



HPC at INFN: Astroparticle

**Matteo Tenti
(INFN - CNAF)**

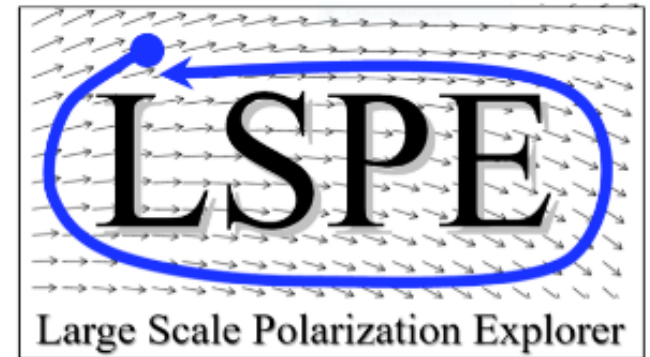
04/05/2018

INFN and The Future of Scientific Computing –
Episode I: The HPC Opportunity
Torino

Euclid (Matteo Tenti & Alessandro Renzi)



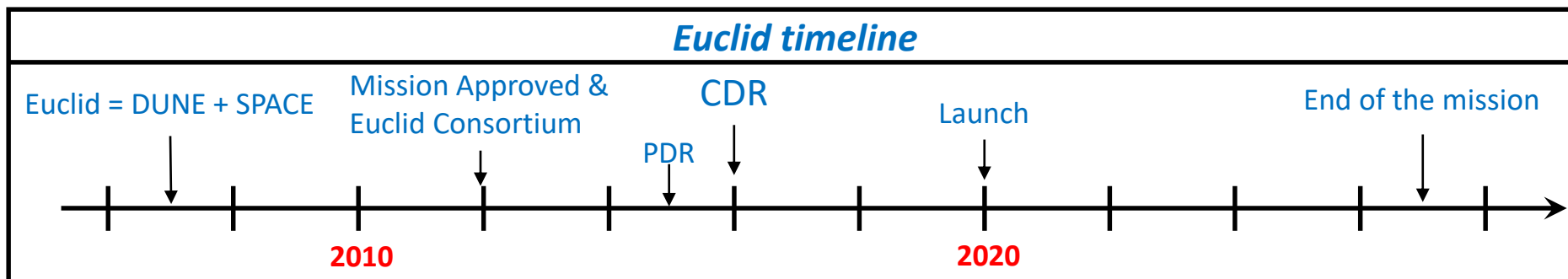
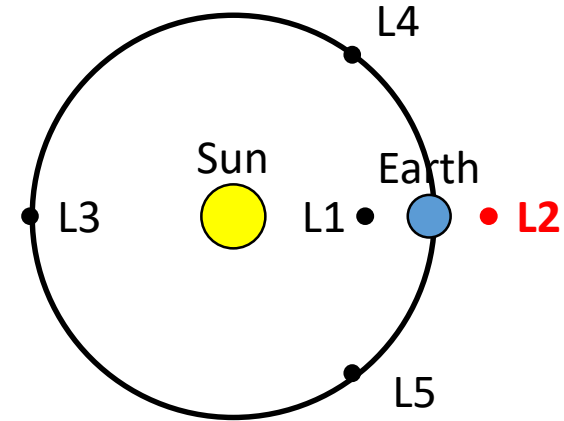
LSPE (Francesco Piacentini)



VIRGO (Sebastiano Bernuzzi & Cristiano Palomba)

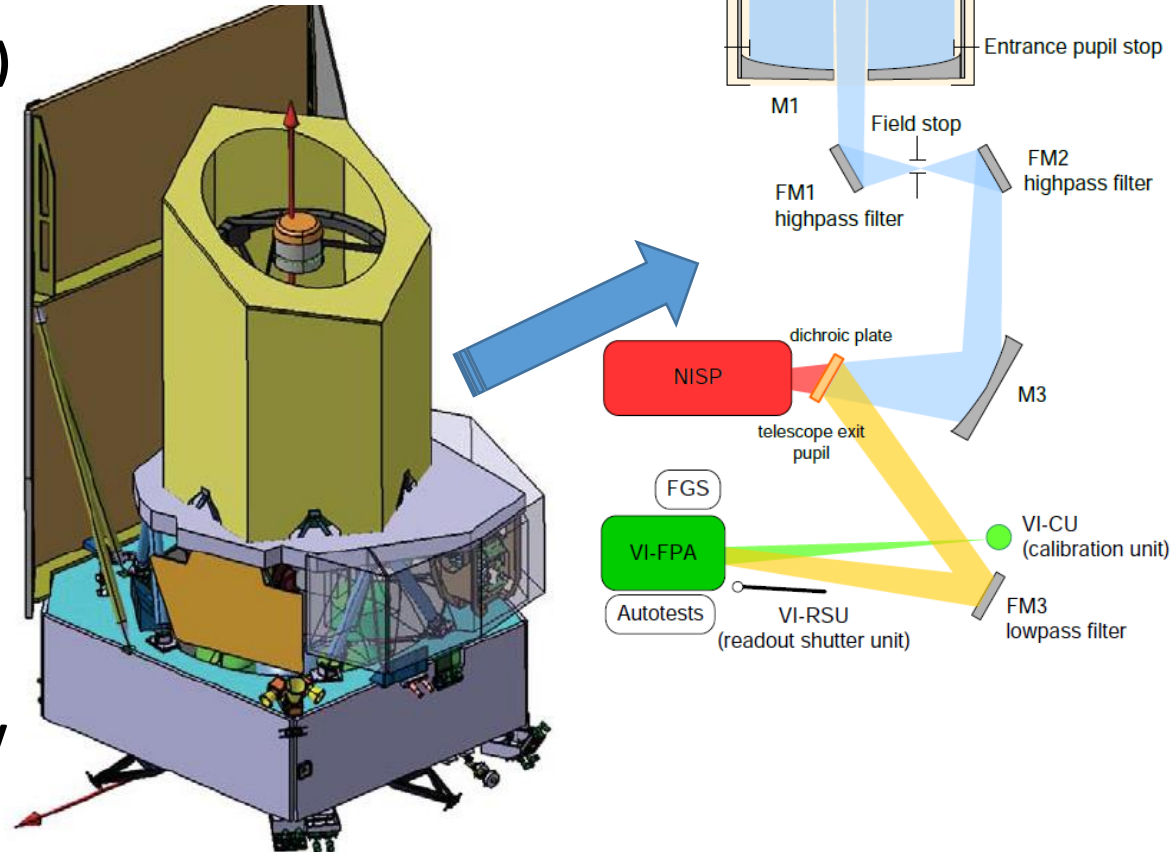


- Euclid is **medium class** mission of ESA **Cosmic Vision** program (2015 - 2025)
- **Launch: 2020** from ESA spaceport in Kourou (French Guyana) with Soyuz ST-2.1B rocket
- Orbit around the Lagrangian point **L2** of Sun-Earth system
- Nominal mission: **6 years**



1.2m diameter **telescope**

- **VIS**: Visual Imager (36 CCDs)
- **NISP**: Near-Infrared Spectrometer and Photometer (16 H2RG)
- **Two wheels**:
 - filters for photometry
 - gratings for spectroscopy



- *Why*: understand the physical **origin of the accelerated expansion** of the Universe
- *How*: **mapping matter** distribution at different redshifts (i.e. looking ~ 10 Gy back in time)
 - Dark Energy equation of state [$w = p/\rho$]:
cosmological constant ($w = -1$) or **scalar field**?
 - Structures' growth rate [$f(z) = \Omega_m(z)^\gamma$]:
general relativity ($\gamma = 0.55$) or **modified gravity**?
 - **Neutrino mass & effective numbers**

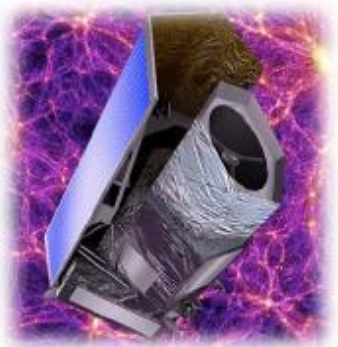


Euclid Data Flow



Science Working Group

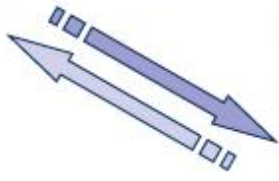
4 hrs/day
Deep Space Antenna
(Cebreros - Spain)



0110101
1110110



Mission Operation Center
(ESA/ESOC-Germany)

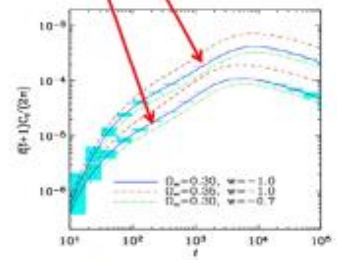
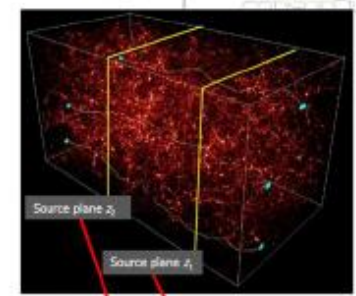
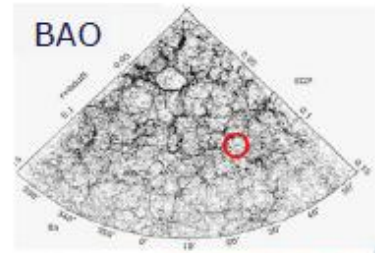


Darmstadt - Germany

Science Operation Center
(ESA/ESAC-Spain)



Villanueva de la Cañada - Spain



SDCs
IOTs

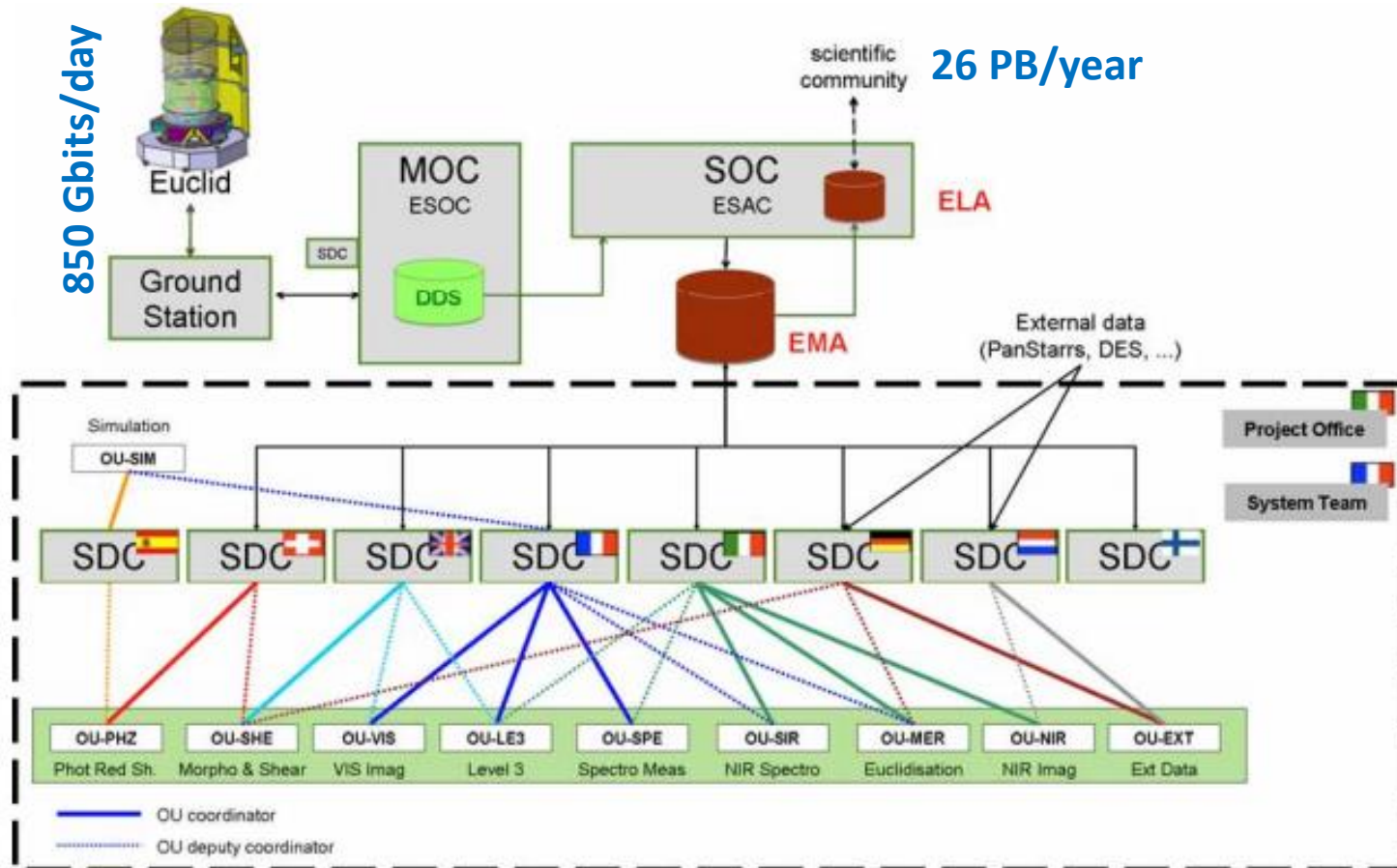


EAS
(archive)



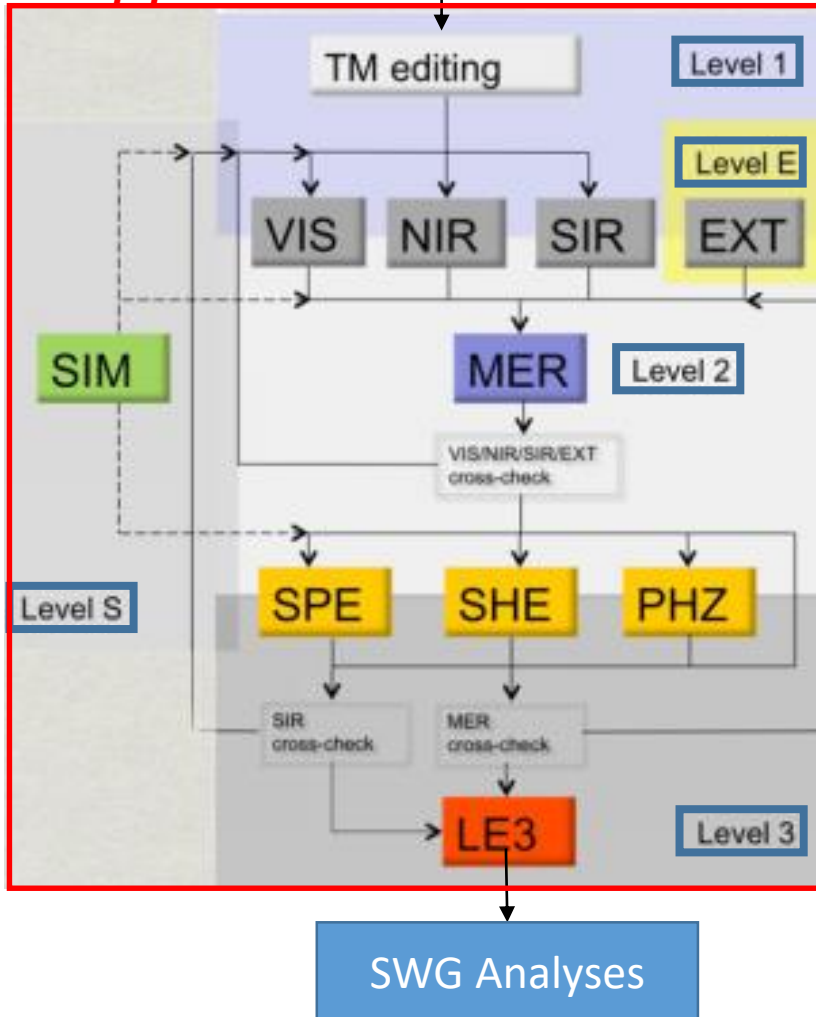
Science Ground Segment

- Euclid data are managed by the **Science Ground Segment (SGS)**



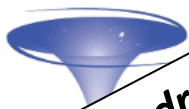


SGS pipeline



Data are organized in different **levels**




- **Raw data** from satellite
- **Level 1:** edited telemetry
- **Level 2:** calibrated signal from instrument
- **Level 3:** physical observables (redshift, shear) reconstruction
- Level Q: quick release
- **Level E:** external data from ground-based experiment
- **Level S:** simulation



Alessandro Renzi



Computing resources in Cosmology: some numbers

	[1603.09303]	[1603.09303]	[1701.08158]
	 PLANCK		 euclid
HPC Computation (cores x hours / year)	~ 10M – 100M	~ 1G – 10G	~ 100M – 1G
Storage for Products	~ 1 PB	~ 10P – 100P	> 100 PB

With respect to Planck, next generation cosmology experiments will require:

order of magnitude in CPU-hour needs
orders of magnitude in Disk Space needs

Take-home messages

Cosmology:

Weak Lensing
Galaxy Clustering
Theory
Clusters of galaxies
CMB Cross-correlations
Strong Lensing

Legacy:

Primordial Galaxies
Galaxy and AGN evol.
Nearby Galaxies
Milky Way
Planets
SNe & Transient

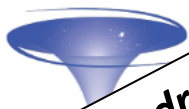
Cosmological
Simulations

Science Working Group (SWG)

- The science activities performed by **Science Working Groups** *[using Level 3 data]*
- **INFN groups** are mainly interested in
 - Dark Energy
 - Neutrinos

Cosmological simulation: an example

- **Simulations** are the main tool to investigate evolution of the universe at small scale where **non linear effects become important**
- C. Carbone, M. Petkova, K. Dolag [1605.02024]
- 4 simulations with different Σm_ν [0, 0.17, 0.3, 0.53 eV]
- 62 sampling in time
- 3D grid dimensions: $L_{\text{box}} = 2h^{-1}\text{Gpc}$ and a mesh of 4096^3 cells
- For every time sampling save a snapshot of:
 - CDM particles
 - Neutrinos
 - 3D grid of the gravitational potential
 - 3D grid of the derived gravitational potential
- Resources for **one** simulation:
 - ~ **1M CPU-hours**
 - ~ **90 TB**



Cross-correlations between CMB and large scale structure



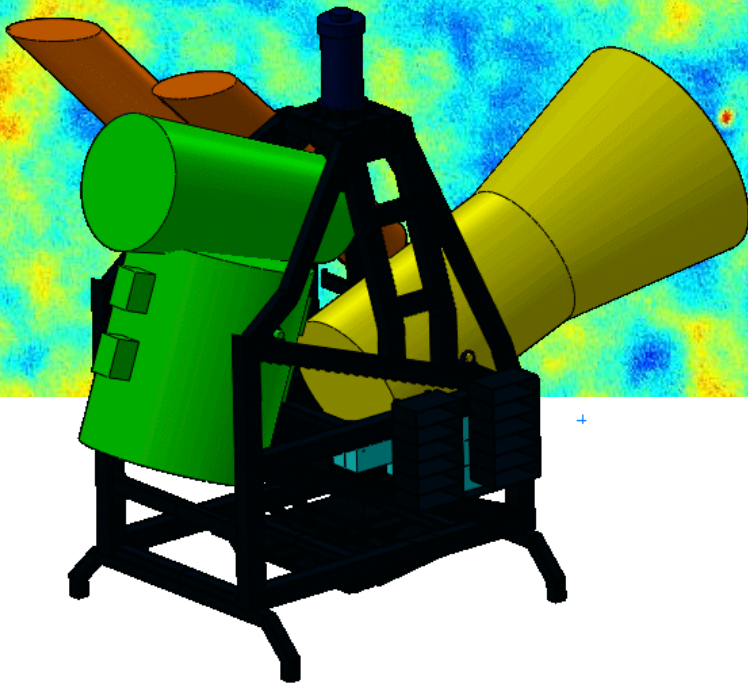
The CMB fluctuation originates at last scattering surface when radiation and baryon matter decouple at $z \sim 1000$

Structures formed at low redshift ($z \sim 2$) leave imprints on the CMB through different effects (tSZ, kSZ, ISW, gravitational lensing) which give information on cosmological parameters

- Estimated Requirement for **developing and optimization** of data analysis codes:
 - **Dedicated HPC/MPI with high-speed low-latency communication**
 - **1k cores (8 GB RAM/core)**
 - **~ 1 PB Storage**
- The use of **large HPC facilities** (like CINECA) will be soon a must

LSPE

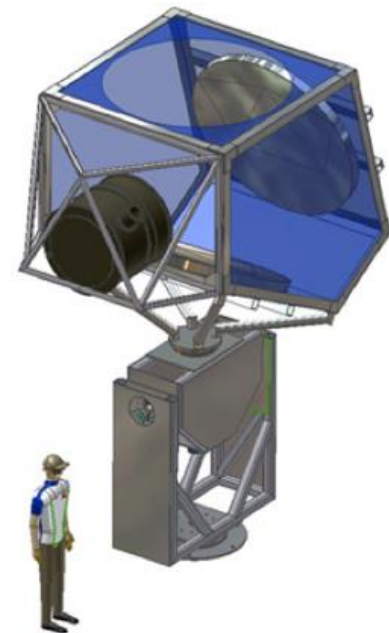
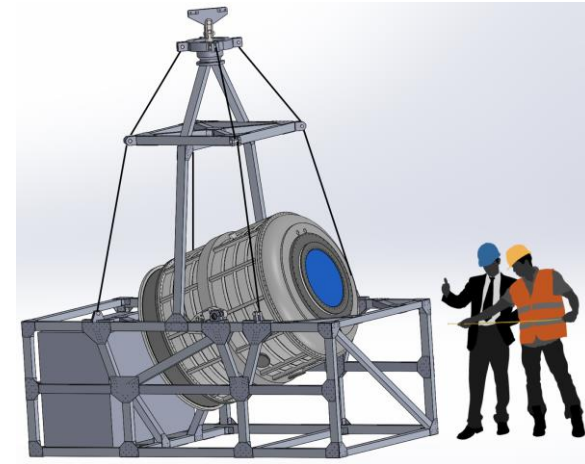
Large Scale Polarization Explorer



LSPE: measurement of CMB polarization

LSPE: Large Scale Polarization Explorer

- **Goal:**
 - Measure the **polarization of the CMB**, at **large angular scales** (30% of the sky, ~ 1 deg angular resolution)
 - To detect the signature of **primordial gravitational waves**, which imprint the polarization of the CMB with a particular pattern, named B-mode
 - To improve knowledge of inflationary mechanism in the early Universe
- Two **instruments**:
 - **SWIPE**: stratospheric balloon based, launched in the polar night from Svalbard (Norway)
 - **STRIP**: ground based, in Tenerife



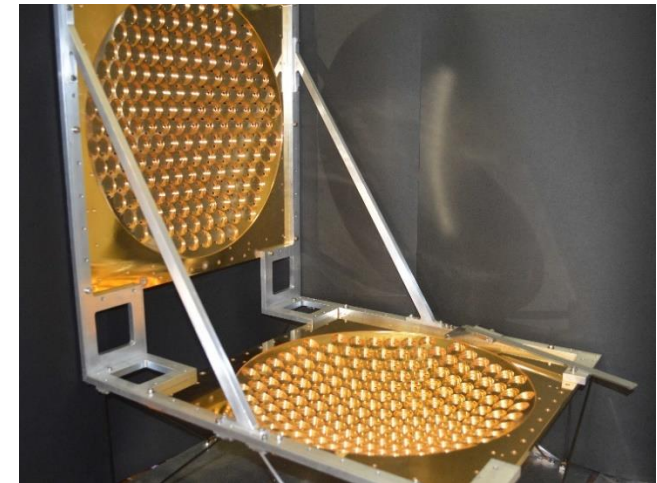
Francesco Piacentini

LSPE instrumentation / 1

LSPE SWIPE: Winter Arctic **stratospheric balloon**:

- Svalbard, Dec 2019
- Full dark for 15 days
- Powered by batteries
- Microwave: 150 - 220 - 240 GHz
- 300 mK cryogenic system
- Spinning telescope
- 500 mm aperture
- 1.5 deg angular resolution
- Covering 30% of the sky

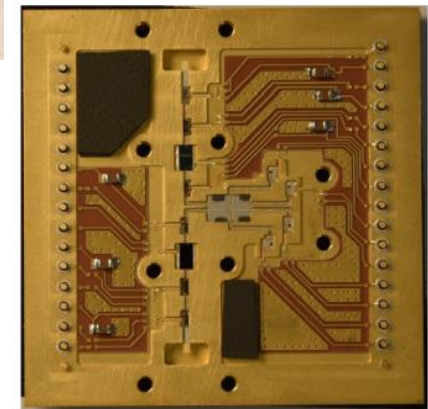
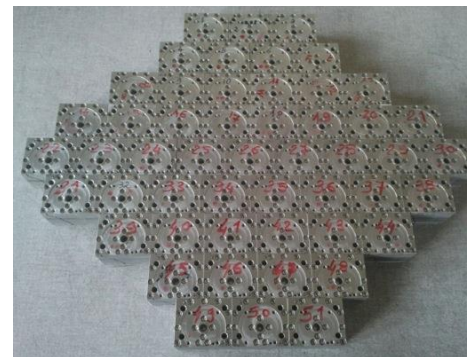
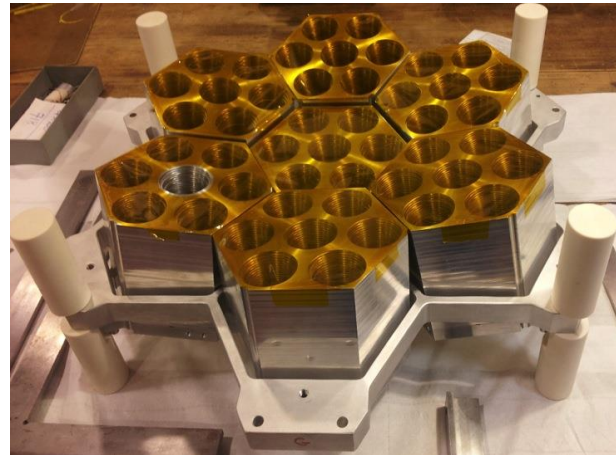
- INFN contribution:
 - Multimode TES bolometers
 - readout for TES bolometers
 - Cryogenic facility
 - Data analysis



LSPE instrumentation / 2

- LSPE STRIP: **Ground based**
 - Tenerife, Mar 2018
 - 2 years campaign
 - Microwave: 43 - 90 GHz
 - 20K cryogenic system
 - Spinning telescope
 - 1500 mm aperture
 - 0.3 deg angular resolution
 - Covering 30% of the sky (same as SWIPE)

- INFN contribution:
 - Telescope mount
 - Test instrumentation
 - Data analysis

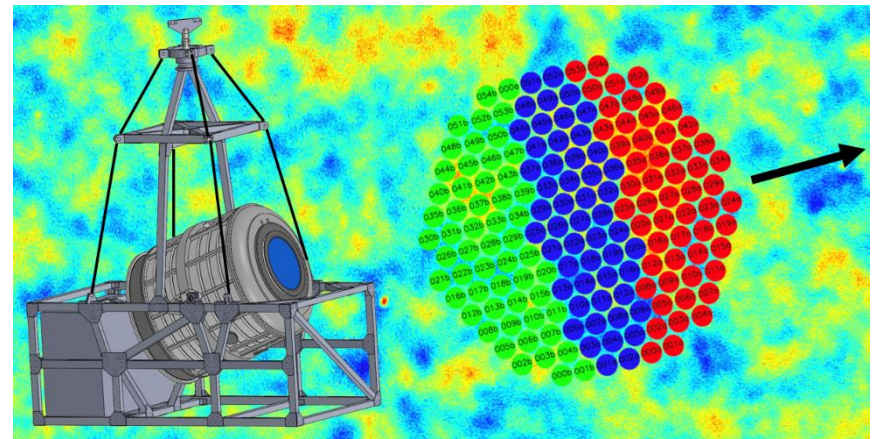


Francesco Piacentini

LSPE HPC requirements: instruments simulators

- Simulation of:
 - 326 detectors SWIPE + 49 STRIP (HPC required to run efficiently)
 - Each one sampled at 100 Hz for ($\sim 10^{10}$ samples)
 - Each sample is the convolution of the sky with the angular response (on a 5 degrees radius)
 - Simulation of signal, noise and systematic effects
 - Time domain Filtering effects
 - Projection to sky maps

- These are very **heavy HPC simulations**, in particular in case of Montecarlo realizations



LSPE Computational model and resources

- Heaviest tasks are:
 - Instrument simulator:
 - Parallel Fortran code
 - The more complex version requires **1.3 k core hr** for one simulation
 - ~100 detectors per band; 16 GB RAM for each detector simulation
 - **1000 simulations require 1.3 M core hr**
 - Mapmaking, with correlated noise
 - Parallel Fortran code
 - Can produce pixel-pixel inverse noise covariance matrix
 - 320 cores x 10 hr with 10 GB RAM per core, for one map
 - **300 maps require 1 M core hr**

LSPE Computational model and resources

- Heaviest tasks are:
 - CMB component separation
 - R&D to select adequate methods for LSPE
 - Not computationally demanding (~ 32 core node)
 - Power spectrum estimation (Quadratic Maximum Likelihood method)
 - MPI/OpenMP
 - Flexible (32 to 1000+ cores)
 - Cosmological parameter estimation
 - Critical piece is likelihood code
 - Starting from map pixels (32-256 cores adequate)
 - power spectrum based: minimal computational burden at likelihood level, but heavily relies on simulations and QML

The background is a faded aerial photograph of a landscape. A road or railway line runs diagonally across the frame. In the center, there is a large, white, rectangular building with a flat roof, surrounded by a circular area of green grass. The sky is overcast with light clouds. The logo 'VIRGO' is superimposed over the center of the image. The 'V' is black, and the 'IRGO' is also black. To the left of the 'V' are several teal-colored, curved lines that resemble a stylized 'V' or a series of parallel curves.

VIRGO

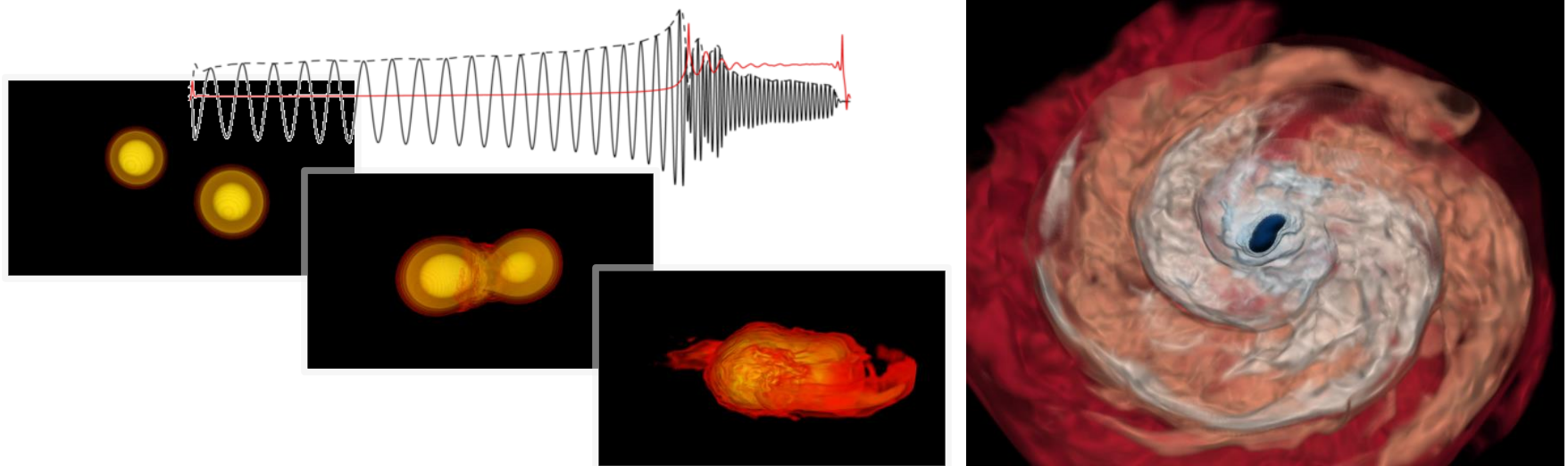
Theoretical modeling for gravitational-wave and multi-messenger astrophysics

Sebastiano Bernuzzi

Extreme phenomena: **neutron stars collision**, black hole collision and supernovae explosions

- Strong and dynamical gravity, matter at supranuclear density, interactions matter / radiation at extreme conditions

Multi-physics and multi-scale 4D simulations from *first principles* (all fundamental theories)

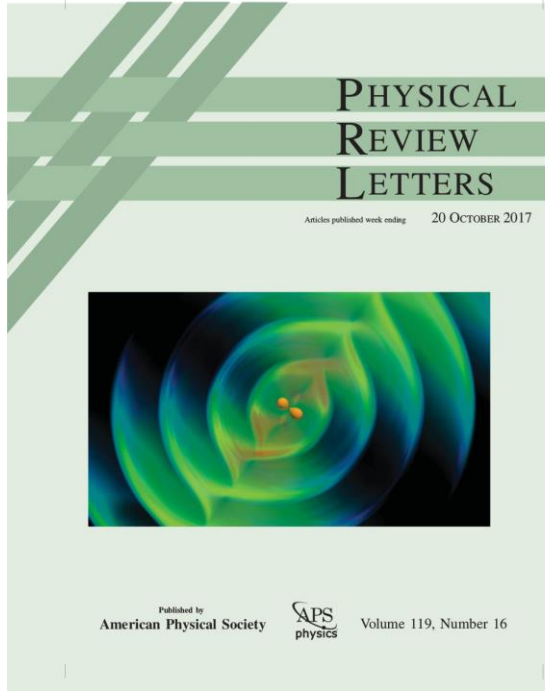


Neutron star merger simulations of the *Computational-relativity collaboration* (CoRe).

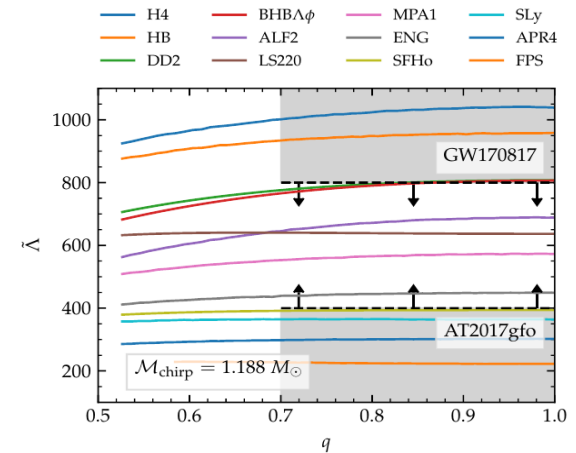
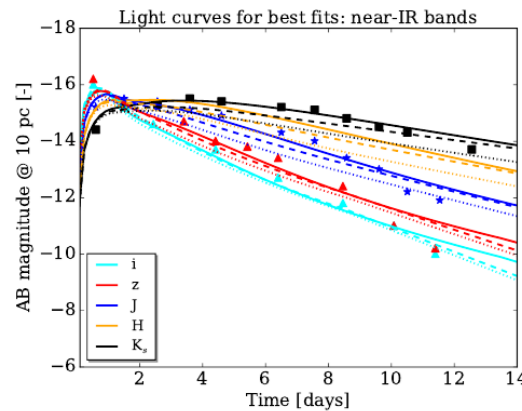
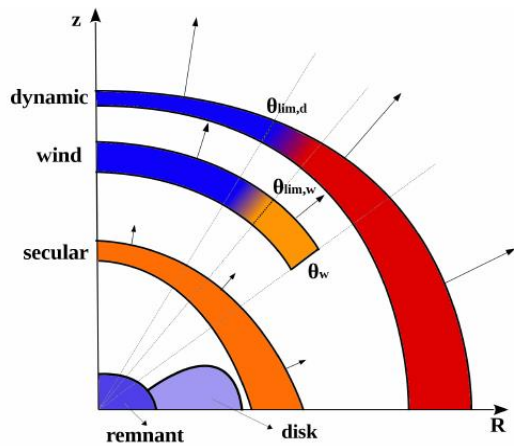
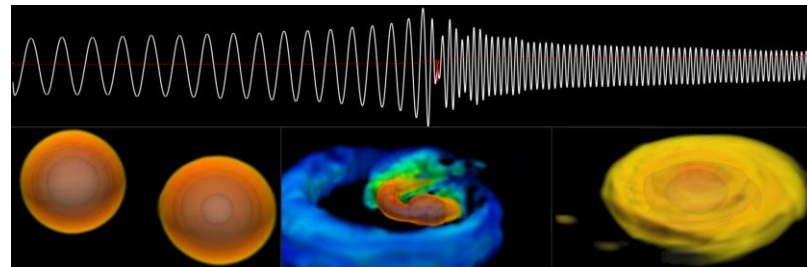
[S.Bernuzzi, B.Bruegmann, T.Dietrich, A.Nagar, D.Radice, A.Perego, W.Tichy, M.Ujevic, and others]

Simulations are key for multi-messenger science

Sebastiano Bernuzzi



- Example: **GW170817**
- State of art gravitational-wave models
[S. Bernuzzi, A. Nagar et al PRL 114 (2015) 161103]
- Support LIGO-Virgo data analysis with models and interpretation
- Large database of waveforms
- Understand origin of electromagnetic transient
- Develop models of counterparts

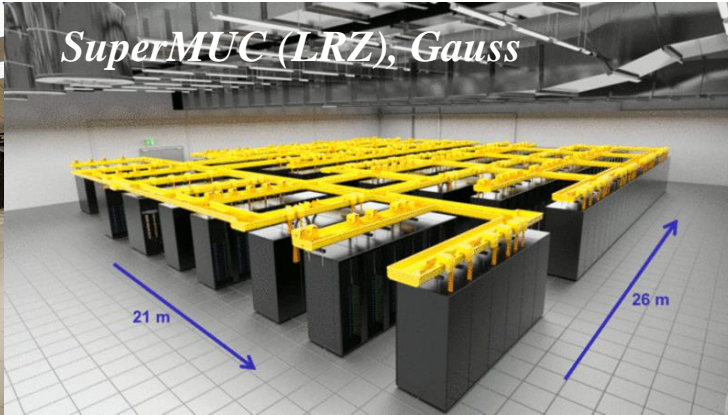


[A. Perego et al ApJL (2017) Multicomponent model of the AT2017gfo kilonova]

[D. Radice et al ApJL (2018) Joint constraint on the neutron star equation of state from GW170817 and AT2017gfo]

Simulation details & Resources

Sebastiano Bernuzzi

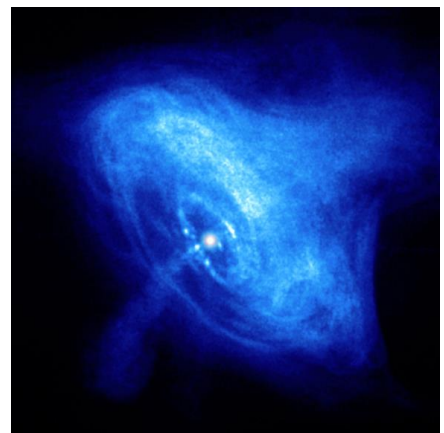


- **Large-scale HPC simulations**
- 3D + time, explicit evolution of spacetime and general relativistic hydrodynamics
- Microphysics and radiation hydrodynamics (in some cases)
- Resolve multiple scales consistently, from strong field to radiation zone in a single simulation
- Parallel adaptive mesh-based codes with hybrid **MPI/OpenMP techniques**
- **Typical simulation: 100 - 3000 CPUs** (depending on mesh resolution)
- **Runtime: weeks to months** (depending on mesh resolution)
- Explore different physical configurations
- Control results with multiple resolution simulations
- Mature production codes but also active developments of new computational strategies

Last 2 years usage: > 160 M CPU-hours on largest machines world-wide
Peer-reviewed applications through different agencies

Cristiano Palomba

Data analysis for the search of persistent GW signals from spinning neutron stars

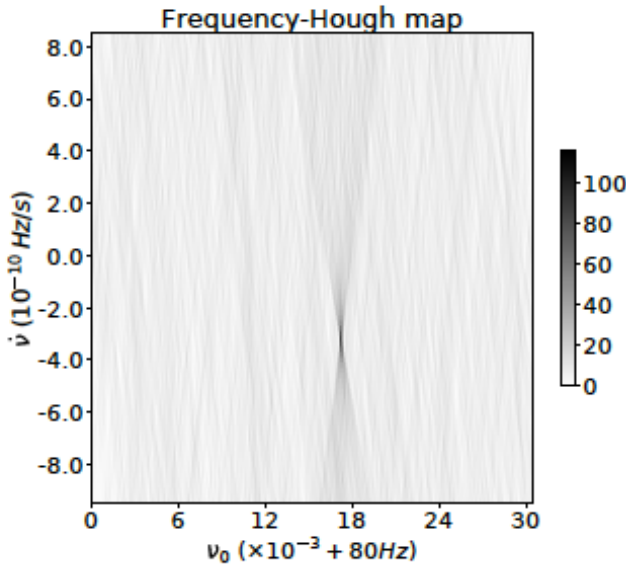
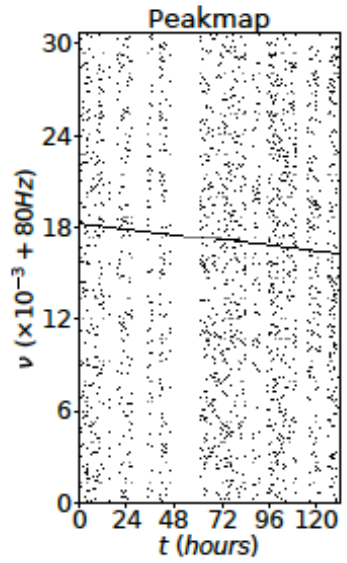


- Blind analyses explore a huge parameter space searching for signals from neutron stars with no electro-magnetic counterpart
- $O(15)$ M CPU-hours for a typical blind search over three detectors (2 LIGOs + Virgo) and 6 months of data

Most of the load in computing several independent Hough transforms (HT):

“embarrassing” parallelism

Production analyses currently on GRID



- Porting of the HT code on **GPU** has been recently done (Iuri La Rosa's Master Thesis)

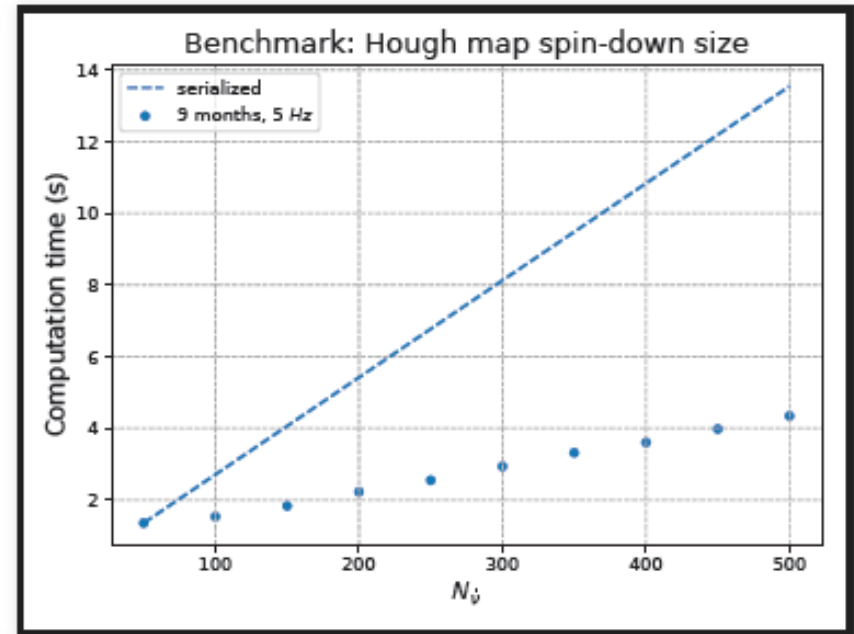
Cristiano Palomba

- Based on TensorFlow framework

- **Speed gain: ~20**

- Further improvements by better exploiting GPU parallelism

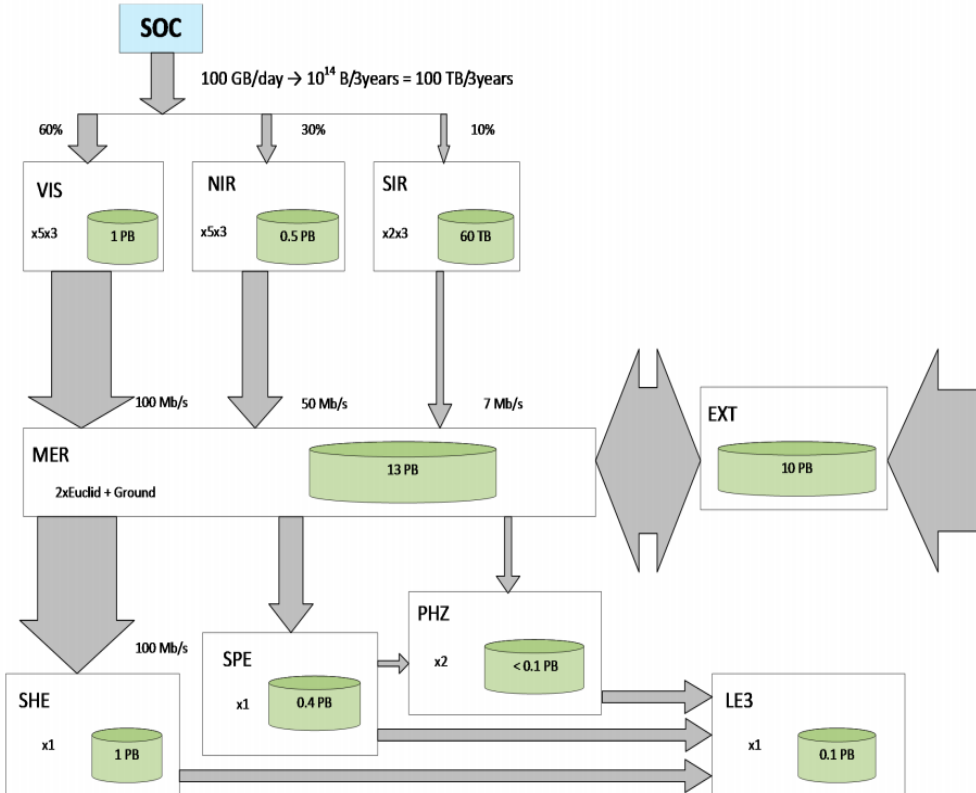
- At fixed available computing resources it will allow to make deeper searches



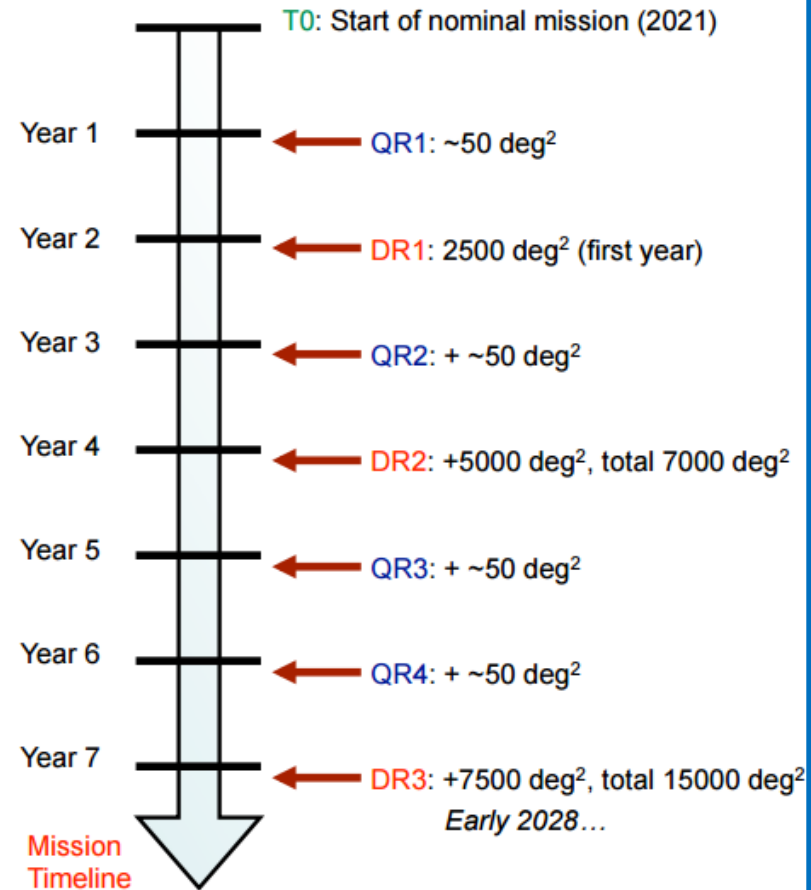
- We aim at having the new GPU code in production for O3 run (beginning of 2019). Internal LIGO-Virgo review starting today!
- Other analysis pipelines will be ported on GPU

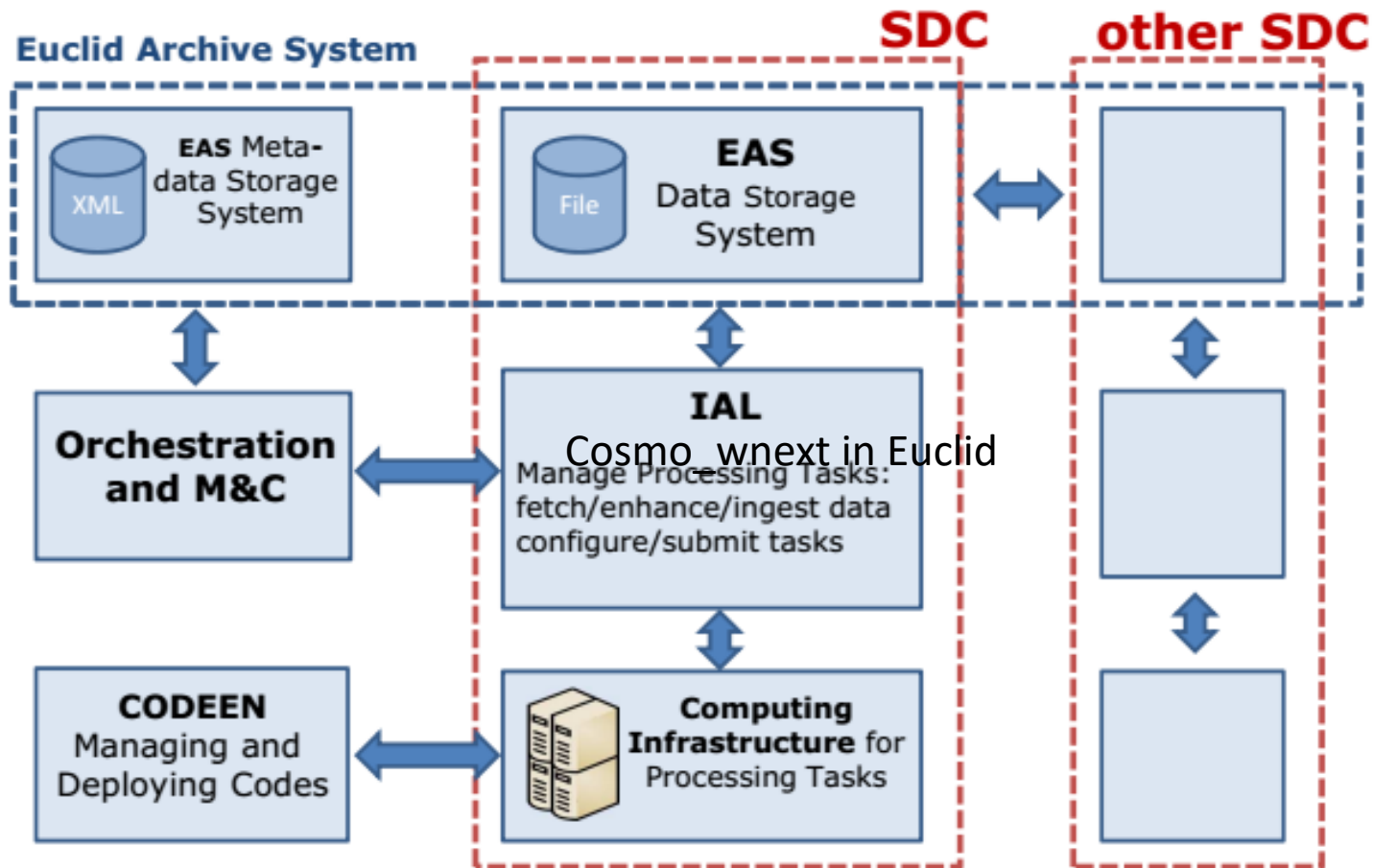
Spares

Expected data flow among PF



Planned data release





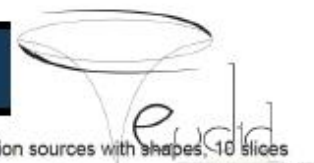
Common tools



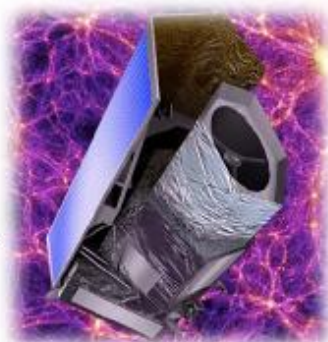
Different domains

- Development environment
 - ✓ CODEEN (high-level centralized for dev/build/doc/packaging etc...)
 - ✓ EDEN (encompasses all common standards and tool for developers)
 - ✓ LODEN (Virtual machine pre-installed with EDEN tools)
- Infrastructure environment : deployment/installation
- Scientific environment :
 - ✓ common (third parties) scientific libs
 - ✓ common scientific packages (developed once and shared among different processing functions)
 - ✓ Mission Data Base : data to be shared (physical constants, instrumental parameters, environment parameters,...)

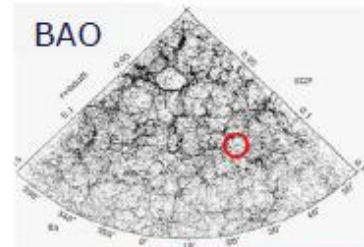
Euclid Operations: In Flight



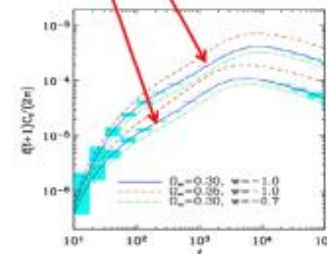
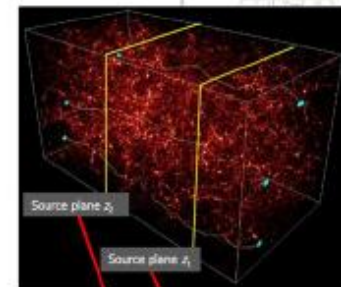
4 hrs/day



0110101
1110110



1.5 billion sources with shapes, 10 slices



Deep Space Antenna
(Spain)



Mission Operation Center
(ESA/ESOC-Germany)



Science Operation Center
(ESA/ESAC-Spain)



SDCs
IOTs

EAS
(archive)

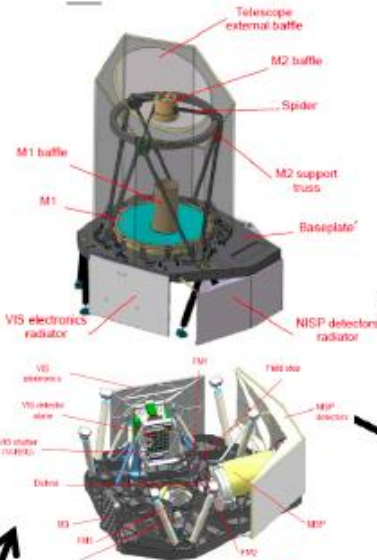
The Euclid Mission in one slide

Sovuz@Kourou

Q1 2020



PLM+SVM: 2010-2019



VI-FPA

36 CCD's (153 K)

VI-RSU

One year shutter

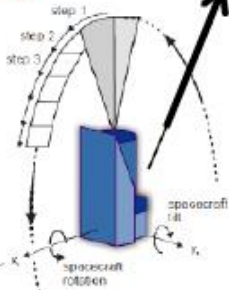
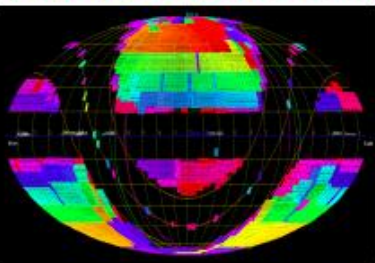
VIS



VIS imaging: 2010-2020

(VIS team)

Surveys: 2010-2028 (Survey WG)



6 yrs - 15,000 deg²

Commissioning - SV

Euclid opération:

5.5 yrs: Euclid Wide+Deep

+ SNIa, mu-lens, MW?

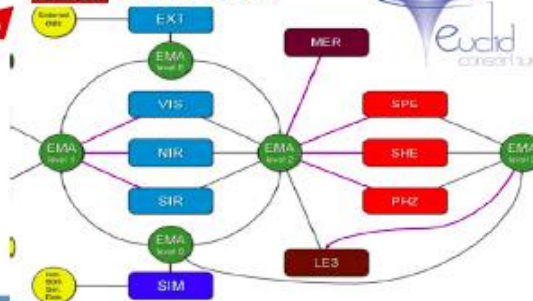


Ground data



October, 16 2015

SGS: 2010-2028



20-30 PB data processing (EC-SGS team)

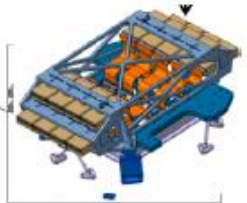
NISP

NI-OMA

Camera Lens Assembly

Calibration Unit

NIR spectro-imaging 2010-2020 (NISP team)



SWG:

2019-2028

L. Valenziano on behalf of the EC

Science analyses

SDC - Italia

La SDC italiana si basa sul cluster DHTCS a INAF-OA_TS.

Si tratta di un cluster HPC basato su Linux con circa 800 core e 8 GB di RAM per core.

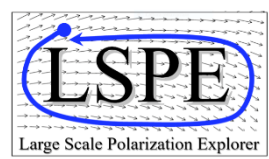
I nodi di elaborazione sono collegati fra loro e al GPFS (400 TB di storage parallelo) con 40 Gbps InfiniBand.

Secondo le stime SGS esistenti, la prevista rampa in tempo di risorse fornite è tale da avere 7 kcores e 35 PB di storage entro il 2027.

Data size

Data type	Parameter	Value	Unit
TOD	Sampling detectors	100	Hz
	duration	330	
	data	15	gg
	byte per data	$\sim 4.3 \cdot 10^{10}$	
	Total	4	
	Total	117	GB (INT)
ATTITUDE	sensors	4	
	data	$5.2 \cdot 10^8$	
	byte per data	4	
	Total	2	GB (INT)
MAPS	nside	256	
	Map pixels	786432	
	pixel_TQU	2359296	
	coverage	0.3	
	data_map	707788.8	
	Total	5.66	MB (double precision)
Covariance [†]	nside	64	
	Map pixels	49152	
	pixel_TQU	147456	
	coverage	0.2	Useful sky fraction
	Covariance matrix	$\sim 8.7 \cdot 10^8$	
	Total	6.957	GB (double precision)
Monte Carlo	realizations	1000	
	tod signal	171	TB
	tod noise	171	TB
	maps signal	5.66	GB (double precision)
	maps noise	5.66	GB (double precision)

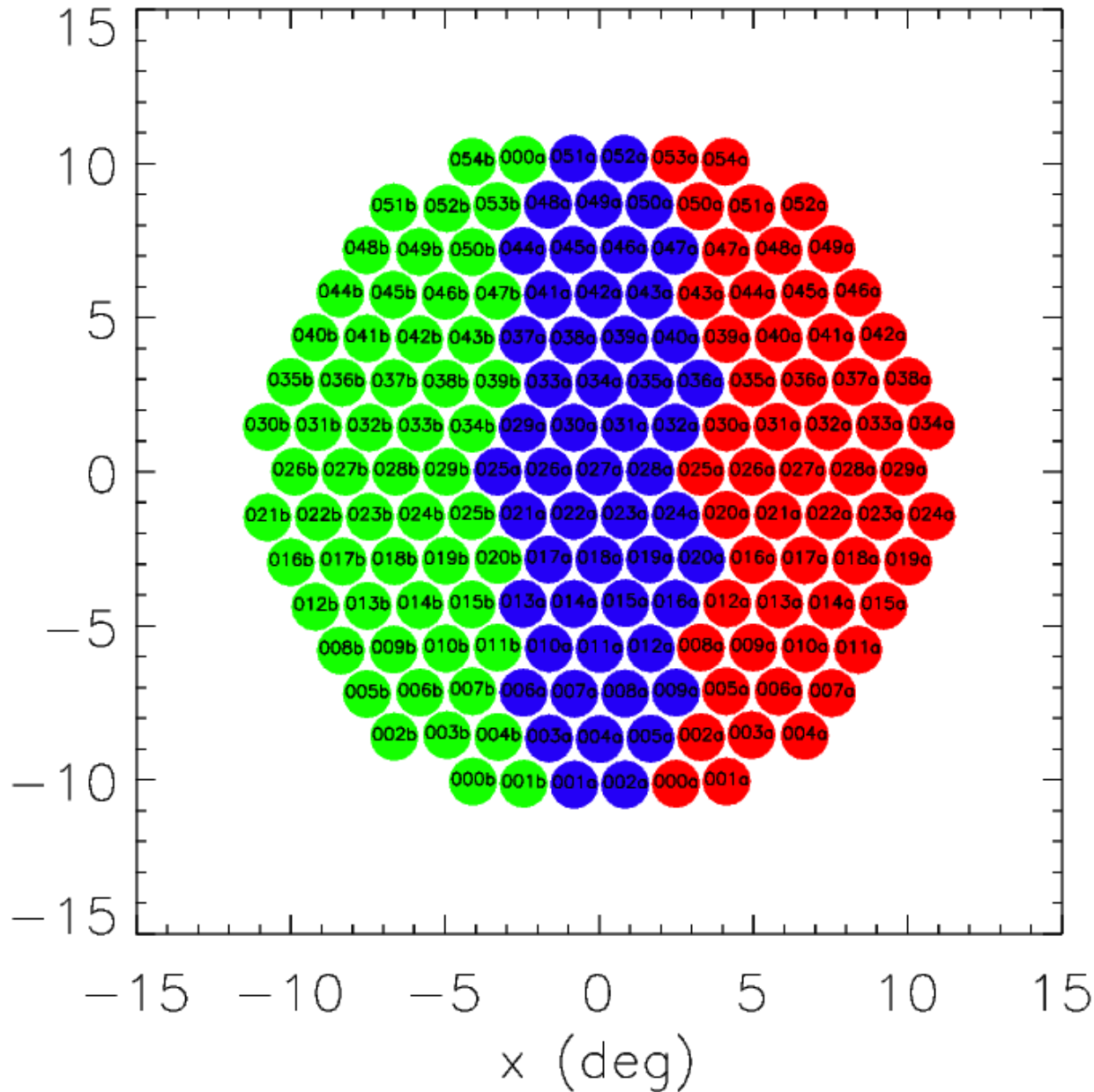
[†] This is the noise covariance matrix of the map, expressed in pixel space.



SWIPE - Focal plane

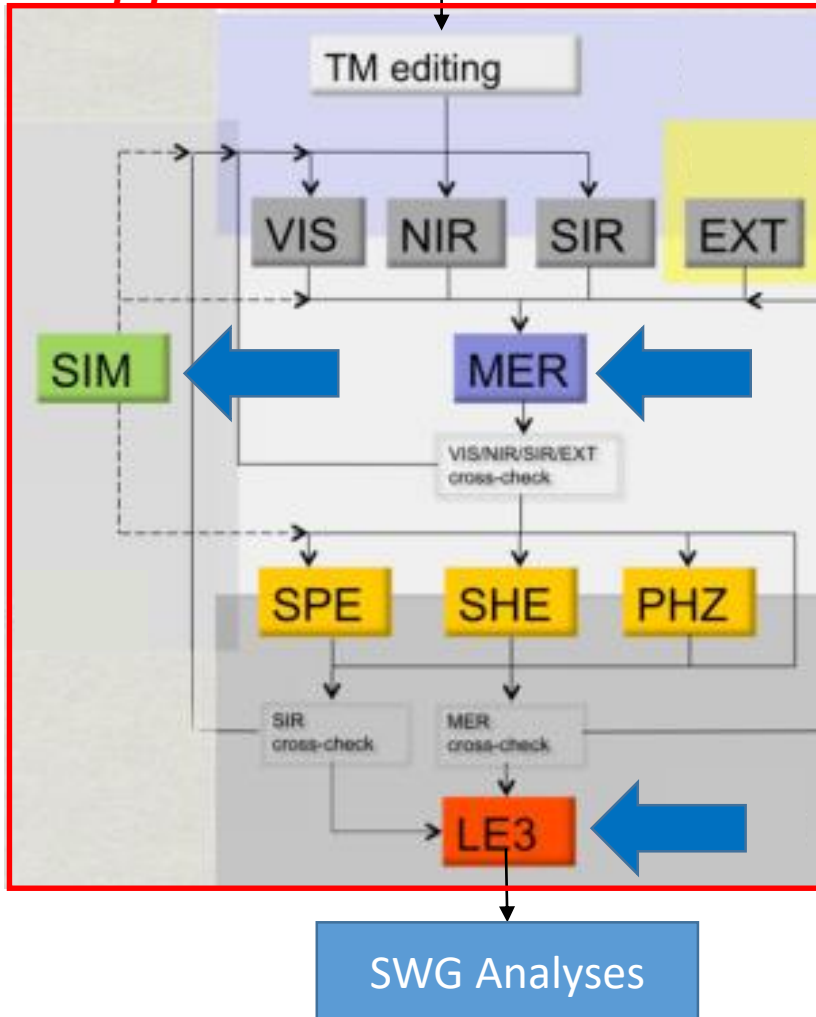
- 2 focal planes
- Total: $163 \times 2 = 326$ detectors

- 140GHz: $55 \times 2 = 110$ detectors
- 220GHz: $56 \times 2 = 112$ detectors
- 240GHz: $52 \times 2 = 104$ detectors





SGS pipeline



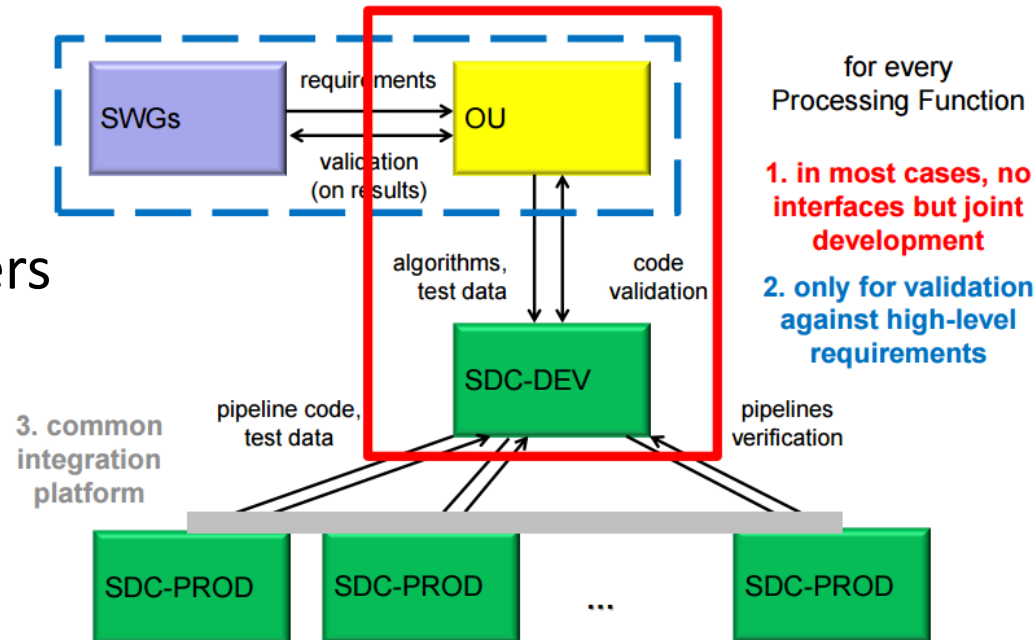
- Pipeline elements are the **Processing Functions** (PF), each having a specific task
- Each PF is mainly (*but not exclusively*) related to one Science Data Centers (SDC)

- **Designed** by Organization Units according to the requirements from Science Working Groups

- **Developed** in collaboration between the Organization Units and Science Data Centers

- **Integrated** and **Run** by the Science Data Centers

- **Continuous development and implementation** during the entire mission



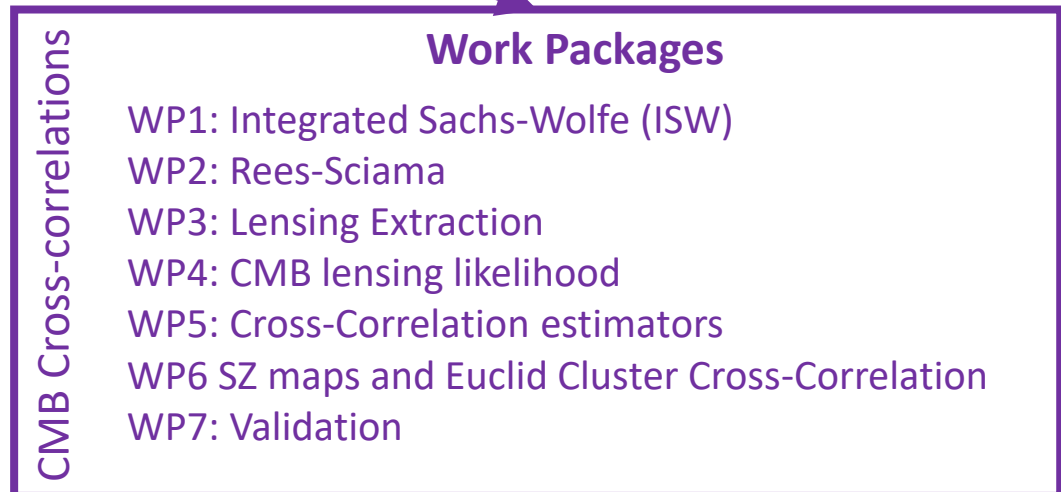
- **Data-centric** information system:
 - *Move the code, not the data*
- **Centralised** information repository
 - *separation of metadata from data*
- **Distributed** data and processing
 - *each SDC is both a processing and a storage node*
- **No dedicated** SDC
 - *each SDC runs the same code through **virtualization** (CernVM, Docker, ...)*
- **MapReduce** model: **μ pipelines** lower level of processing
 - *operates on the minimal processable set of data covering a given sky area*
- Requirements: **Robust, Reliable, Scalable, Maintainable**

- A **Euclid Archive System** (EAS)
 - *Central Metadata Repository inventories, indexes and localizes distributed data*
 - *Distributed Storage over the SDCs balance between data availability, data transfers and redundancy*
- A set of services (middleware) **decoupling** SGS components
 - *e.g. metadata query and access, data localization and transfer, data processing M&C, ...*
- An **Infrastructure Abstraction Layer** (IAL)
 - *decouple data processing software and underlying IT infrastructure*
- **Monitoring&Control** (M&C) **and Orchestration** layers
 - *responsible for distributing data and processing among the SDCs.*



Each WG task is divided in several **Work Packages**.

INFN groups, beside instrument commitments, are currently involved in the **CMB cross-correlations WG** (*more if other groups, hopefully, join in*)



- **COSMO_WNEXT** is an INFN GR11 research program, which includes activities in two ESA space missions (Euclid & Planck)
from Bologna and Padova Divisions : ~ 20 people
- In Euclid
 - responsibility at instrument level (AIV Warm Electronics)
 - Data analysis & simulation:
 - *mildly non-linear large scale structure simulations*
 - *estimation of the tomographic cross-correlation power spectra between CMB and density fields derived from Euclid galaxy*
- Necessity of HPC resources (possibly at **INFN-CNAF**):
 - *O(1k) cores (physical)*
 - *Filesystem GPFS ~ 400 TB*
 - *Infiniband 40 Gbps (nodes and storage)*

Cosmology HPC needs forecast

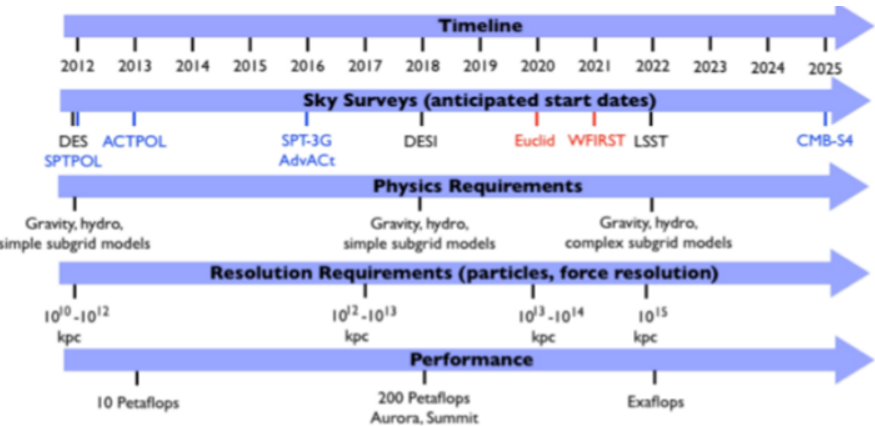


Figure 7: Timelines for cosmological surveys (blue: CMB, black: optical, ground-based, red: optical/NIR satellite) and supercomputing resources as well as simulation requirements. DOE HEP plays a major role in the ground based optical surveys and in some of the CMB surveys.

Code: TOAST	Column 1: Current Usage	Future Usage: 2020 (As a factor of column 1)	Future Usage: 2025 (As a factor of column 1)
Computational core hours (Conventional)	O(100M)	30x	1000x
Memory per node	0.1 GB	30x	1000x
Aggregate memory	1 TB	30x	1000x
Data read and written per run	Read: 10 TB Write: 500 TB	Read: 30x Write: 3x	Read: 1000x Write: 10x
Maximum I/O bandwidth needed	0.1 GB/sec	10x	10x
Percent of runtime for I/O	25%	0.1x	0.1x
Scratch file system space needed	500 TB	3x	10x
Permanent online data storage	5 PB	3x	10x
Archival data storage needed	50 PB	3x	10x

Cosmology HPC needs

	Planck (see 1603.09303)	CMB-S4 (see 1603.09303)	Euclid (see 1701.08158)
Core-Hours	~ 10-100M/year	~ 1-10G/year	~ 100M-1G/year
Storage Disk Required (Products)	~ 1PB	~ 10-100 PB	< 100 PB
Products	# MC Maps ~ 10^6 ~ 400MB/Map	#MC Maps ~ 10^8 (considering ~ 400MB/Map)	1.5G galaxies (estimated >33GB); 30M spectra (?dim)

Take-home messages

With respect to Planck satellite mission (at least):

- 1 order of magnitude in CPU-hour needs
- 2 orders of magnitude in Disk Space needs

Moreover:

Scientific analysis of data will require many medium-size N-body simulations

An example of Medium-size N-body for Euclid

See the paper: C. Carbone, M. Petkova, K. Dolag <https://arxiv.org/abs/1605.02024>

- Four different simulation with $\Sigma m_\nu = (0, 0.17, 0.3, 0.53)$ eV
- Have been run on the Fermi supercomputer at CINECA employing ~ **1M CPU-hours per simulation**
- 62 “points” in time
- For every time point are saved snapshot of:
 - CDM particles,
 - neutrino particles,
 - 3D grid of the gravitational potential,
 - 3D grid of the derived gravitational potential

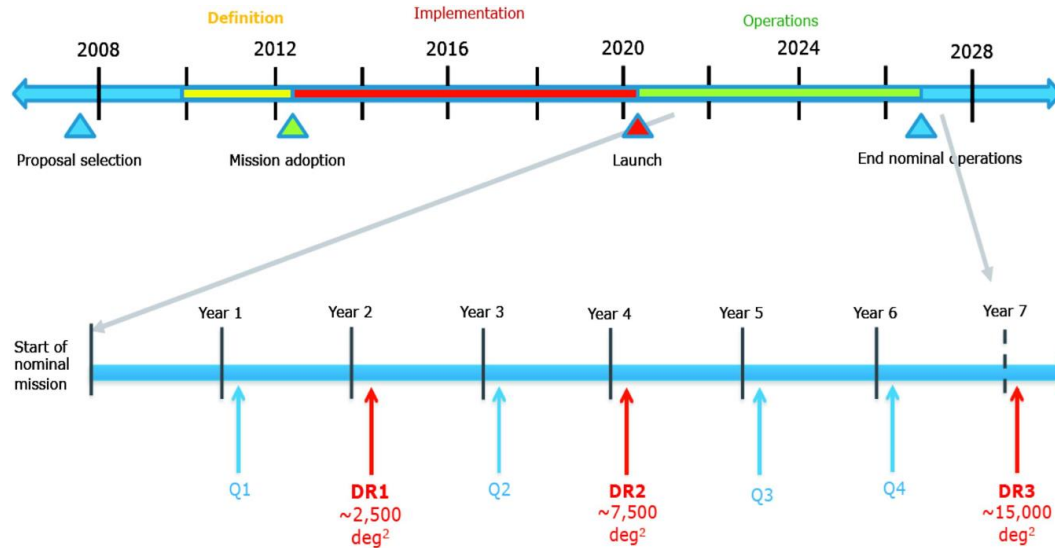
[the 3D grid have dimensions: $L_{\text{box}} = 2h^{-1}\text{Gpc}$ and a mesh of 4096^3 cells]
with a total size of ~ **90 TB per simulation**

Total (only to produce the simulations):

- 4M CPU-hours
- 360 TB of space

NOTE: those are **Medium-size** simulations, to study neutrino

Euclid timeline



→ Present requirement (**for developing and [parzial] optimization** of the data analysis codes):

Dedicated HPC/MPI with high-speed low-latency communication

1000 cores

8 GB RAM/core

~ 1 PB Storage

→ It is critical a reliable **long term large Disk Storage space**

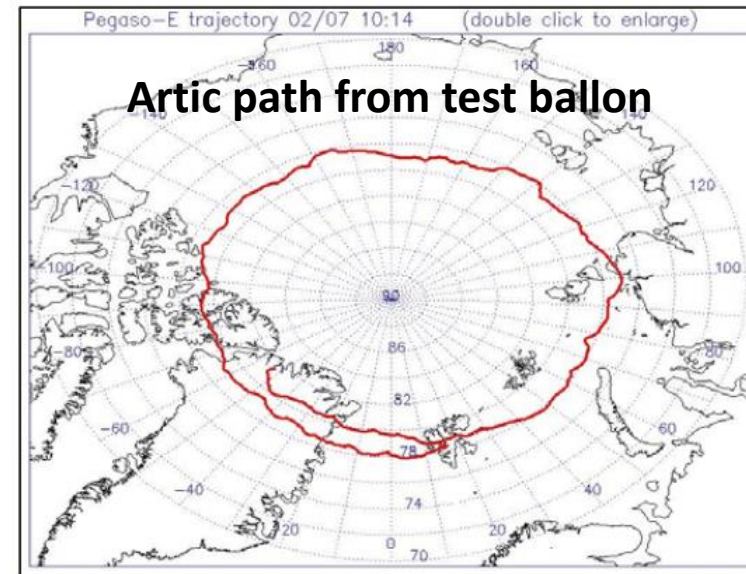
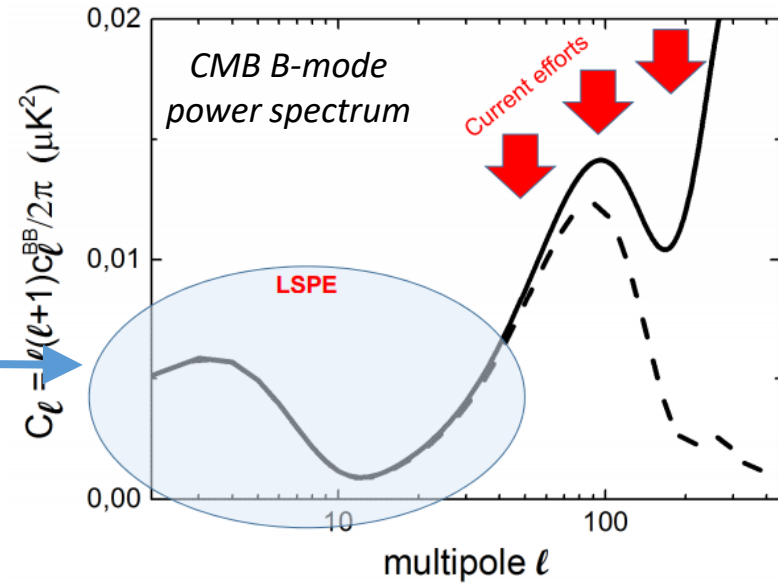
→ High bandwidth connection with Euclid HPC facilities (only part of data are needed at a time)

→ The use of **large HPC facilities** (like CINECA) it will be soon a priority!

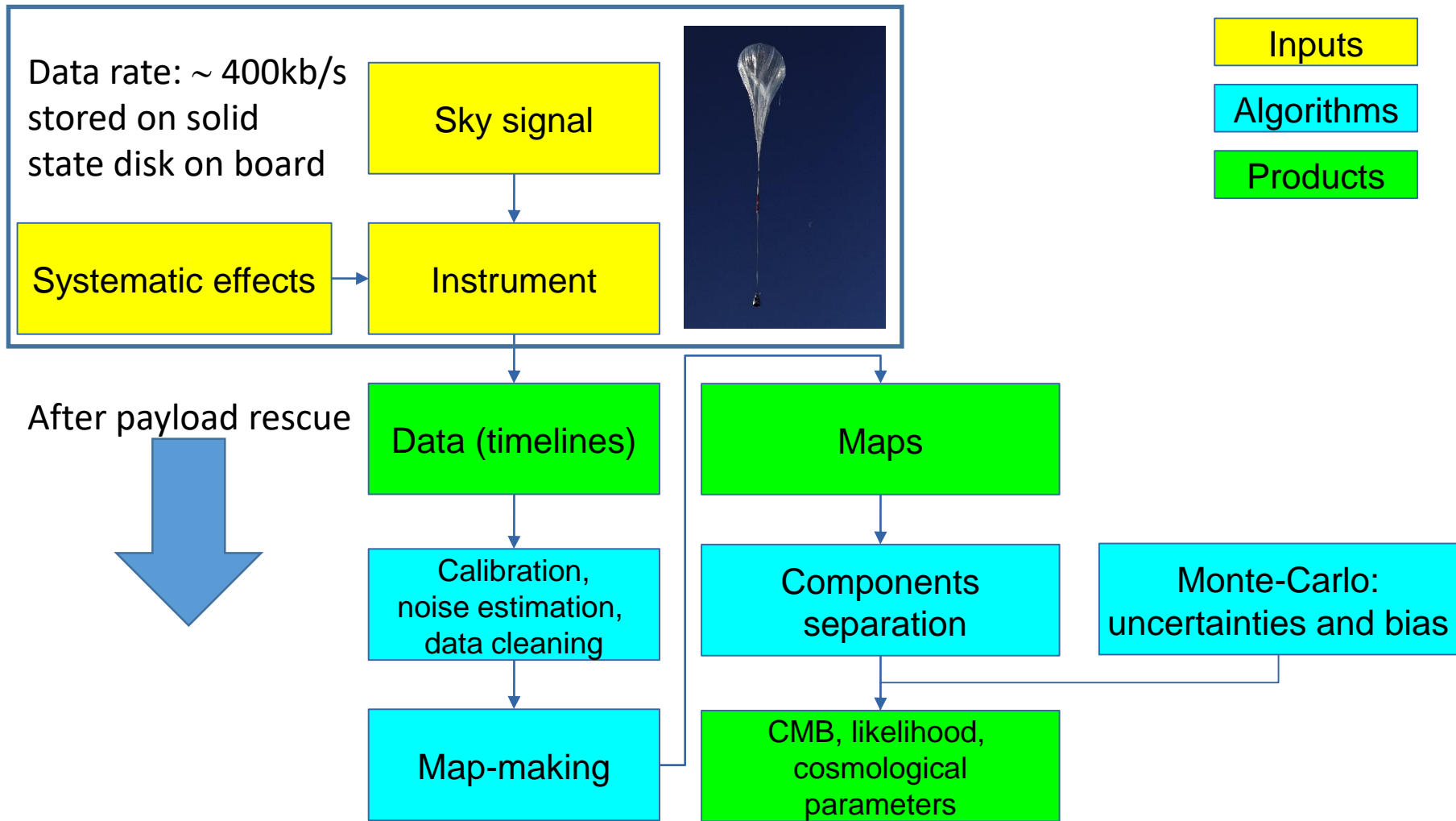
Groups involved in data analysis

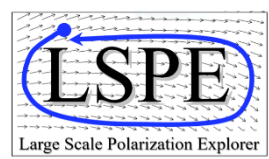
WP	Task	Participants
0	Coordination	RM1
1	Instrument simulator SWIPE	RM1, FE, RM2, PI
1	Instrument model SWIPE	RM1, PI, GE, RM2
1	Focal plane definition SWIPE	RM1
1	Mission planning SWIPE	RM1
2	Calibration SWIPE	RM1, PI, GE
2	Attitude and pointing SWIPE	RM1
2	Calibration SWIPE	RM1, FE, RM2, PI, GE
2	Polarimetry SWIPE	RM1, GE
2	Data cleaning SWIPE	PI, RM1, RM2, GE
1b	Instrument simulator STRIP	UniMI
1b	Instrument model STRIP	UniMI, UniMIB
1b	Focal plane definition STRIP	INAF-BO, UniMI
1b	Mission planning STRIP	UniMI, SISSA
2b	Calibration STRIP	INAF-BO, UniMI, UniMIB
2b	Attitude and pointing STRIP	INAF-BO, OATs, UniMI
2b	Calibration STRIP	INAF-BO, UniMI, UniMIB
2b	Polarimetry STRIP	INAF-BO, UniMI, UniMIB
2b	Data cleaning STRIP	UniMI, SISSA
3	Noise estimation	RM1, RM2, FE, OATs, MI, MIB
3	Map-making	RM2, FE, PI, RM1, OATs
3	Monte-Carlo	RM2, FE, PI, OATs
4	Component separation	FE, RM2, SISSA
4	Power spectra estimation	FE, RM2
4	Likelihood	FE, RM1, RM2, PI
4	Consistency tests	RM1, FE, GE
5	Cosmological parameters	RM1, FE, RM2, PI
6	Foreground characterization	SISSA, RM2, UNIPD
6	Secondary science	RM1, GE, SISSA, UNIPD

- Large Scale Polarization Explorer:
 - measure the **polarization of CMB** at large angular scales
 - targeting the **reionization peak of B-mode** power spectrum
 - spinning (3 rpm) **stratospheric balloon** payload
 - flying long duration (15 days) in polar night
- Frequency coverage: **40 – 250 GHz** (5 channels, 2 instruments: STRIP & SWIPE)
- Sky coverage: **25% of the sky**



LSPE Data flow





Simulation & Analysis

- **Instrument simulator** is essential:
 - in the pre-launch phase to control of systematic effects
 - in post flight analysis to de-bias the cosmological estimators from systematic contributions
- The simulator is a parallel (**MPI**) code. One detector (326 in SWIPE) per task. **16 GB RAM** needed per detector.
- Data size produced by simulation are dominated by the signal and noise time ordered data (TOD) simulation, equal to **342 TB**
- **Data Analysis: Map-making and power spectrum estimation**
- Needed HPC facility, preferably at CNAF:
 - ~ 650 physical cores
 - ~ 350 TB GPFS
 - Infiniband 40 Gbps (node and storage)
 - Currently simulator runs in «opportunistic mode» at NERSC HPC facility

Cosmology:

Weak Lensing
Galaxy Clustering
Theory
Clusters of galaxies
CMB Cross-correlations
Strong Lensing

Legacy:

Primordial Galaxies
Galaxy and AGN evol.
Nearby Galaxies
Milky Way
Planets
SNe & Transient

Cosmological Simulations

Science Working Group (SWG)

- The science activities performed by **Science Working Groups**
[using Level 3 data]