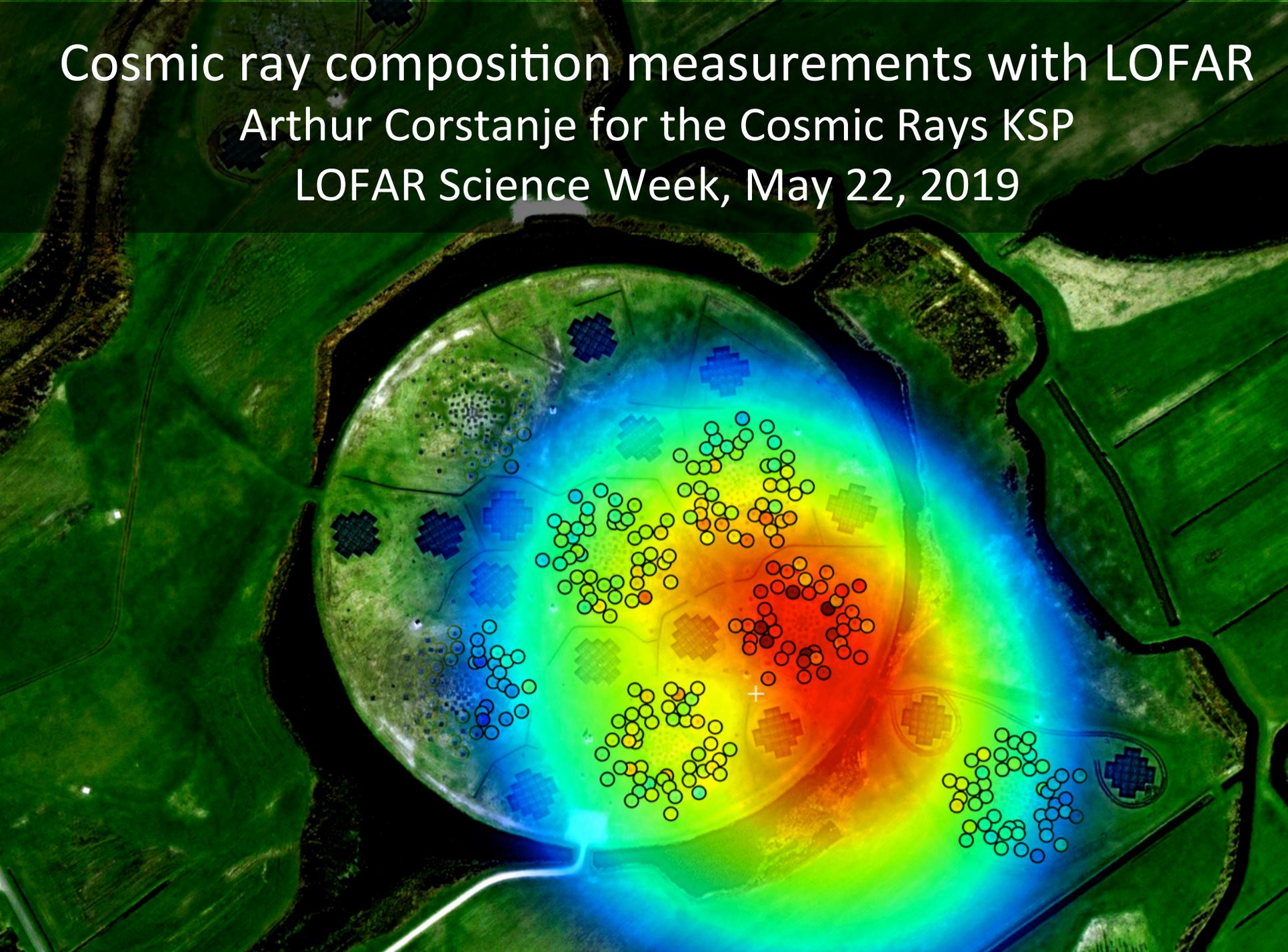


# Cosmic ray composition measurements with LOFAR

Arthur Corstanje for the Cosmic Rays KSP  
LOFAR Science Week, May 22, 2019

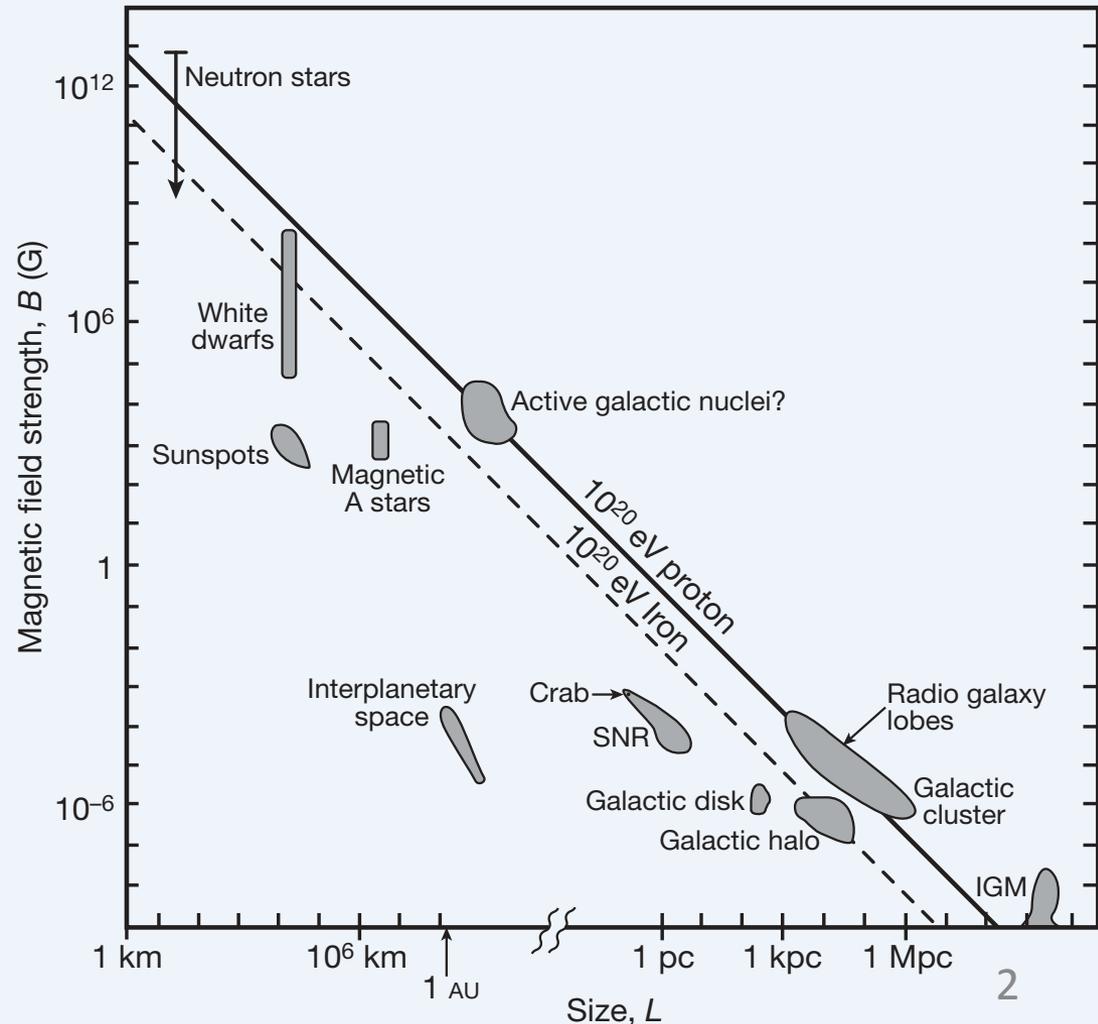


# Origin and composition of cosmic rays

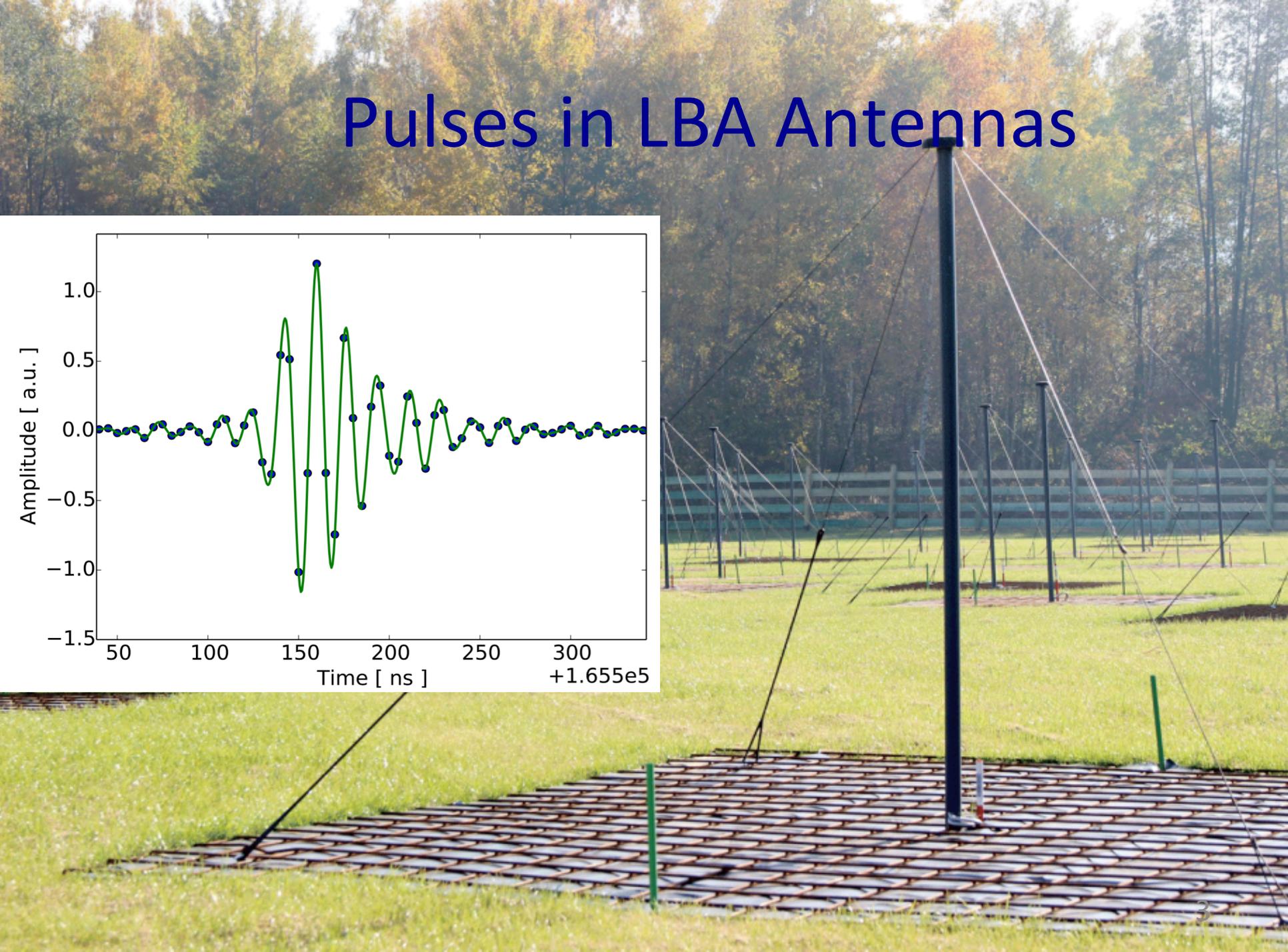
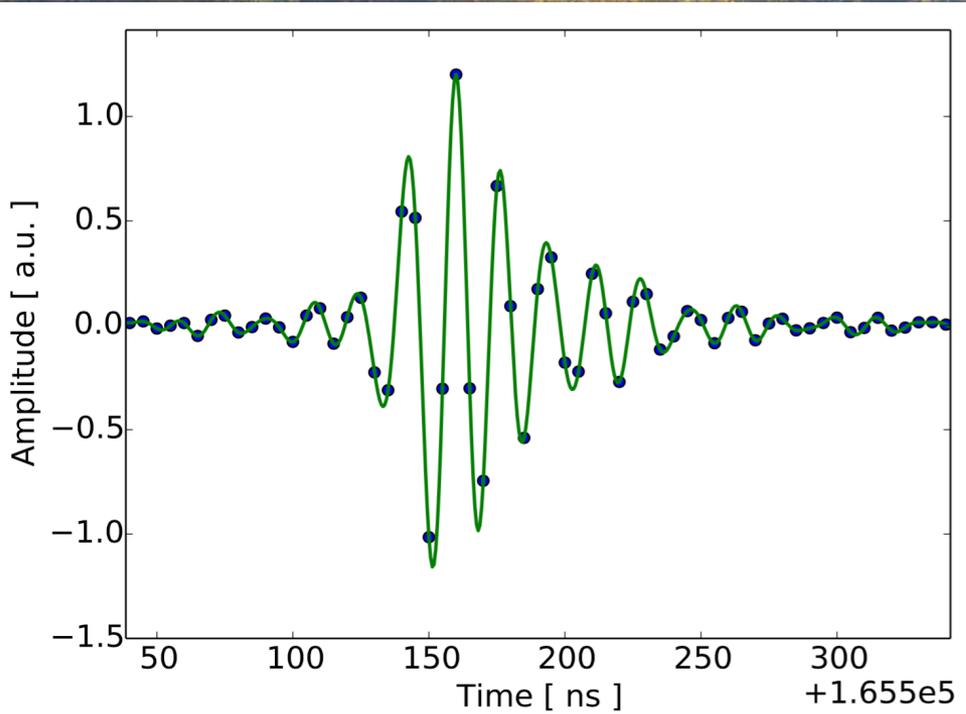
Cannot trace back CRs to sources due to magnetic fields

Hillas criterion for maximum energy of particles produced by a given source (proportional to charge  $Z$ )

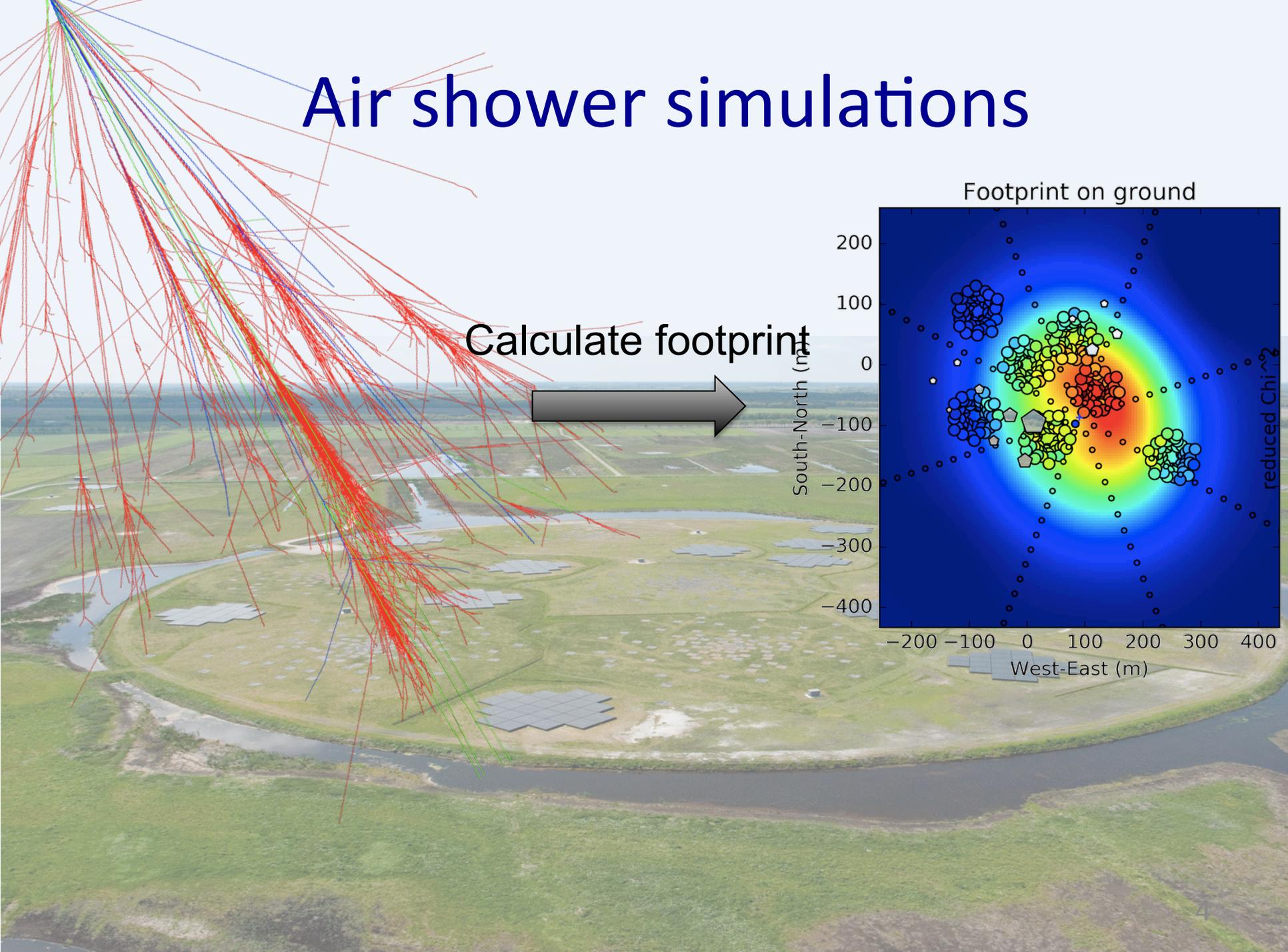
Transition galactic – extragalactic origin expected between  $\sim 10^{17}$  and  $10^{18}$  eV (in range of LOFAR!)  
First for protons, heavier nuclei can reach higher energies



# Pulses in LBA Antennas

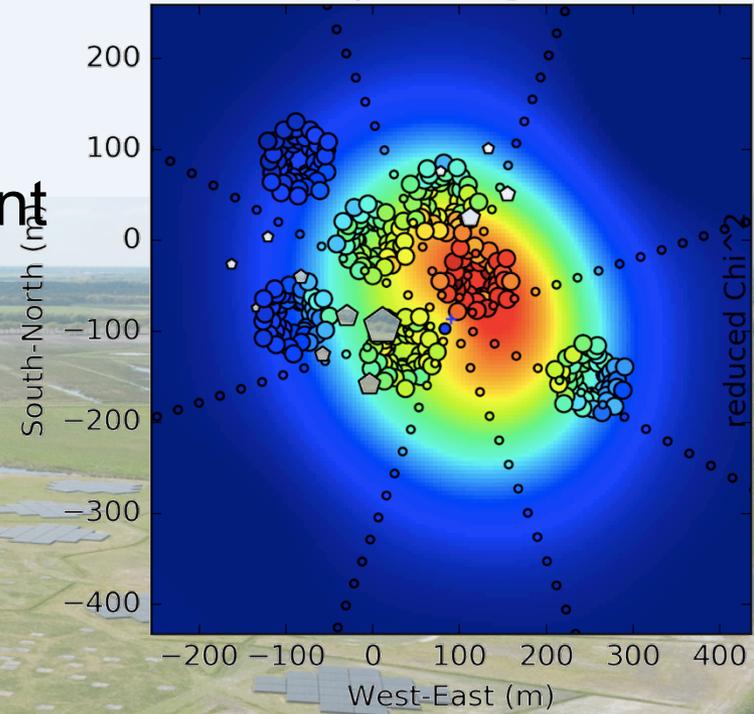


# Air shower simulations



Calculate footprint

Footprint on ground



# Air shower maximum $X_{\max}$

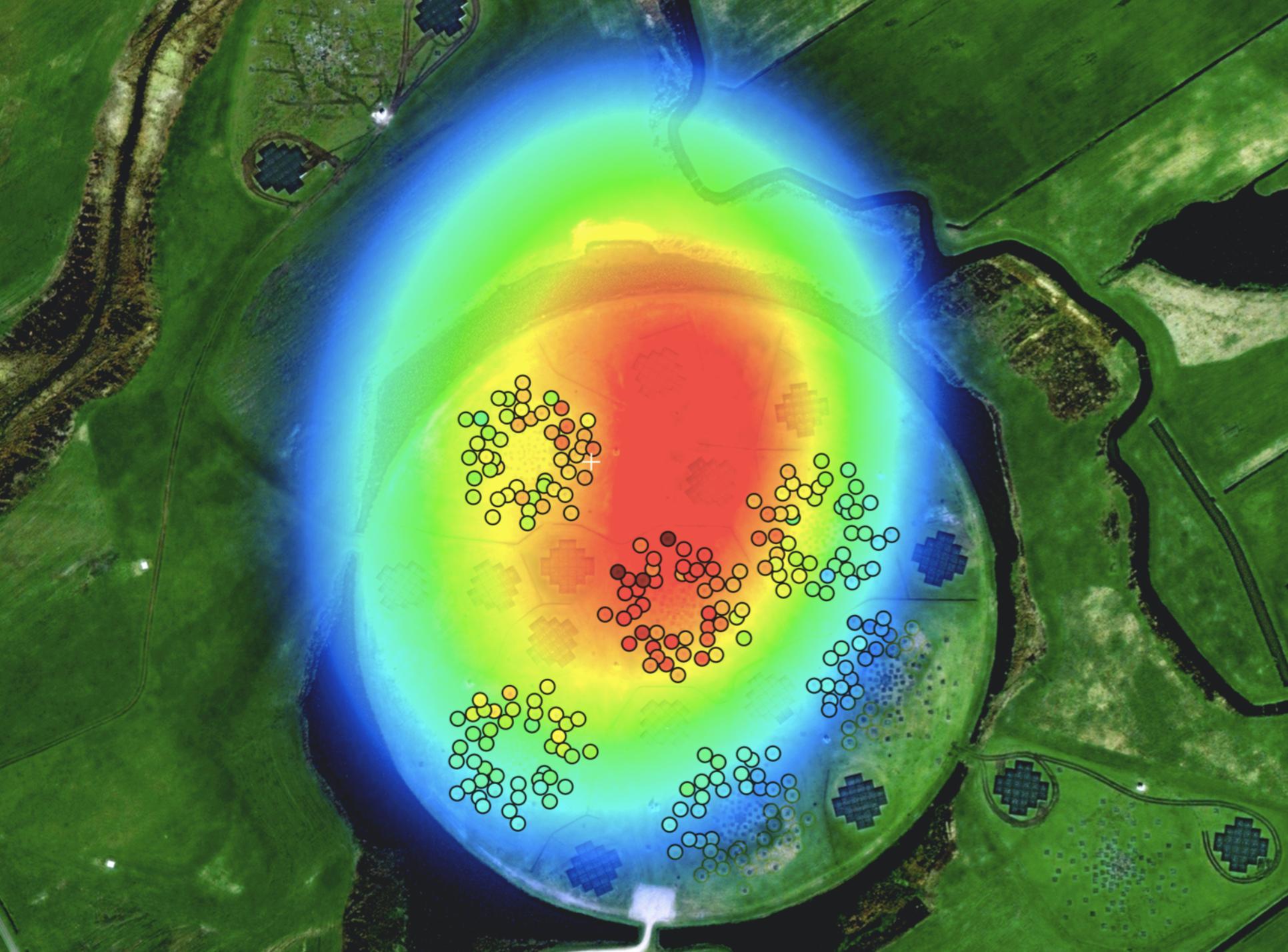


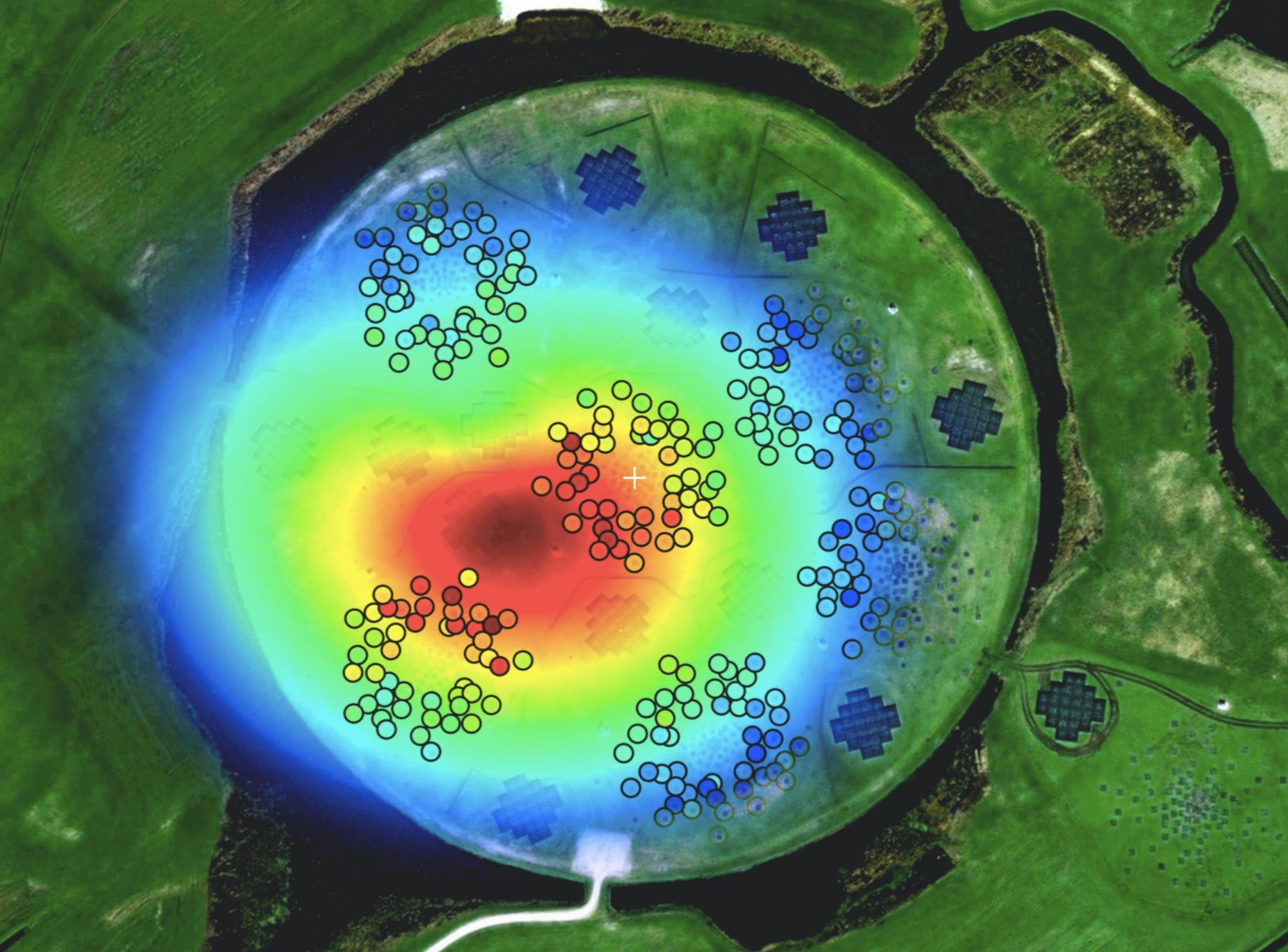
Heavy particles:  
low  $X_{\max}$  (high up)  
on average

- Over-simplified
- not only size, also the exact footprint shape and strength varies – and can be measured to constrain  $X_{\max}$



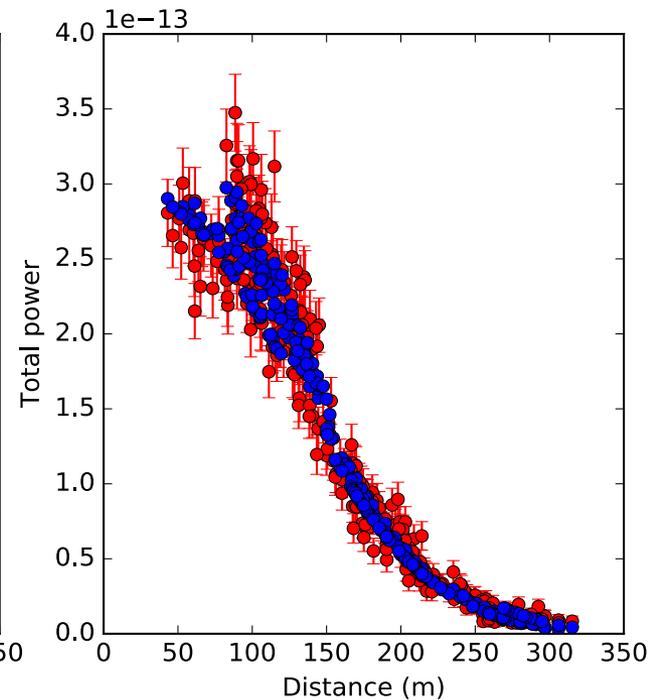
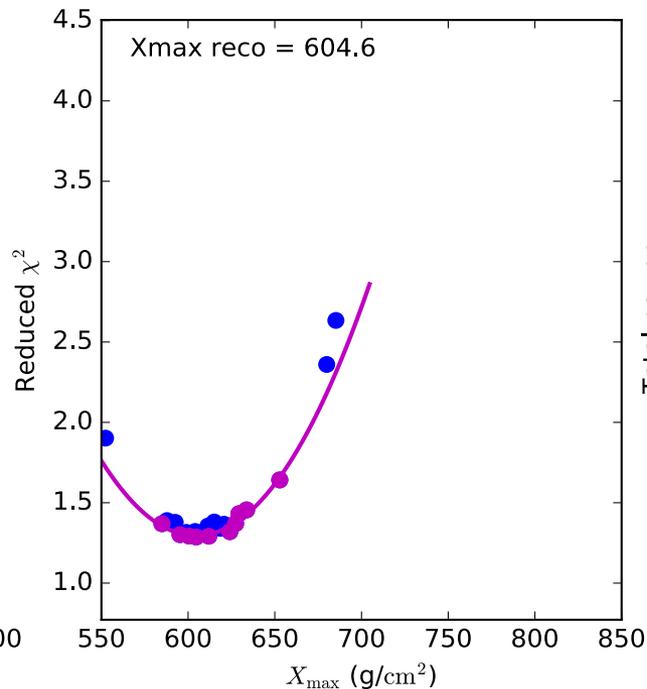
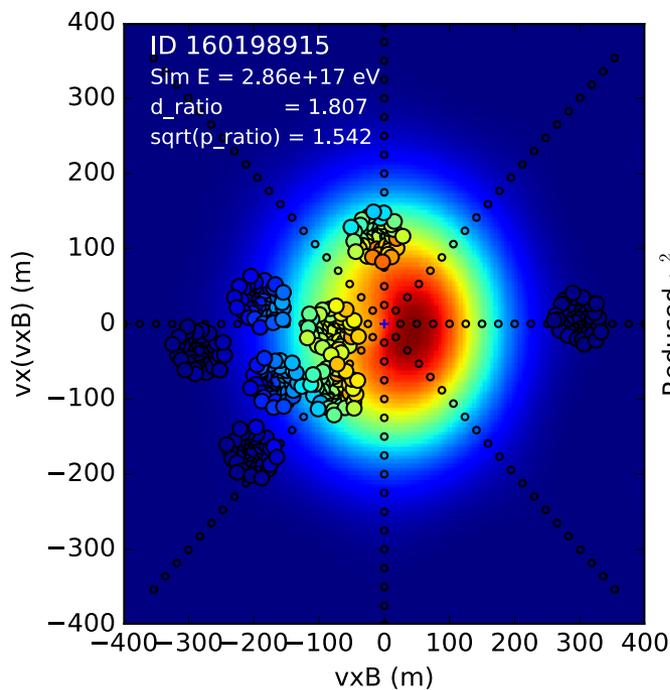
High  $X_{\max}$  (close to ground):  
radio footprint is smaller





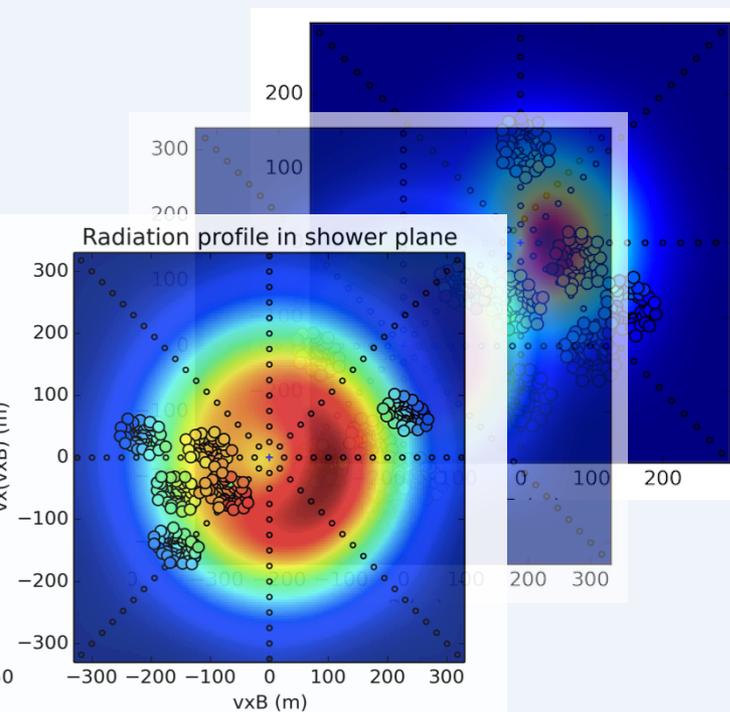
# Matching simulated footprints to LOFAR data

- CoREAS: Simulate  $\sim 30$  showers per event, spanning  $X_{\max}$  range
- Fit chi-squared as function of simulated  $X_{\max}$ : optimum
- State-of-the-art resolution of  $< 20 \text{ g/cm}^2$
- Fit now works on radio data only



# Matching simulated footprints to LOFAR data

- Simulate  $\sim 30$  showers per event, spanning  $X_{\max}$  range
- Reconstruction uncertainty from Monte Carlo procedure
  - Take simulated showers, add LOFAR noise levels, reconstruct with other showers from ensemble



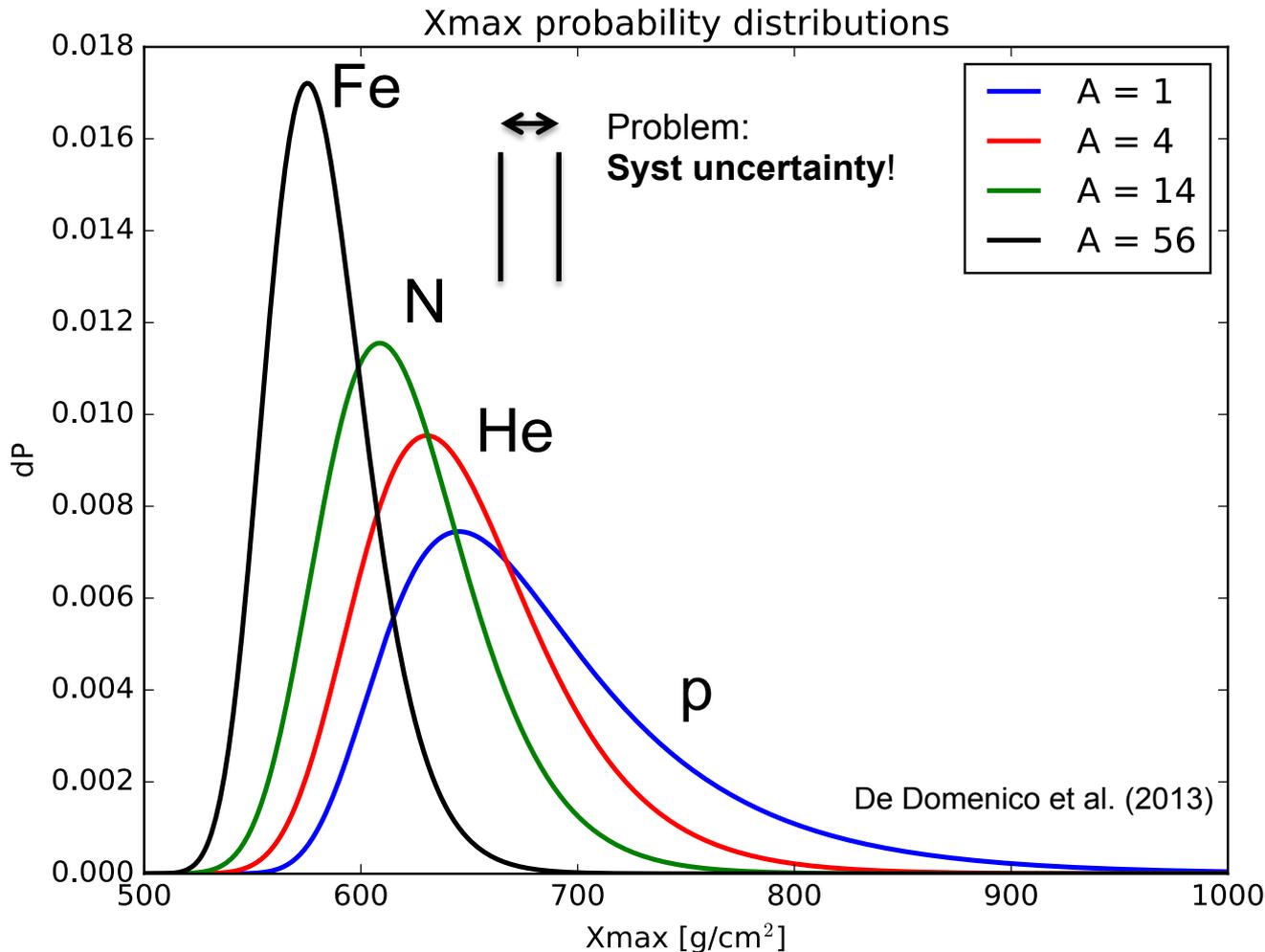
Air shower dataset:

data points

$(X_{\max} \pm \sigma_X, \log E \pm \sigma_{\log E})$

$\times N \sim 350$

# $X_{\max}$ distributions for the elements



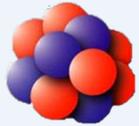
## Statistical challenge

Determine which *linear combination* of these curves fits best to the measured  $X_{\max}$  set

Determine confidence intervals for the element fractions

- Challenging, need to **reduce systematics** wherever possible!

# Bias-free sample selection



Low  $X_{\max}$  (high up)  
Few particles reach the  
ground  
(may not trigger LORA)



High  $X_{\max}$  (close to ground):  
radio footprint is small  
(may not trigger 3 LOFAR stations)

## Criterion:

- Each measured shower must be able to trigger both LORA and LOFAR, would it have any other  $X_{\max}$  level within natural range
- **196 showers** included

# Improving accuracy (reducing systematic uncertainties)

- Add local atmospheric profiles to Corsika / CoREAS, including refractive index
  - Saves a contribution of 4 to 11 g/cm<sup>2</sup> (low to high zenith angle)
- More elaborate fiducial selection criteria
  - Bias now bounded, < 4 g/cm<sup>2</sup>
- Attention to curve-fitting for optimal  $X_{\max}$ 
  - Reconstructed  $X_{\max}$  inside densely simulated region
  - Saves contribution of a few g/cm<sup>2</sup>

# Systematic uncertainties

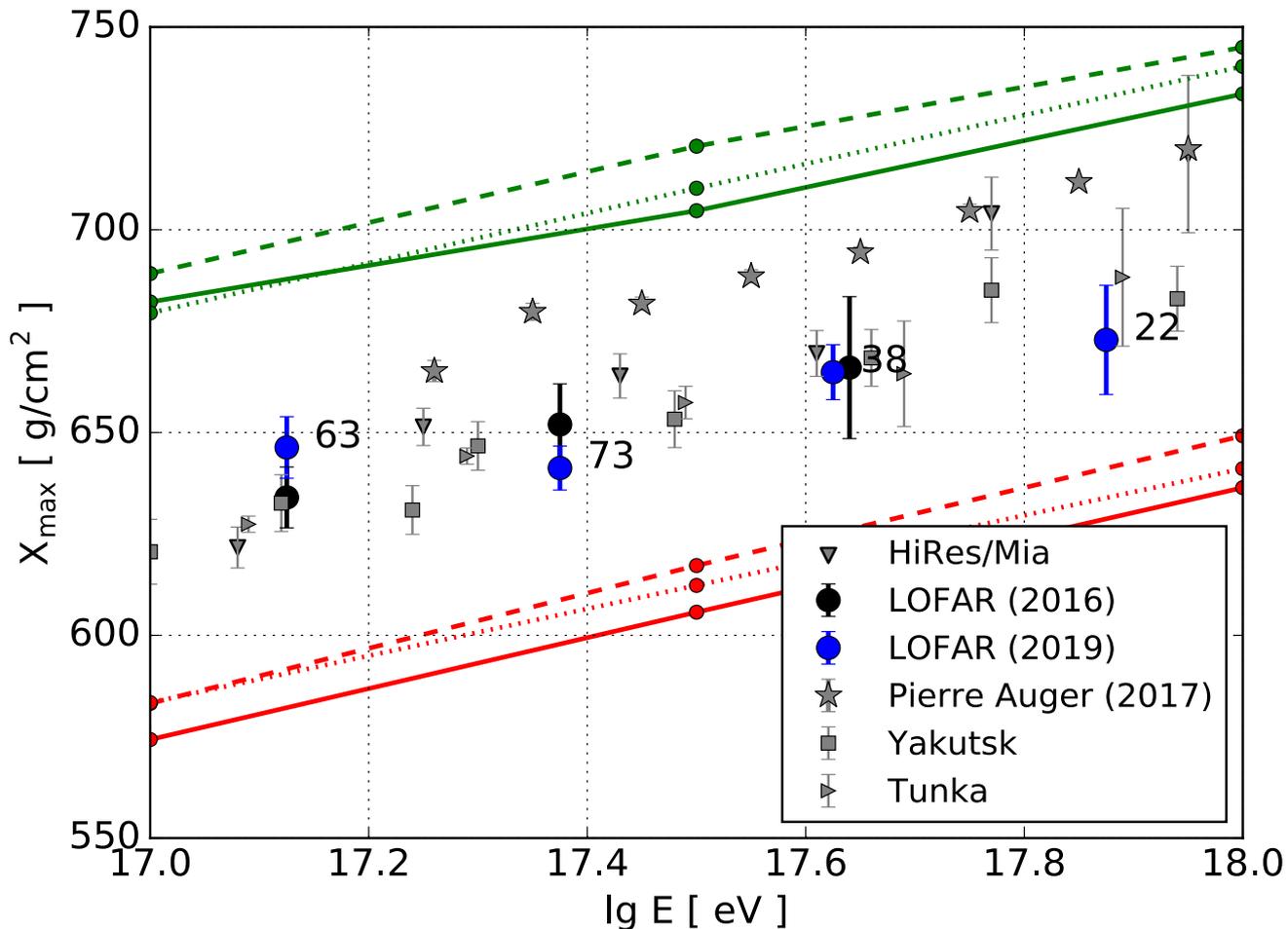
	SYST	STAT
On $X_{\max}$ :		
• Choice of hadronic interaction model: (for $X_{\max}$ reconstruction)	5 g/cm <sup>2</sup>	
• Remaining uncertainty, atmosphere	~ 1 g/cm <sup>2</sup>	2 g/cm <sup>2</sup>
• Atmospheric uncertainty (5-layer Corsika):	2 g/cm <sup>2</sup>	4 g/cm <sup>2</sup>
• Possible bias, from $\langle X_{\max} \rangle$ vs zenith:	4 g/cm <sup>2</sup>	
<b>Total</b> , added in quadrature:	<b>7 g/cm<sup>2</sup></b>	
For composition analysis:		
• Parametrized $X_{\max}$ distributions, Conex:	5 g/cm <sup>2</sup>	
<b>Total</b> , added in quadrature:	<b>9 g/cm<sup>2</sup></b>	<b>20 g/cm<sup>2</sup></b>
Energy:	<b>27 %</b>	<b>10 %</b>
Syst uncertainty from comparison to particle detector energy (standalone later)		
Statistical uncertainty: average from radio data (improved! Was 32 %)		

# Statistical analysis

- Measurements take time and effort
- Statistically distinguishing  $X_{\max}$  distributions is tricky
- Unbinned maximum likelihood analysis for optimal distinguishing power
- Additional goodness-of-fit analysis from cumulative distribution (i.e. unique, no binning)
- Likelihood ratio test for confidence intervals

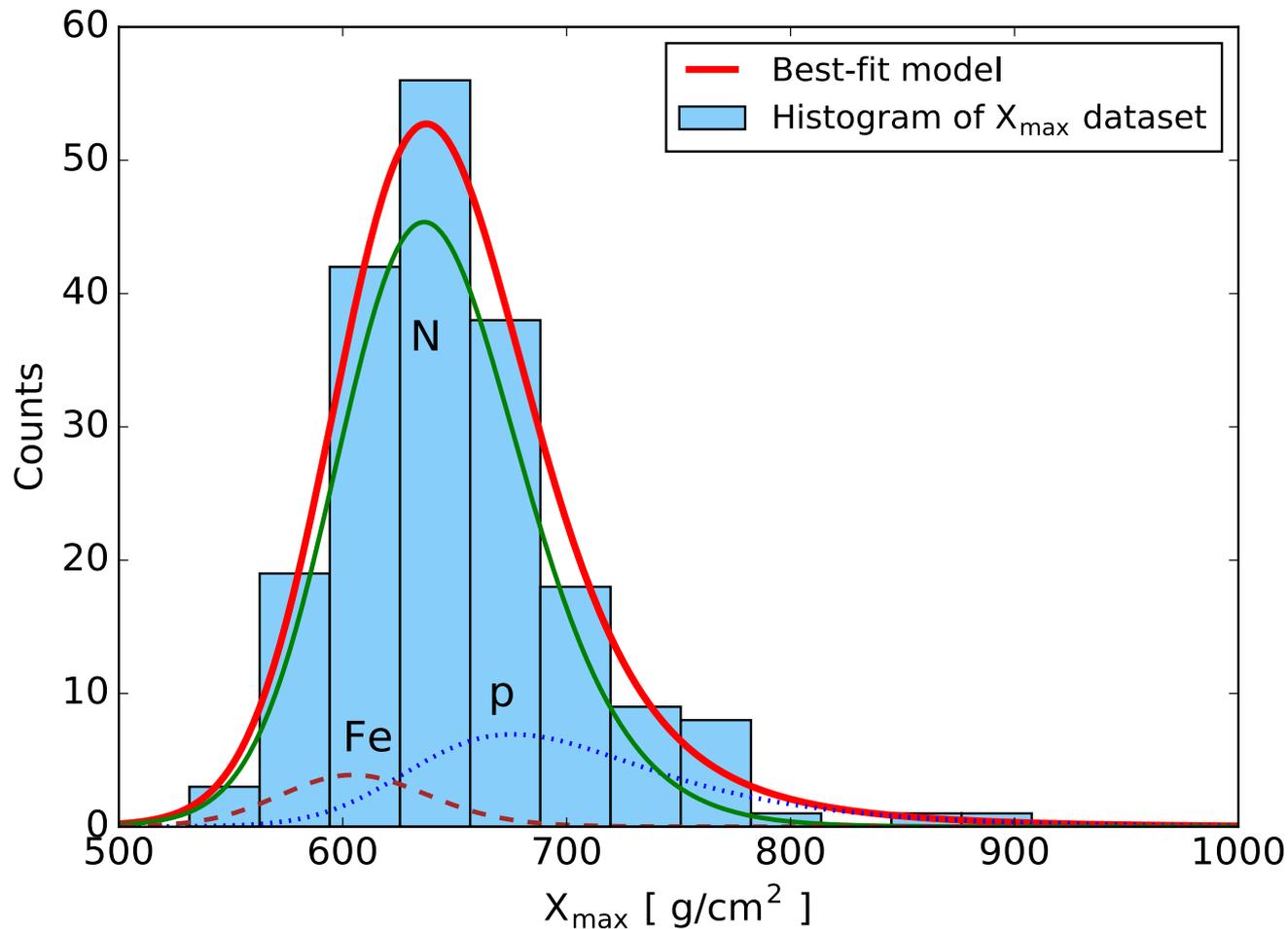
# Results: average $X_{\max}$

Figures from A. Corstanje (2019), PhD thesis (to appear this summer)



Average of  $X_{\max}$  is in line with other experiments, except Auger which finds consistently higher values

# Results: $X_{\max}$ histogram



Best fit:  
(from unbinned  
statistical analysis)

17 % p

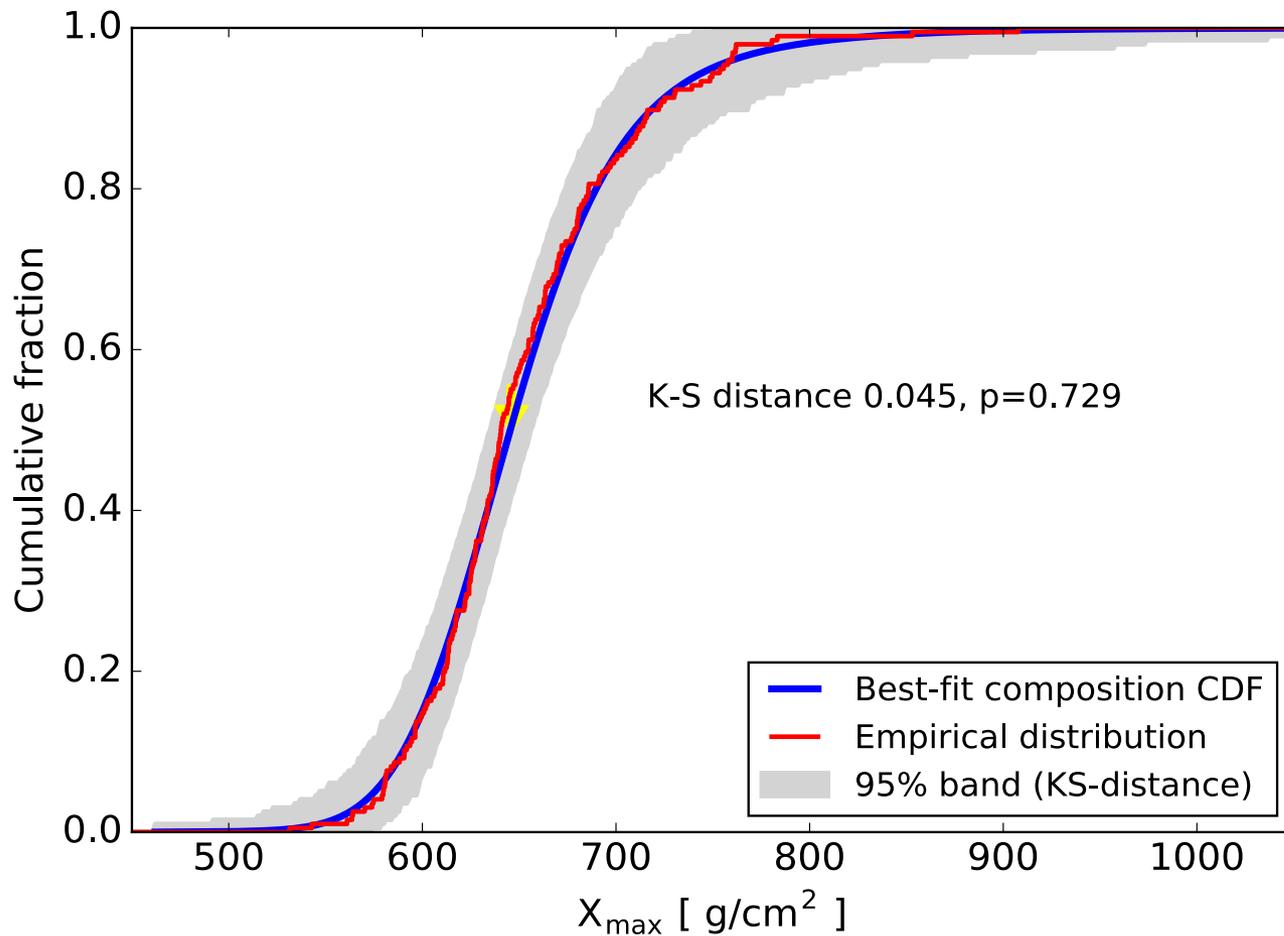
0 % He

78 % N

5 % Fe

Protons and helium  
somewhat  
interchangeable

# Results: goodness of fit



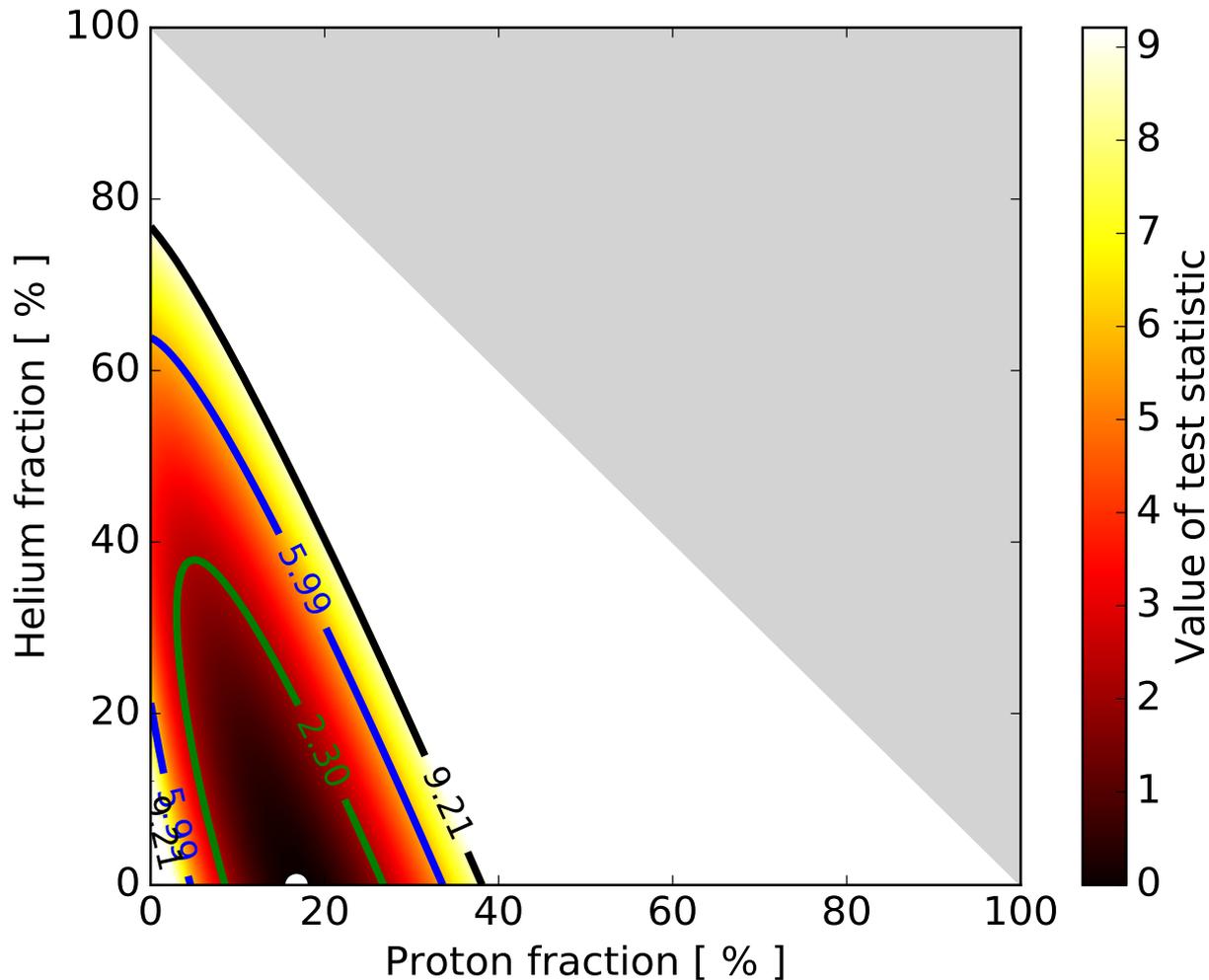
Unbinned analysis gives no goodness of fit estimate

Do separately; Kolmogorov-Smirnov test is a simple method for this.

Uses cumulative distribution and empirical distribution (uniquely defined)

Fit quality is good

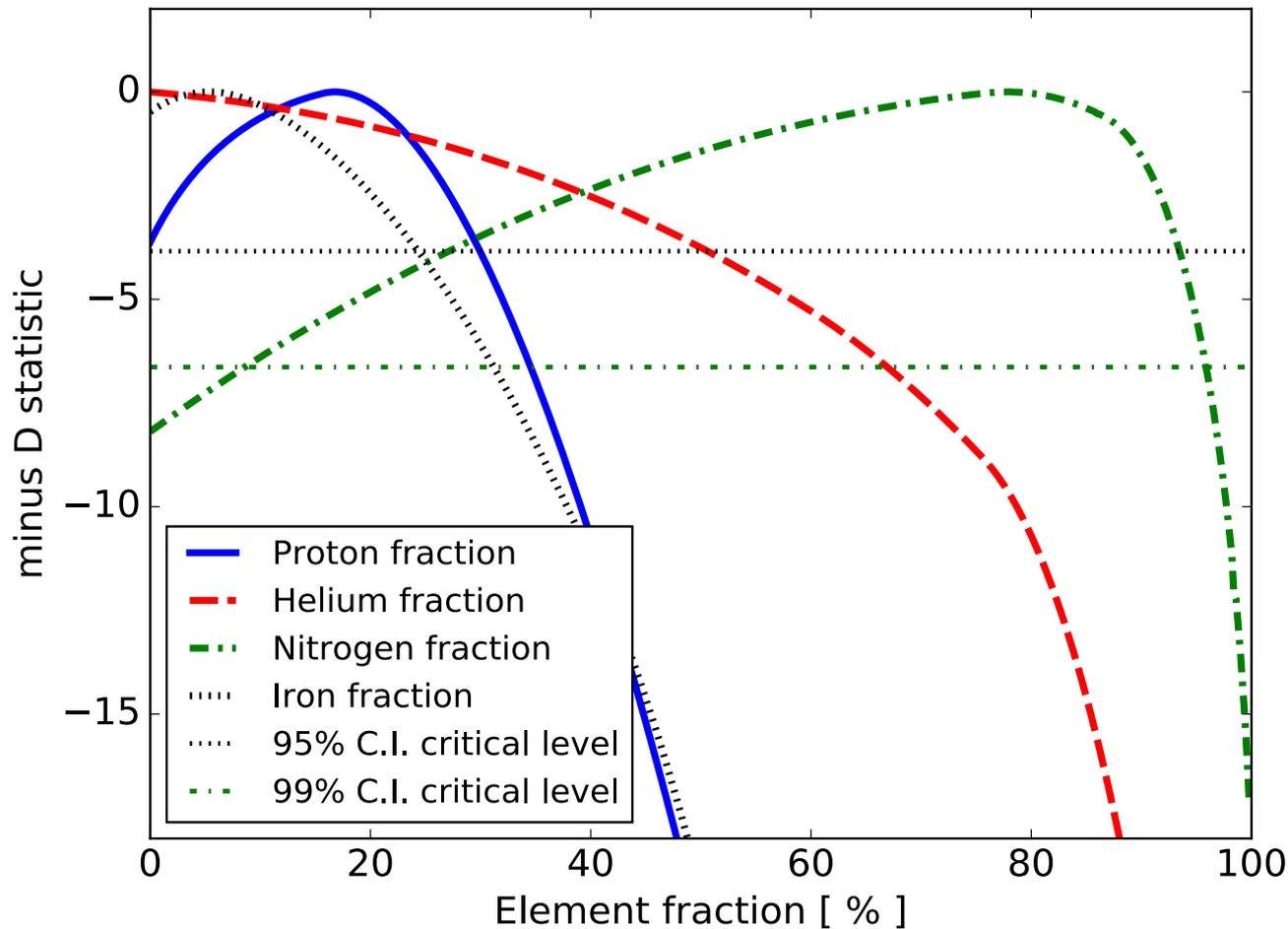
# Results: protons vs helium



Within the one-sigma (green) contour, protons and helium can be interchanged, in a ratio near 1:3 for p:He

Contours show one-sigma, 95 and 99% C.L., respectively

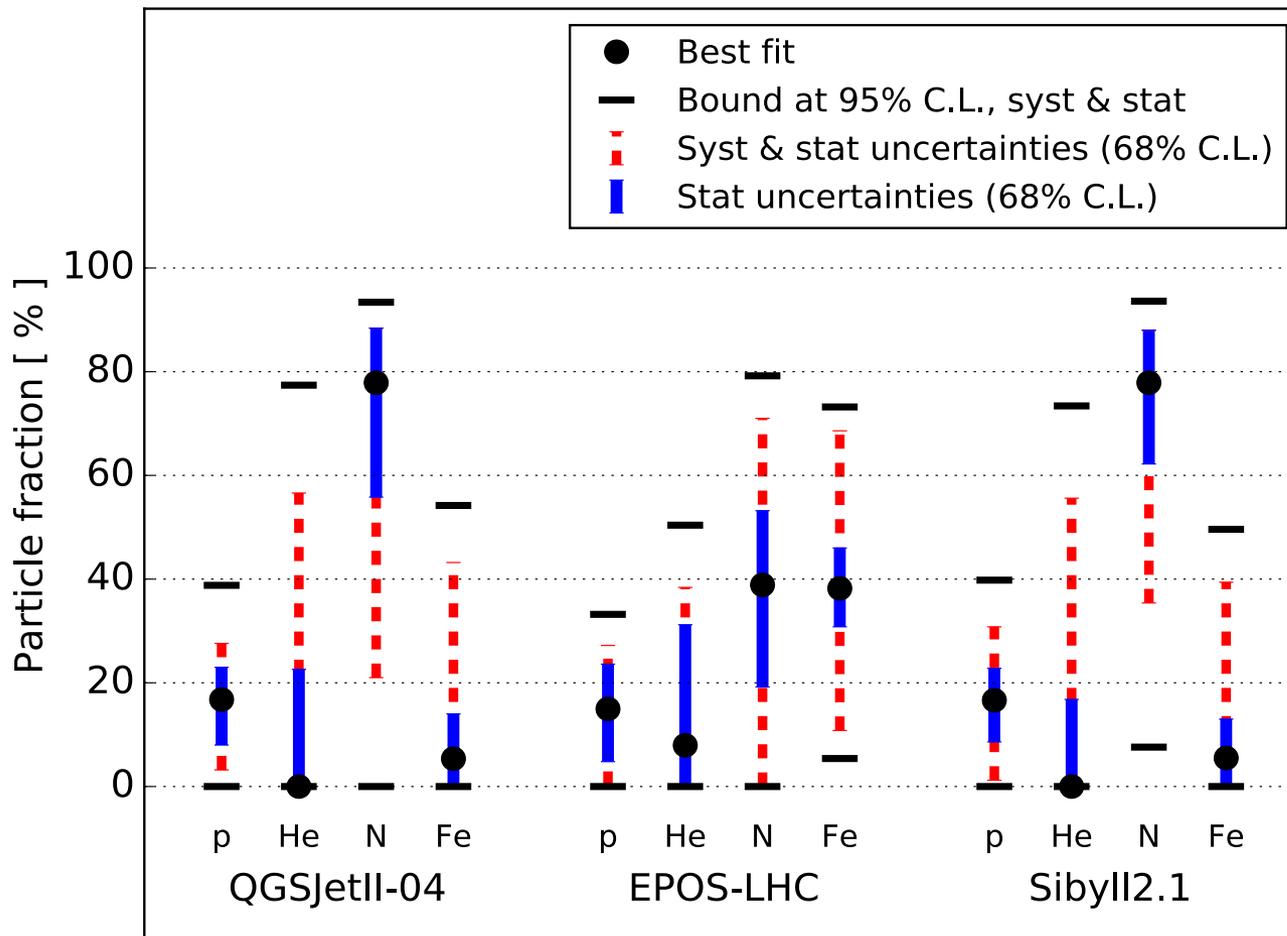
# Results: likelihood ratio test



Test statistic for likelihood ratio test

Confidence intervals defined by having the curves above the horizontal line for the desired C.L.

# Composition result per element



CRs in our energy range are mostly intermediate-mass nuclei

Some tendency to C/N/O rather than He (syst. limited)

Upper bound on protons of 40 %, at 95 % C.L. and across 3 hadronic interaction models

- Cannot (yet) resolve He and N

# Summary

- Composition analysis for our data set
  - Mostly intermediate-mass elements
  - Upper bound on protons and on iron
- Distinguishing power is still limited by statistics,  $N=196$  is a small set compared to e.g. Auger ( $> 3000$  per bin)
  - However, result for iron is already systematics-limited
- Radio  $X_{\max}$  measurements: stat. uncertainty  **$< 20 \text{ g/cm}^2$**  and syst. uncertainty  **$\sim 9 \text{ g/cm}^2$** 
  - Competitive with state-of-the-art experiments!
- Proton component likely from extragalactic origin; heavier nuclei may be (re)accelerated inside the Galaxy e.g. supernova remnants with strong magnetic fields, or termination shocks

# Outlook

- Radio  $X_{\max}$  measurements: stat. uncertainty **< 20 g/cm<sup>2</sup>** and syst. uncertainty **~ 9 g/cm<sup>2</sup>**
  - Competitive with state-of-the-art experiments!

Improvements:

- LORA expansion, doubles detector count
- Extension to lower energies, not available with e.g. fluorescence detection; capture 'second knee' in CR spectrum:  
**hybrid trigger** needed
- 24/7 LBA background mode

All these increase the effective (bias-free) exposure, for the next factor of 3 in statistics.