

# Input from Dark Matter Community\*

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HOW Conference

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# Science one slider

PHYSICAL REVIEW D

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## Detectability of certain dark-matter candidates

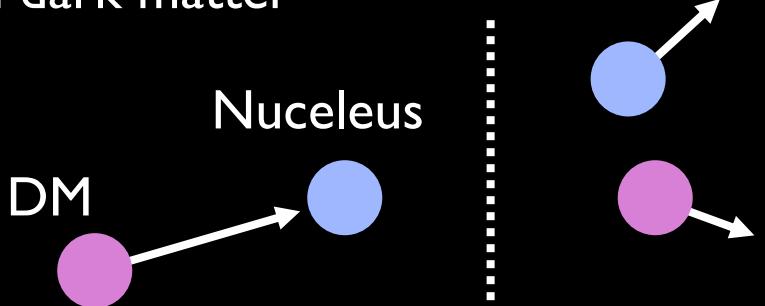
Mark W. Goodman and Edward Witten

*Joseph Henry Laboratories, Princeton University, Princeton, New Jersey 08544*

(Received 7 January 1985)

We consider the possibility that the neutral-current neutrino detector recently proposed by Drukier and Stodolsky could be used to detect some possible candidates for the dark matter in galactic halos. This may be feasible if the galactic halos are made of particles with coherent weak interactions and masses  $1-10^6$  GeV; particles with spin-dependent interactions of typical weak strength and masses  $1-10^2$  GeV; or strongly interacting particles of masses  $1-10^{13}$  GeV.

Theory:  
Elastic scattering of galactic-bound dark matter



Experiment:  
Detect faint fast keV\* signal  
in tonne-scale background-free cryogenic experiment

\*keV not a typo!



# Question:

Dark Matter experimentally diverse, so:

- What does each do?
- What are challenges?
- Commonalities within Dark Matter, HEP, industry?
- What ‘inputs’ do we have?

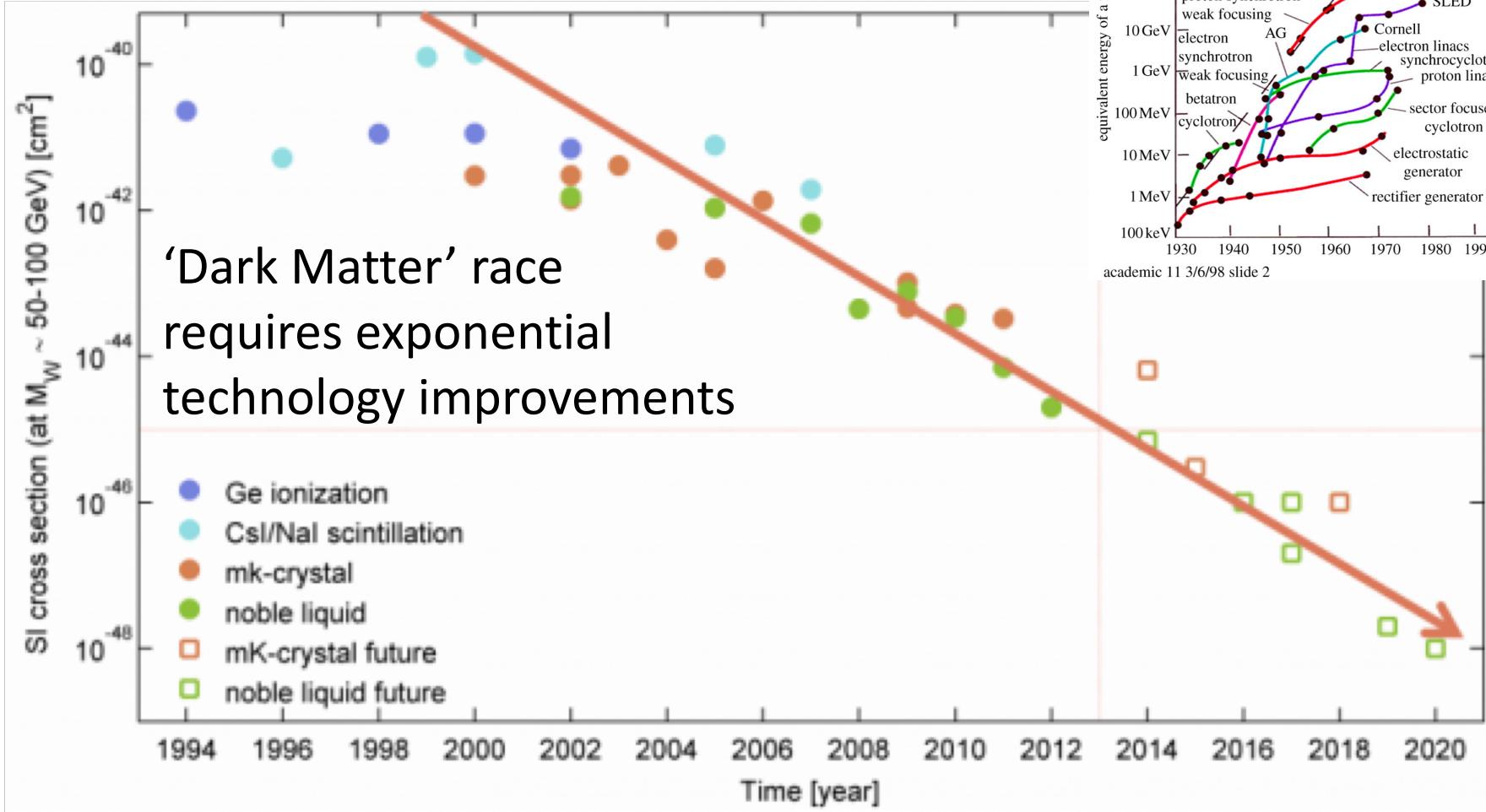
# Methodology:

- First (?) review of field’s *cyberinfrastructure*
- Approach leading experiments using similar tech\*  
DarkSide, PandaX, LZ, nEXO<sup>^</sup>, XENONnT
- Determine what each experiment does and challenges
  - Determine where synergies exist (if any) to communicate here

<sup>^</sup> nEXO is a neutrinoless double-beta decay experiment, but uses very similar technology to PandaX/LZ/XENONnT

\* Subjective; SuperCDMS technically much different than noble TPCs despite pushing 1-10 GeV WIMP sensitivity..

# Dark Matter's Livingston Plot



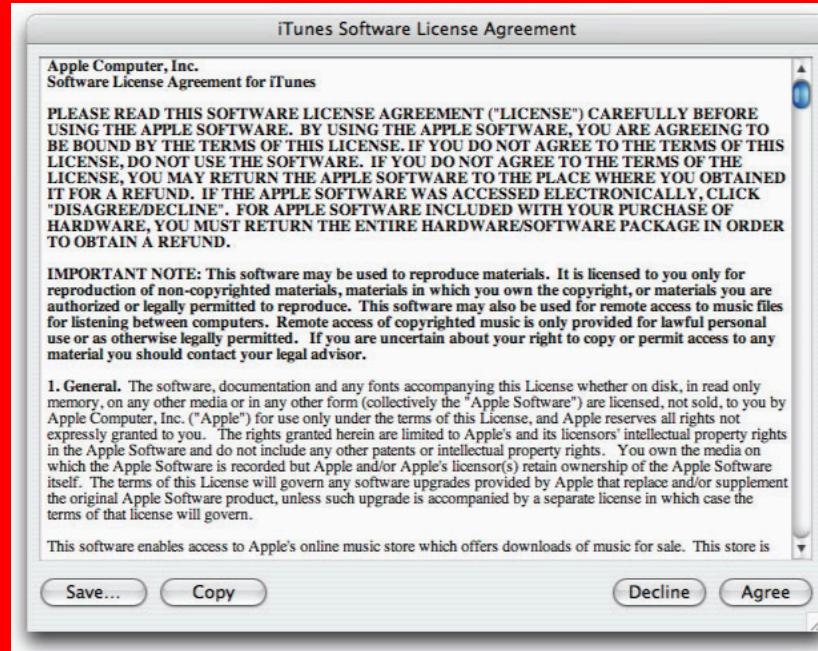
Credit Laura Baudis who updated a figure from her Dark Matter review

# Terms and Conditions

# Disclaimer

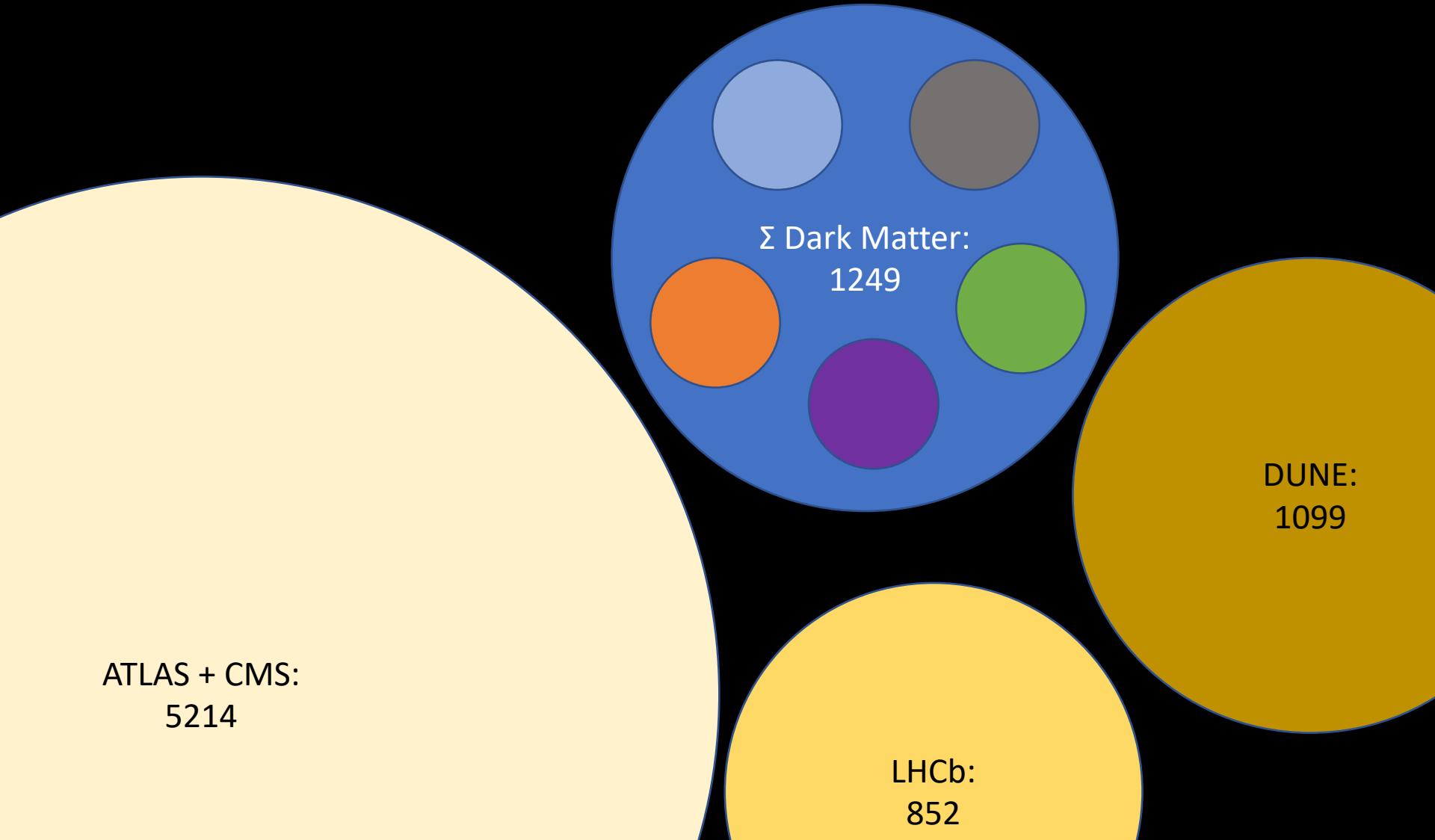
Views are my own.

The information contained within is an incomplete survey of the field. The presentation purpose is to communicate the current state of the field, though this is subjective. The bias of the author may unintentionally be present. For official information from the collaboration, please follow the links within this talk or contact the collaborations directly. Using this talk as a reference is unwise as I have selective hearing. By going further, the audience member agrees to not make the various experiments regret talking to the speaker.



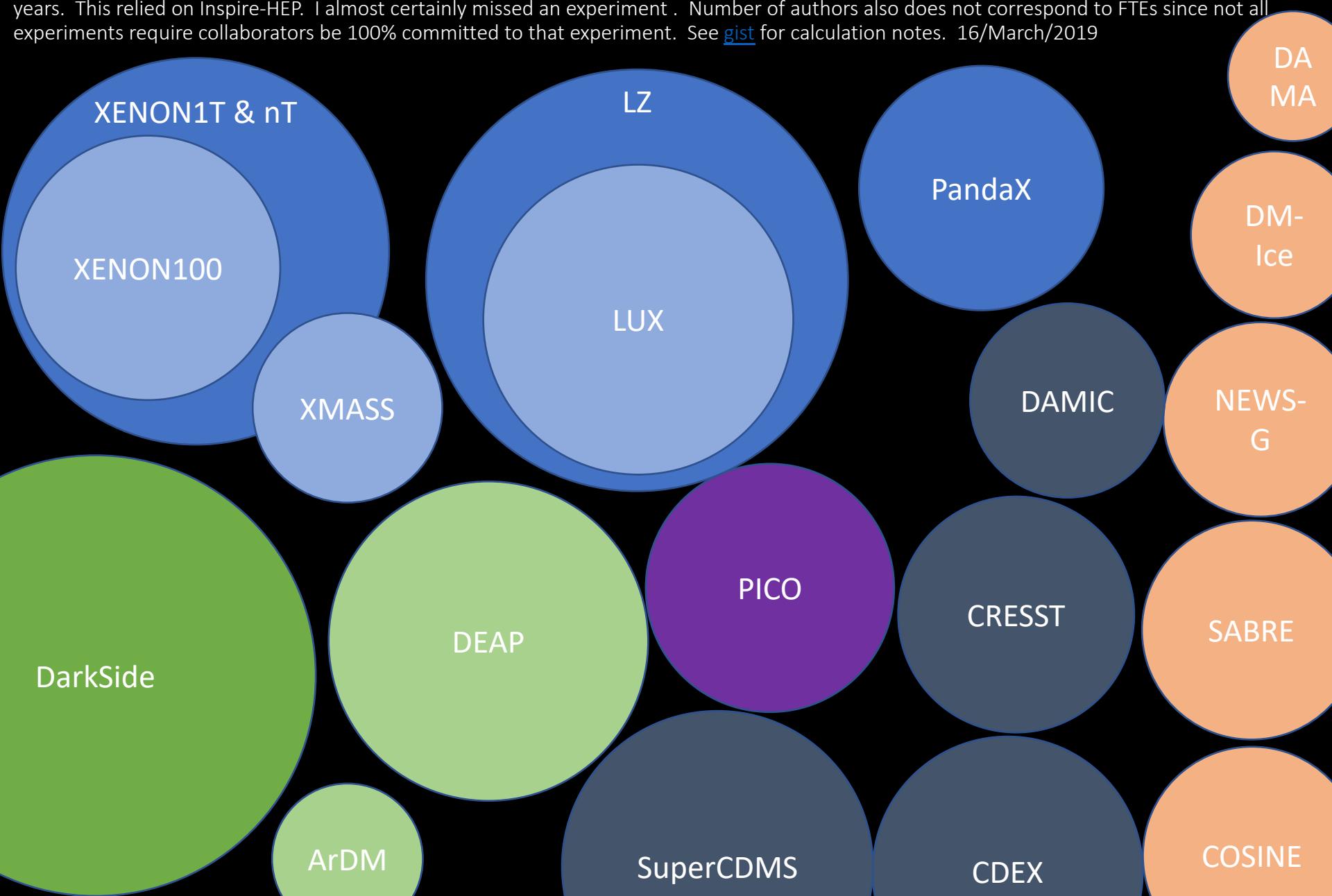
# Dark Matter Detection community big

Area corresponds to number of people based on most recent publication from any experiment that has published scientific papers in the last two years. This relied on Inspire-HEP. I almost certainly missed an experiment . Number of authors also does not correspond to FTEs since not all experiments require collaborators be 100% committed to that experiment. See [gist](#) for calculation notes. 16/March/2019



# But 1249 Dark Matter users spread out

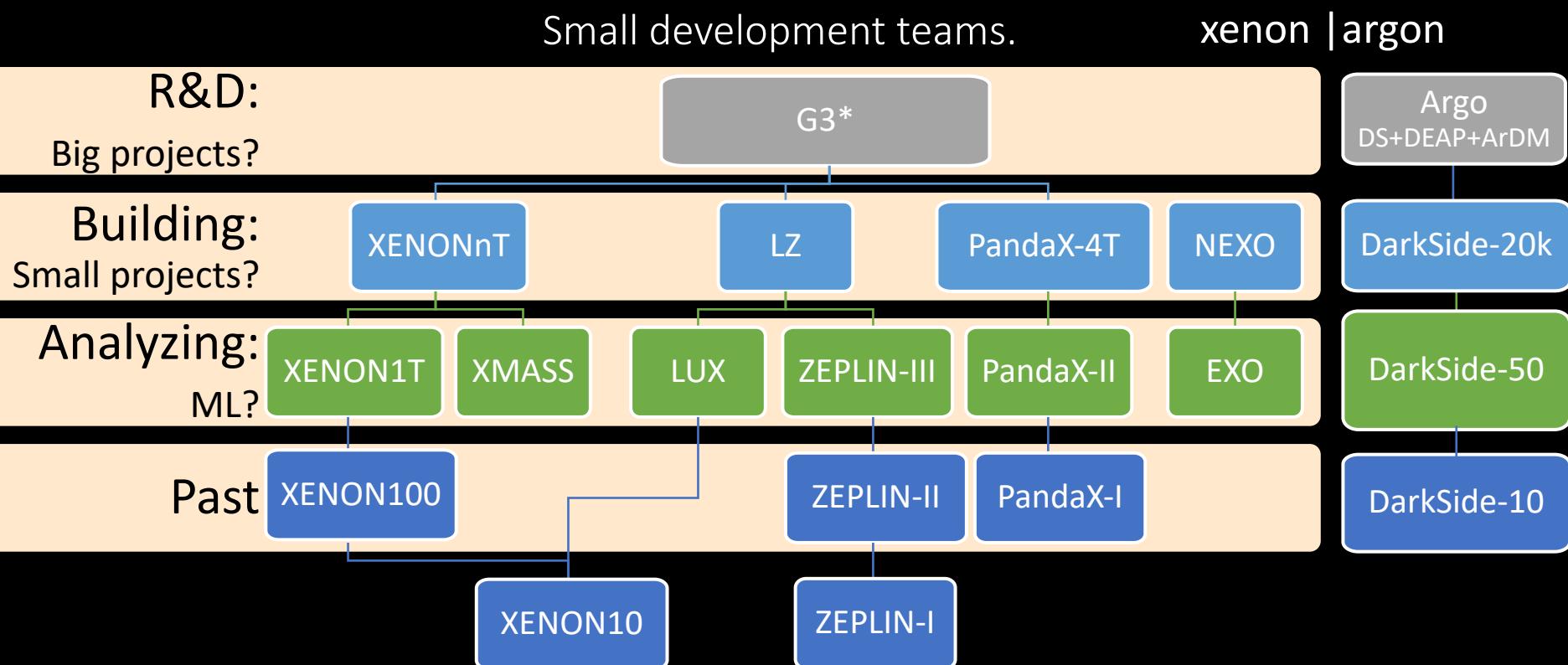
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# DM Experimental statuses... stati?

Dark Matter experiments are HEP-like: O(PB) raw data, analysts often work on reduced data, groups of analysts often work O(year) on publications.

Many phases of experiment and opportunities for collaboration, prototyping, and support by wider particle-physics software community.



\*There are concrete proposals for what “G3” would look like. This is on the European roadmap as “[Darwin](#)”. Young faculty from the US XENON, LZ, nEXO groups are exploring R&D avenues. The Chinese have plans too in their nice new underground lab. The physics and R&D are clear, if the politics of it are still to converge.

# Experimental details

## References used

Preliminary, subjective, not built.  
Missing info means didn't discuss yet

XENONnT

Data distribution [talk link](#)

Software Github [1T nT Ax](#)

Non-analysis open source

LZ

TDR [arXiv:1703.09144](#)

PandaX

MC [talk link](#)

Data model [talk link](#)

Software [Github](#)

DarkSide

[arXiv:1707.08145](#)

EXO

Machine learning [following](#)

# Experimental details

## Data handling

Preliminary, subjective, not built.  
Missing info means didn't discuss yet

### XENONnT

- PBs
- Highly distributed, ~10 sites
  - Distributed difficult... computing
  - Rucio and OSG
  - Gardner UChicago group provides *substantial* support incl. B. Riedel

### LZ

- PBs
- SURF->NERSC->UKDC
  - Limited sites simplifies things
  - *Subjective: DOE labs must make this easier? Same story with nEXO.*

### PandaX-II

- 100s TB
- JinPing->SJTU
  - Limited sites simplifies things
  - Ships AWS snowball style it sounds

### DarkSide

- **10s of PB**
- (See next slide)

### EXO

- 10s TB
- Easy and great SLAC support
  - Bigger challenge getting lots of MC from NERSC

# Experimental details

## Software

Preliminary, subjective, not built.  
Missing info means didn't discuss yet

### XENONnT

- In-house Python (much faster than C++ :P)
  - agile paradigm, evangelically open source, MongoDB
  - 500 MB/s trigger, processor/analysis
  - numba e.g. strax
- Advertisement: I view our software as R&D / research in own right, is their grant \$\$\$?

### LZ

- Gaudi
  - Only software engineer fulltime this
  - @you: more framework support for small experiments?
- NERSC: Difficult small experiments adapt to multithread or new CPU/GPU architectures

### PandaX

- In-house C++, low bus factor
- Live processing with JS monitoring
- MongoDB
- Subjective: seem to do neat things, though limited details.
- Seem interested in openness and collaborating (maybe through HSF?)

### DarkSide

- ART and DIRAC
- Main focus is on software trigger development (argon detectors huge!)
- User management difficult for the NSF experiments (incl. XENON)
  - *Where is David Groep (Nikhef) at this meeting?*

### EXO

- Sniper and great SLAC support

# Experimental details

## Simulations

Preliminary, subjective, not built.  
Missing info means didn't discuss yet

XENONnT

PandaX

DarkSide

Everybody uses geant4... but even if this (or  
any other) code we make was open source,  
different frameworks would make it of limited  
copy-paste value.

LZ

EXO

# Experimental details

## Machine learning

Preliminary, subjective, not built.  
Missing info means didn't discuss yet

### XENONnT

- Used but only published in masters theses

### LZ

- Used extensively in LUX, starting in LZ

### PandaX

- CNNs [article](#)

### DarkSide

- Dedicated efforts ramping up

### EXO

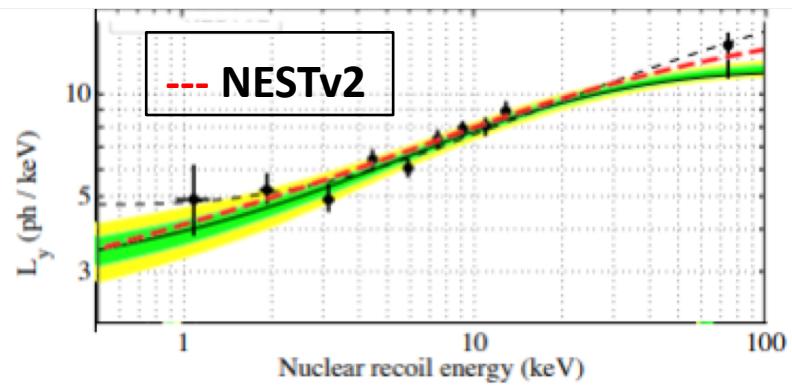
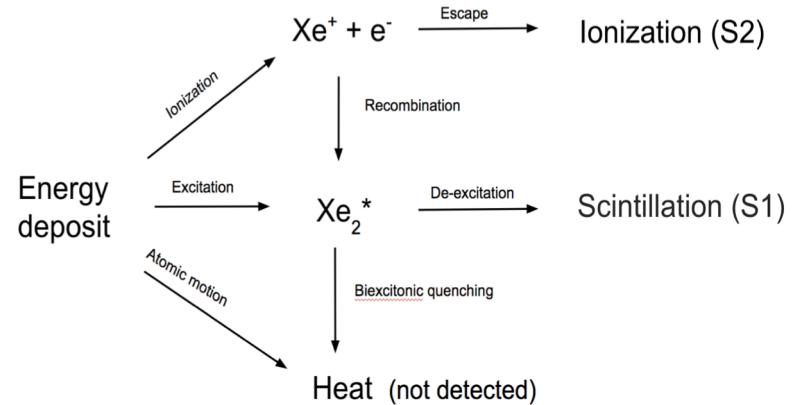
- High energy reconstruction article
- Major challenge:
  - Using Python ML codes starting from ROOT (said see uproot)

# NEST example of successful intercollaboration software



- NEST simulates interactions of particles with xenon and argon atoms
  - Members from LUX, LZ, XENON1T/nT, **DUNE**, nEXO
  - Actively developed with v2.0 recently released
  - Henry Schreiner (IRIS-HEP) helped us develop nestpy
  - **Vital** to field in interpreting our data and designing new experiments
  - **Challenge:** for years NEST unfunded\* which complicates support/usability experiments, meaning experimental FTEs often wasted reinventing wheel then making subtle microphysics mistake
- Are there other such niches? That we can get support for? So we can focus on detector-specific software?
  - Statistics? (astrophysics, form factors, flux, publish likelihoods)
  - Signal processing and templating?
  - Software triggers?
  - HEP-Python challenge with ML?
  - Simulations?
  - ?

## Signal production in xenon



\*SciDAC fail, OAC pending

# First Computational Dark Matter Direct Detection Workshop?

- Other subareas of our field have dedicated workshops
  - TPC design
  - PMTs
  - Calibration
  - Statistics
- Most students and postdocs code, but never discussed
- Limited communication on software, computing, machine learning
  - ‘HEP’ name discouraging?
- Broad interest in initiating a workshop
  - Communicate to improve all experiments without changing balance of power between experiments?
  - Support PhDs/PDs for cybertraining?
  - Unconference?
- Will have first organizational call in coming month with representative of each experiment.
  - Details all TBD by consensus.
  - Interested? Email.

## Summary:

“The Dark Matter community is substantial and could be engaged more by this community for mutual benefit.”

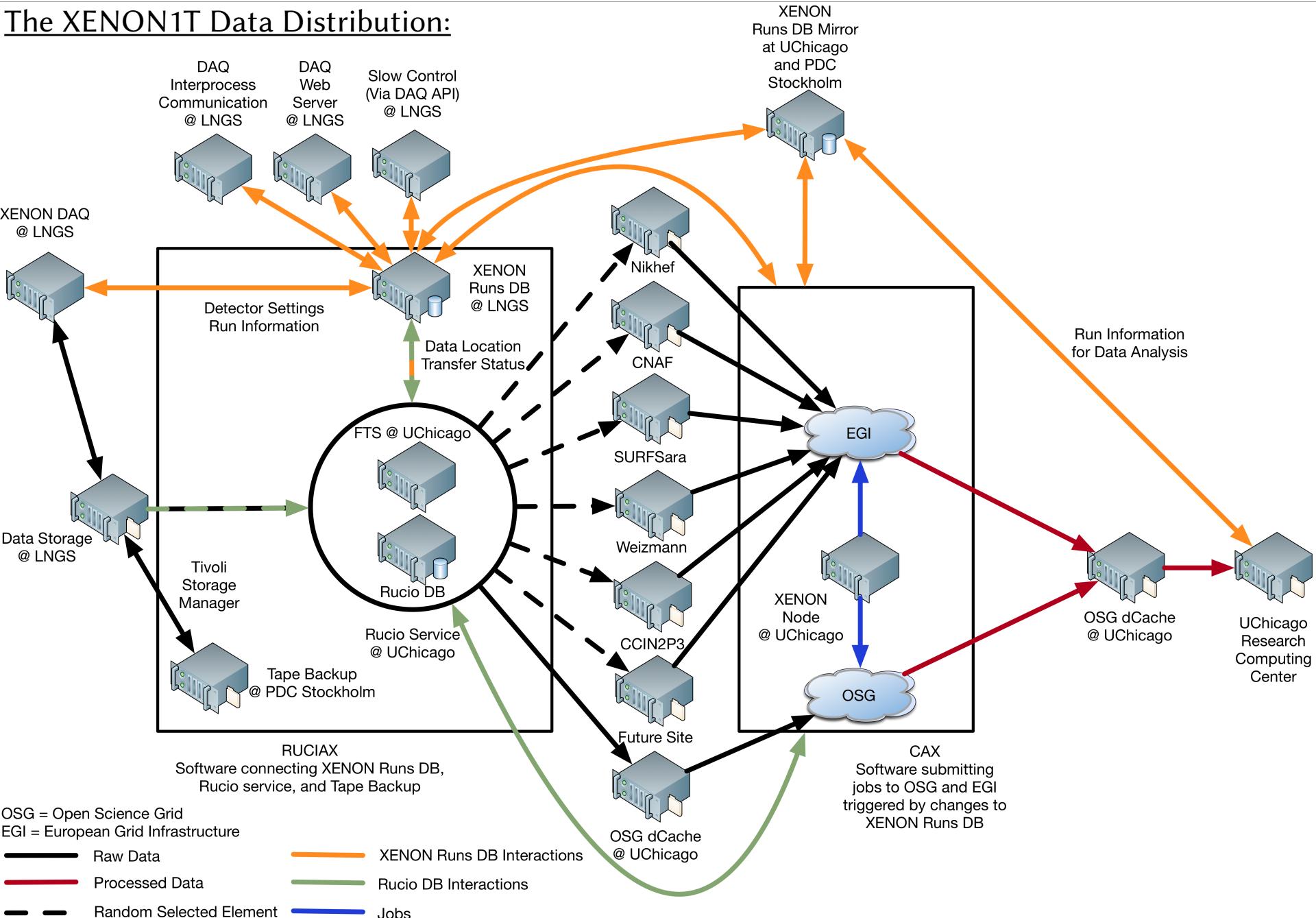
*Looking for Dark Matter job? Can connect you.*

This talk was partially based on long discussions with a half dozen experiments, which only worked due to the openness, support, and significant time of many busy people ranging from spokespeople to research scientists to students. Outside XENON, thanks to those willing to speak Xun Chen, Jianglai Liu, Pengwei Xie, Maria Elena Monzani, Igor Ostrovskiy, Cristiano Galbiati, Emilija Pantic, Andrew Renshaw, Nektarios Benekos, Valerio Ippolito, Marco Rescigno. Within XENON, long chats unrelated to this talk and public talks over years with Rob Gardner, Benedikt Reidel, Boris Bauermeister, Evan Shockley, Jelle Aalbers, and many more. Any misrepresentation is my fault.



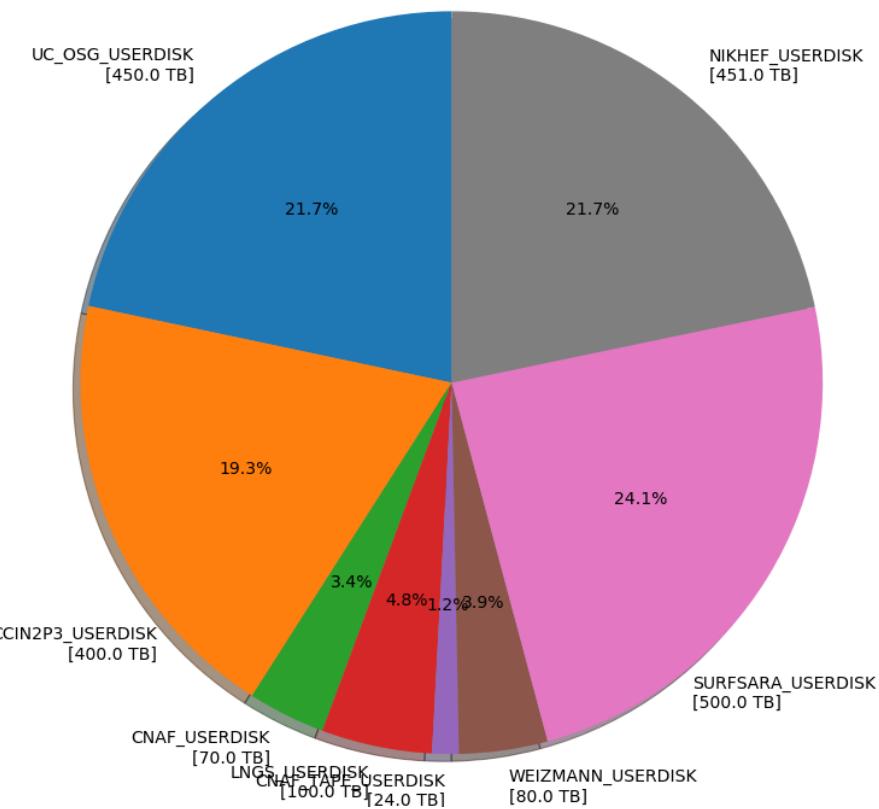
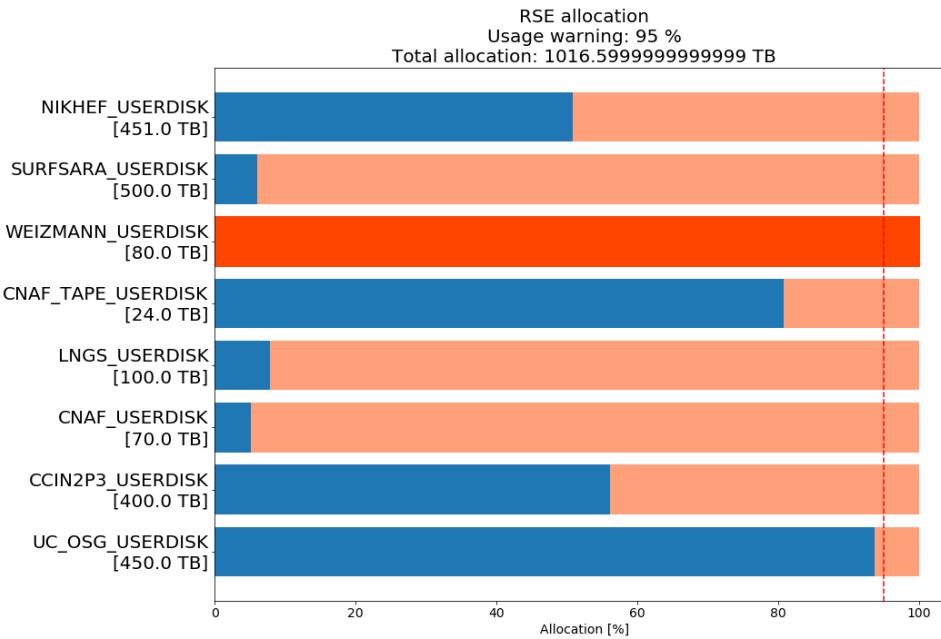
Backup  
slides on  
different  
experiments

# The XENON1T Data Distribution:



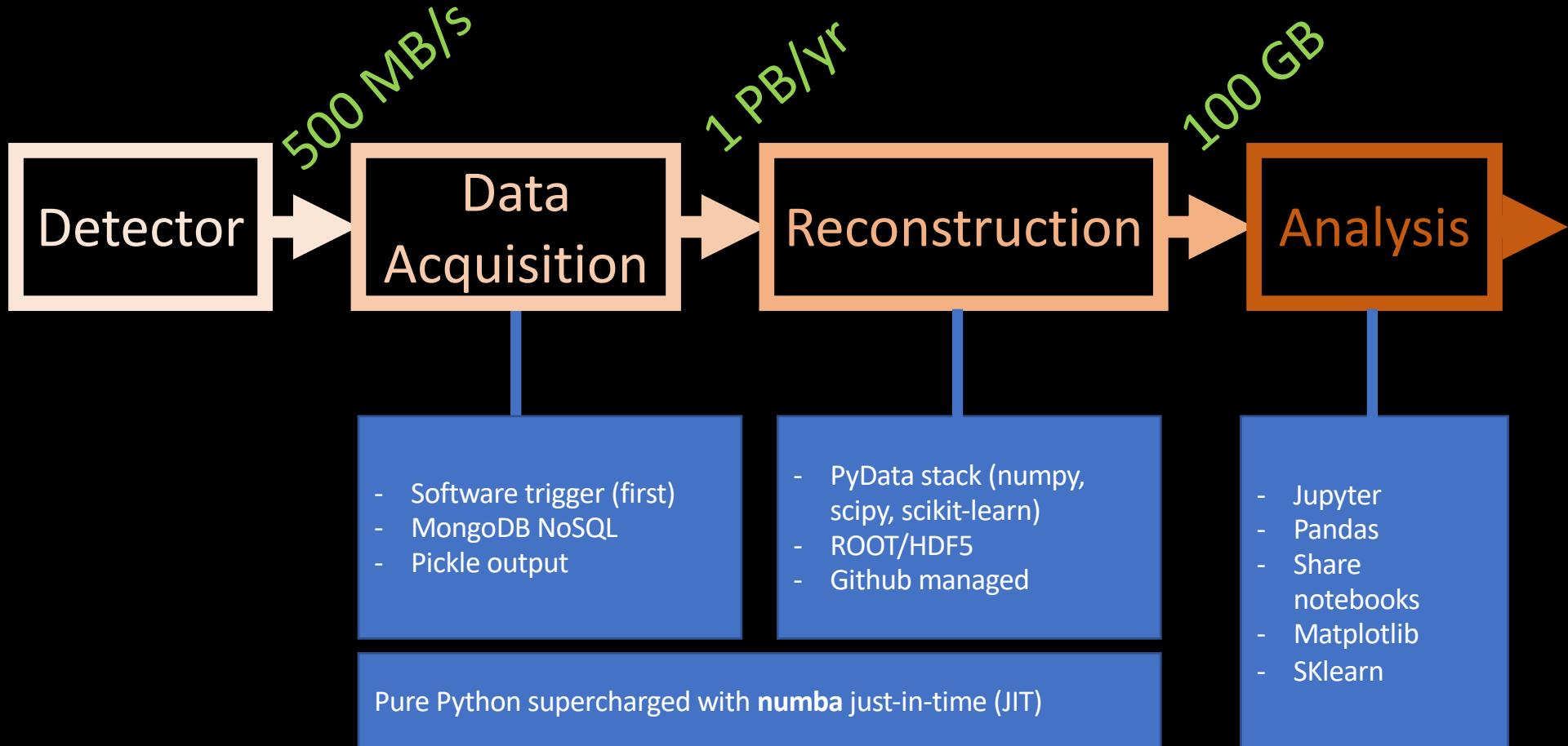
## The XENON1T Disk Allocation and Requirement

- Data have two copies:
  - US: OSG dCache at UChicago (hold only relevant data)
  - Europa: One of several computing centers
- Tape copy in Stockholm Independent from Rucio



- In total: ~2 PB available
- Distributed worldwide
- Connected to computing centers

# Data Flow Essentials



# Numba: Python just-in-time compiler

- Few ‘array-oriented’ compilers though common use case and hardware optimizations exist.
- Wasn’t possible few years ago, **Python faster than your C++ code.**

```
@vectorize
def sinc(x):
    if x==0.0:
        return 1.0
    else:
        return sin(x*pi)/(pi*x)
```

```
1 ; ModuleID = 'sinc_mod_7b29370'
2
3 define double @sinc(double %x) {
4 Entry:
5   %0 = fcmp oeq double %x, 0.000000e+00
6   br i1 %0, label %BLOCK_12, label %BLOCK_16
7
8 BLOCK_12:                                ; preds = %Entry
9   ret double 1.000000e+00
10
11 BLOCK_16:                                ; preds = %Entry
12   %1 = fmul double %x, 0x400921FB54442D18
13   %2 = call double @llvm.sin.f64(double %1)
14   %3 = fmul double %x, 0x400921FB54442D18
15   %4 = fdiv double %2, %3
16   ret double %4
17
18 BLOCK_47:                                ; No predecessors!
19   ret double 0.000000e+00
20 }
21
22 declare double @llvm.sin.f64(double) nounwind readonly
```

# Use in XENONnT: give it a rethink

**Throughput in uncompressed raw data / core**



Pax: 0.3 MB



XENON1T eventbuilder: 3 MB



Strax: 100 MB