

Distributed computing with DIRAC Interware

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Throughput vs Performance



Throughput vs Performance

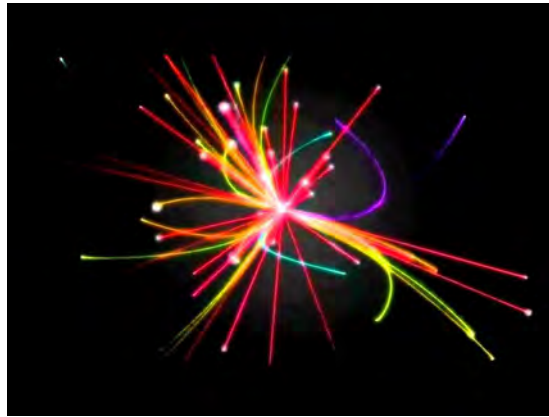
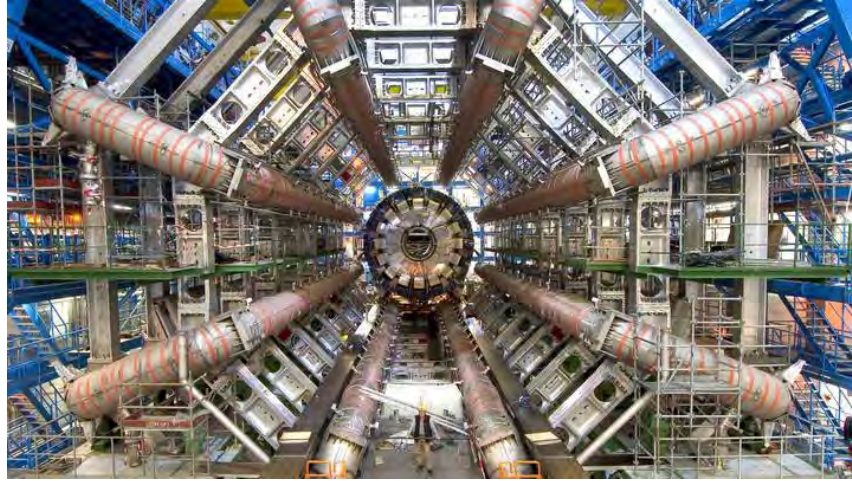
High Performance - Sharing the workload of **interdependent** processes over multiple cores

Focus of this talk

High Throughput - Many **independent** processes that can run in 1 or few cores on the same computer

Example of jobs: Monte-Carlo generation, Data reconstruction

Experiment



Raw data

CH0:0.001;

CH2:0.14;

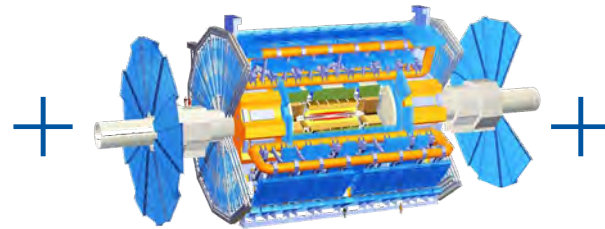
CH4:0.34;

...

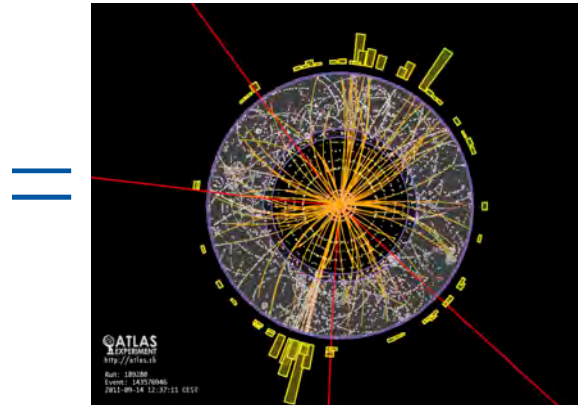
CH98039232:0.08;

Reconstruction

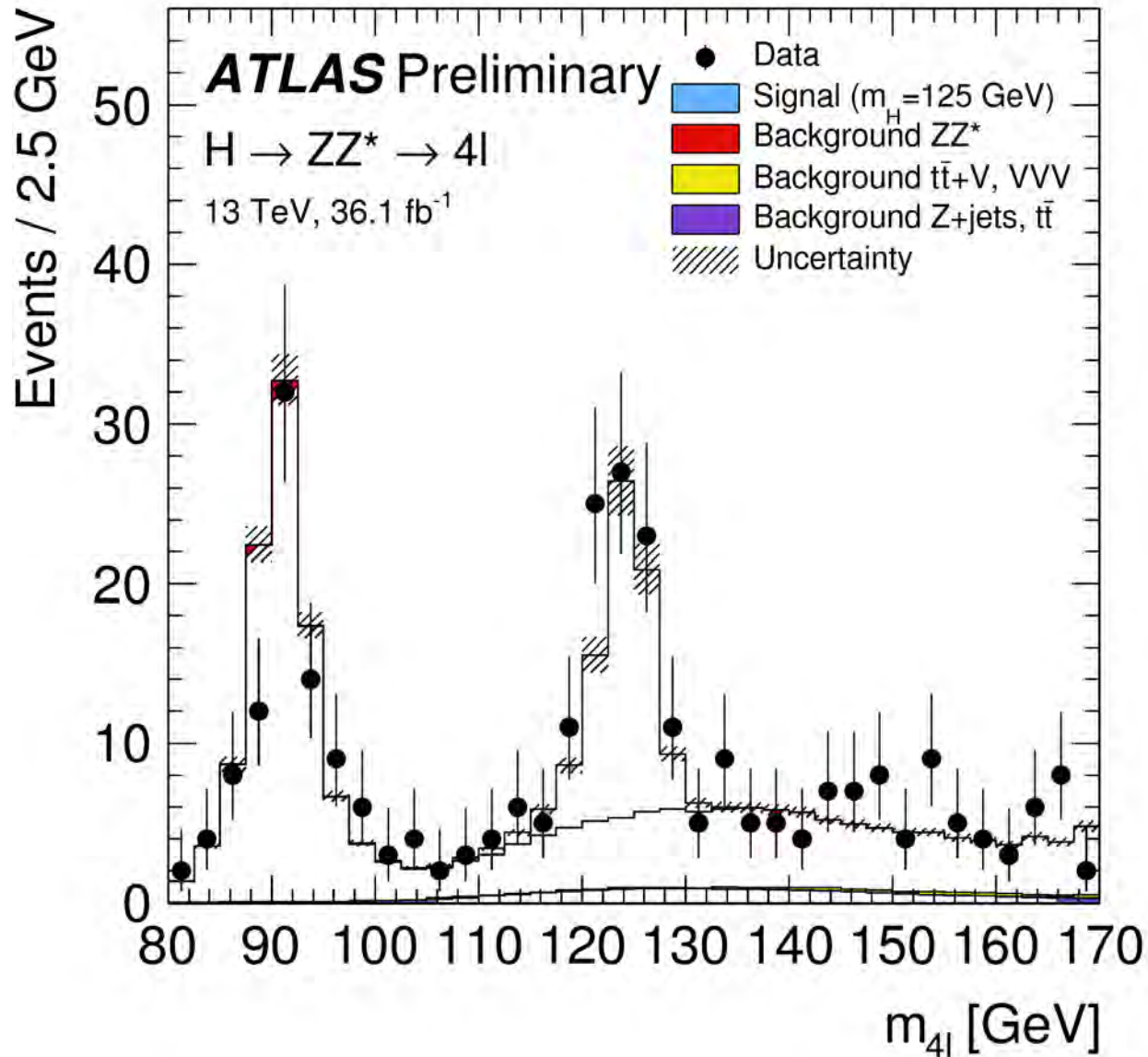
CH0:0.001;
CH2:0.14;
CH4:0.34;
...
CH98039232:0.08;



Reconstruction
algorithm



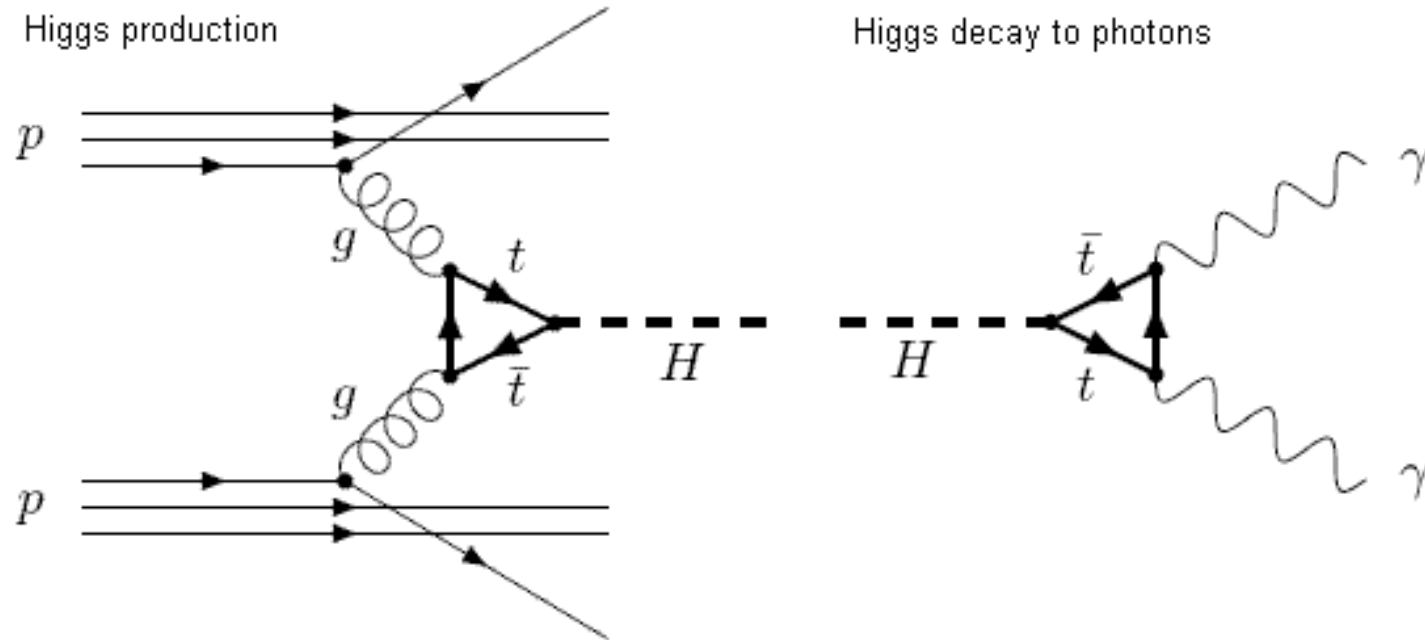
But that is not enough



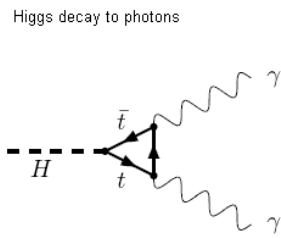
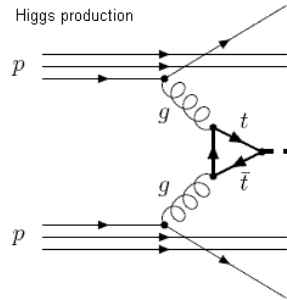
Model

$$\begin{aligned}\mathcal{L} = & -\frac{1}{4} F_{\mu\nu} F^{\mu\nu} \\ & + i\bar{\psi} \not{D} \psi + \text{h.c.} \\ & + \chi_i y_{ij} \chi_j \phi + \text{h.c.} \\ & + |D_\mu \phi|^2 - V(\phi)\end{aligned}$$

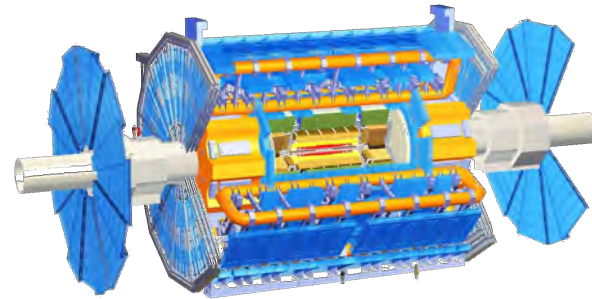
Event



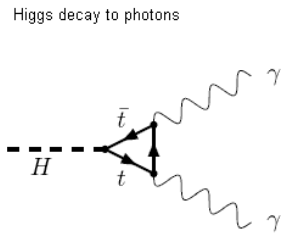
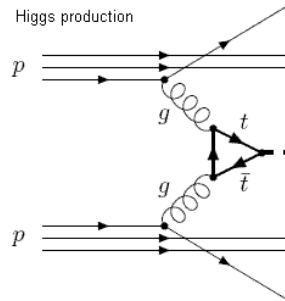
Simulation



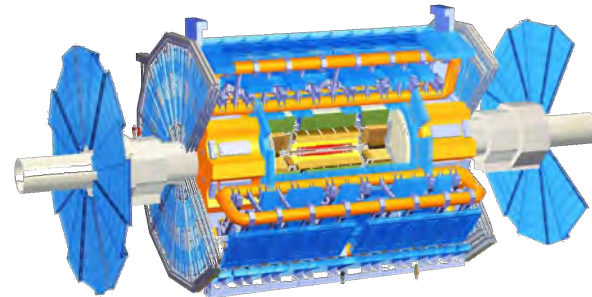
+



Simulation



+



CH0 : 0.001 ;

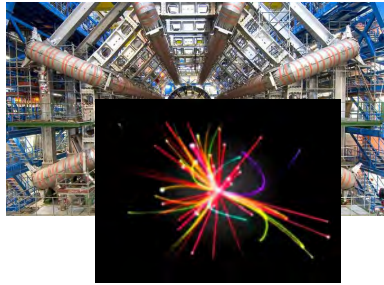
CH2 : 0.14 ;

CH4 : 0.34 ;

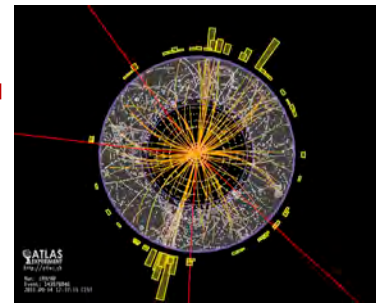
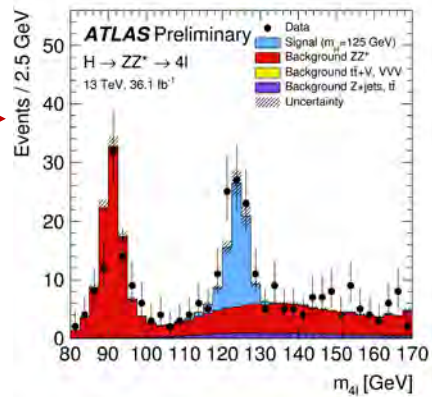
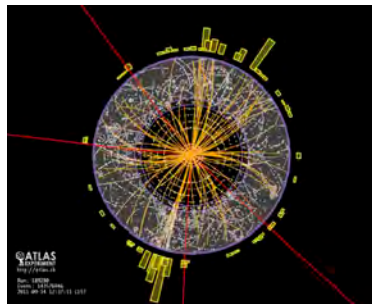
...

CH98039232 : 0.08 ;

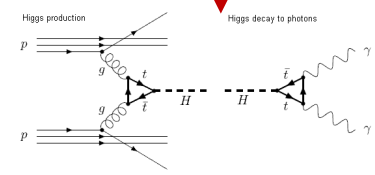
Full workflow



CH0:0.001;
 CH2:0.14;
 CH4:0.34;
 ...
 CH98039232:0.08;

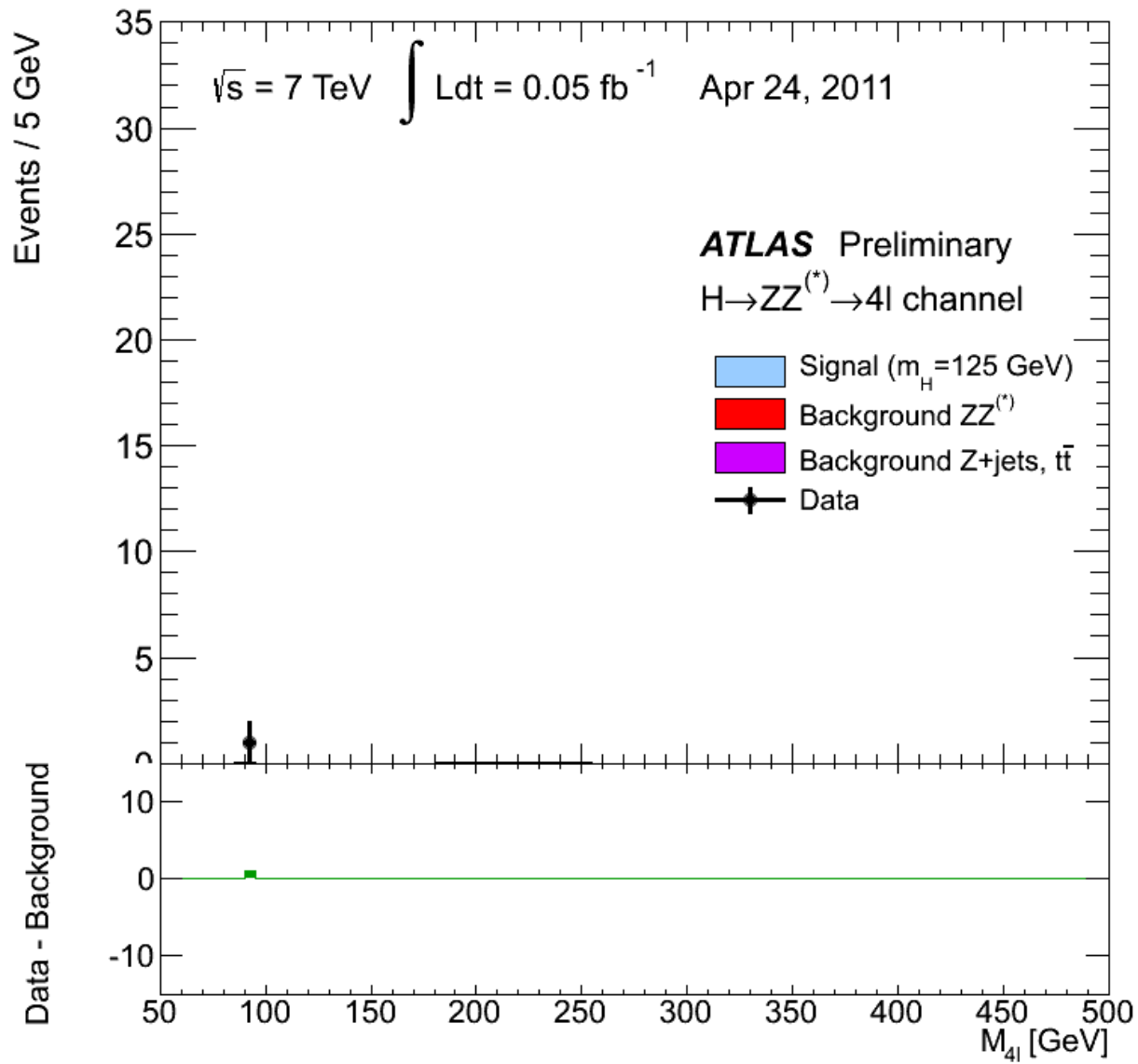


$$\mathcal{L} = -\frac{1}{4} F_{\mu\nu} F^{\mu\nu} + i\bar{\psi}\not{D}\psi + h.c. + \chi_i \psi_j \chi_k \phi + h.c. + |D_\mu \phi|^2 - V(\phi)$$



CH0:0.001;
 CH2:0.14;
 CH4:0.34;
 ...
 CH98039232:0.08;

Result

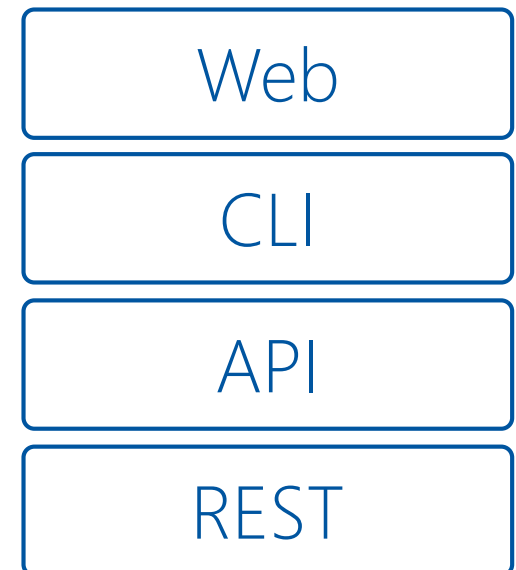
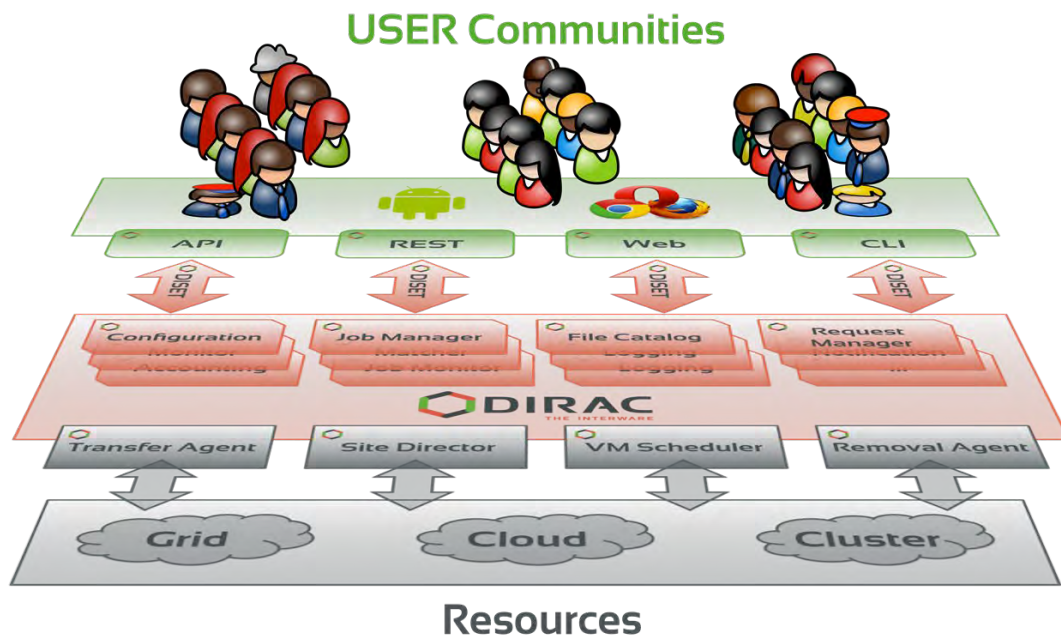


Birth of DIRAC

- LHC experiments, all developed their own middleware
 - PanDA, AliEn, glideIn WMS, PhEDEx, ...
- DIRAC is developed originally for the LHCb experiment
- The experience collected with a production grid system of a large HEP experiment is very valuable
 - Several new experiments expressed interest in using this software relying on its proven in practice utility
- In 2009 the core DIRAC development team decided to generalize the software to make it suitable for any user community.
- The results of this work allow to offer DIRAC as a general purpose distributed computing framework

What is DIRAC?

DIRAC provides all the necessary components to build ad-hoc grid infrastructures **interconnecting** computing resources of different types, allowing **interoperability** and simplifying **interfaces**. This allows to speak about the DIRAC *interware*.



Why DIRAC?

1. Single system for all aspects of computing



User Interface

API

Central configuration

Workload management

Data management

Integration tools

File Catalog

Workflow management

Metadata management

Accounting

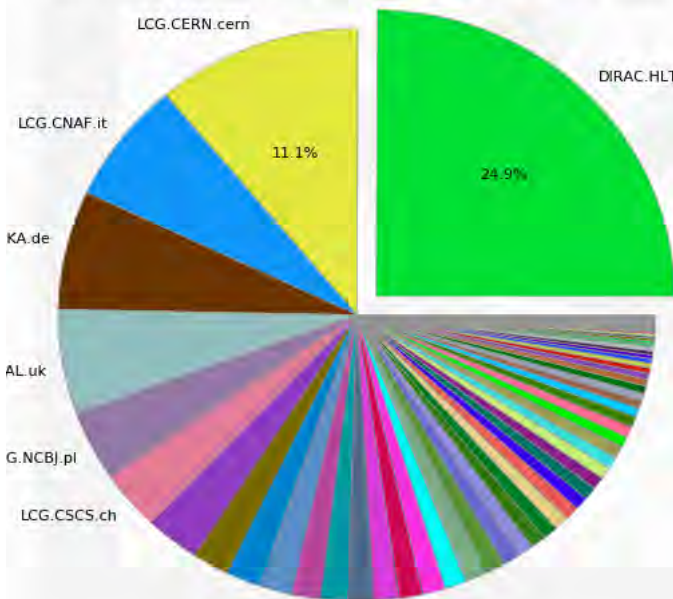
Management

Why DIRAC?

2. Good performance

Wall time days used by Site

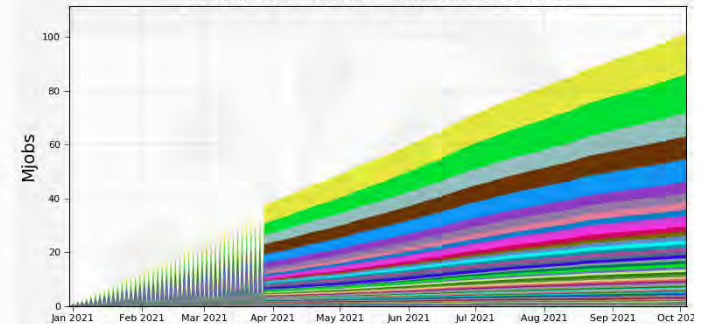
39 Weeks from Week 00 of 2021 to Week 40 of 2021



DIRAC.HLTFarm.lhcb	8735245.1
LCG.CERN.cern	3895823.4
LCG.CNAF.it	2421484.2
LCG.GRIDKA.de	2353391.6
LCG.RAL.uk	2061729.7
LCG.NCBI.pl	1390750.6
LCG.CSCS.ch	1172944.7
LCG.IN2P3.fr	1042061.3
LCG.Manchester.uk	689467.2
LCG.RRCKI.ru	663460.3
LCG.UKI-LT2-QMUL.uk	612525.1
LCG.MIT.us	549385.2
LCG.UKI-LT2-IC-HEP.uk	515392.8
LCG.LAL.fr	490277.7
LCG.NIKHEF.nl	474998.9
DIRAC.Client.fr	446574.6
DIRAC.Client.ch	435127.7
DIRAC.Client.de	408990.6
LCG.CPPM.fr	407705.7
LCG.NIPNE-07.ro	380158.5
LCG.Lancaster.uk	332407.3
LCG.CBPF.br	291745.9
DIRAC.Client.it	286298.3
LCG.Liverpool.uk	284122.6
LCG.JINR.ru	283145.2
LCG.LAPP.fr	273415.1
LCG.SARA.nl	255426.3
DIRAC.Client.nl	248673.9
LCG.RAL-HEP.uk	244129.9
LCG.Beijing.cn	241335.1
LCG.DURHAM.uk	235125.9
LCG.UKI-LT2-RHUL.uk	233936.2
LCG.PIC.es	214956.9
DIRAC.UZH.ch	212277.2
LCG.LPNHE.fr	211377.3
LCG.BEER.cern	178553.2
LCG.CINECA.it	152835.0
LCG.IHEP.ru	150573.2
LCG.Bristol.uk	149147.8
LCG.LPC.fr	131954.5
VAC.Glasgow.uk	121261.9
LCG.Oxford.uk	106505.4
...	plus 49 more

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Cumulative Jobs by Site
39 Weeks from Week 52 of 2020 to Week 40 of 2021

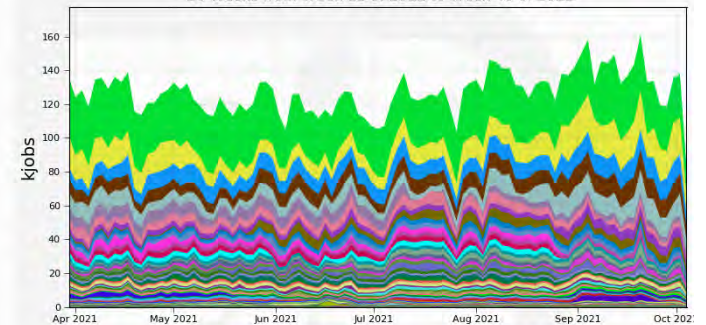


Max: 101, Min: 0.00, Average: 41.1, Current: 101

LCG.CERN.cern	15.2	LCG.NIKHEF.nl	2.1	LCG.SARA.nl	1.2	LCG.LAPP.fr	0.7
DIRAC.HLTFarm.lhcb	14.3	DIRAC.Client.ch	1.8	LCG.CPPM.fr	1.1	LCG.RAL-HEP.uk	0.7
LCG.RAL.uk	8.7	DIRAC.Client.fr	1.8	DIRAC.Client.nl	1.0	LCG.CBPF.br	0.6
LCG.GRIDKA.de	8.5	LCG.Manchester.uk	1.7	LCG.PIC.es	1.0	LCG.UKI-LT2-RHUL.uk	0.6
LCG.CNAF.it	8.4	LCG.UKI-LT2-QMUL.uk	1.6	LCG.Lancaster.uk	1.0	LCG.Liverpool.uk	0.6
LCG.IN2P3.fr	4.3	DIRAC.Client.de	1.4	LCG.Beijing.cn	0.9	LCG.DURHAM.uk	0.6
LCG.NCBI.pl	3.4	LCG.UKI-LT2-IC-HEP.uk	1.4	DIRAC.Client.it	0.9	DIRAC.UZH.ch	0.6
LCG.CSCS.ch	2.8	LCG.MIT.us	1.3	LCG.NIPNE-07.ro	0.9	LCG.LPNHE.fr	0.5
LCG.RRCKI.ru	2.3	LCG.LAL.fr	1.3	LCG.JINR.ru	0.8	...	plus 56 more

Running jobs by Site

26 Weeks from Week 13 of 2021 to Week 40 of 2021



Max: 161, Min: 81.9, Average: 127, Current: 81.9

DIRAC.HLTFarm.lhcb	24.2%	LCG.RRCKI.ru	2.0%	LCG.NIKHEF.nl	1.2%
LCG.CERN.cern	9.9%	LCG.UKI-LT2-QMUL.uk	1.8%	LCG.NIPNE-07.ro	1.2%
LCG.CNAF.it	7.3%	DIRAC.Client.ch	1.8%	LCG.Lancaster.uk	1.2%
LCG.GRIDKA.de	6.5%	LCG.MIT.us	1.6%	DIRAC.Client.it	1.1%
LCG.RAL.uk	5.9%	DIRAC.Client.fr	1.6%	LCG.CBPF.br	0.9%
LCG.NCBI.pl	3.8%	DIRAC.Client.de	1.4%	DIRAC.Client.nl	0.9%
LCG.CSCS.ch	3.7%	LCG.UKI-LT2-IC-HEP.uk	1.4%	LCG.Liverpool.uk	0.9%
LCG.IN2P3.fr	2.6%	LCG.CPPM.fr	1.4%	LCG.LAPP.fr	0.8%
LCG.Manchester.uk	2.5%	LCG.LAL.fr	1.3%	...	plus 56 more

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Why DIRAC?

3. Active users and developers community



GridPP
UK Computing for Particle Physics



- ▶ Dedicated installations
 - ▶ LHCb, Belle II, CTA
- ▶ Multi-community services
 - ▶ ILC, CALICE
 - ▶ IHEP: BES III, Juno, CEPC
 - ▶ FG-DIRAC
 - ▶ GridPP
 - ▶ DIRAC4EGI
 - ▶ PNNL

▶ **DIRAC@JINR**

▶ DIRAC@CNAF

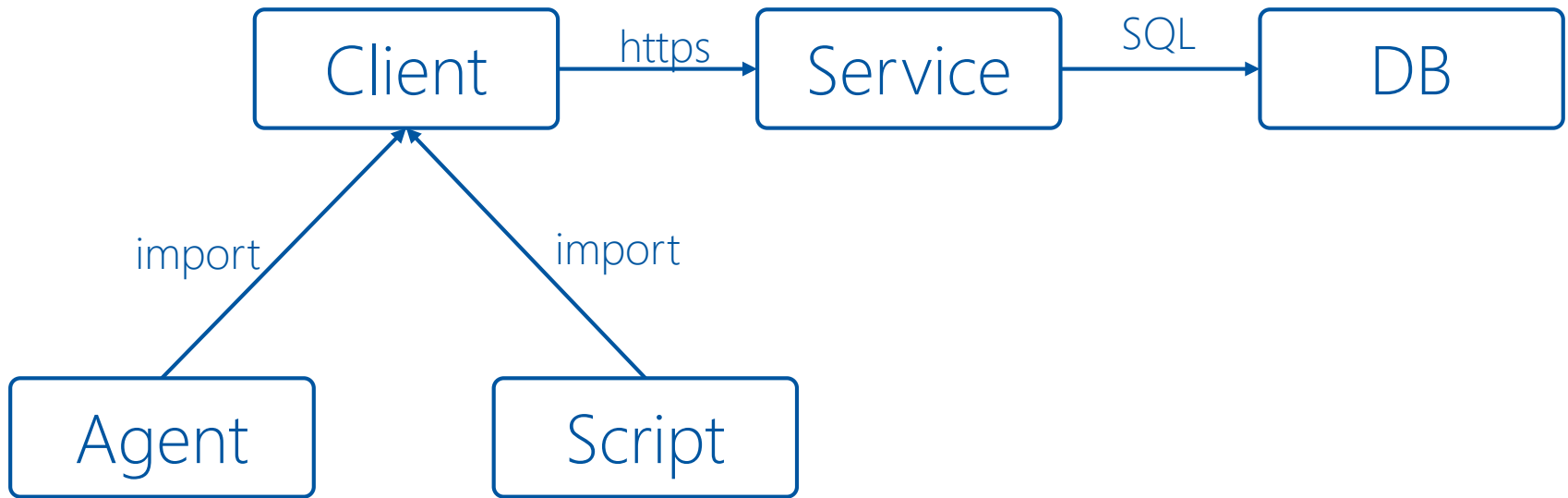
- ▶ Several DIRAC evaluations are ongoing
 - ▶ Auger, ELI, NICA, Virgo, LSST, ...



What is DIRAC?

- DIRAC is a multi-agent system written in Python.
- DIRAC implements Service Oriented Architecture.
- Whole system is built with the following *bricks*:
 - Services
 - Clients
 - DBs
 - Agents
 - Scripts
- Repository: <https://github.com/DIRACGrid>

What is DIRAC?



DIRAC standard job workflow

1. Initial configuration
2. Input data download
3. Processing
4. Output data upload
5. Finalization

Job example

```
dirac-configure config.cfg
```

```
dirac-dms-get-file /bmn/raw/AuAu/data1002.raw
```

```
root -l -q -b reco.MC("data1002.raw")
```

```
#or
```

```
root -l -q -b reco.MC(/eos/nica/bmn/AuAu/data1002.raw)
```

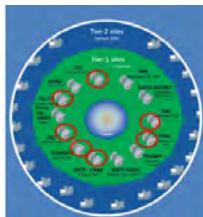
```
dirac-dms-put-file /bmn/reco/AuAu/data1002.root \\  
                                                         data1002.root \\  
                                                         JINR-EOS-BMN
```

```
rm -f data1002.raw data1002.root
```

Workload management



Submit thousand of jobs to DIRAC Job Queue



Tier-1



CICC/Tier-2



Clouds



Govorun



NICA Cluster

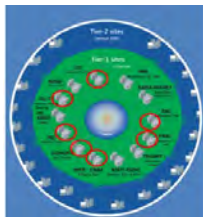


UNAM

Workload management



Submit thousand of jobs to DIRAC Job Queue



Tier-1



CICC/Tier-2



Clouds



Govorun



NICA Cluster

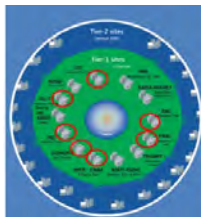


UNAM

Workload management



Submit thousand of jobs to DIRAC Job Queue



Tier-1



CICC/Tier-2



Clouds



Govorun

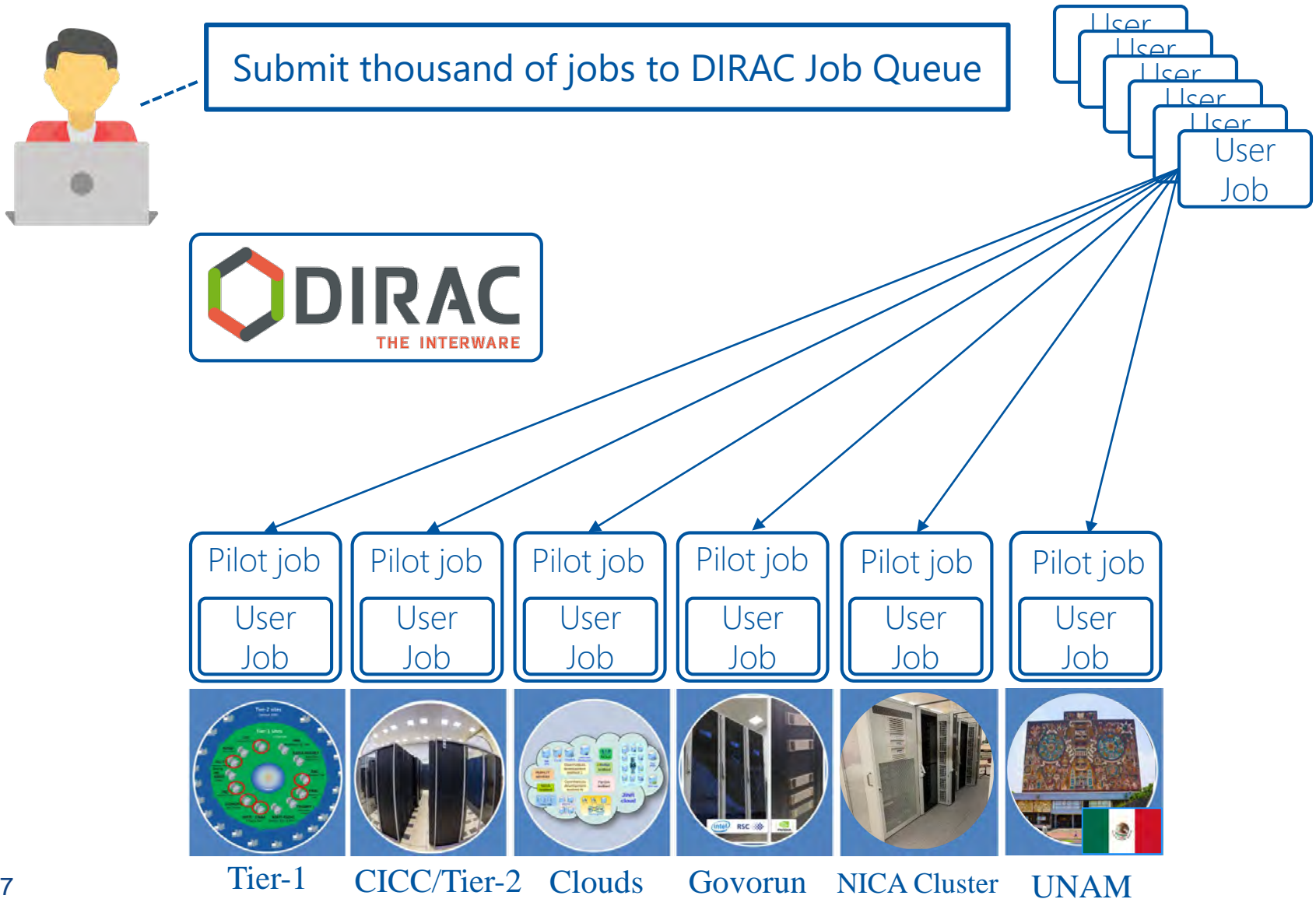


NICA Cluster

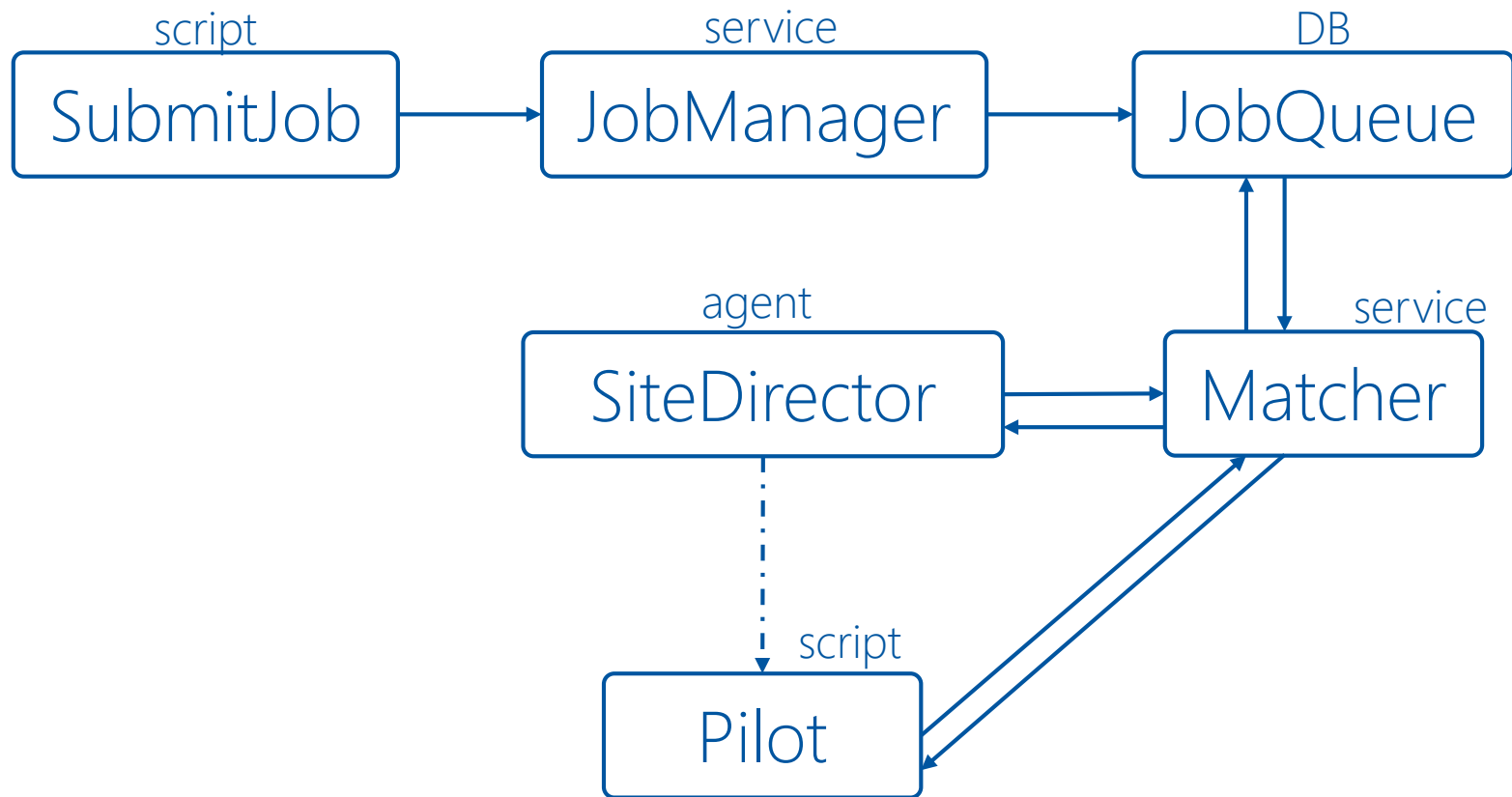


UNAM

Workload management



How to achieve that?



Computing resources

- Computing Elements
- Clouds
- Computing clusters (not included in any grid infrastructure)
 - Resources available at Universities and scientific laboratories
- High Performance Computing (HPC) Centers, or Supercomputers
- Volunteer Computing
 - Mostly based on BOINC technology
 - SETI@Home, LHC@Home, etc

JINR Main Resources

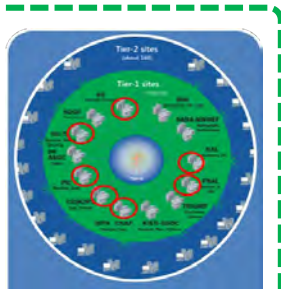
EOS LIT

EOS HybriLIT

EOS LHEP



root – transfer protocol
X509 – authentication
VOMS - authorization

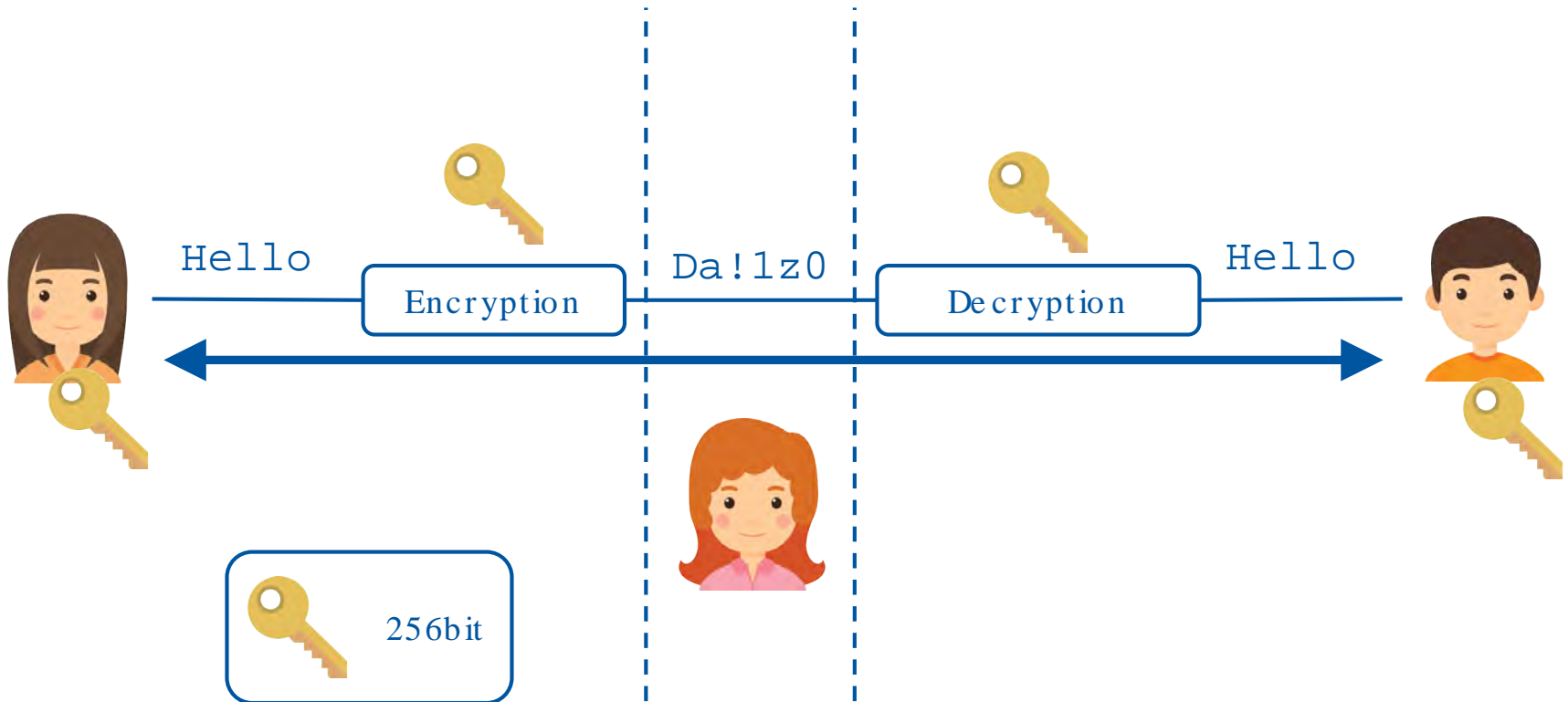


* Any computer with xrdcp,
your certificate, or proxy of
your certificate**

**How to pass credentials to processes to write?

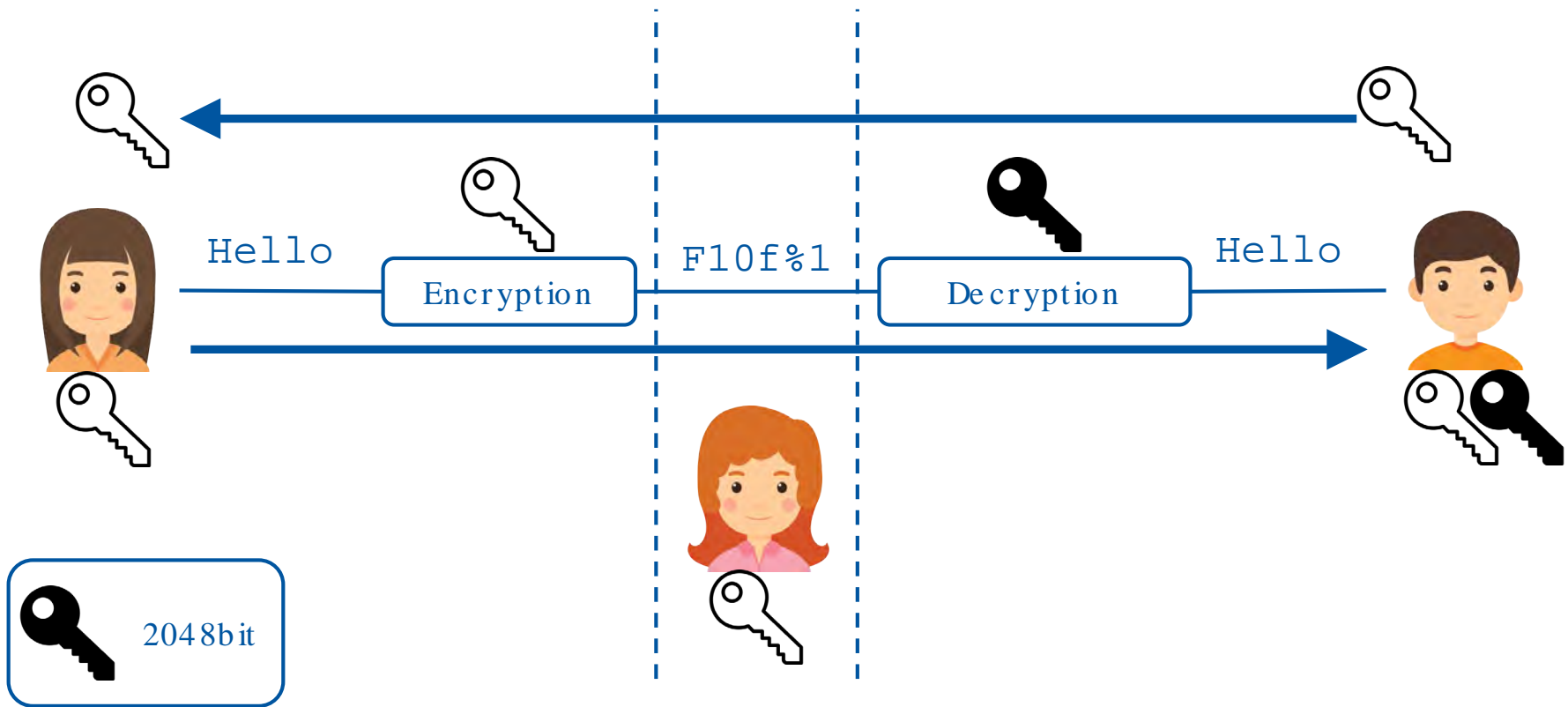
Proxy is the answer!

Symmetric-key algorithm



Gues  key is hard

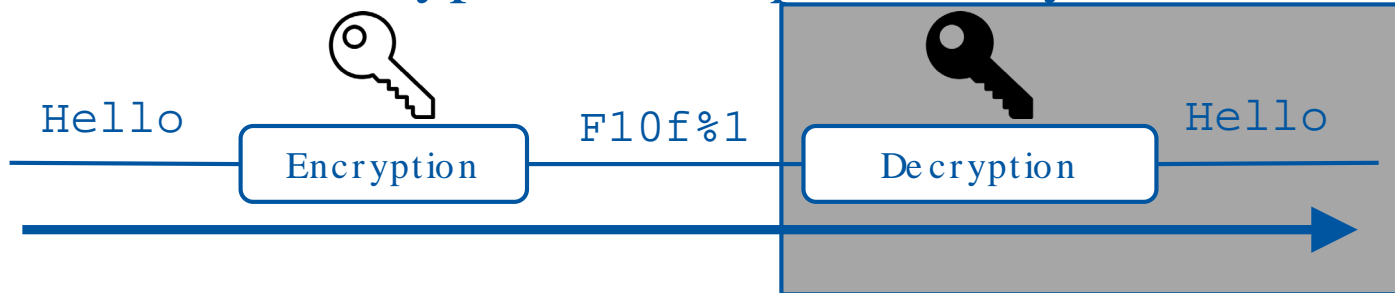
Asymmetric-key algorithm



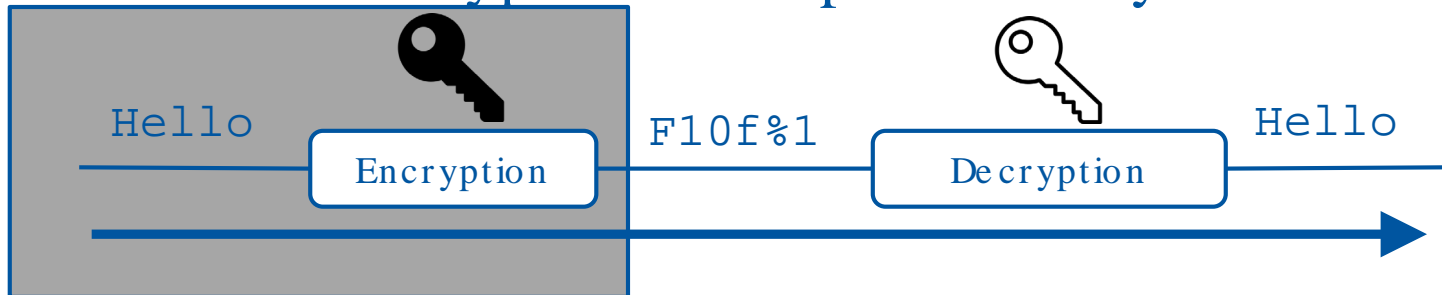
Guess  key is hard

Asymmetric-key algorithm

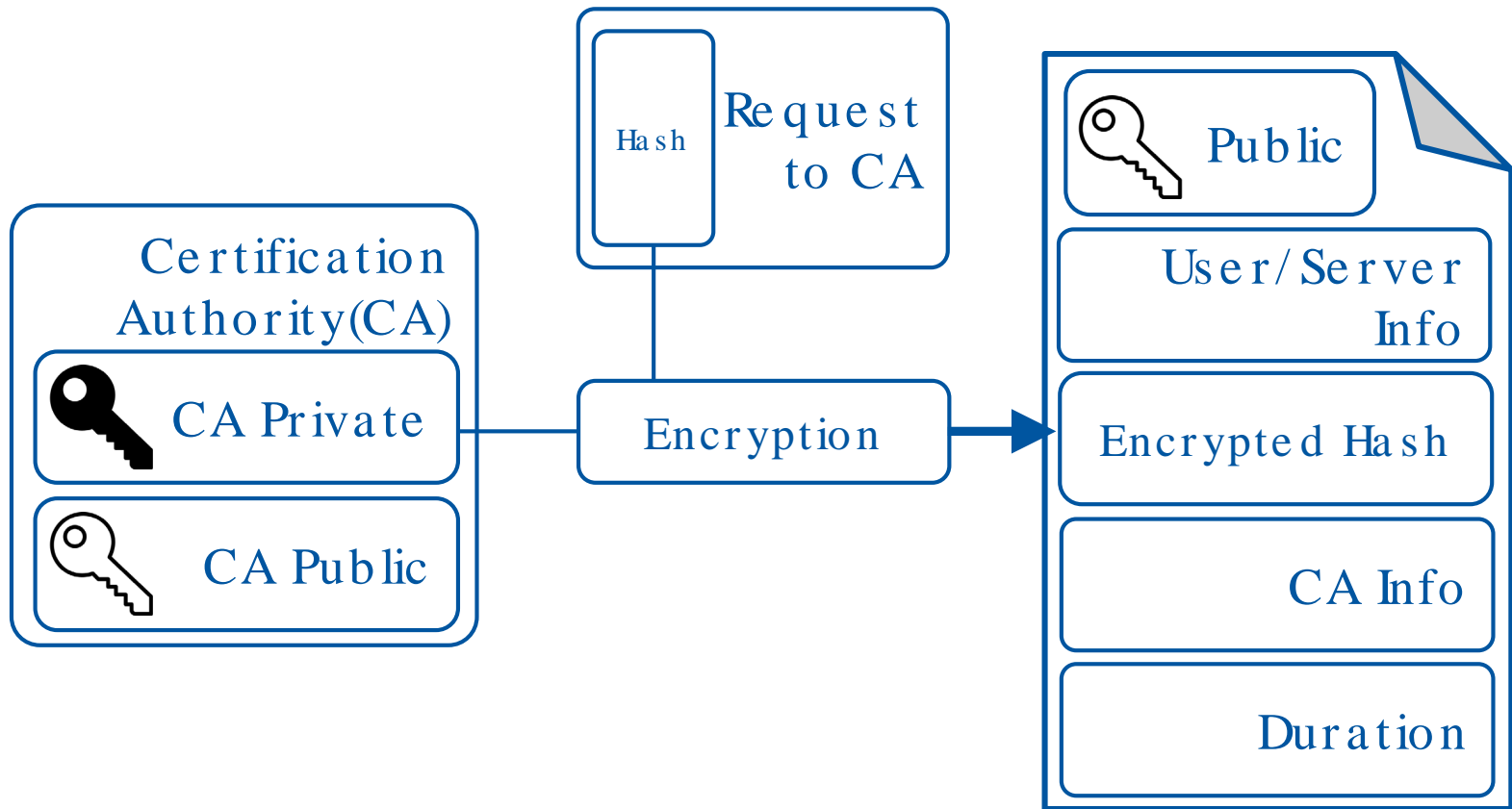
Encryption with public key



Encryption with private key

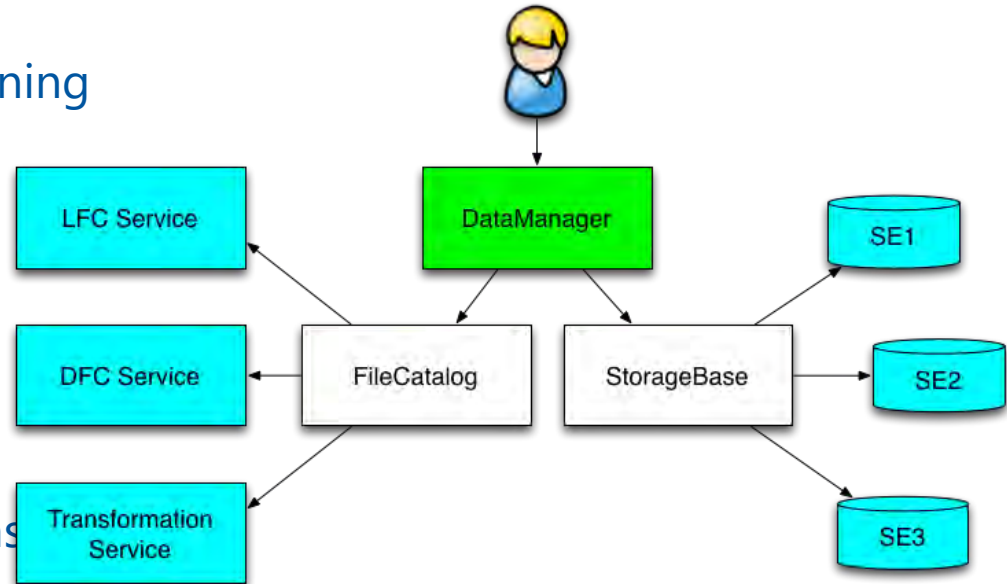


Making a certificate



Data Management

- DIRAC File Catalog(DFC) is maintaining a single global logical name space
- A user sees it as a single catalog with additional features
- DataManager is a single client interface for logical data operations



- Upload file(example):

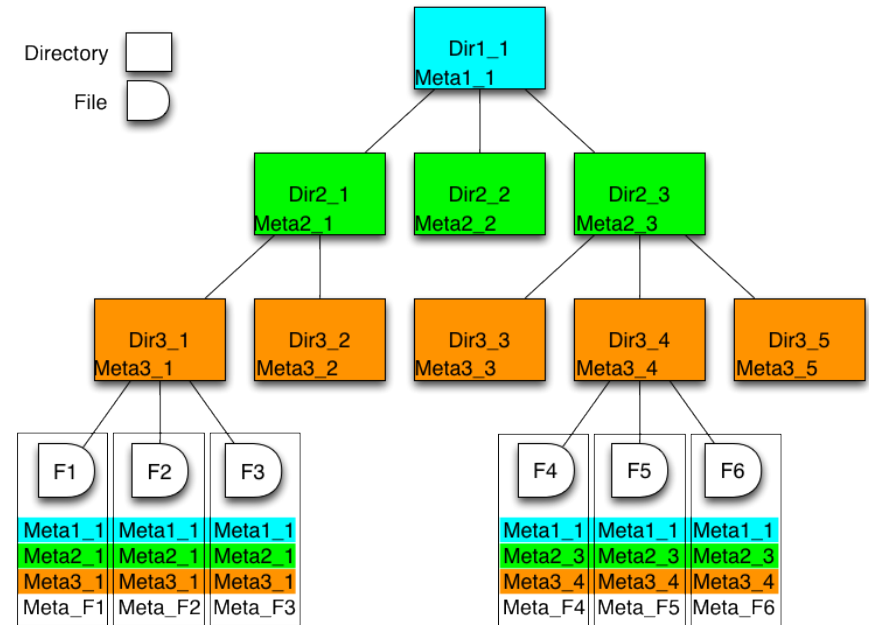
```
dirac-dms-add-file /mpd/vo/model/DQGSM/data.root ./data.root EOS-MPD
```

- Download file(example):

```
dirac-dms-get-file /mpd/vo/model/DQGSM/data.root
```

Meta Data

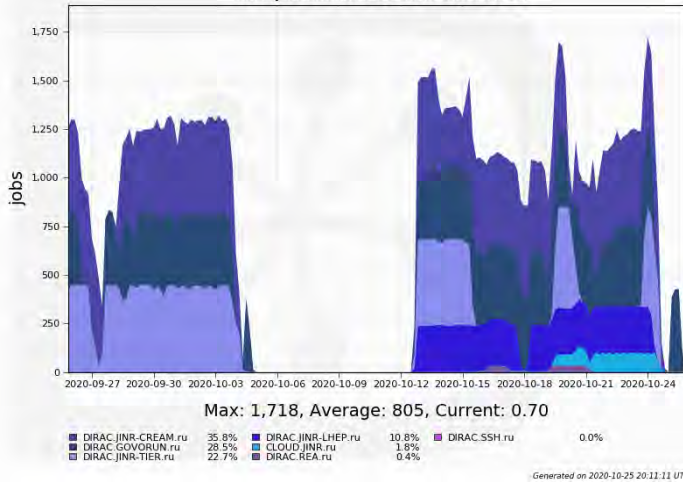
- DFC also may host Metadata
 - User defined metadata
 - The same hierarchy for metadata as for the logical name space
 - Metadata associated with files and directories
 - Allow for efficient searches
 - Efficient Storage Usage reports



```
find /experiment/model LastAccess<01-10-2020  
GaussVersion=v1,v2 SE=EOS-MPD Name=*.raw
```

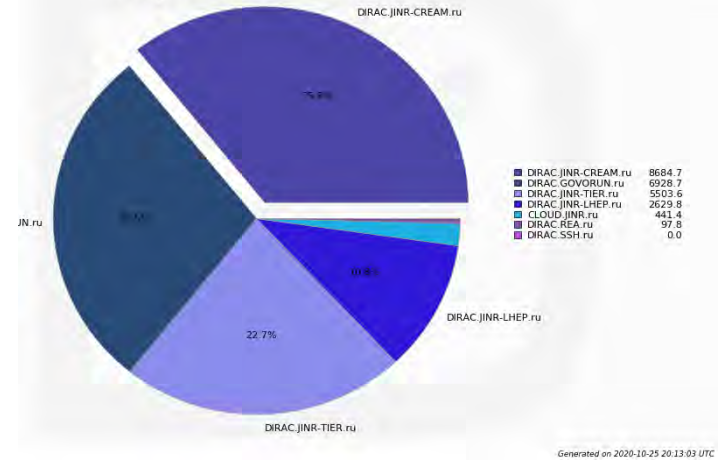
Accounting

Running jobs by Site
30 Days from 2020-09-25 to 2020-10-25



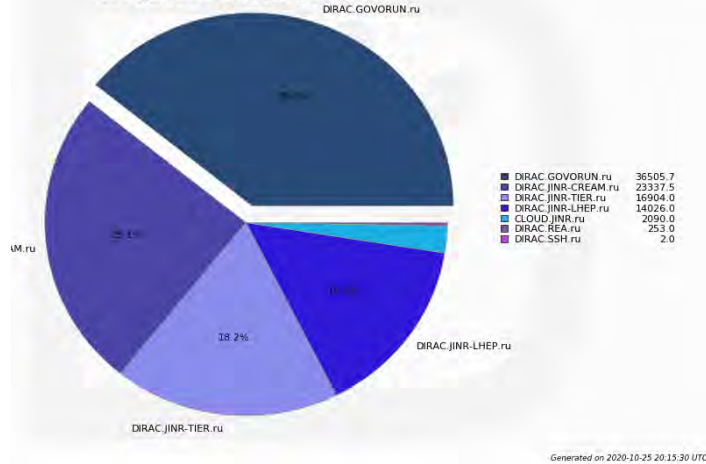
Wall time days used by Site

30 Days from 2020-09-25 to 2020-10-25



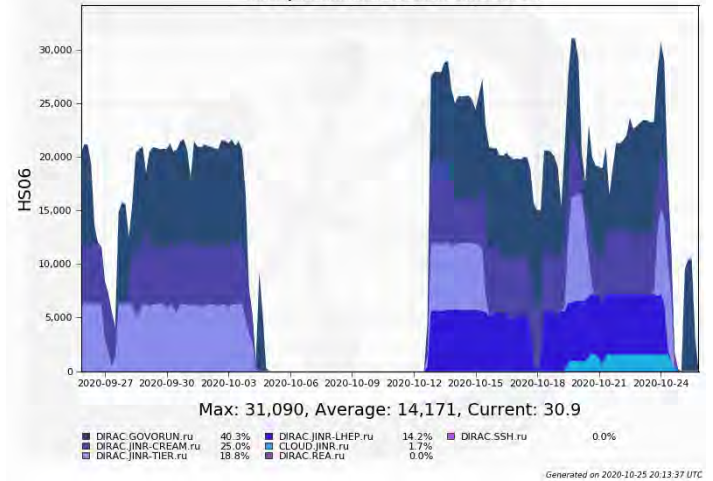
Total Number of Jobs by Site

30 Days from 2020-09-25 to 2020-10-25



Normalized CPU usage by Site

30 Days from 2020-09-25 to 2020-10-25



MultiVO support

Installing, configuring and supporting DIRAC requires a lot of efforts.



CEPC* and JUNO** have joined to BES-III computing infrastructure.

*Circular Electron Positron Collider

**Jiangmen Underground Neutrino Observatory

Resource utilization



Support needs



Feature development



What was done



Tier-1 Running CICC/Tier-2 Running Clouds Running Govorun Running NICA Cluster Running UNAM Running

The computing resources of the JINR Multifunctional Information and Computing Complex, clouds in JINR Member-States, cluster from Mexico University were combined using the DIRAC Interware.

History of DIRAC at JINR

2013 – Development of monitoring system for BES-III installation. First tries to setup and configure DIRAC infrastructure.

2017 – DIRAC Interware installed; basic configuration done. Used for educational purposes. **dCache** storage integrated, **Tier2** integrated.

2018 – **HybriLIT** integrated. **JINR cloud** integrated using OCCl protocol. Tests of full cycle of Monte-Carlo for **BM@N** were performed.

2019 – **Clouds** of JINR Member-States integrated by module developed in JINR. **MPD** starts using DIRAC for massive Monte-Carlo production. **Tier1**, **Govorun** and **EOS** integrated in DIRAC.

2020 – **Folding@Home** jobs submitted to clouds via DIRAC. **Baikal-GVD** jobs submitted to JINR and PRUE clouds.

2021 – First tests for **SPD** Monte-Carlo successfully done. First million jobs done!

2022– Total walltime exceeds 1000 years. DIRAC in JINR updated to use Python 3.

Computing Resources

JINR



Tier-1
920 slots

CICC/Tier-2
1000 slots

Cloud
80 slots

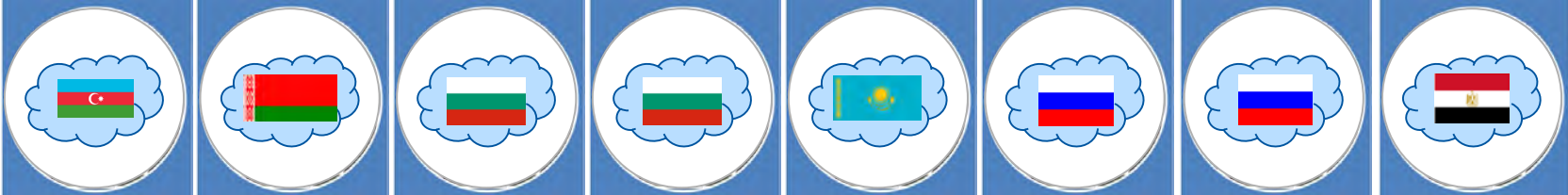
Govorun
184-870 slots

NICA Cluster
250 slots

UNAM
100 slots

MPD
collaboration

Clouds



IPANAS
16 slots

INP
132 slots

SU
48 slots

INRNE
20 slots

INP
50 slots

REA Plehanova
132 slots

NOSU
84 slots

STI-SCI
98 slots

Total amount of cores exceeds 3000

Steps

1. DIRAC setup, configuration, development and tuning



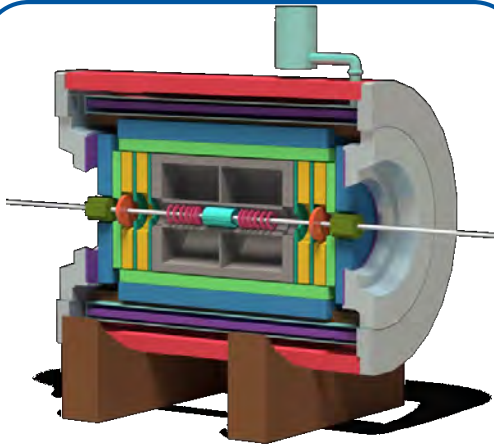
2. Integration of computing and storage resources



3. Elaboration of approaches for effective use of resources



What do we use DIRAC for?



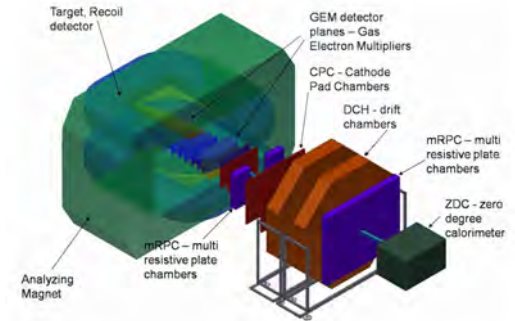
MPD@NICA

Monte-Carlo – Real
Analysis – Maybe



Baikal-GVD

Monte-Carlo – Real



BM@N

Monte-Carlo – Real
Reconstruction – Tests



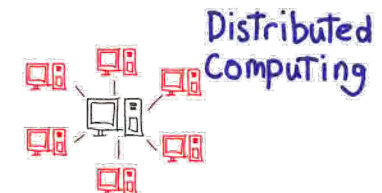
SPD@NICA

Monte-Carlo – Real



FOLDING
@HOME

Folding@HOME

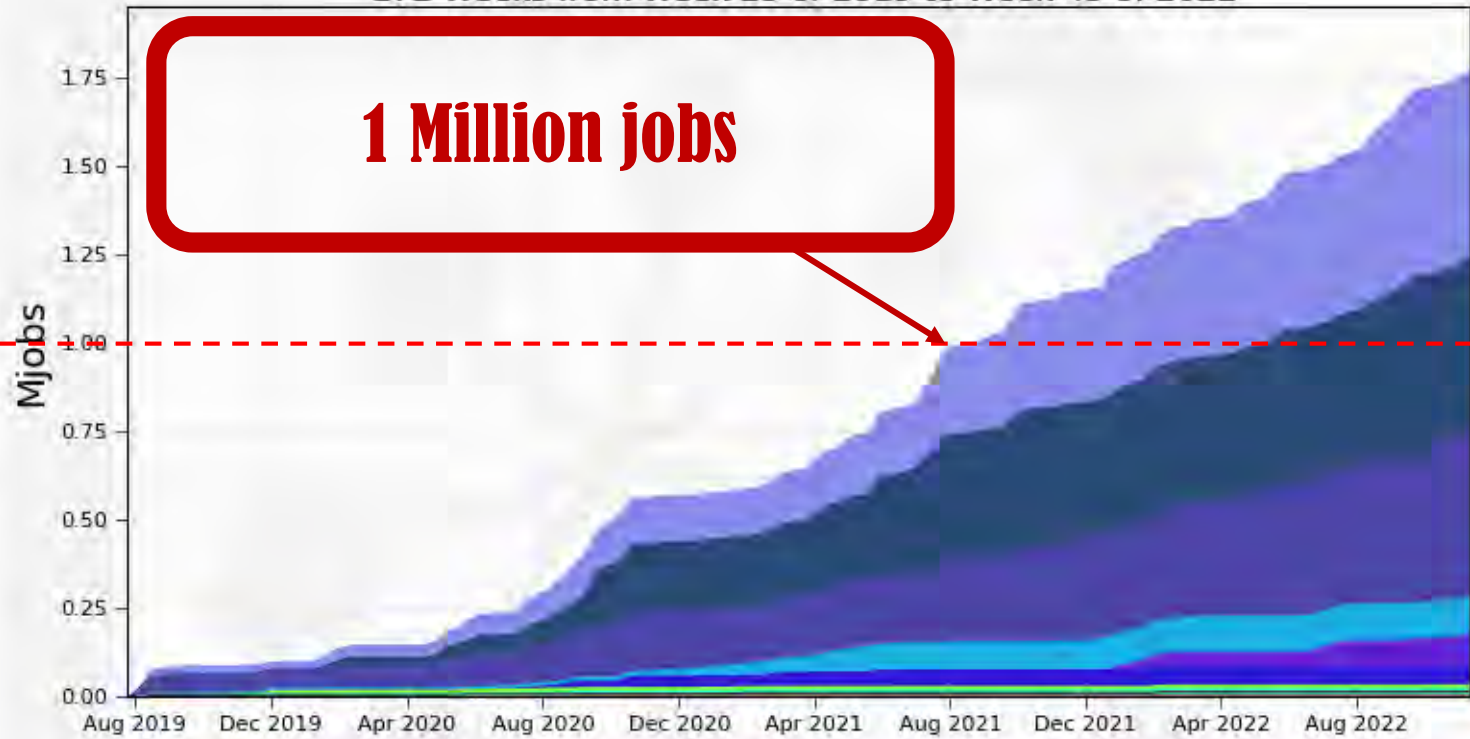


Teaching

Statistics: jobs done

Cumulative Jobs by Site

172 Weeks from Week 29 of 2019 to Week 45 of 2022



Max: 1.77, Min: 0.00, Average: 0.76, Current: 1.77

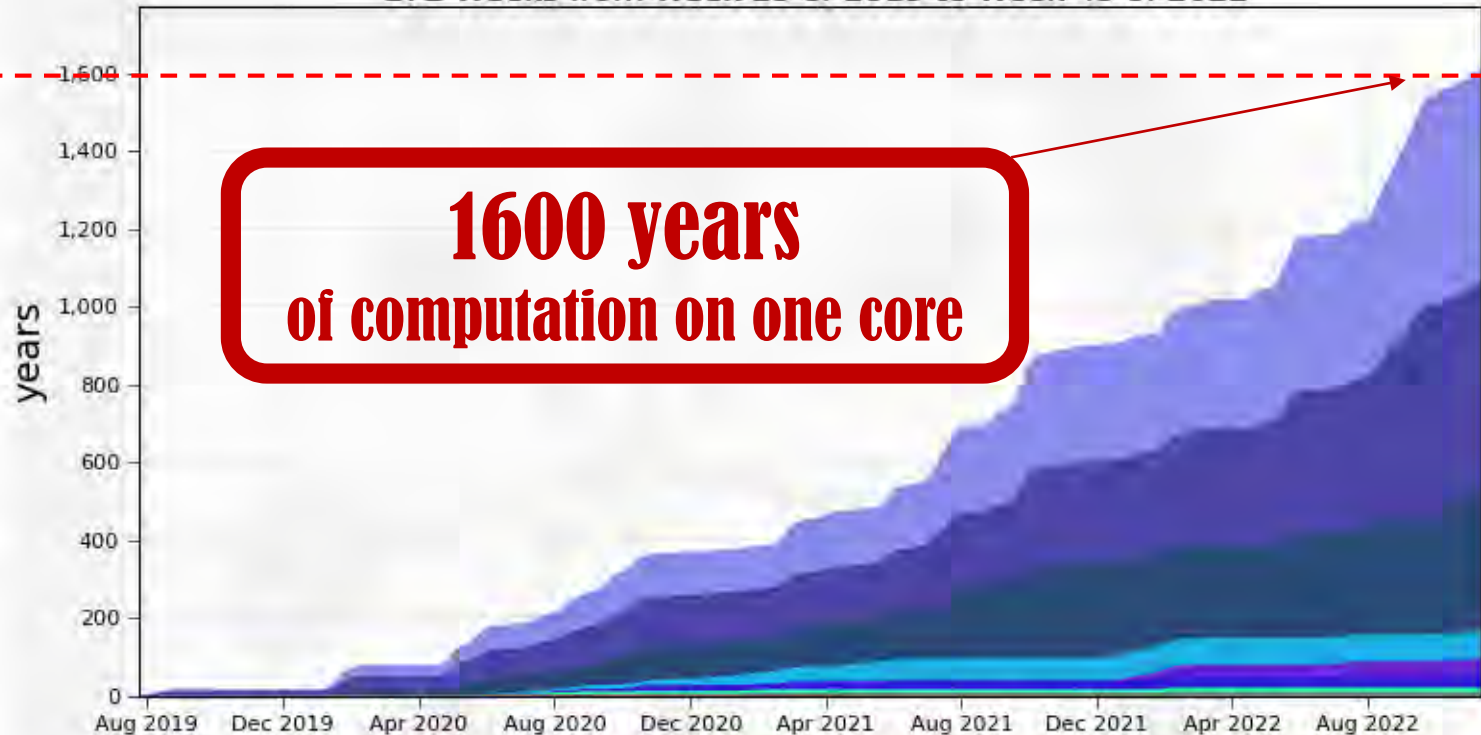
DIRAC.JINR-TIER.ru	0.5	CLOUD.PRUE.ru	0.0	DIRAC.INP.uz	0.0	CLOUD.SU.bg	0.0
DIRAC.GOVORUN.ru	0.5	CLOUD.GRENA.ge	0.0	CLOUD.INP.by	0.0	CLOUD.JINR-JUNO.ru	0.0
DIRAC.JINR-CREAM.ru	0.5	DIRAC.NIKS-JSCC.ru	0.0	CLOUD.STI-SCI.eg	0.0	DIRAC.TEST.ru	0.0
CLOUD.JINR.ru	0.1	CLOUD.NOSU.ru	0.0	CLOUD.INP.kz	0.0	DIRAC.UPJS.sk	0.0
DIRAC.JINR-CONDOR.ru	0.1	CLOUD.NU.kz	0.0	DIRAC.REA.ru	0.0		
DIRAC.JINR-LHEP.ru	0.0	CLOUD.IPANAS.az	0.0	CLOUD.INRNE.bg	0.0		
DIRAC.JINR-SANC.ru	0.0	DIRAC.UNAM.mx	0.0	DIRAC.SSH.ru	0.0		

Generated on 2022-11-14 08:09:44 UTC

Statistics: walltime

Cumulative wall time by Site

172 Weeks from Week 29 of 2019 to Week 45 of 2022



Max: 1,609, Min: 0.01, Average: 568, Current: 1,609

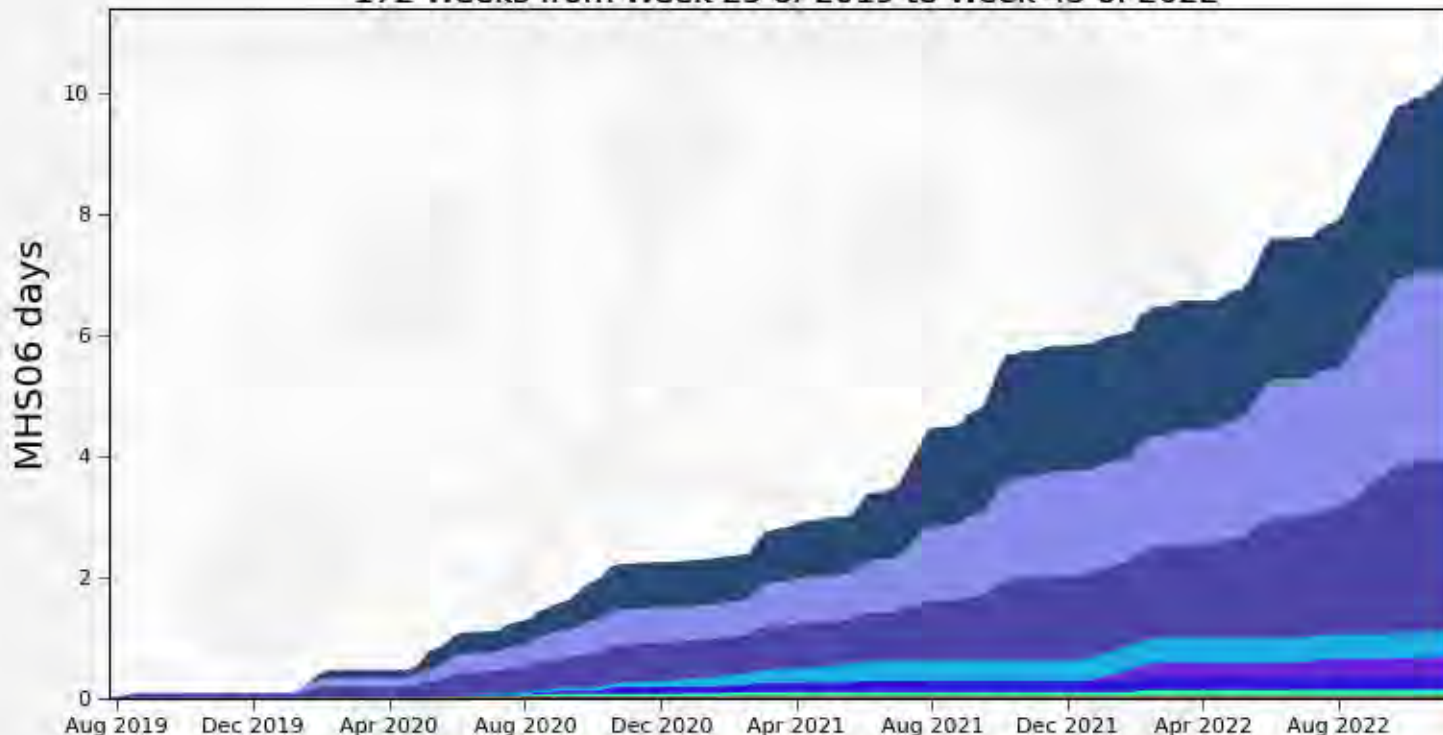
DIRAC.JINR-TIER.ru	543.0	DIRAC.NIKS-JSCC.ru	4.9	CLOUD.INP.kz	0.2	DIRAC.SSH.ru	0.0
DIRAC.JINR-CREAM.ru	531.5	CLOUD.NOSU.ru	2.3	CLOUD.JNRNE.bg	0.2	DIRAC.TEST.ru	0.0
DIRAC.GOVORUN.ru	367.0	CLOUD.IPANAS.az	2.0	DIRAC.REA.ru	0.2	CLOUD.JINR-JUNO.ru	0.0
CLOUD.JINR.ru	69.4	DIRAC.UNAM.mx	1.3	CLOUD.NU.kz	0.2	CLOUD.SU.bg	0.0
DIRAC.JINR-CONDOR.ru	49.6	CLOUD.INP.by	1.0	DIRAC.INP.uz	0.0		
DIRAC.JINR-LHEP.ru	26.8	CLOUD.STI-SCI.eg	0.7	DIRAC.JINR-SANC.ru	0.0		
CLOUD.PRUE.ru	9.3	CLOUD.GRENA.ge	0.5	DIRAC.UPJS.sk	0.0		

Generated on 2022-11-14 08:10:04 UTC

Statistics: normalized time

Normalized CPU used by Site

172 Weeks from Week 29 of 2019 to Week 45 of 2022



Max: 10.4, Min: 0.00, Average: 3.60, Current: 10.4

DIRAC.GOVORUN.ru	3.3	DIRAC.NIKS-JSCC.ru	0.0	CLOUD.INRNE.bg	0.0	DIRAC.SSH.ru	0.0
DIRAC.JINR-TIER.ru	3.1	CLOUD.NOSU.ru	0.0	CLOUD.INP.kz	0.0	DIRAC.TEST.ru	0.0
DIRAC.JINR-CREAM.ru	2.8	CLOUD.IPANAS.az	0.0	CLOUD.NU.kz	0.0	CLOUD.JINR-JUNO.ru	0.0
CLOUD.JINR.ru	0.4	DIRAC.UNAM.mx	0.0	DIRAC.INP.uz	0.0	CLOUD.SU.bg	0.0
DIRAC.JINR-CONDOR.ru	0.4	CLOUD.INP.by	0.0	DIRAC.JINR-SANC.ru	0.0		
DIRAC.JINR-LHEP.ru	0.2	CLOUD.STI-SCI.eg	0.0	DIRAC.REA.ru	0.0		
CLOUD.PRUE.ru	0.1	CLOUD.GRENA.ge	0.0	DIRAC.UPJS.sk	0.0		

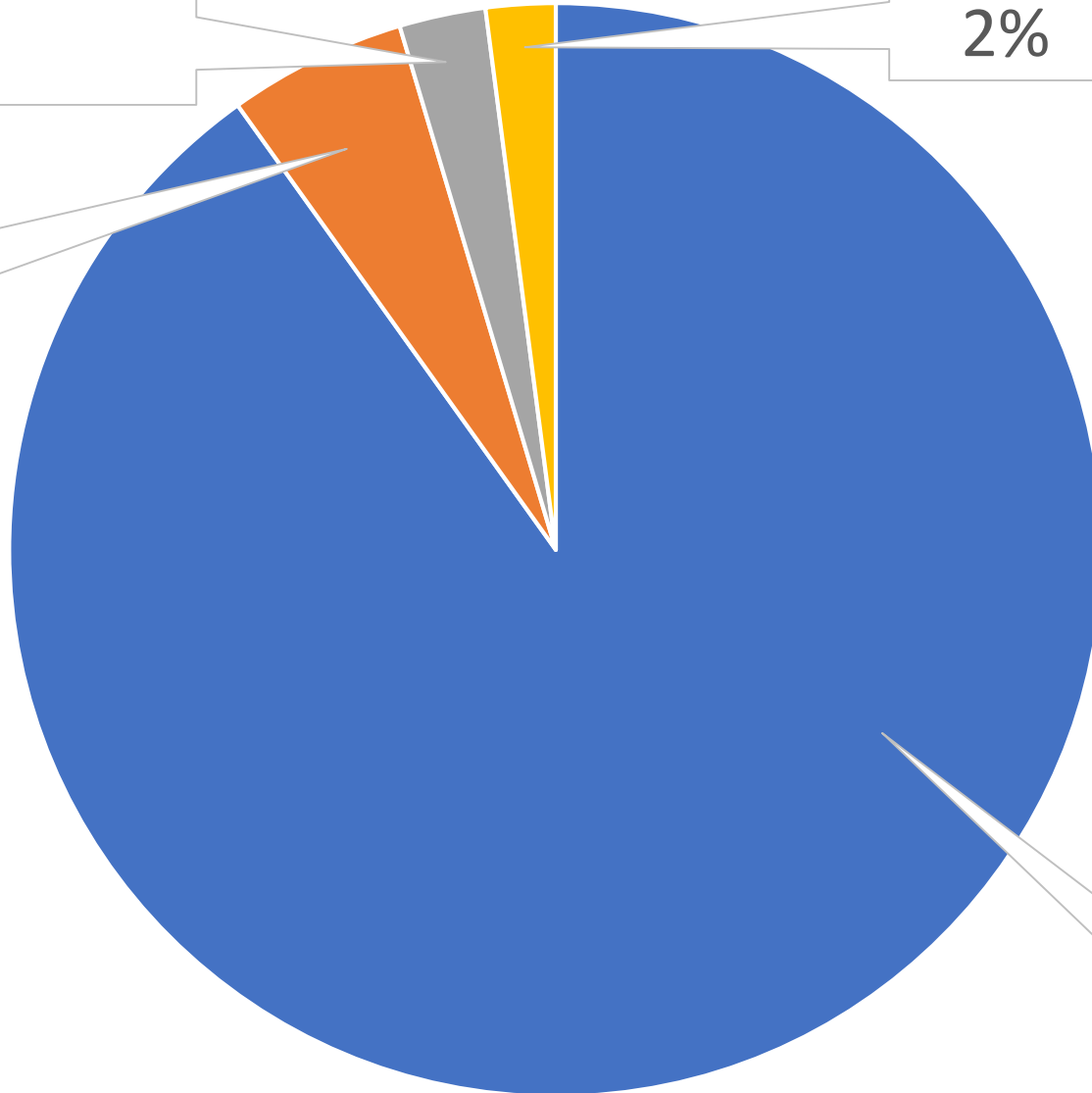
Generated on 2022-11-14 12:18:19 UTC

Ratio: between experiments

Folding@Home
3%

BM@N
2%

Baikal-GVD
5%

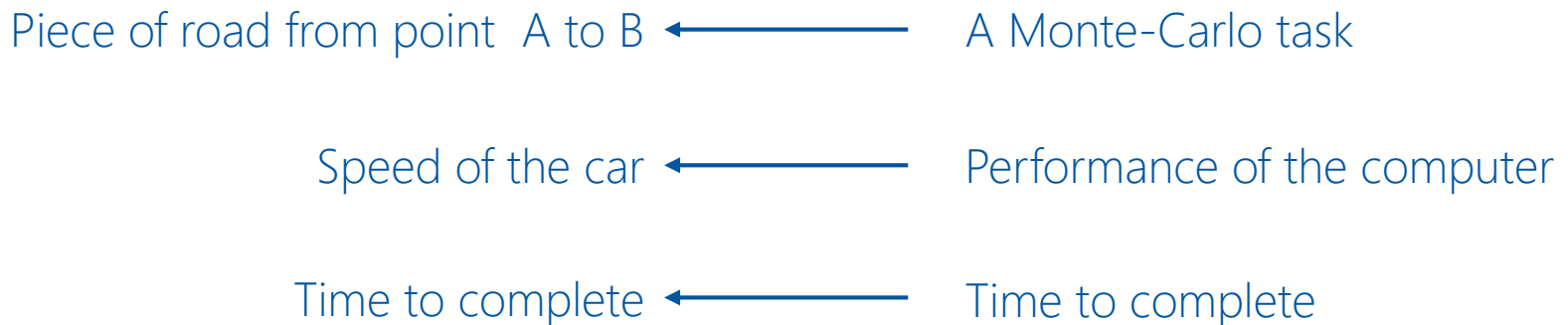


MPD
90%

Individual CPU core performance study

- Centralized job management gives possibility for centralized and unified performance study of different computing resources.
- Before running user jobs DIRAC Pilots execute benchmark for CPU core they are running on.
- Benchmark is DiracBenchmark2012 or DB12. It evaluate just CPU core performance. Disk I/O, RAM speed, Network, CPU caches and other highly important aspects of performance are **neglected by DB12**.

DB12 benchmark study

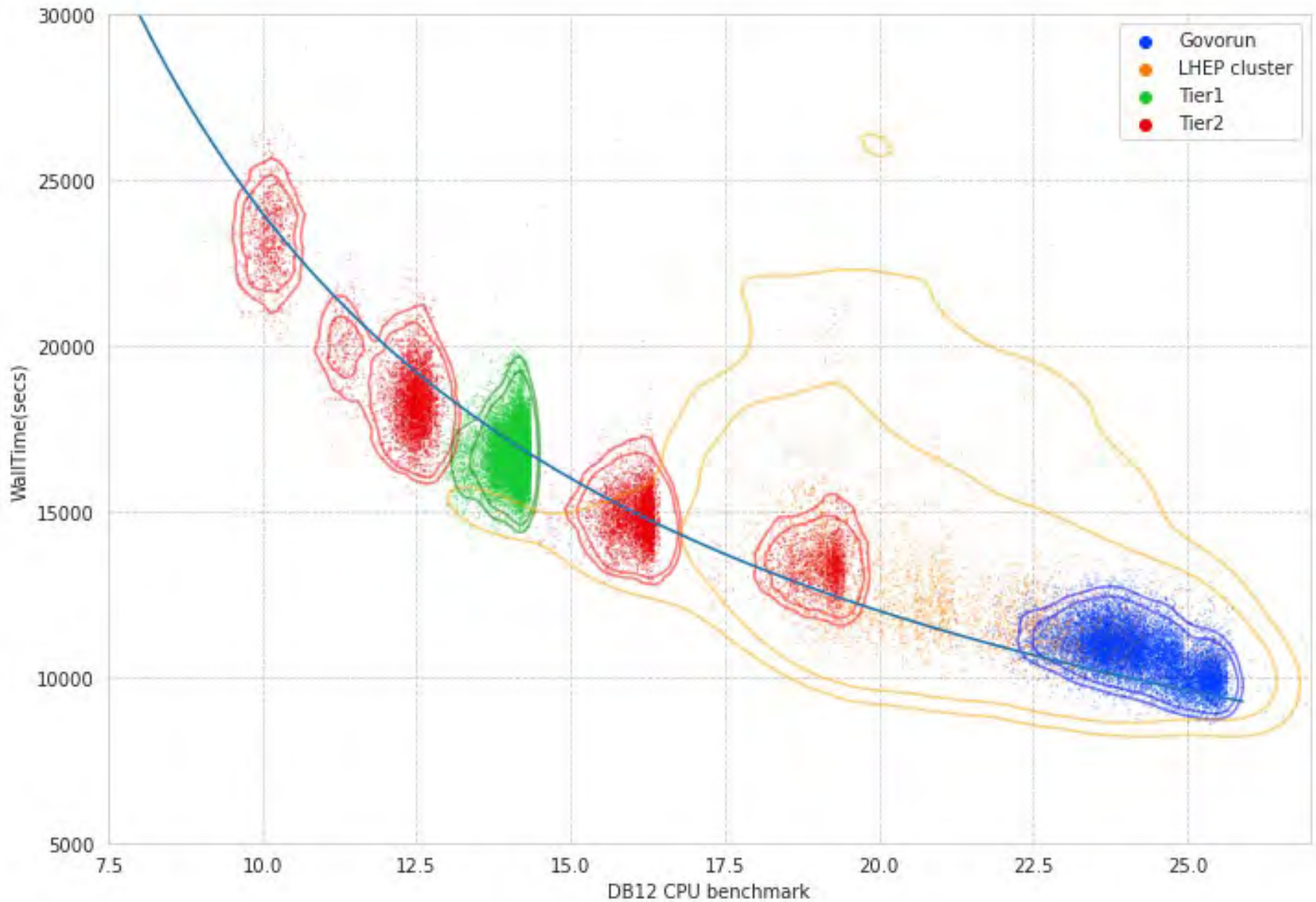


$$Time = \frac{Amount\ of\ work}{Speed\ of\ computer}$$

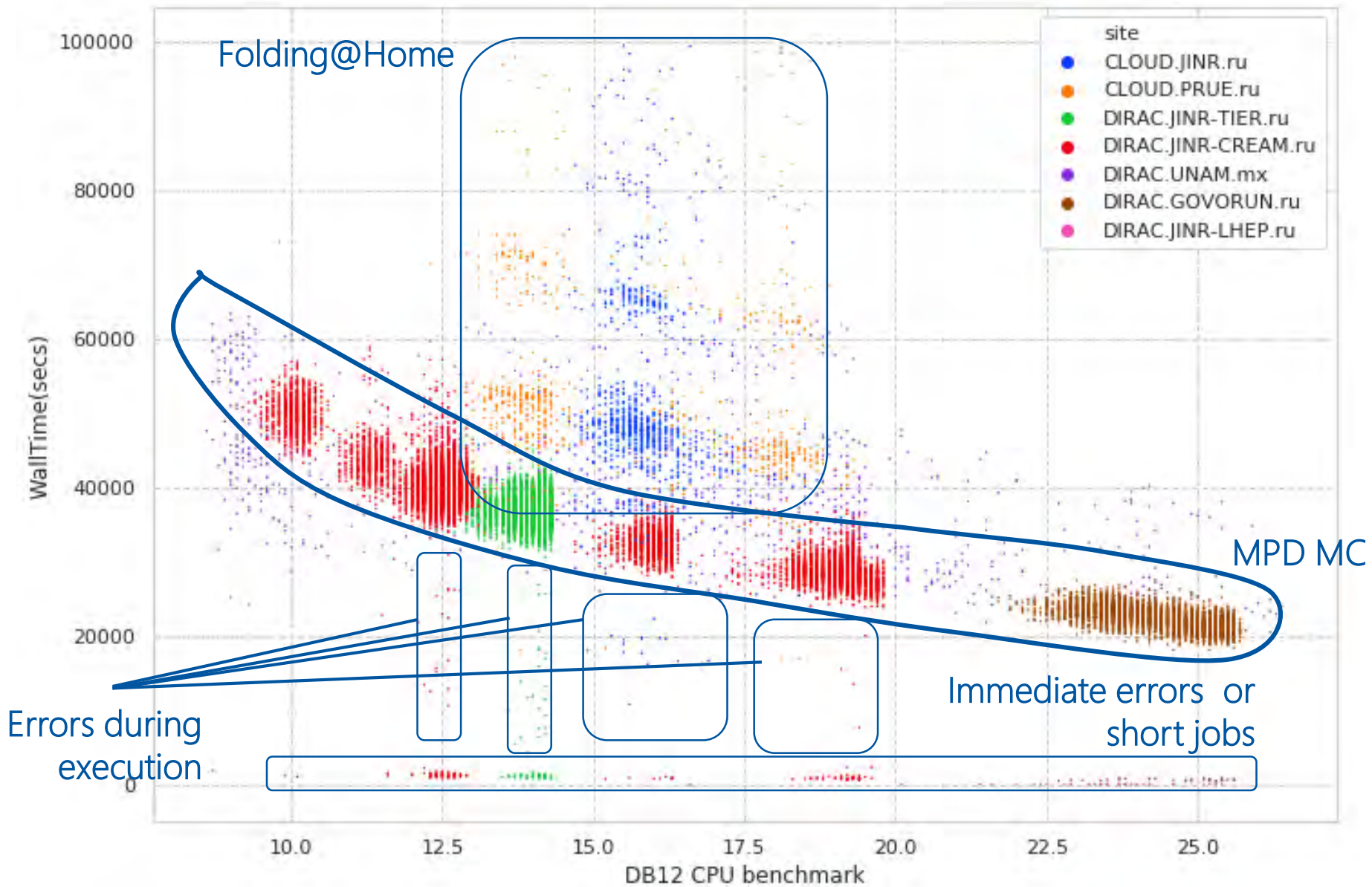
DB12 gives results like: 10(old slow core), 17 (standard server core), 27 (high performance core)

What if we build a plot, where X is DB12 result, Y is time in seconds. Then, every point on the plot represent one job. It would be mostly useless if all jobs were unique and different. But, in the real life there are usually many similar jobs.

Performance analysis



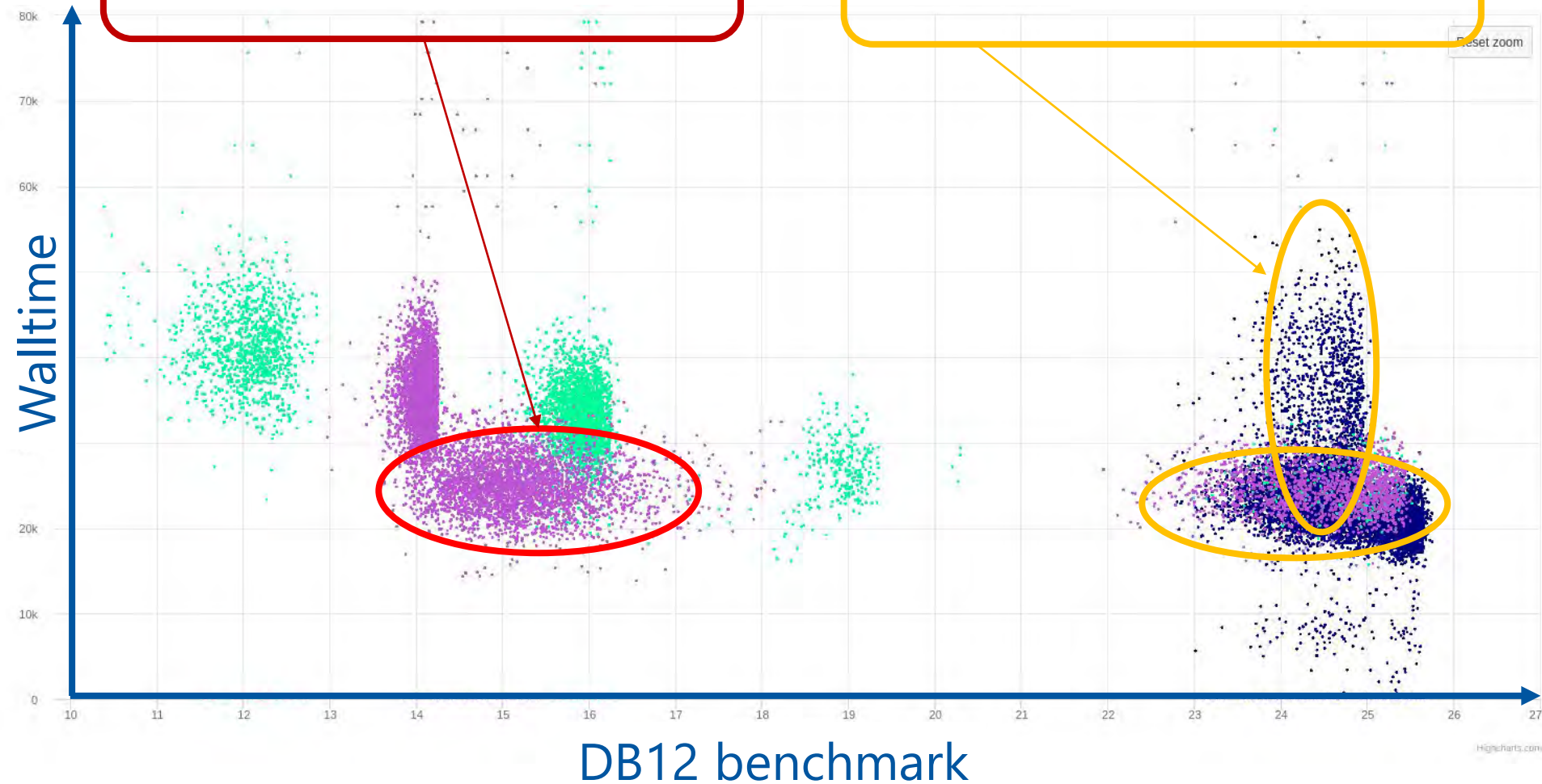
Performance analysis



Discoveries

Wrong AMD processors estimation

Occasional speed loss on high ram Govorun nodes



CPU core performance



Total CPU performance



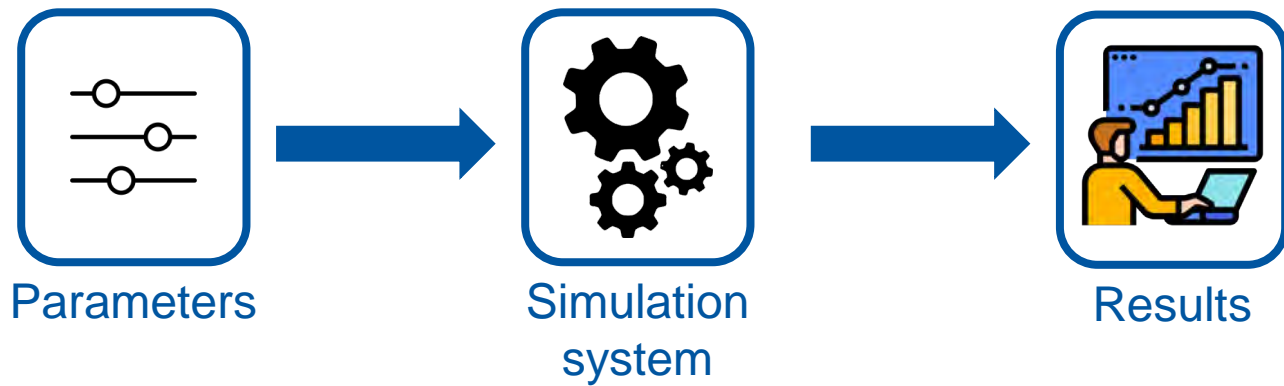
Questions that we ask

- Are we efficient in our job execution?
 - We have no access to monitoring information on a remote computing resources
 - Even if we have monitoring, it may be spoiled by other jobs
- Can we utilize more computing resources if we would have them in our disposal?
 - It is not so difficult to submit jobs on another thousand of cores, but will network handle them efficiently?

Parameters example

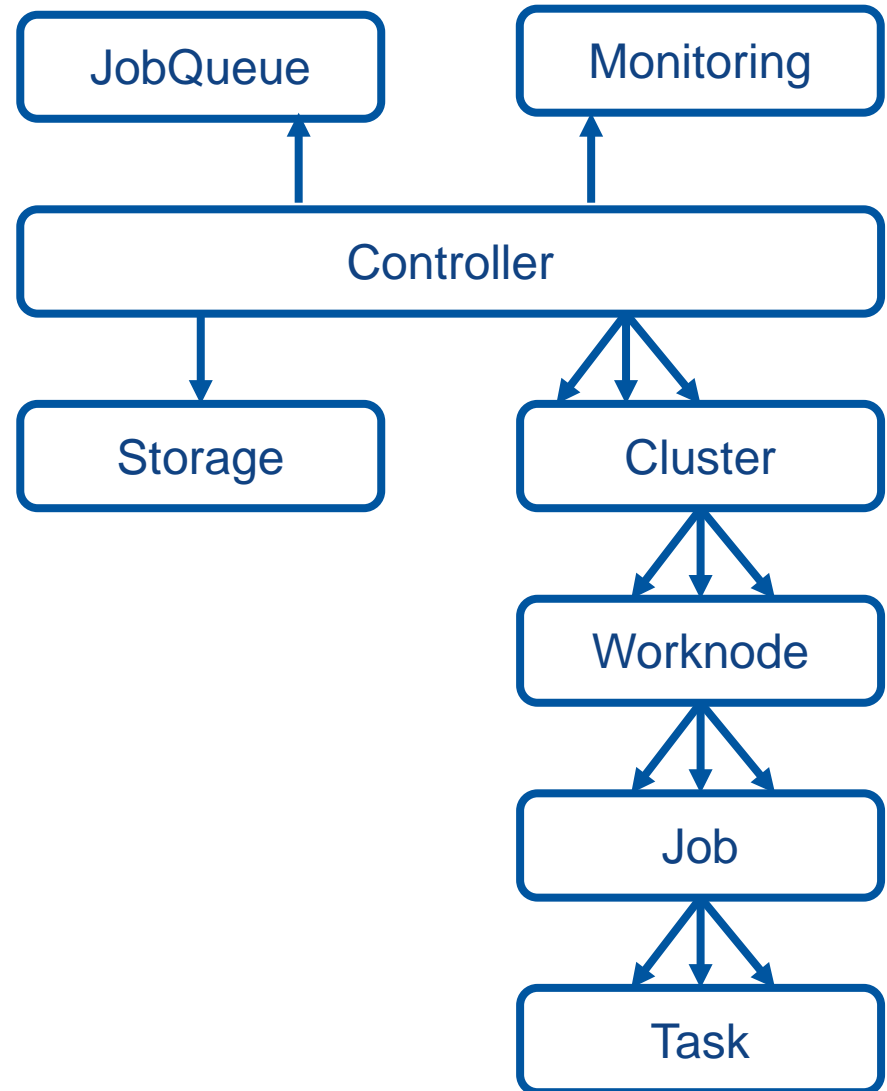
- If we have **20** computing worknodes, **40** cores available on each worknode.
- If **100 MB/s** maximum disk writing speed on each worknode.
- If new **40 GB** RAW file appears every **90** seconds. 105000 events in each RAW file.
- If each event processing time is 0.5 sec – one file processing will last for **14.5** hours.

Simulation is a solution

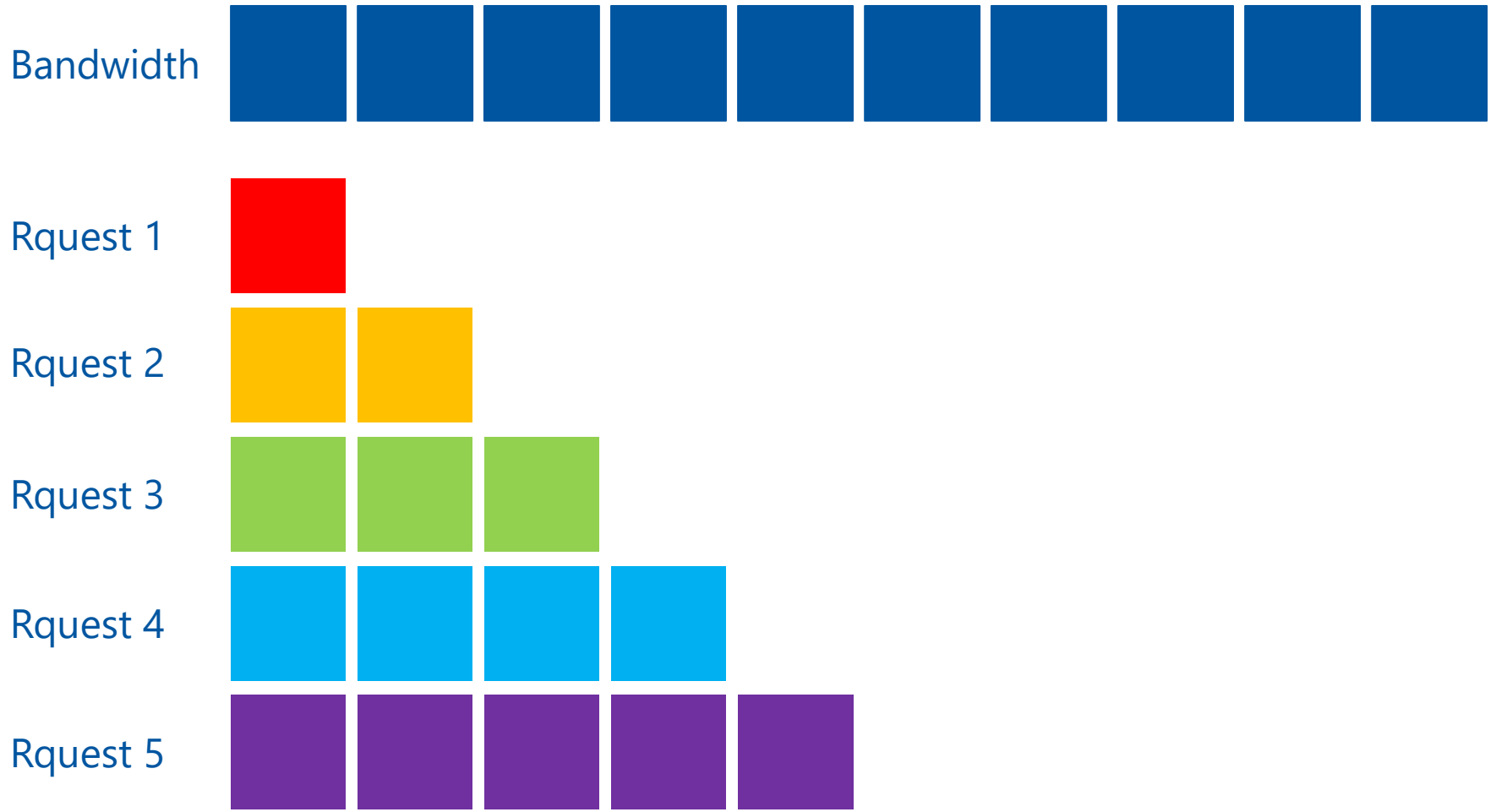


Simulation system

- Written in python to predict CPU, RAM, network and disk load
- Uses data about performance of resources integrated in DIRAC
- It is used to check the behavior of DIRAC jobs in real infrastructure.
- Simulation is done every second, but period may be increased for speeding up simulation.
- InfluxDB is used for results storage and visualization



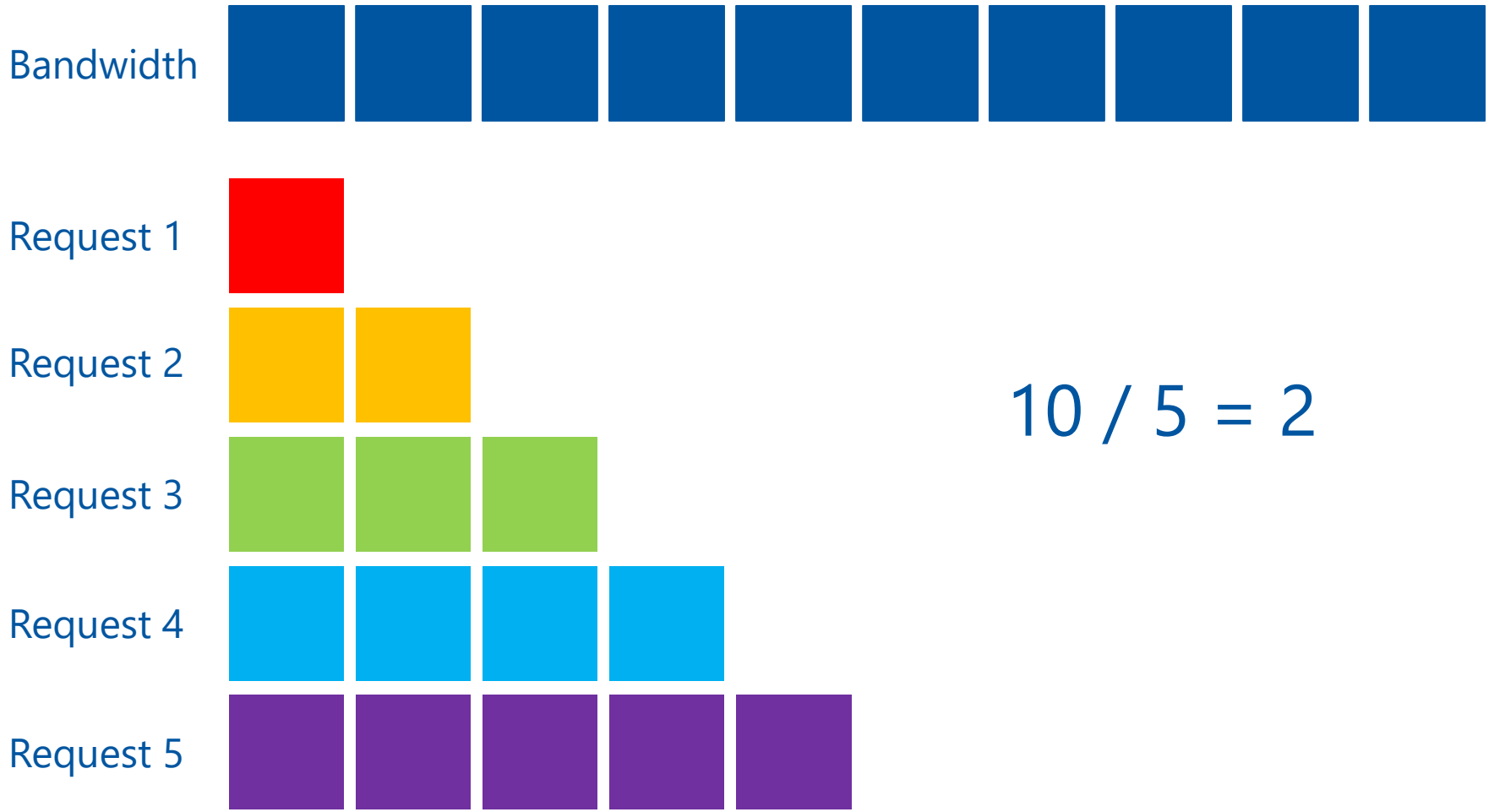
Most important part transfer simulation



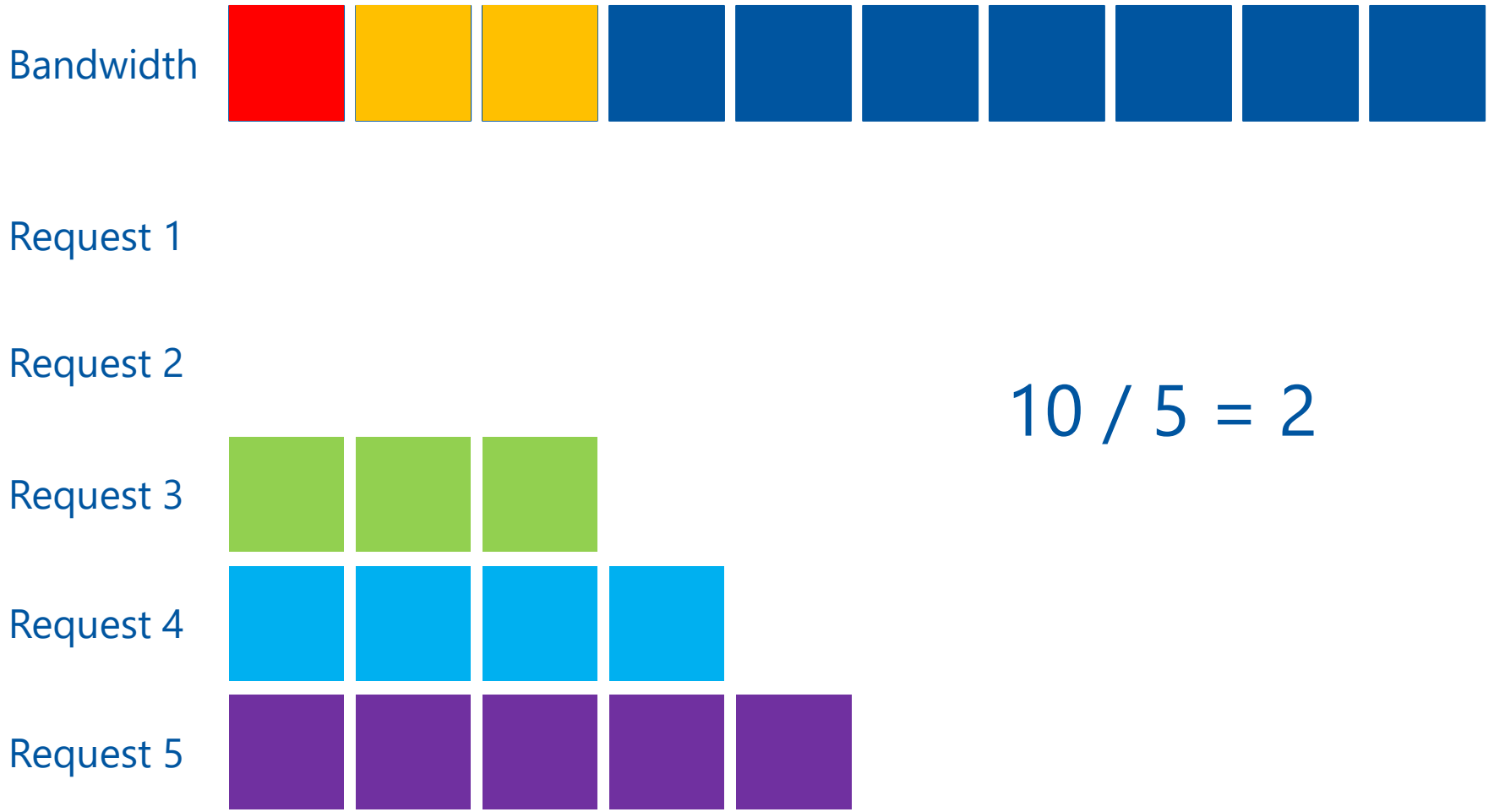
Simple approach



Used approach



Try to apply share



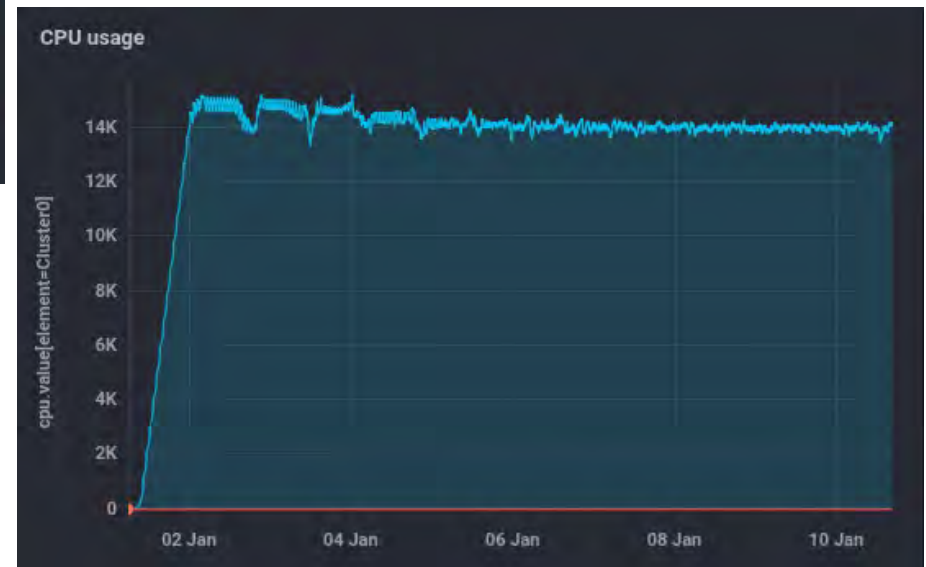
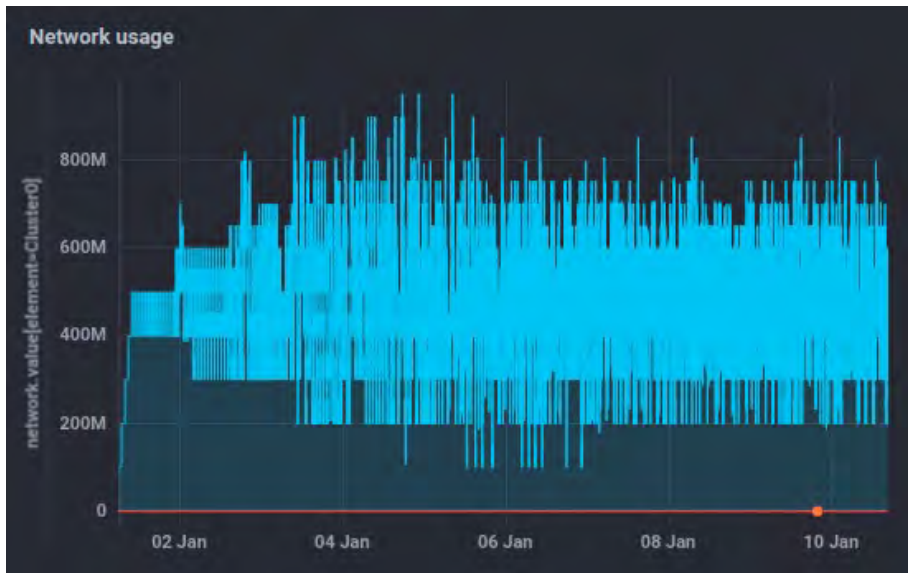
Recalculate share



Apply share

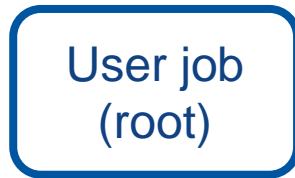


Simulation results

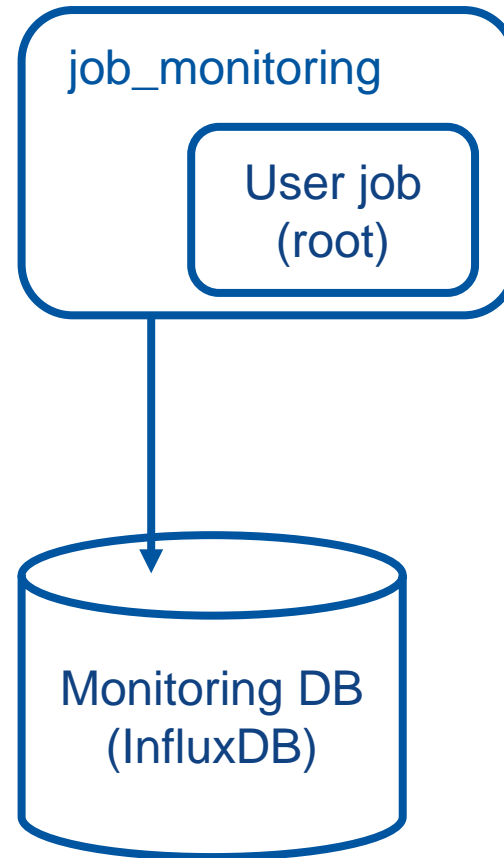


User job monitoring

```
$ root macro.c(input)
```

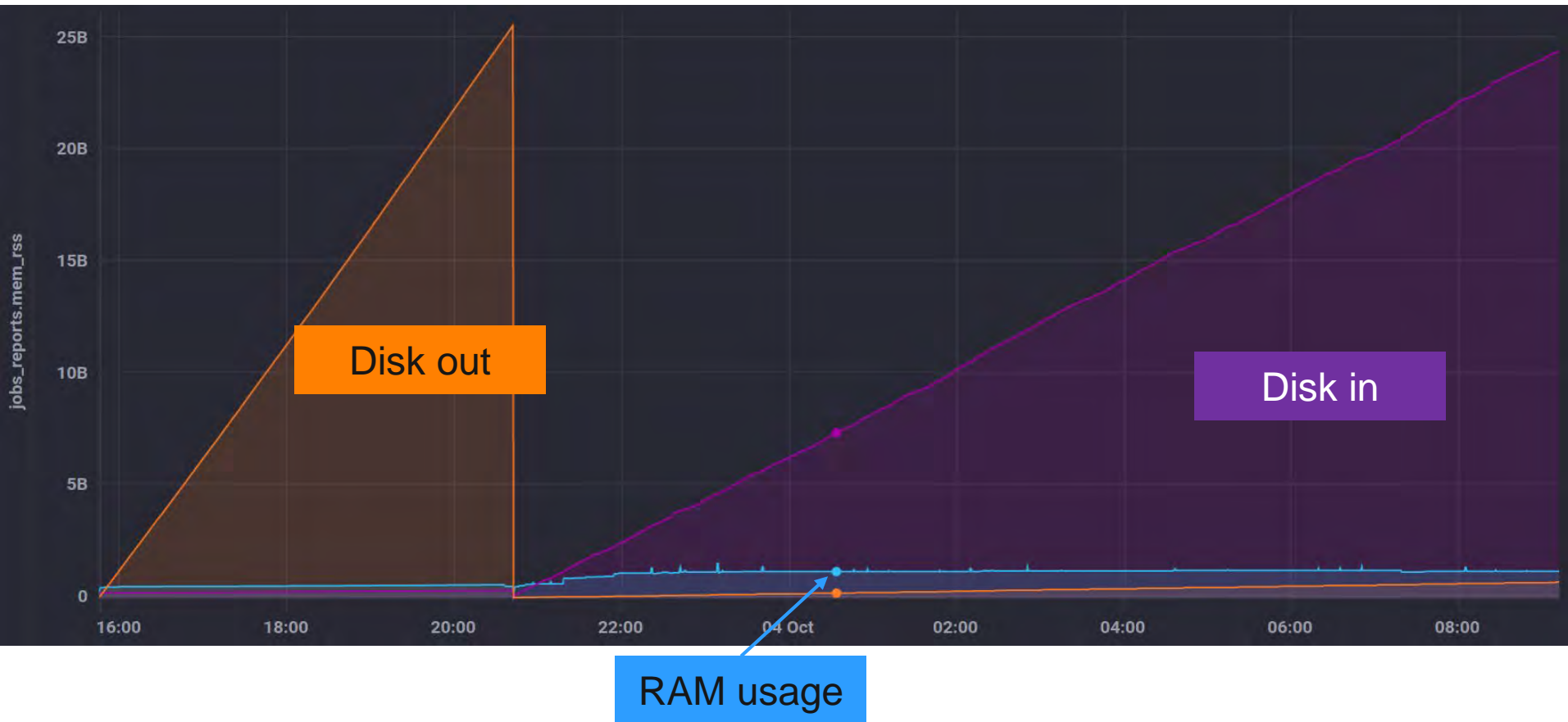


```
$ job_monitoring root macro.c(input)
```



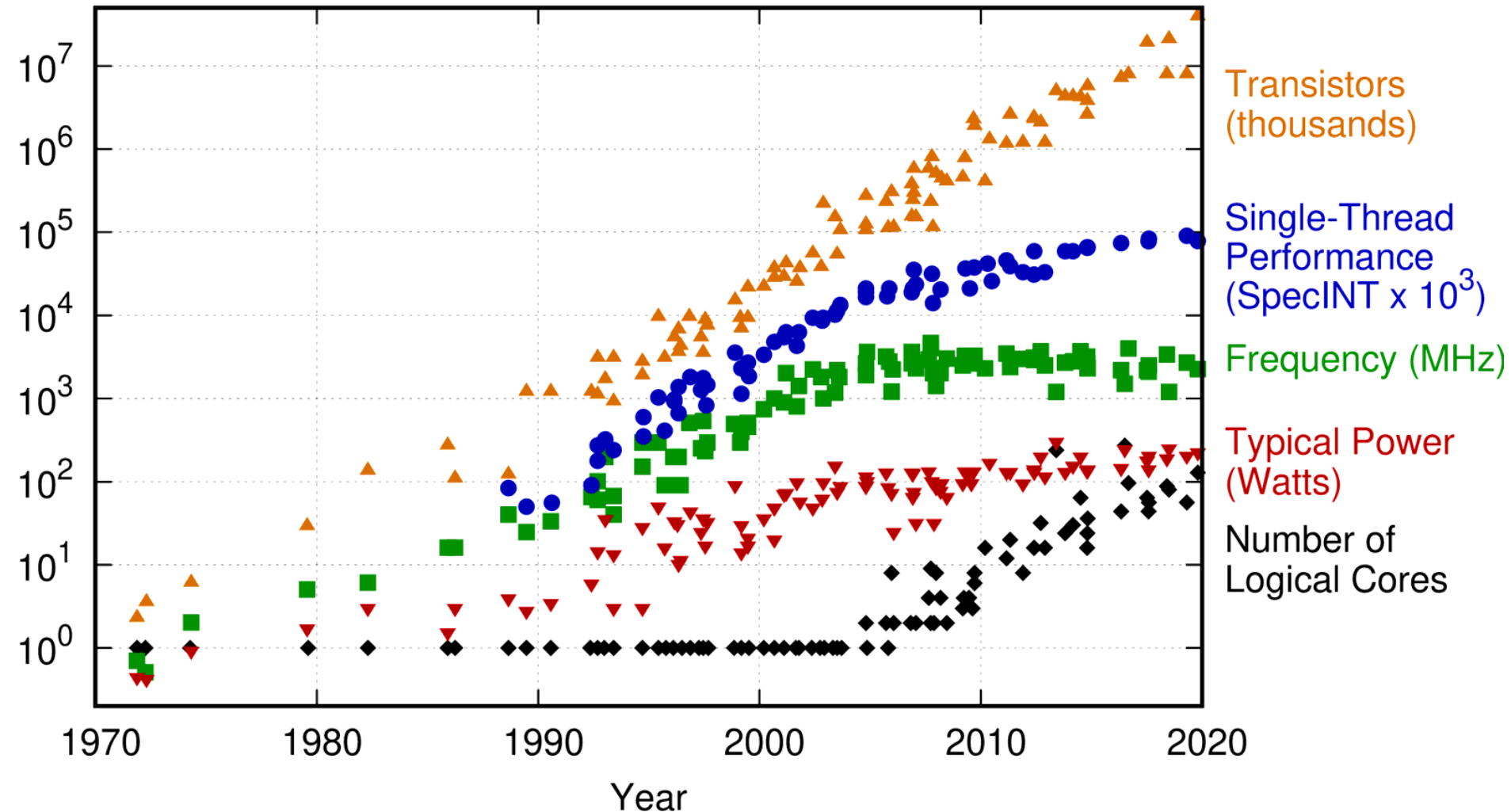
User job monitoring

GenToDst job on Govorun



Why do we do all that?

48 Years of Microprocessor Trend Data



Original data up to the year 2010 collected and plotted by M. Horowitz, F. Labonte, O. Shacham, K. Olukotun, L. Hammond, and C. Batten
New plot and data collected for 2010-2019 by K. Rupp

What to do with that



Go Parallel

HPC, Supercomputers

Go Distributed

Grid,
clusters

Go Effective

New algorithms,
machine learning

List of participants

DIRAC: Igor Pelevanyk, Andrey Tsaregorodtzev

Baikal-GVD: Dmitry Zaborov

BM@N: Konstantin Gertsenberger, Dmitry Tsvetkov

MPD: Oleg Rogachevskiy, Andrey Moshkin

SPD: Alexey Zhemchugov, Katherin Shtejer

Responsible for resources:

Govorun: Dmitry Podgainy, Dmitry Belyakov, Maxim Zuev

LHEP cluster: Boris Schinov

Tier-1, Tier-2, EOS: Valery Mitsyn

Cloud: Nikolay Kutovskiy, Nikita Balashov

dCache: Vladimir Trofimov

Detailed articles

1. Gergel, V., V. Korenkov, I. Pelevanyuk, M. Sapunov, A. Tsaregorodtsev, and P. Zrellov. 2017. **Hybrid Distributed Computing Service Based on the DIRAC Interware**.
2. Korenkov, V., Pelevanyuk, I. & Tsaregorodtsev, A. 2019, "**Dirac system as a mediator between hybrid resources and data intensive domains**", CEUR Workshop Proceedings, pp. 73.
3. Balashov, N.A., Kuchumov, R.I., Kutovskiy, N.A., Pelevanyuk, I.S., Petrunin, V.N. & Tsaregorodtsev, A.Y. 2019, "**Cloud integration within the DIRAC Interware**", CEUR Workshop Proceedings, pp. 256.
4. Korenkov, V., Pelevanyuk, I. & Tsaregorodtsev, A. 2020, **Integration of the JINR hybrid computing resources with the DIRAC interware for data intensive applications**.
5. Kutovskiy, N., Mitsyn, V., Moshkin, A., Pelevanyuk, I., Podgayny, D., Rogachevsky, O., Shchinov, B., Trofimov, V. & Tsaregorodtsev, A. 2021, "**Integration of Distributed Heterogeneous Computing Resources for the MPD Experiment with DIRAC Interware**", Physics of Particles and Nuclei, vol. 52, no. 4, pp. 835-841.
6. Pelevanyuk, I., "**Performance evaluation of computing resources with DIRAC interware**", AIP Conference Proceedings 2377, 040006 (2021)

