

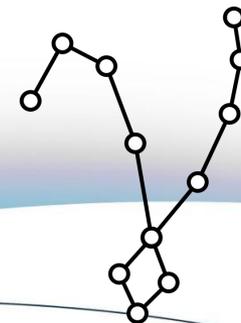


# 3<sup>rd</sup> ASTERICS-OBELICS Workshop

23-25 October 2018, Cambridge, UK.



H2020-Astronomy ESFRI and Research Infrastructure Cluster  
(Grant Agreement number: 653477).

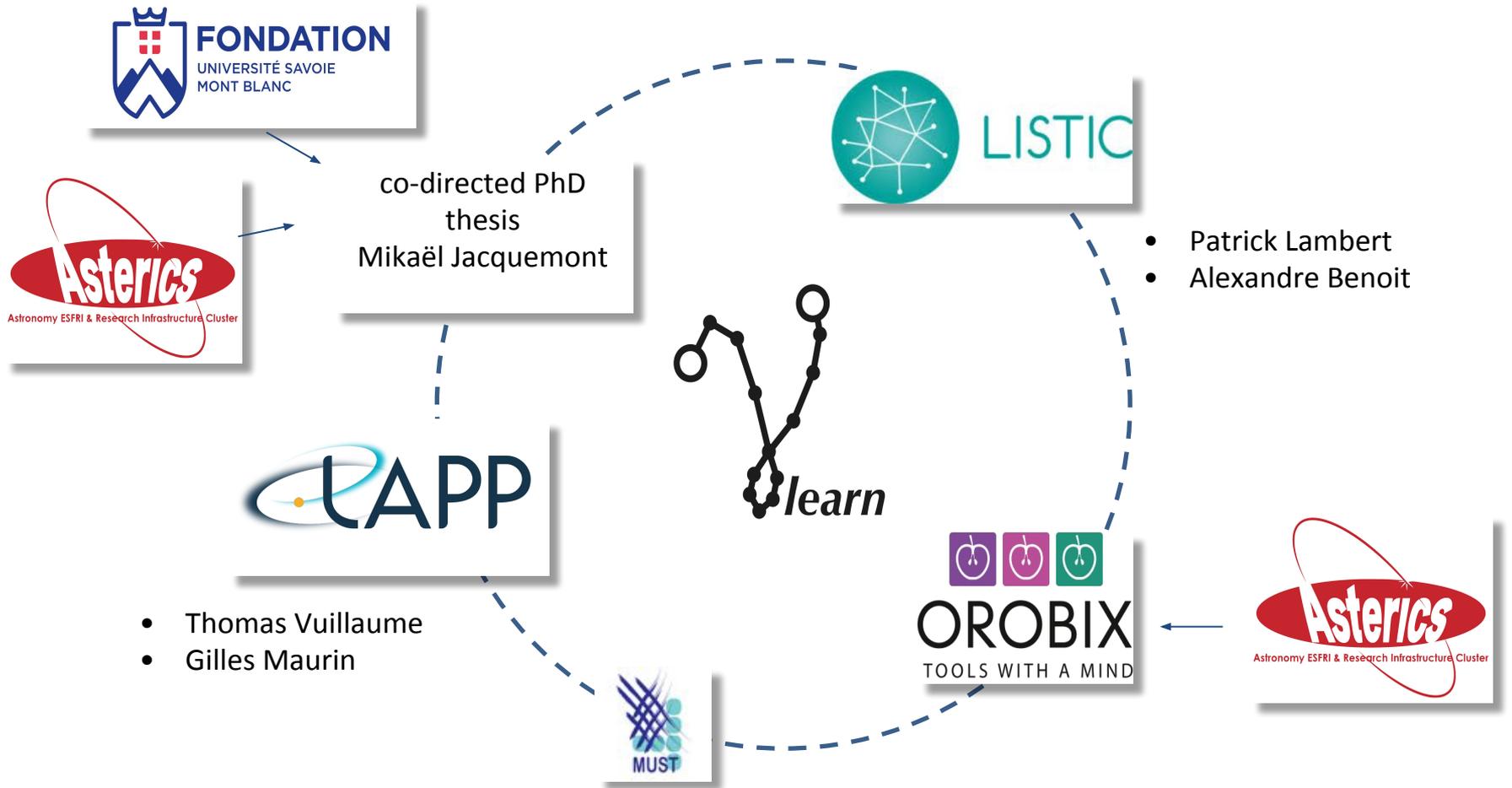


# GammaLearner

## A Deep Learning framework for CTA

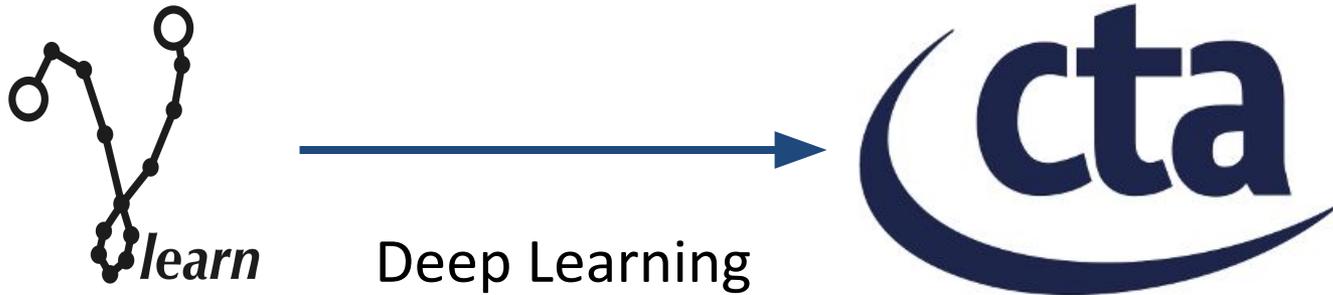
Mikaël Jacquemont\*, Luca Antiga, Thomas  
Vuillaume, Giorgia Silvestri, Alexandre Benoit,  
Patrick Lambert, Gilles Maurin  
**3<sup>rd</sup> ASTERICS-OBELICS Workshop**  
23-25 October 2018, Cambridge, UK.

# The GammaLearn project



\*ASTERICS: european H2020 project

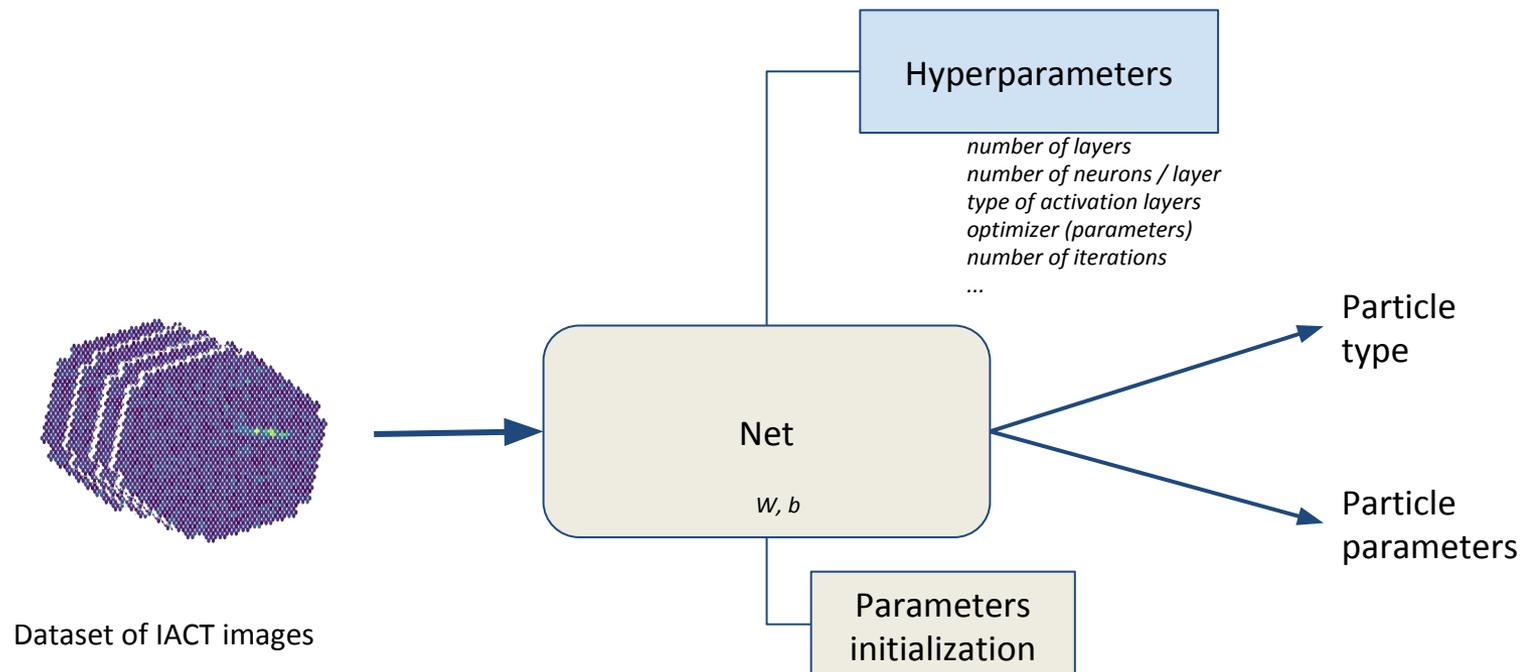
# The GammaLearn Project



# The GammaLearn project

## Challenges

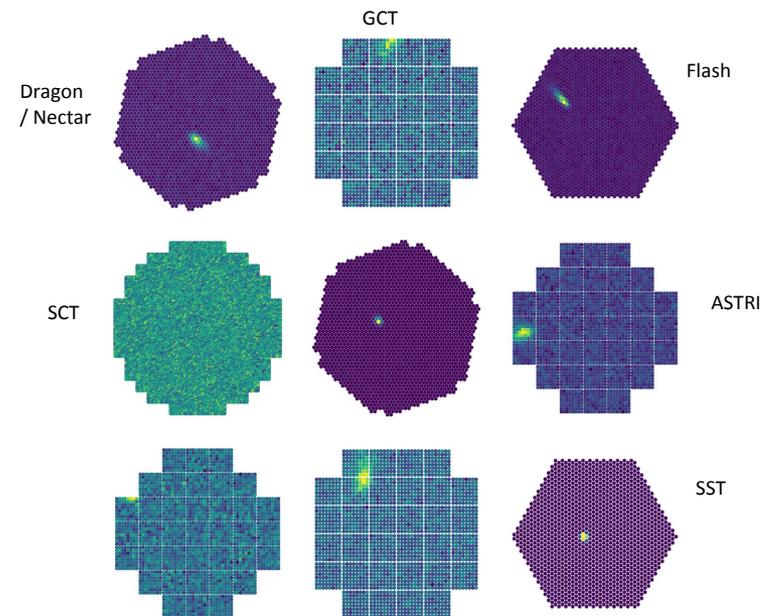
- Deep Learning
  - Iterative process: lots of experiments



# The GammaLearn project

## Challenges

- Deep Learning
  - Iterative process: lots of experiments
- CTA
  - Unconventional images
    - different shapes and resolutions
    - some with **hexagonal lattices**

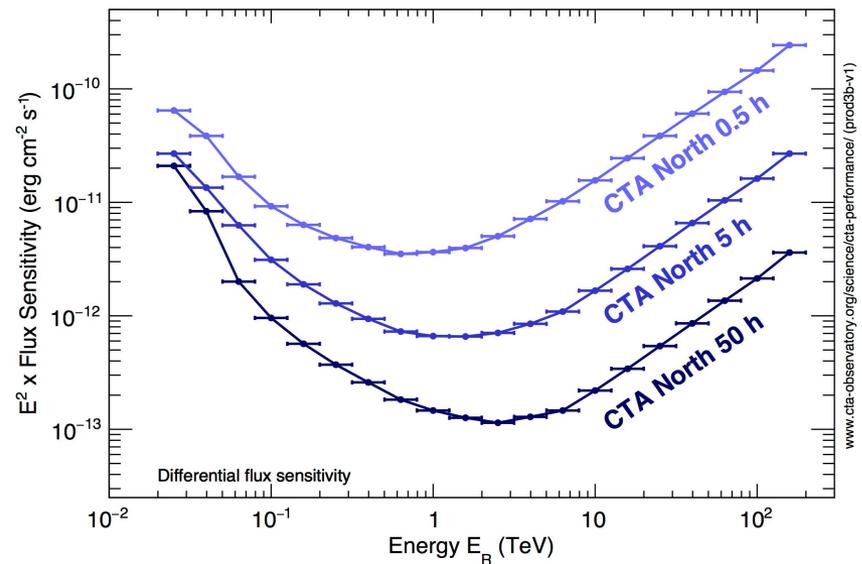
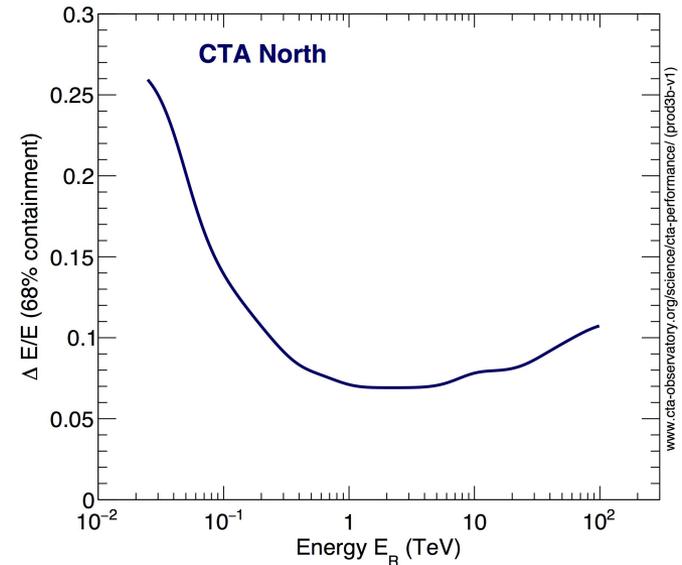


Credits: pschitt! (<https://arxiv.org/abs/1709.04675>)

# The GammaLearn project

## Challenges

- Deep Learning
  - Iterative process: lots of experiments
- CTA
  - Unconventional images
    - different shapes and resolutions
    - some with **hexagonal lattices**
  - Specific metrics
    - Resolution curves
    - Sensitivity curves



# The GammaLearn project

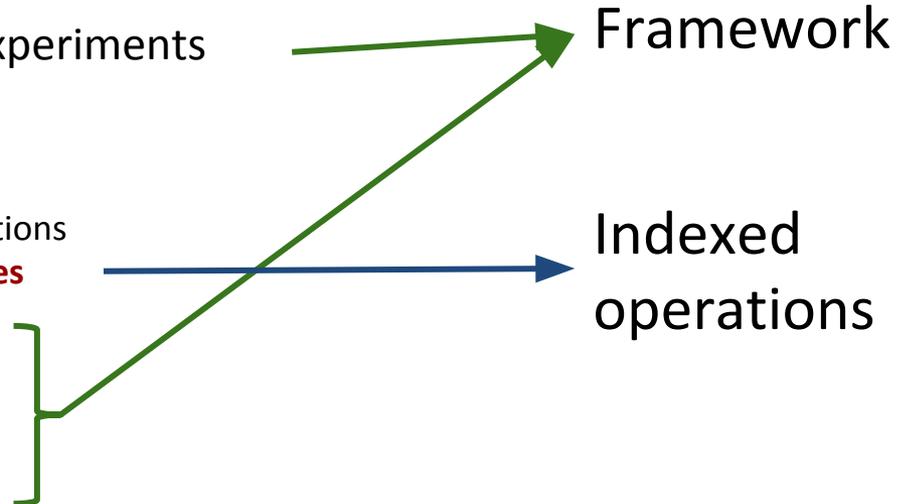
## Challenges

- Deep Learning
  - Iterative process: lots of experiments
- CTA
  - Unconventional images
    - different shapes and resolutions
    - some with **hexagonal lattices**
  - Specific metrics
    - Resolution curves
    - Sensitivity curves
  - Mono and stereo analysis

# The GammaLearn project

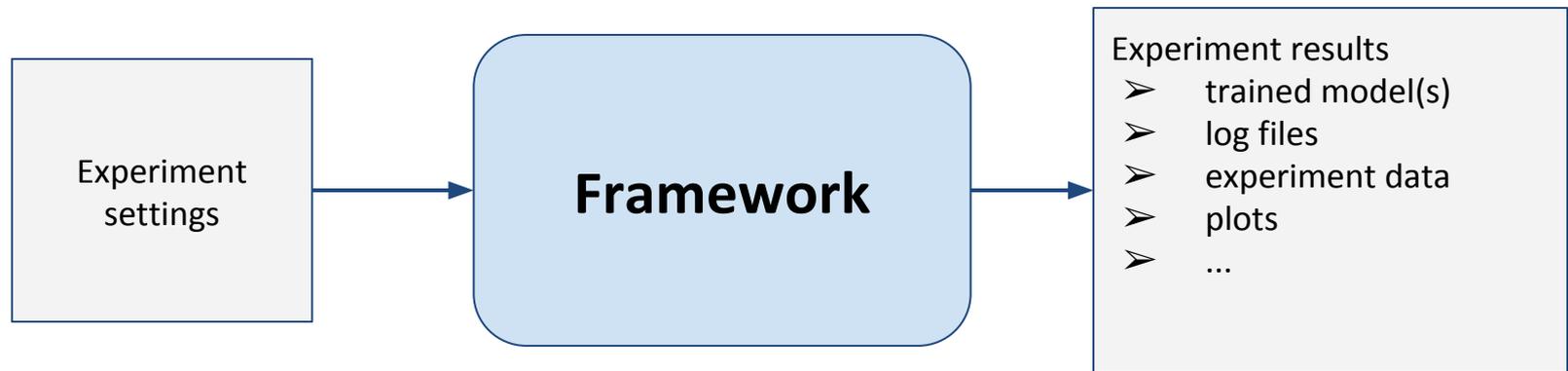
## Challenges

- Deep Learning
  - Iterative process: lots of experiments
- CTA
  - Unconventional images
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    - some with **hexagonal lattices**
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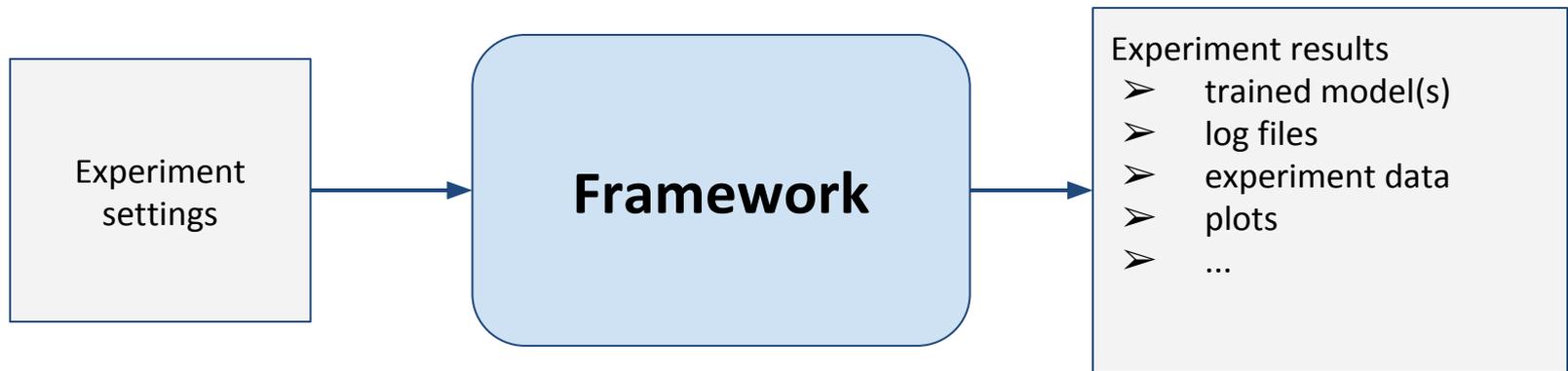
## The GammaLearner framework

- Easing deep learning experiments
- Suitable to computing center



## The GammaLearner framework

- Easing deep learning experiments
- Suitable to computing center

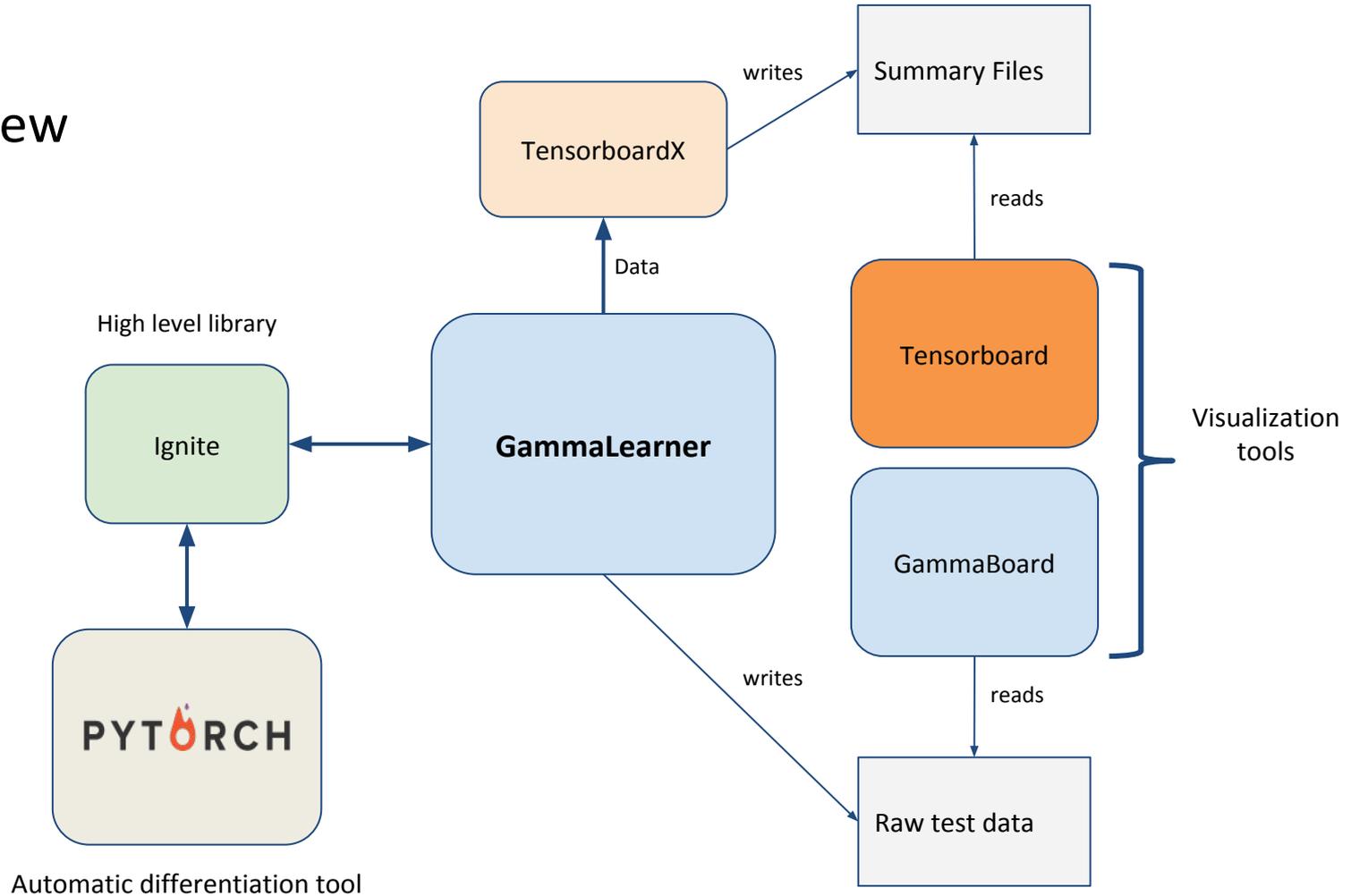


## Philosophy

- Python first
- Lego like components

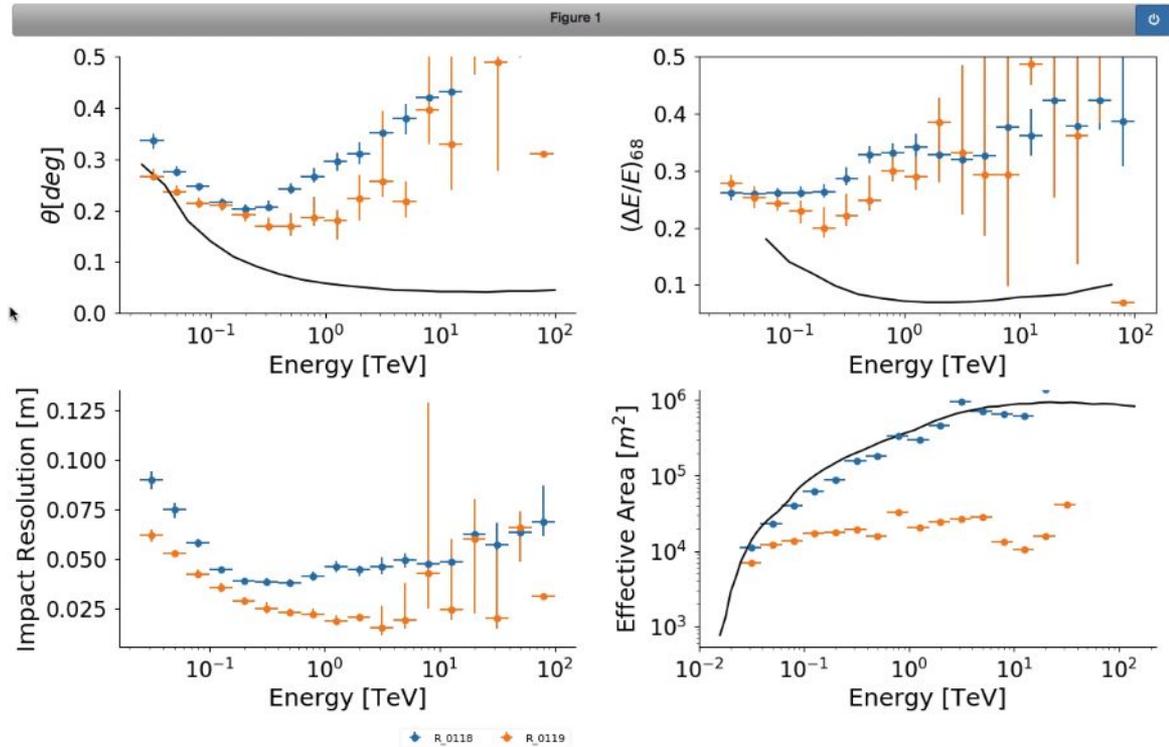
# The GammaLearner framework

## Overview



# The GammaLearner framework

## Gammaboard



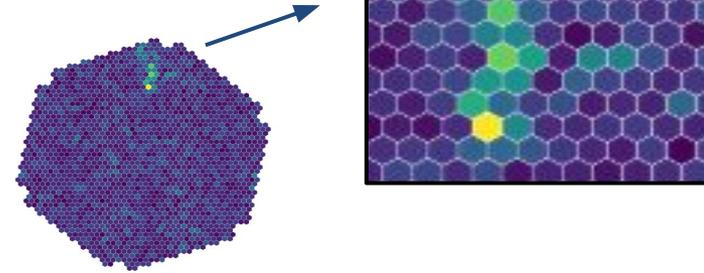
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# Indexed operations

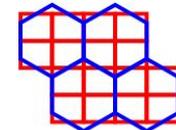
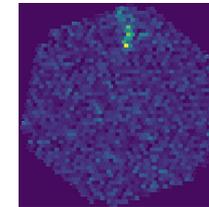
## Processing unconventional images



- Other approaches

- Oversampling

- Pros: straightforward use of DL libraries
    - Cons: more data, possible distortions, pre-processing

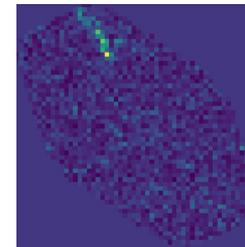


(c) oversampling

Credits: T. Holch et al.

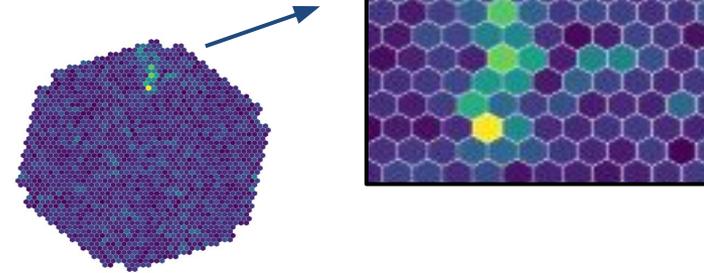
- Image shifting + masked convolution

- Pros: minor change to DL libraries
    - Cons: pre-processing, mask over-head, more data



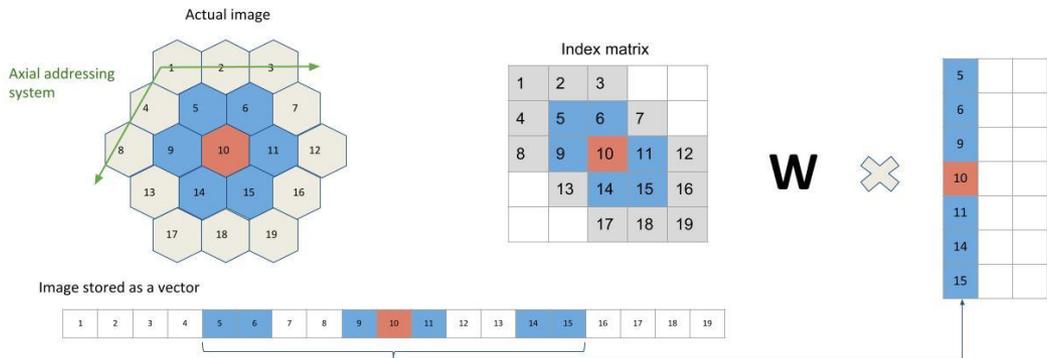
# Indexed operations

## Processing unconventional images

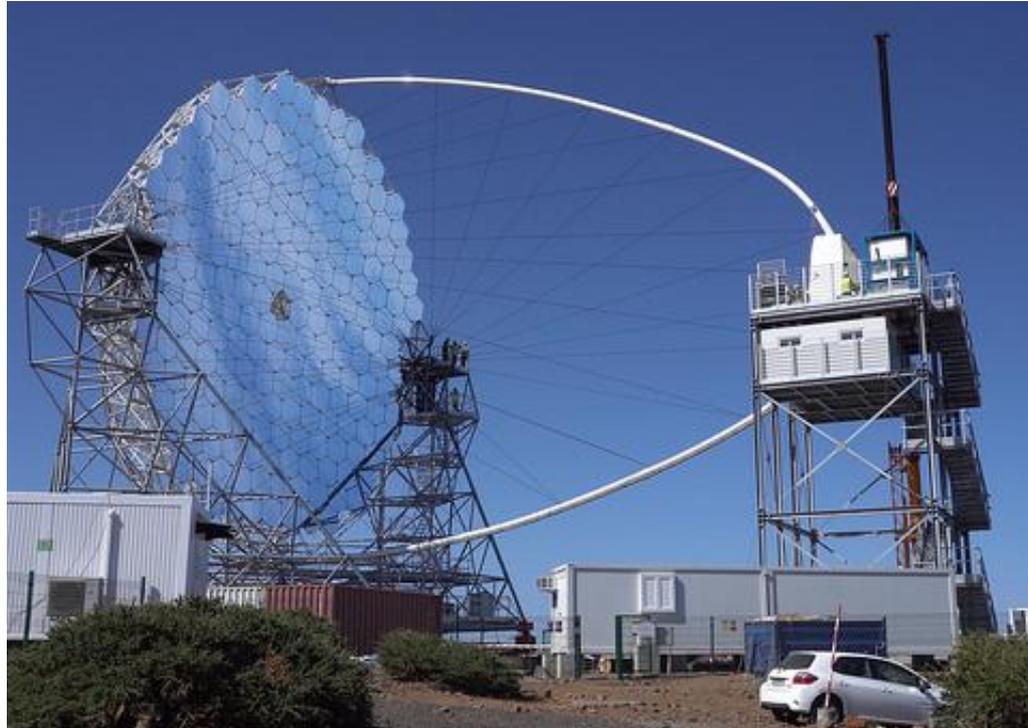


- Indexed convolution and pooling

- Validated on CIFAR and AID datasets
- Publication under preparation (VISAPP)
- Pros: process unaltered images, easily applicable to other detectors shape
- Cons: slower (Python for now)
  - C++ / cuda version version being developed



# Thank you for your attention



GammaLearner framework: <https://gitlab.lapp.in2p3.fr/GammaLearn/GammaLearn>

Indexed operations: <https://github.com/IndexedConv/IndexedConv>



# Acknowledgement

- H2020-Astronomy ESFRI and Research Infrastructure Cluster (Grant Agreement number: 653477).