



## **Extending ctapipe image reconstruction using FACT methods**

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18. März 2019

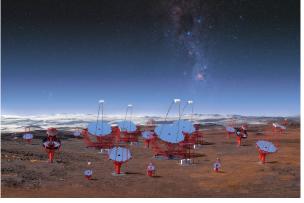
E5b





## The Cherenkov Telescope Array

- "Cherenkov Telescope Array"
- Proposed in 2005
- Currently in pre-production
- Two arrays of multiple telescopes
- Three types of telescopes: LST, MST, SST
- Goals: Extend observable energy range, huge field of view, higher sensitivity
- Status: First light on LST1

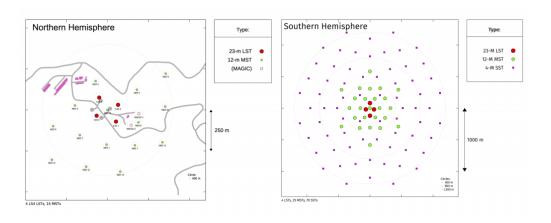


Visualization of the different telescope types. (1)



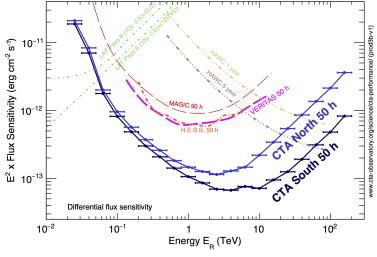


## Planned Layout (2)





## **Expected Sensitivity (2)**







### ctapipe

- Pipeline for low level cta data
- Performs Transformation, Calibration, Cleaning, Hillas-Parameter, 3D-Reconstruction. Visualization
- Mainly python based
- Still in active development
- https://github.com/ctaobservatory/ctapipe









### The FACT Experiment

- "First G-APD Cherenkov Telescope"
- Operating in La Palma since 2011
- Monoscopic reconstruction only
- Advanced analysis pipeline
- What did we take a look at?
  - More advanced cleaning method
  - Distinction of "islands" in shower images
  - → Possible improvements for monoscopic reconstruction in ctapipe
  - → First use case: LST1



(3)



## Image cleaning in FACT





## **Cleaning Methods**

#### Tailcuts cleaning

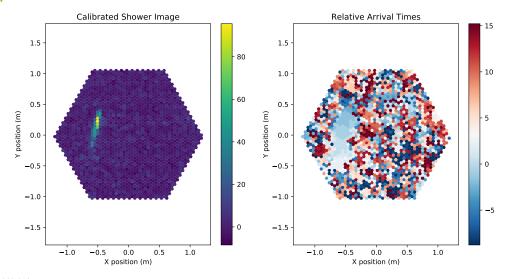
- "Two treshold procedure"
- Pixels above upper threshold survive
- Signal pixels need at least N neighbors
- Add neighboring pixels above the lower threshold

## "FACT image cleaning"

- Similar behaviour, but also uses information about the arrival times
- Pixels nedd to have a similar arrival time as their neighbors
- More steps removing "lonely" pixels
- → Probably removes more pixels with the same intensity thresholds



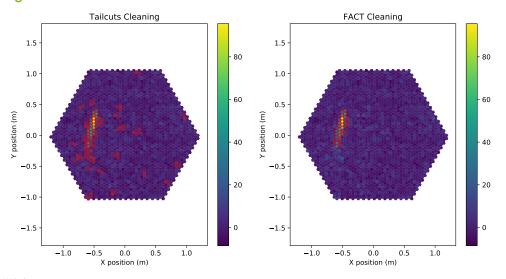
## Sample MC Event







## **Cleaning Results**



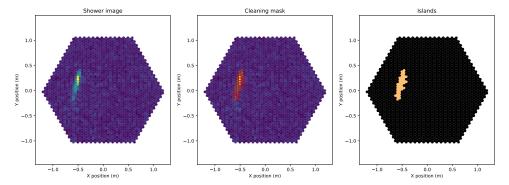


## Finding islands



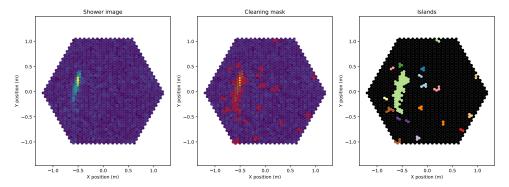


- Cleaning removed all but one cluster of pixels
- → Number of islands: 1





- Cleaning kept too many pixels
- → Number of islands: > 1





## Machine learning impacts





### Setup and expectations

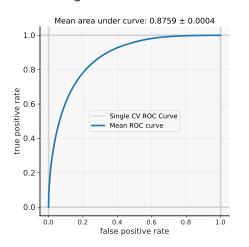
- A few 100 000 diffuse gamma and proton events
- Preprocessed with ctapipe, machine learning with aict-tools (3)
- Cleaning might affect separator performance
- Tailcuts cleaning should perform pretty well with the chosen parameters
- Number of islands might contribute to separator performance
- Number of islands will probably not constribute to gamma energy regression

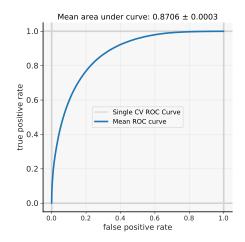




## **Gamma/Hadron Separation - AUC**

## Tailcuts cleaning:



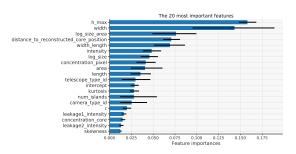


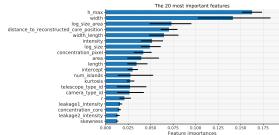




## **Gamma/Hadron Separation - Features**

#### Tailcuts cleaning:



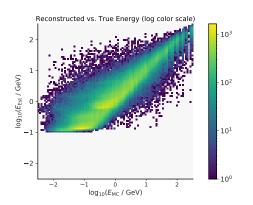


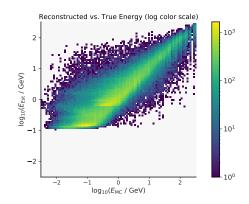




## **Energy Regression**

#### Tailcuts cleaning:



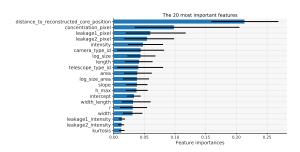


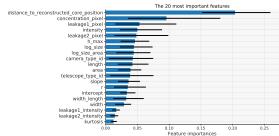




## **Energy Regression - Features**

## Tailcuts cleaning:







# Thank you for your attention!







C.-A. B. (Diaz)/ESO, (https://www.eso.org/public/germany/images/eso1841a/).



T. C. Consortium, CTA's expected baseline performance, (https://www.cta-observatory.org/science/cta-performance).



H. Anderhub u. a., Journal of Instrumentation 8, P06008–P06008, (https://doi.org/10.1088%2F1748-0221%2F8%2F06%2Fp06008) (Juni 2013).