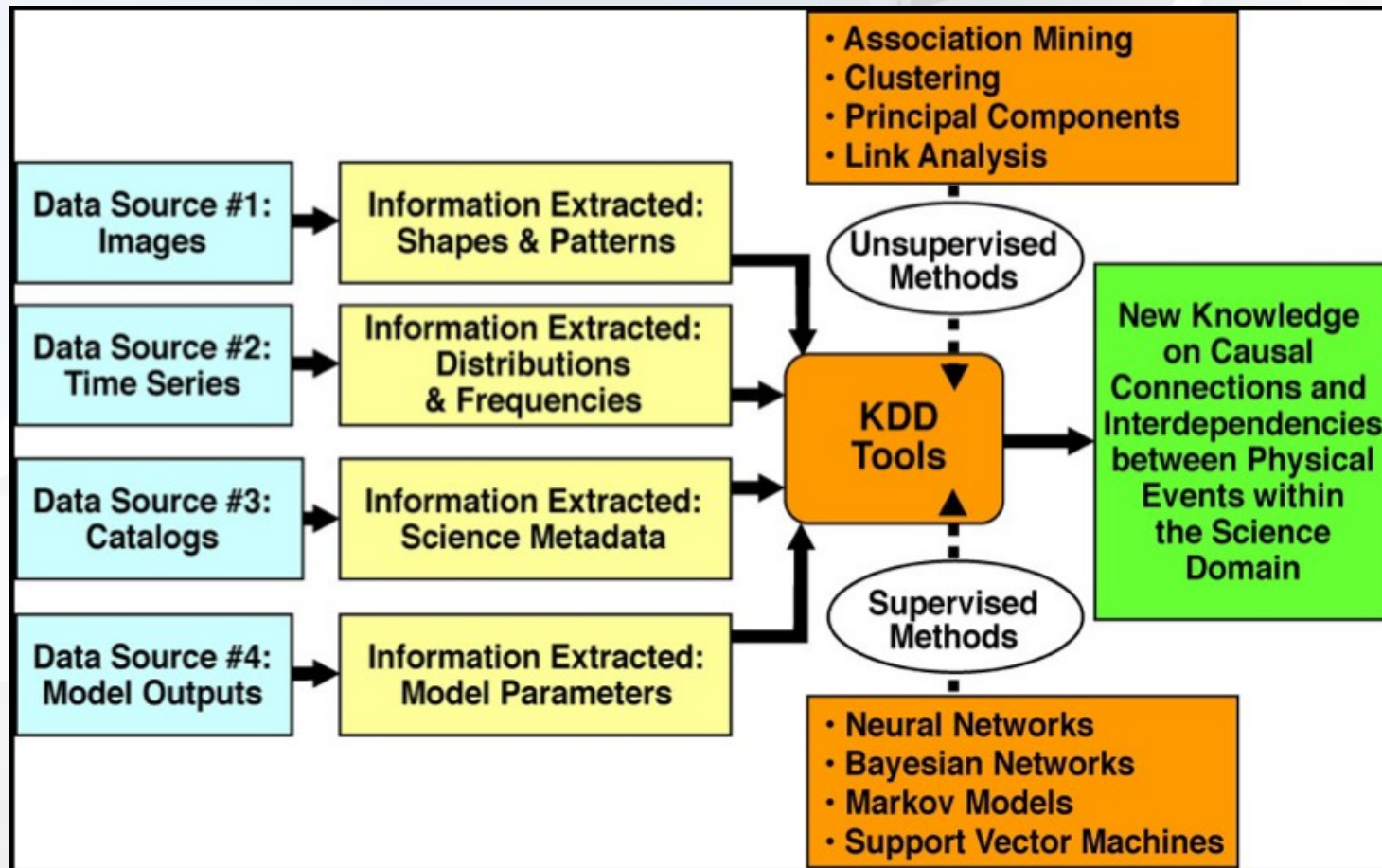
Andrew Conolly (U. Washington)

“How do you turn petabytes of data into scientific knowledge?”

Kirk Borne (George Mason U.)

How to handle astronomical big data ?

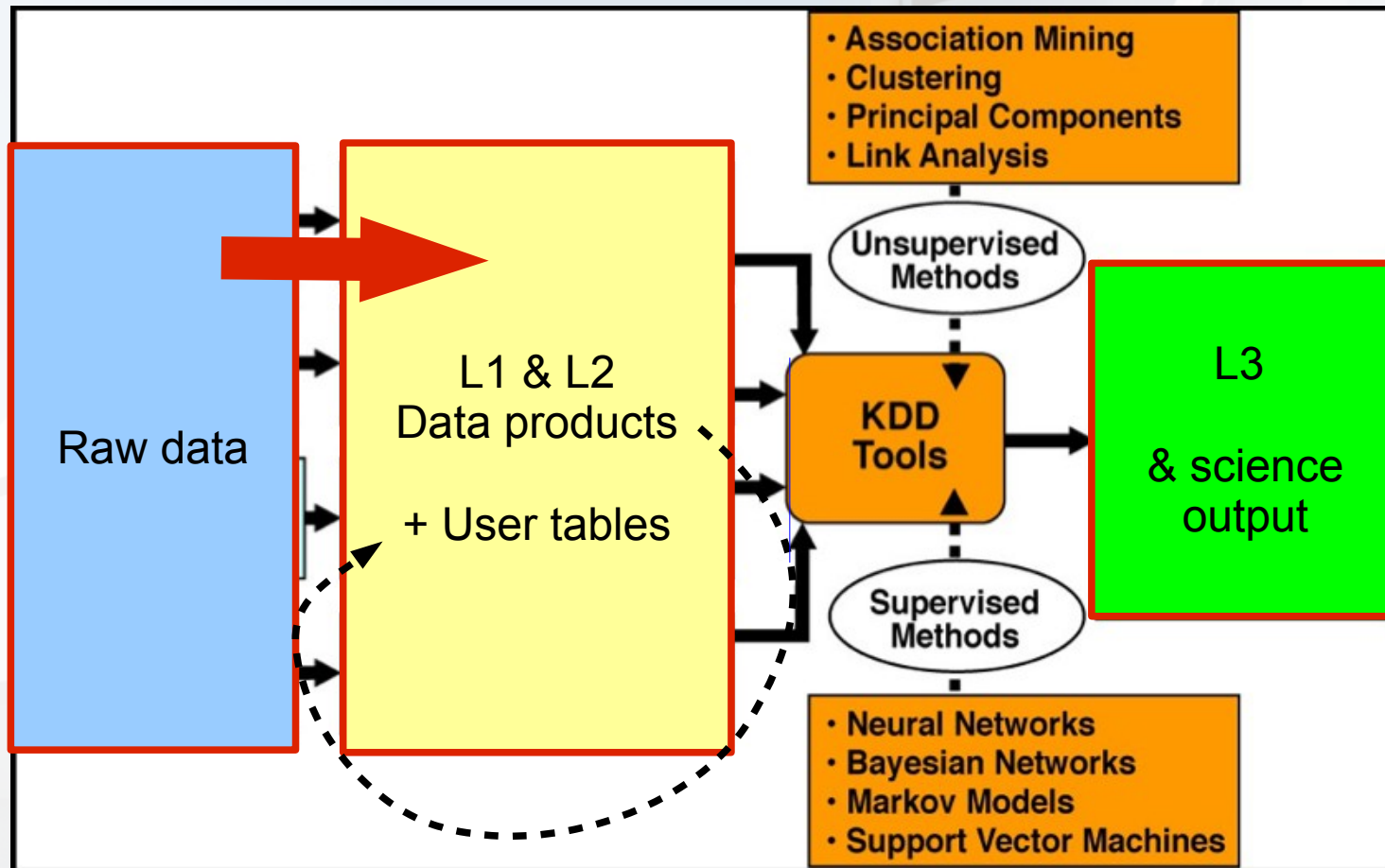
LSST is strongly inspired by Astroinformatics point of view :



Borne 2009

How to handle astronomical big data ?

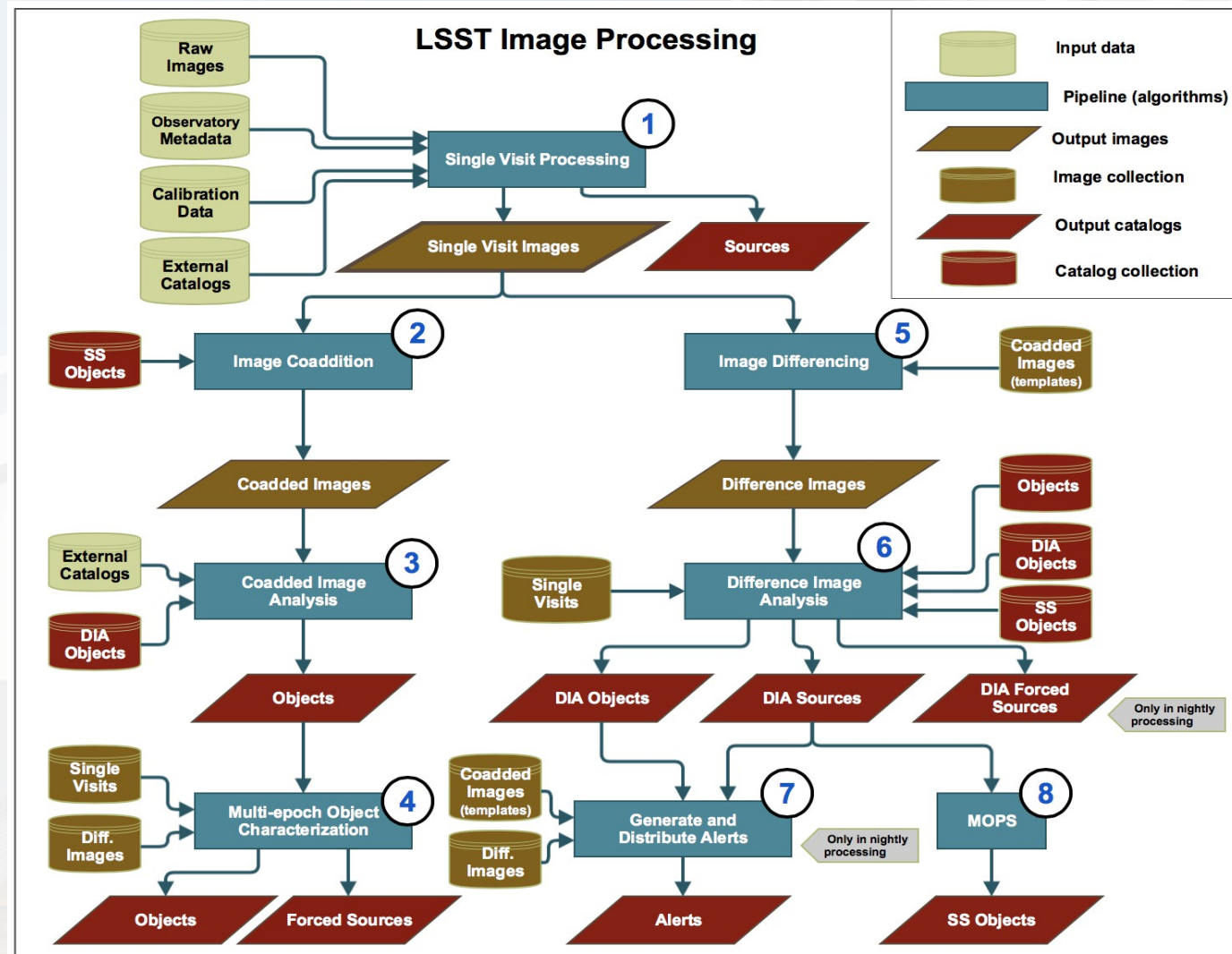
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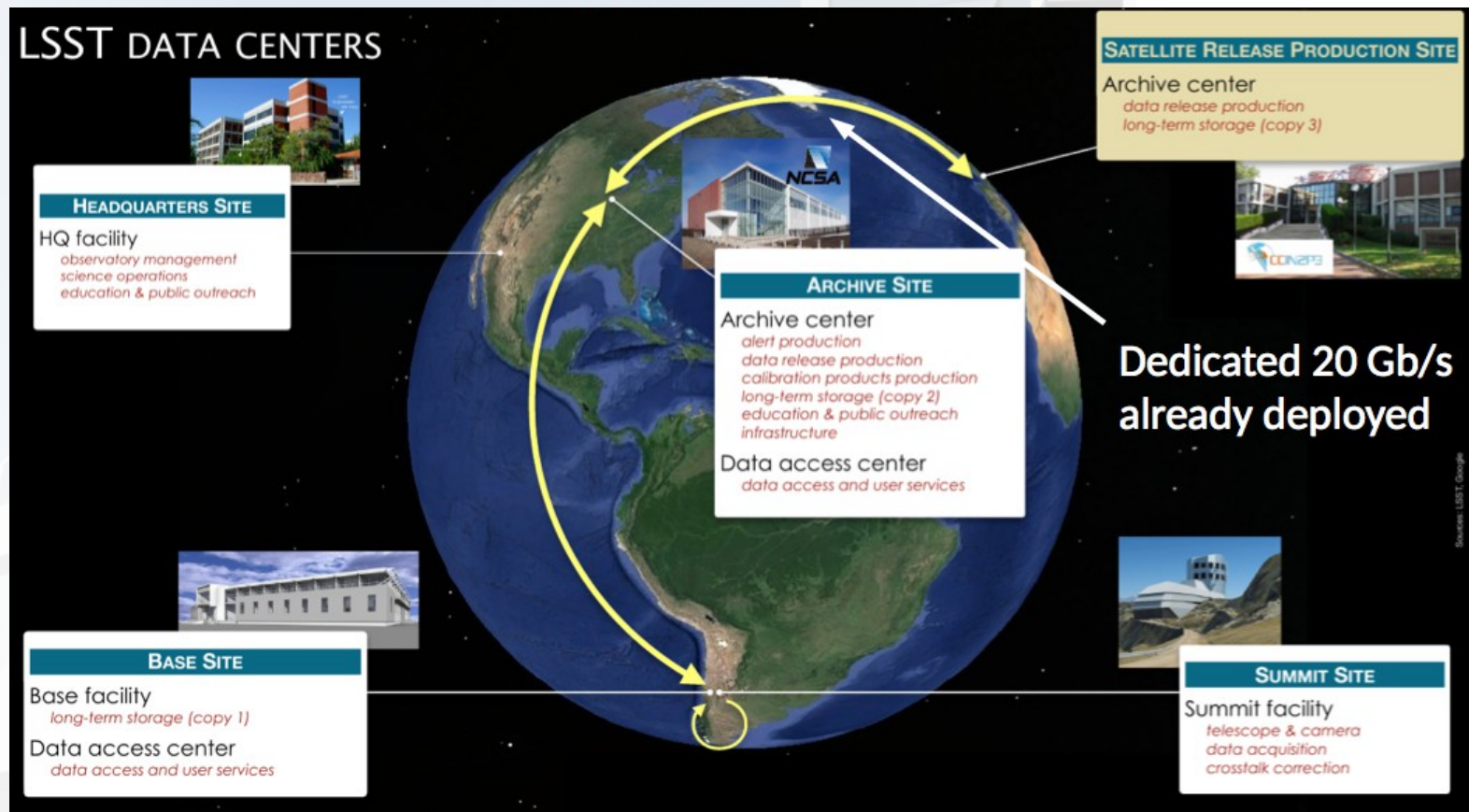
From Raw data to L1 & L2 products

- **Image Processing** pipeline by Data Management team
- Validation on precursor data (SDSS Stripe 82, CFHTLS, HSC)



From Raw data to L1 & L2 products

- **Embarrassingly parallel problem**
 - suited for HTC computing (I/O bound)



Per MoA, FR will:

- Process 50% of data up to L2 products
- Host an archive of LSST data

□ **There will be a full copy of LSST data in EU**

Available data:

Application Layer -

Generates open, accessible data products with fully documented quality

Processing Cadence	Image Category (files)	Catalog Category (database)	Alert Category (database)
Nightly	Raw science image Calibrated science image Subtracted science image Noise image Sky image Data quality analysis	Source catalog (from difference images) Object catalog (from difference images) Orbit catalog Data quality analysis	Transient alert Moving object alert Data quality analysis
	Stacked science image Template image Calibration image RGB JPEG Images Data quality analysis	Source catalog (from calibrated science images) Object catalog (optimally measured properties) Data quality analysis	Alert statistics & summaries Data quality analysis
Data Release (Annual)			

Alerts :
2 M/day
(within 60s.)

Static: 80 TB image
In 6 bands
(all visible sky)

Relation 1-Many
Object
Sources

Dynamic: 60 PB

↔ **Catalogs : 15 PB**

Impact for database

- Huge data release by DR11:
 - 60 T rows
 - ~10 PB
 - $47 \cdot 10^9$ objects (100 TB catalog)
 - $1\,500 \cdot 10^9$ objets extra (1.2 PB catalog)
 - $9\,000 \cdot 10^9$ detections "sources" (5 PB catalog)
 - $50\,000 \cdot 10^9$ measurements "forced sources" (2 PB catalog)
 - Nightly transient alerts: $>2 \cdot 10^6$
- Processing paradigm : **characterize first, analyze later**
 - Data analysis is NOT part of the project
- **New subfield of astronomy: Astrominformatics** (arXiv:0909.3892)



Simulation 1
CCD 4k x 4k

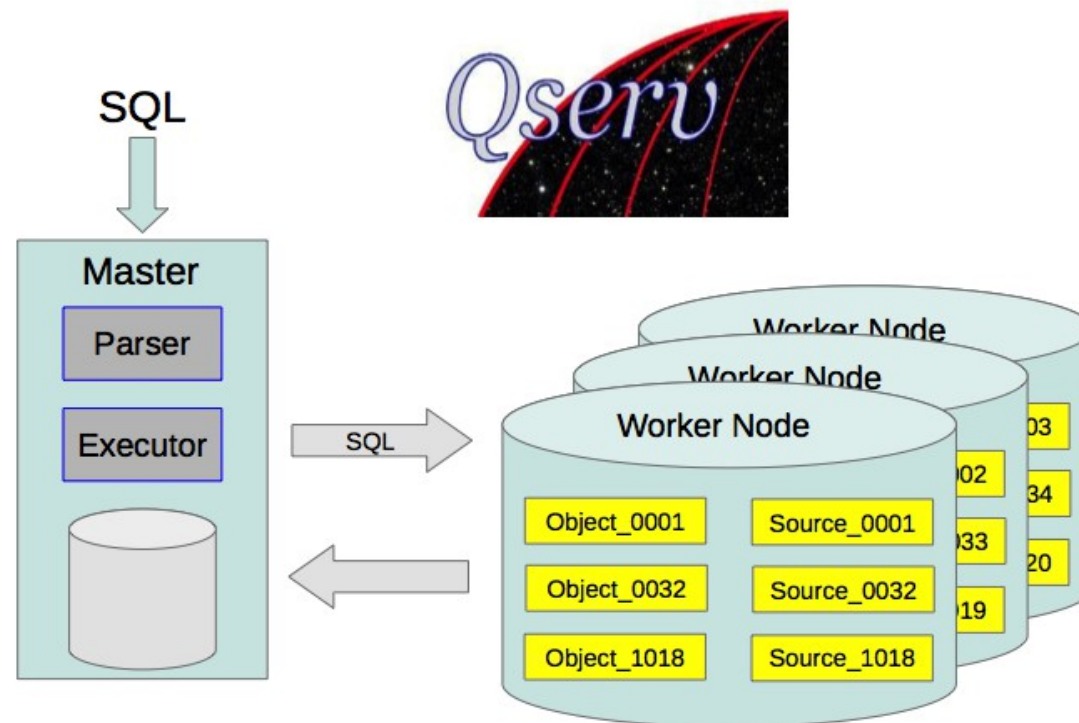
Qserv

Features :

- Shared-nothing MPP RDBMS
- *Spatial partitioning* with overlap
- *Shared scans*
- Replicated data
- Fixed-purpose dedicated hardware

Design

- SQL parser
 - Metadata DB
 - User defined function (geometry)
- Communication with xrootd
- MariaDB Backend
- Returns aggregate results



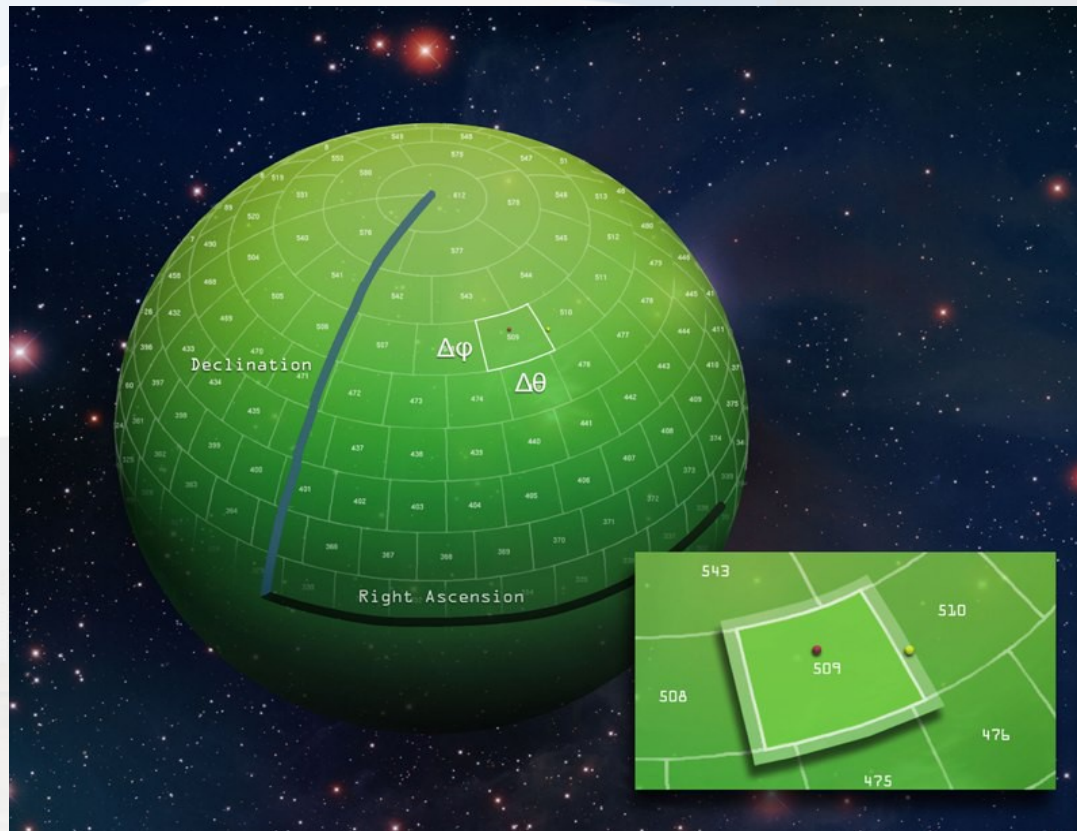
Qserv

Partitioning :

- Optimized for spatial joins on neighbors queries
- Spherical partitioning with overlap
- Two level
 - 2nd level materialized on the fly

Limitations

- Only subset of SQL
 - Spatial constraints
 - No subqueries
 - No function in ORDER BY clause
- Some queries can't be treated
 - (time, volume)



Qserv

Shared scan :

- Implementing Concurrency:
 - 100 simultaneous low volume queries (<0.5 GB @ 10/sec)
 - Eg : single object fetch, small spatial region
 - 50 simultaneous high volume queries (< 6GB @ 20/h)
 - Analytics and full scans
- *Continuous sequential scans*
- *Queries attached to appropriate running scan*
-



Target for production

~500 nodes clusters in 2 international data-centers

Running now

Development platform (CC-IN2P3)

400 cores, 800 GB memory

500 TB storage,

=> ~65 TB data set on 2*25 nodes

Prototype Data Access Center (NCSA)

500 cores, 4 TB memory

700 TB storage,

WISE data loaded

Thanks to a partnership with Dell we have deployed a Qserv test bench

The only test bench currently available in LSST for large scale tests

Lessons learned:

- **Qserv works well !**
 - Better than specs
- **Data deployment is not trivial**
 - Network configuration
 - Need 2-3x more disk space
- Large results stress master node
- Each scale increase raises new issues
 - **test platforms are vital**

Experimentations :

- **Can cloud scale to big data ?**
 - Openstack computation nodes + Ceph storage (cf. F. Gauet talk)
- **Hive/HadoopDB** (A. Mesmoudi et al.)
- **MongoDB** (C. Arnault)
 - Promising results on simple queries
 - Moving to Spark/Dataframe/GeoSpark

Optimization of aggregation queries



Aggregation in Massively Parallel Computing

ZHANG Chao^{1,2}, Farouk Toumani¹, Emmanuel GANGLER²

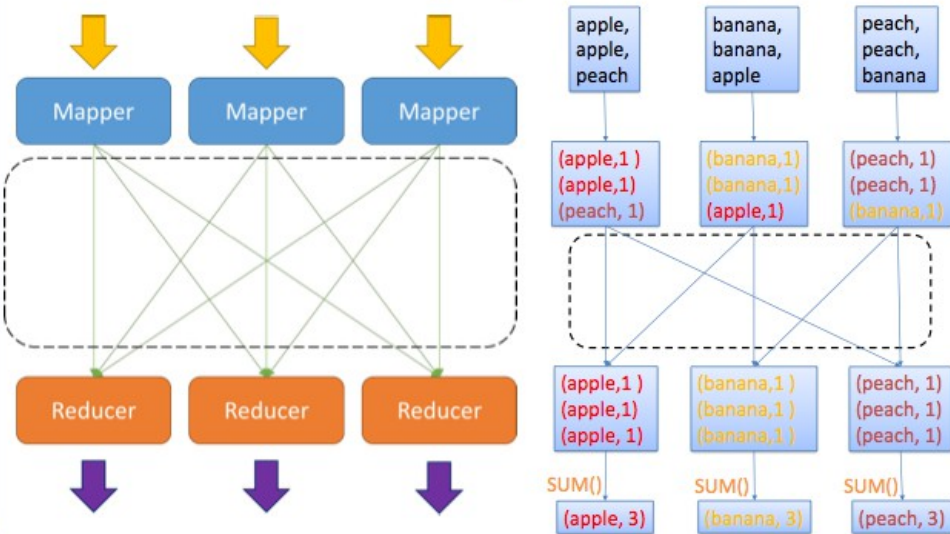
¹ Université Clermont Auvergne, LIMOS CNRS BP 10448, F-63000 Clermont-Ferrand

² Université Clermont Auvergne, LPC CNRS/IN2P3 BP 10448, F-63000 Clermont-Ferrand



Motivation

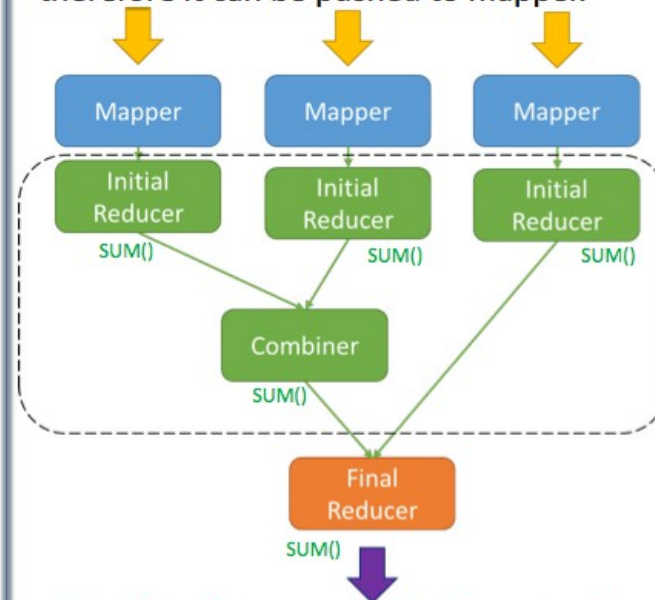
Word count example (naïve version)



Slow: all data are shuffled on network!!!

Word count example (optimized version)

SUM() is associative and commutative (AC), therefore it can be pushed to mapper.



Fast: less data are shuffled on network

AC is a strong condition, and not many aggregations are AC.
Question: given an arbitrary aggregation $\alpha()$, how to process?

KEY points

Main goal: generic algorithms to process arbitrary aggregation $\alpha()$ in parallel.

XLDB 2017 in Europe

Session and chairs:

1.5 days for main conference
~1 day for Hackaton

Polystores

- **Patrick Valduriez, INRIA:** Senior researcher, head of Zenith research team.

Applications: earth and astronomy, neuroscience

- **Peter Baumann, Jacobs University:** Professor and head of the Large-Scale Scientific Information Systems research group.
- **Romulo Goncalves, Nederland eScience Center:** Expert in Databases, Data Structures, Distributed Computing.

Modern data management

- **Anastasia Ailamaki, EPFL:** Professor and Lab Director.
- **Mohand-Said Hacid, LIRIS:** Professor and Lab Director.

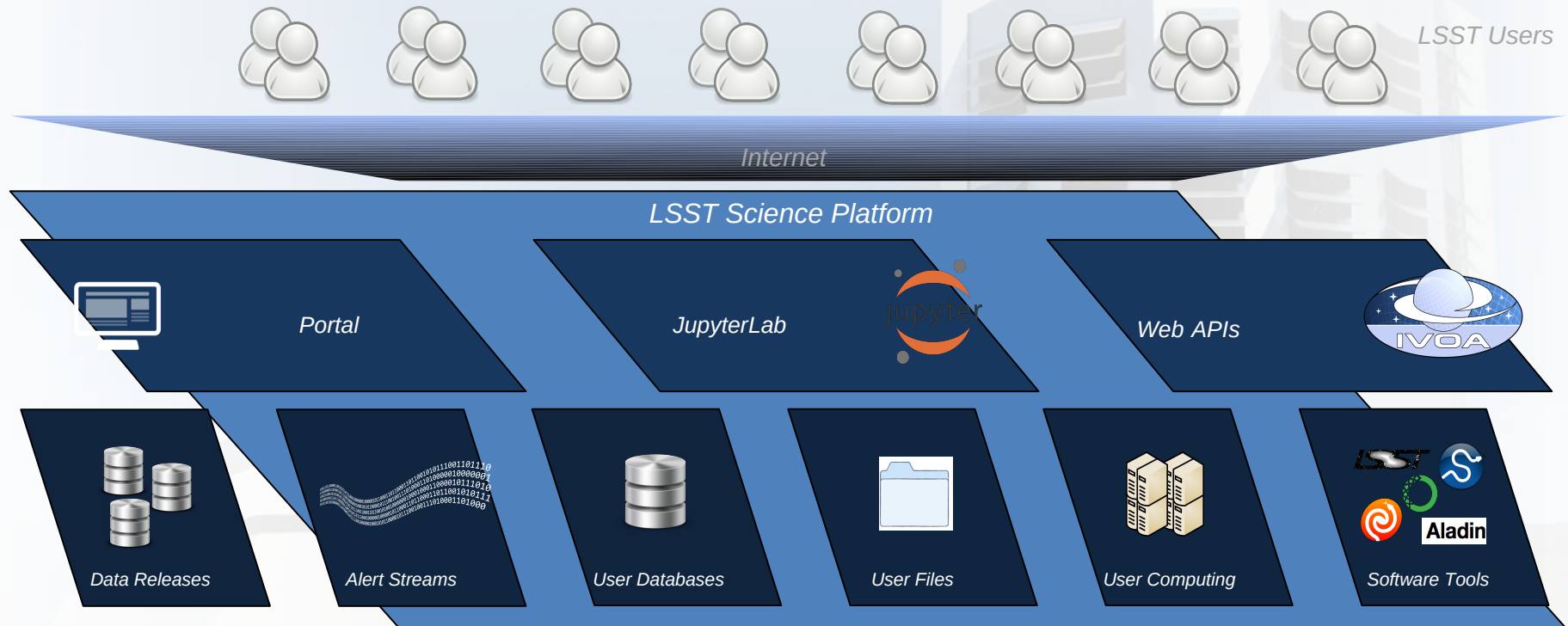
Scaling Cloud to Big Data

- **Dirk Duellmann, CERN:** Deputy leader of the data and storage services group in CERN's IT.
- **Yannick Legré, EGI:** Managing director.



LSST science platform

Accessing LSST data and enabling LSST science



- Statistical analysis of a massive LSST dataset
 - **Portal:** browsing/visualization of Pbyte-scale data
 - **JupyterLab:** user notebooks on DAC computing resources
 - **Web APIs :** interface to VO, tools (eg TOPCAT...)

Which knowledge to extract ?

- Some selected topics (Astroinfo...)
 - **Interpretation of spectral energy distribution (eg. photo-z)**
 - Machine learning vs. template fitting
 - Noise, posteriors pdf vs likelihood, optimal compression ...
 - **Spatial correlations**
 - Scalability : can computations be done directly on DB ?
 - **Moving/Variable objects**
 - Irregular sampling, censored/sparse/missing data,
 - robustness, anomalies, characterization, classification
 - **New algorithms from LSST**
 - Automatic contamination/completeness tradeoff optimization
 - Robust detection of extremely rare events. Real-time
 - (un-)supervised clustering/classification of massive dataset (in db?)

Example 1 : photo-z

Photo-z are critical for LSST

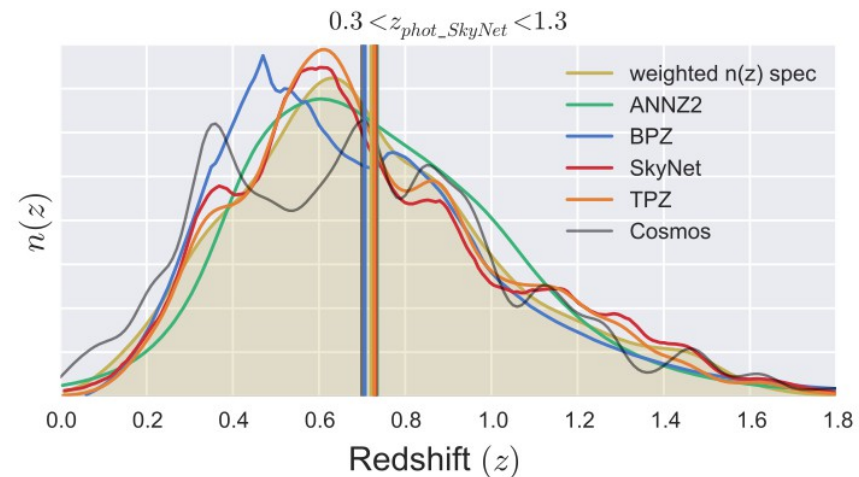
- **Which classifier ?**

- Performance issue
- Systematic uncertainty

- **Training set**

- **Small** spectroscopic sample
 - 50M spectra, 20 B galaxies
- Different **coverage** in parameter space

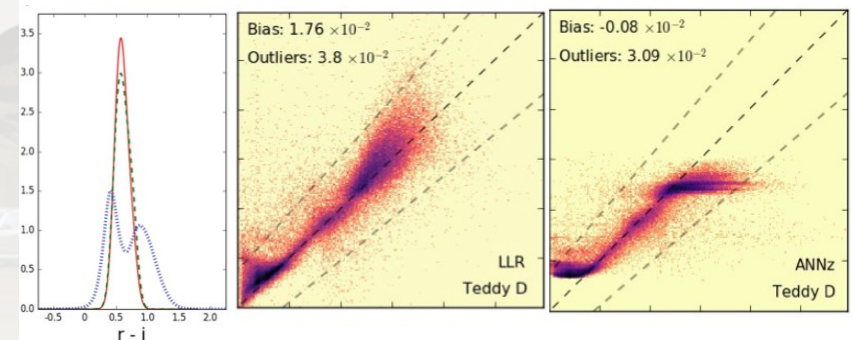
Uncertainties in $N(z)$ highly uncertain



Redshift distributions for DES SV galaxies (Bonnett+ 2015)

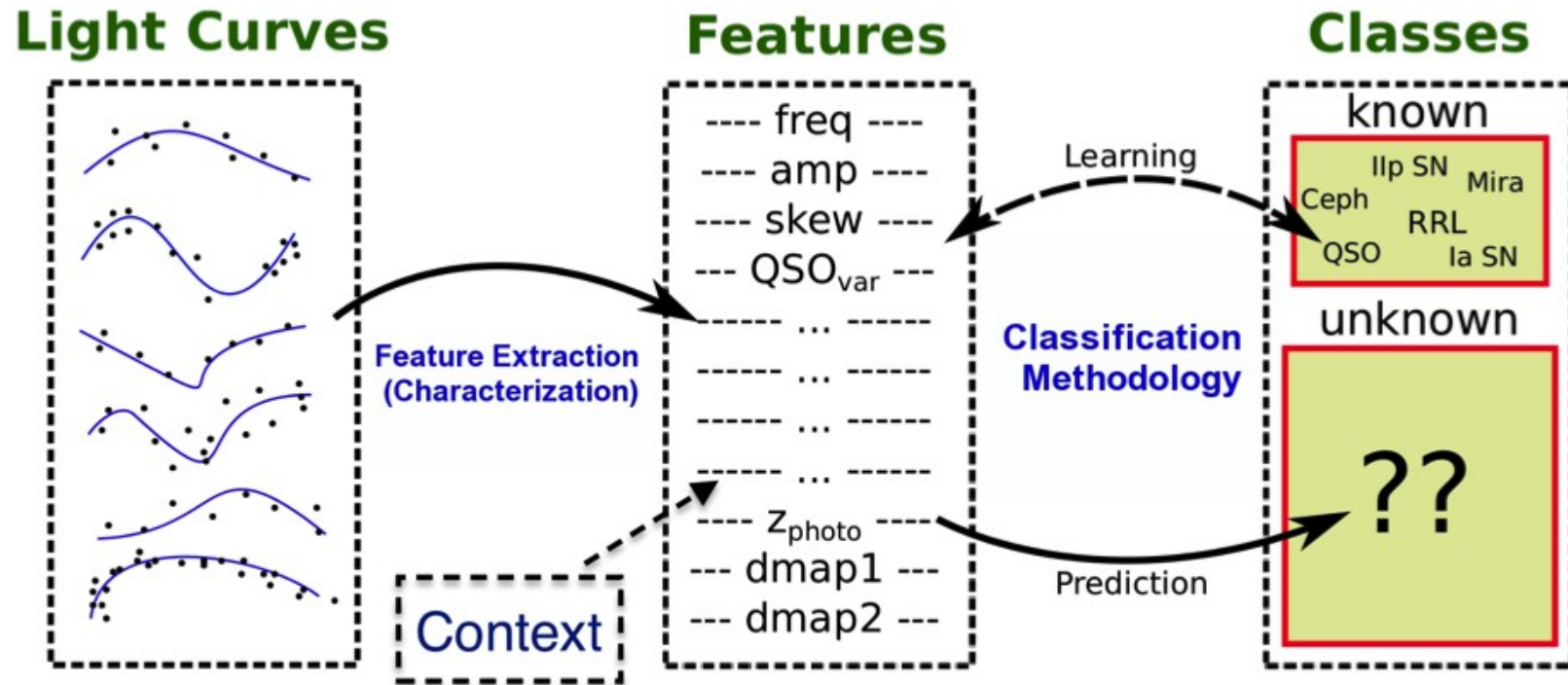


Photo-z



Example 2 : time domain classification

A road map for ML light curve classification:



Announcement : Plasticc

Photometric LSST Astronomical Time-Series Classification Challenge

Conclusions

- **LSST will provide unprecedented data**
 - Opens up time domain
 - ... and a **LOT** of scientific opportunities
- **Proper knowledge on how to use these data needed**
 - Training of students
 - IT cross-disciplinary field : **astrophysics**
 - ***New ideas are welcomed !***
- **Data access has to be organized**
 - A European DAC center is under study
 - **Goal is to serve a broad community**

