

ARENA Workshop
University of Chicago

13th June 2024

Max Büsken for the
Pierre Auger Collaboration



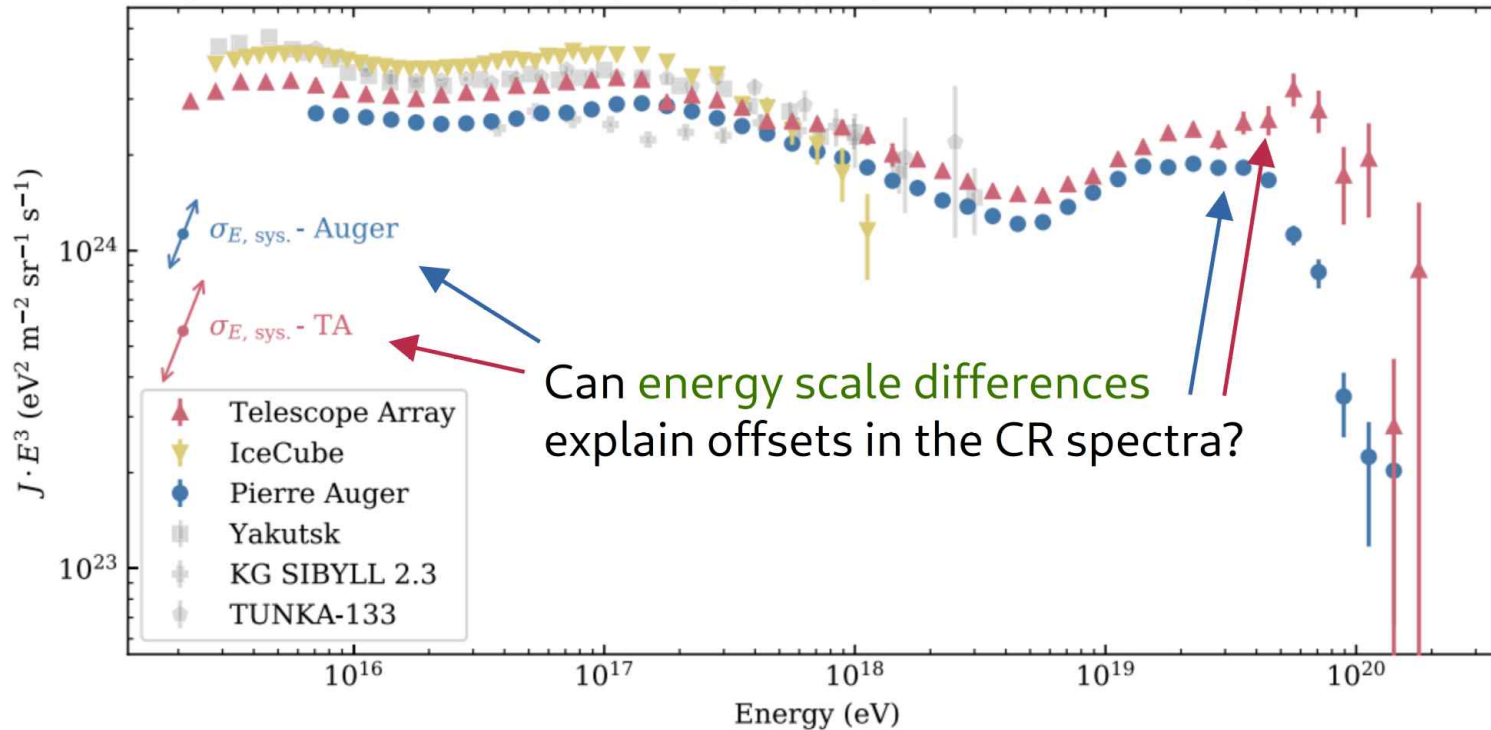
CHICAGO 2024

Towards a Cosmic-Ray Energy Scale with the Auger Engineering Radio Array



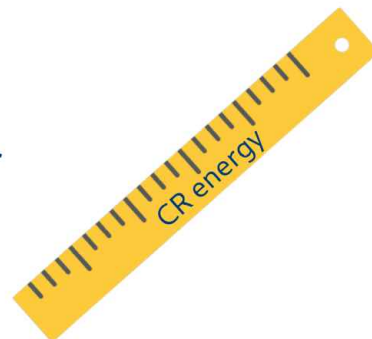
Energy scales of cosmic-ray observatories

[Snowmass White Paper, Astropart. Phys. 149 (2023) 102819]

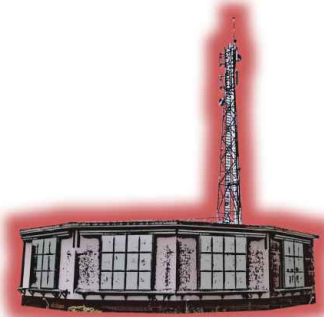


- Each cosmic-ray observatory has an individual **energy scale**
- Comparison of **science results** always in view of energy scale differences
 - ↳ **Absolute determination of energy scale and its accuracy** are crucial

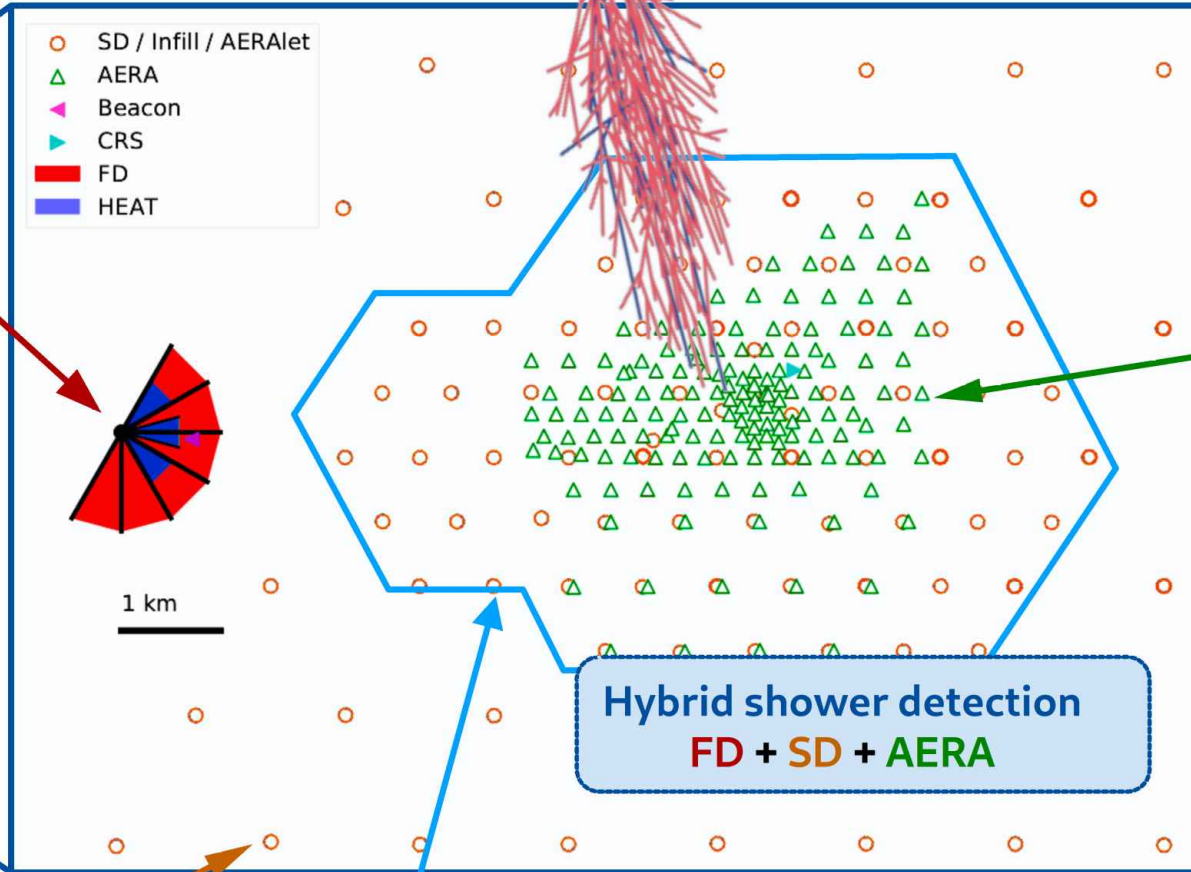
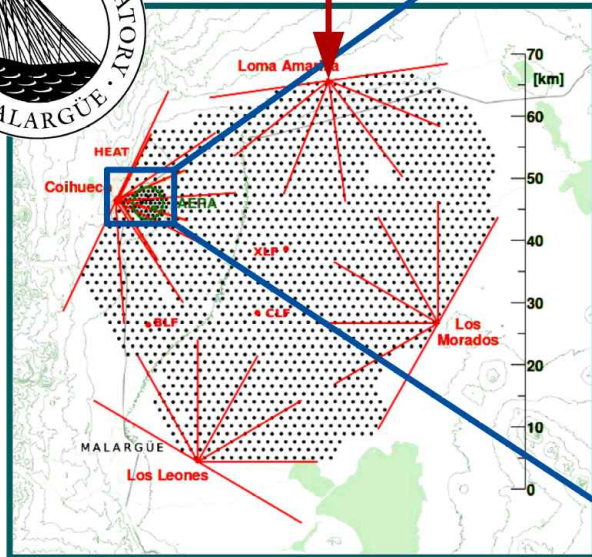
↳ here: cross-check the **Auger** energy scale using **radio**



Pierre Auger Observatory: **hybrid** air-shower detection

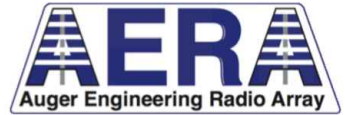


Fluorescence Detector (FD)
4 Sites

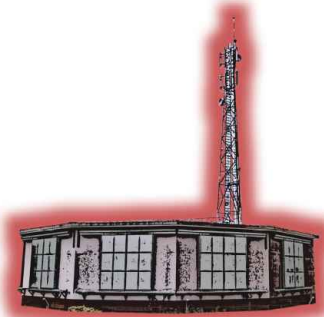


Infill region with denser detector spacing

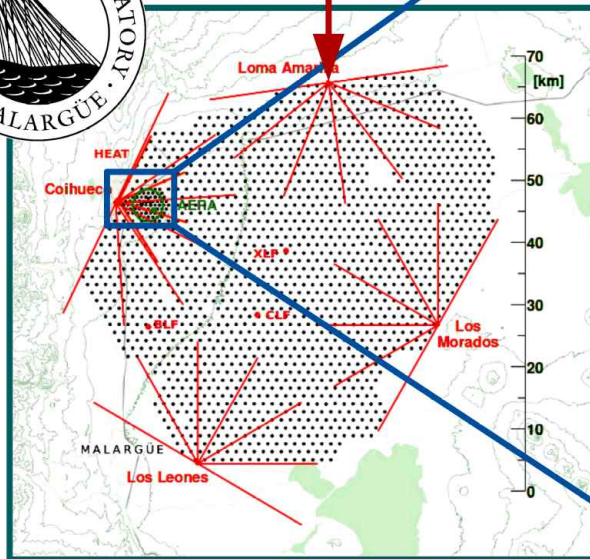
Surface Detector (SD)
1661 Stations
Particle detectors



Pierre Auger Observatory: **hybrid** air-shower detection

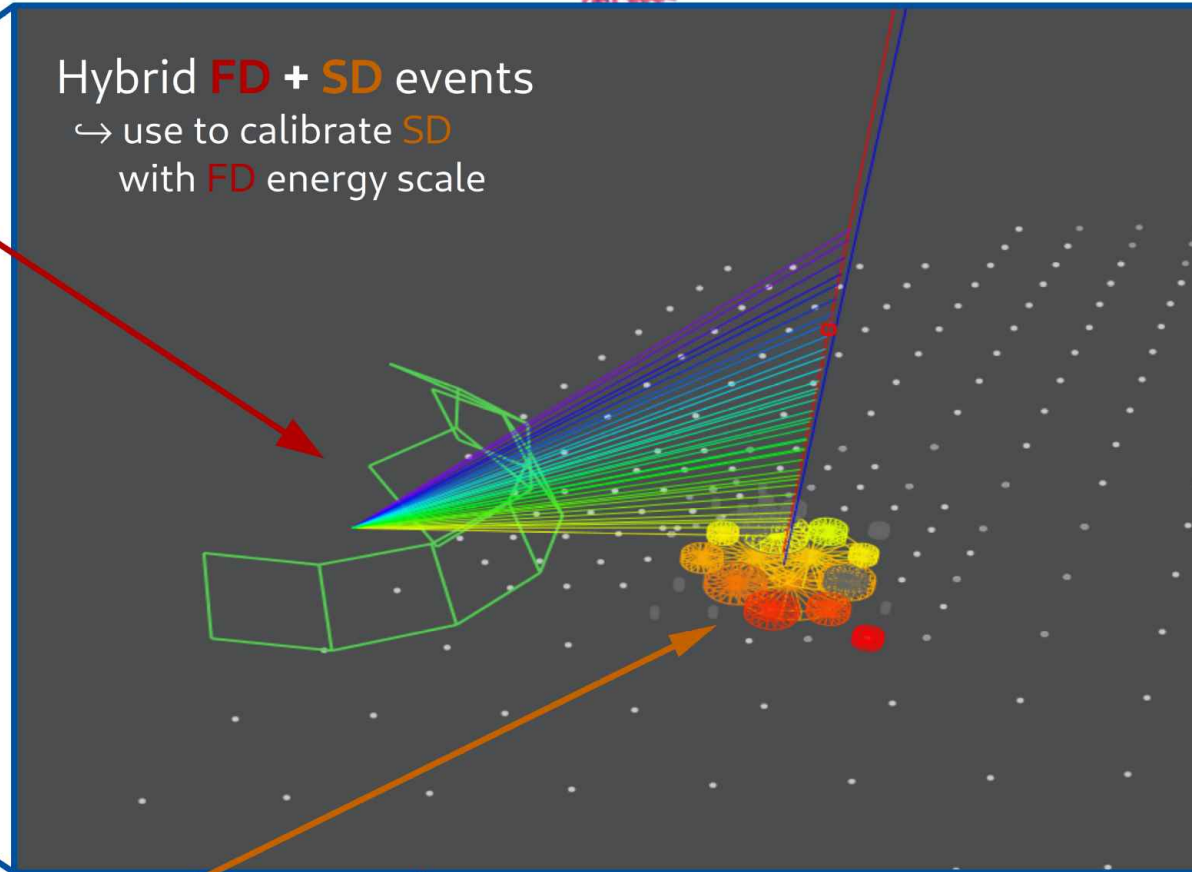


Fluorescence
Detector (FD)
4 Sites



Example event:

Hybrid **FD + SD** events
↔ use to calibrate **SD**
with **FD** energy scale



Infill region with denser detector spacing

Surface Detector (SD)
1661 Stations
Particle detectors

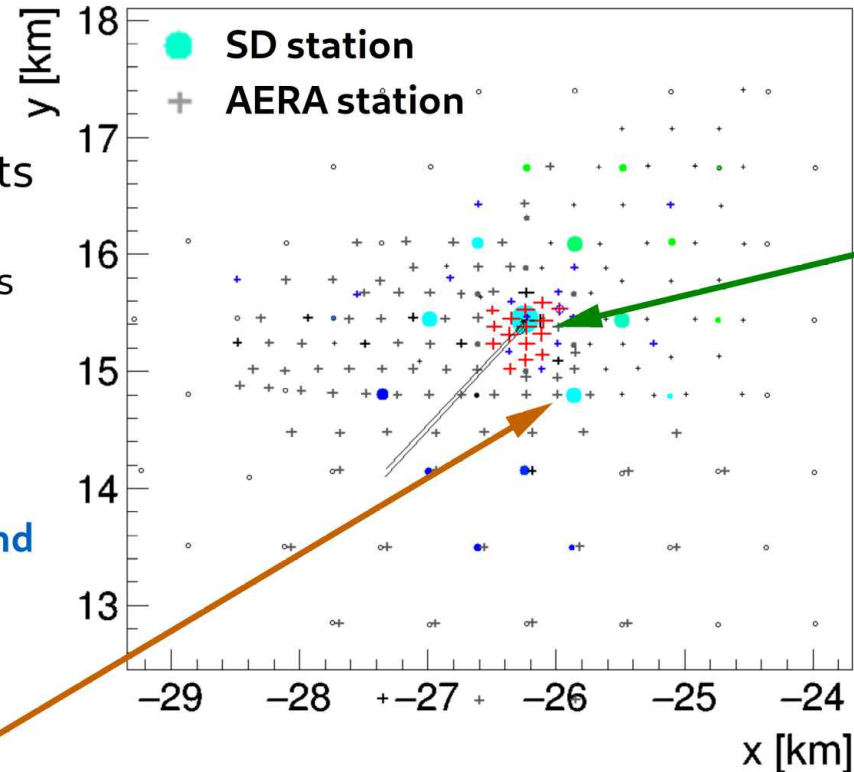


Pierre Auger Observatory: **hybrid** air-shower detection

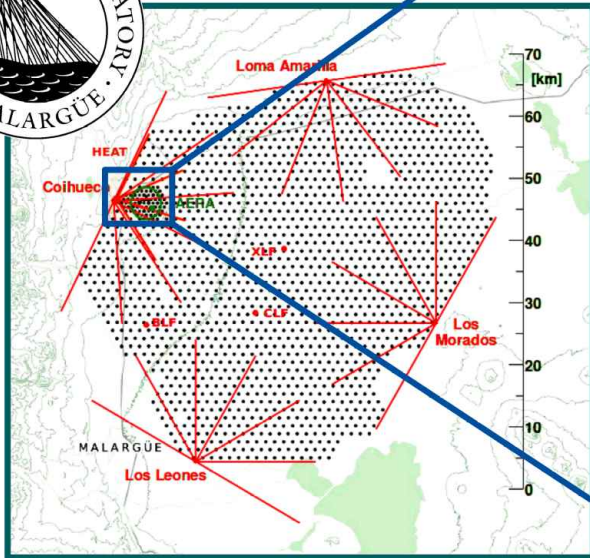
Example event:

Hybrid events
SD + AERA
↔ basis for this analysis

Since 2013:
a **few thousand**
high-quality
hybrid events
recorded
 $E > 3 \cdot 10^{17}$ eV



Infill region with denser detector spacing



Surface Detector (SD)
1661 Stations
Particle detectors

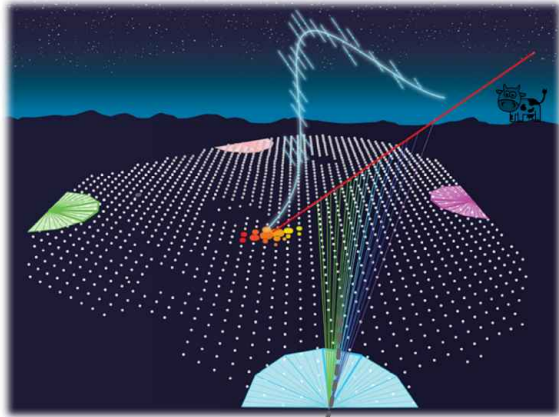


LPDA



Butterfly

Energy scales at the Pierre Auger Observatory



Total number of fluorescence photons proportional to cosmic-ray energy

$$N_{\gamma, \text{fluorescence}} \propto E_{\text{CR}}$$

Measured in the laboratory
[M. Ave et al., AIRFLY Collaboration
Astropart. Phys. 42 (2013) 90.]

Need precise determination of cosmic-ray energy E_{CR}

established (**FD**):

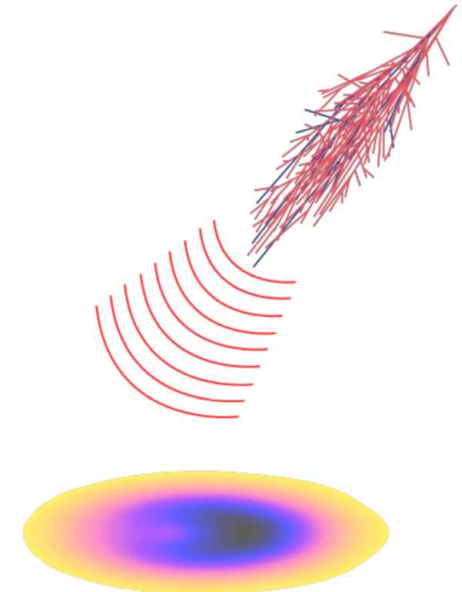
Energy scale defined by the **fluorescence yield**

- Needs permanent monit. of atmosphere
 - Aerosol content
 - Clouds
- Long-term drift of telescope components
- **Syst. uncertainty: 14%**

alternative (**Radio**):

Energy scale defined by **classical electrodynamics** in MC air-shower simulations

- Atmosphere transparent
- No significant or relevant ageing
- **(At least) competitive syst. uncertainty**



High-precision simulations:

- CORSIKA: particle cascade
- CoREAS: microscopic modeling of radio emission

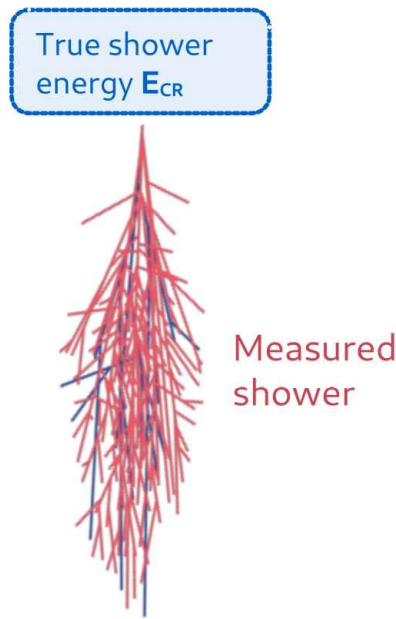
Quality of radio emission simulations probed extensively
[Gottowik et al., Astropart. Phys. 103 (2018) 87-93]
↔ CoREAS & ZHAireS agreement within **~3%** in cosmic-ray energy

→ More details:
see ARENA talk by T. Huege

Compare the scales

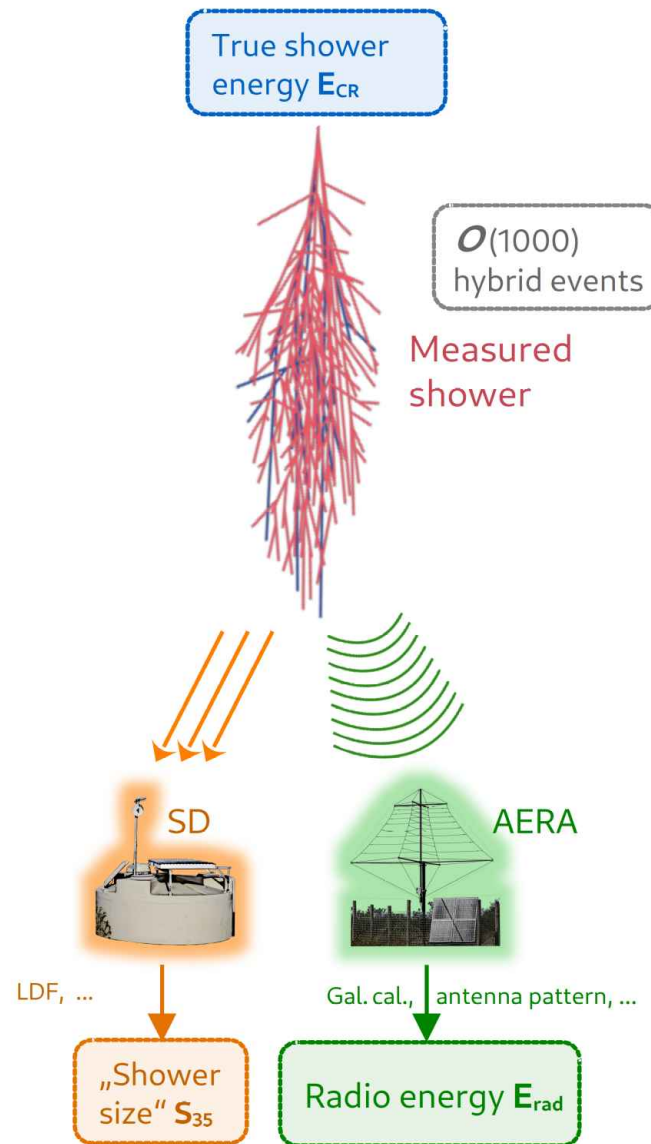
Comparing **FD** and **Radio** energy scales

- „Top-down“-like approach



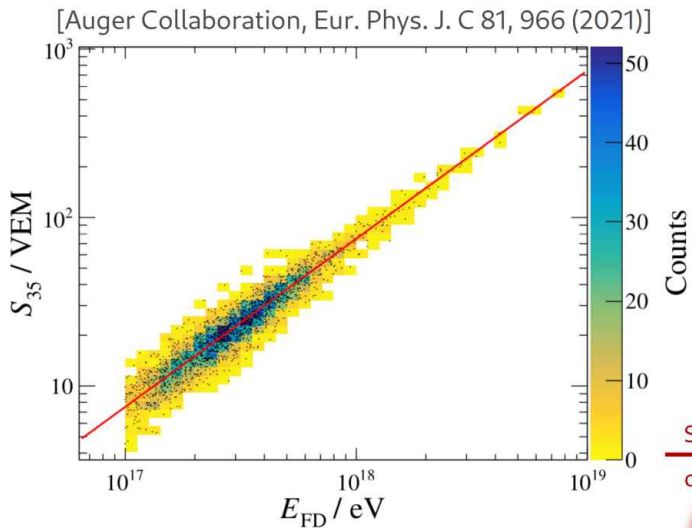
Comparing **FD** and **Radio** energy scales

- „Top-down“-like approach
- Hybrid **SD** – **AERA** events
 - $E > 3 \cdot 10^{17}$ eV, $\theta < 55^\circ$

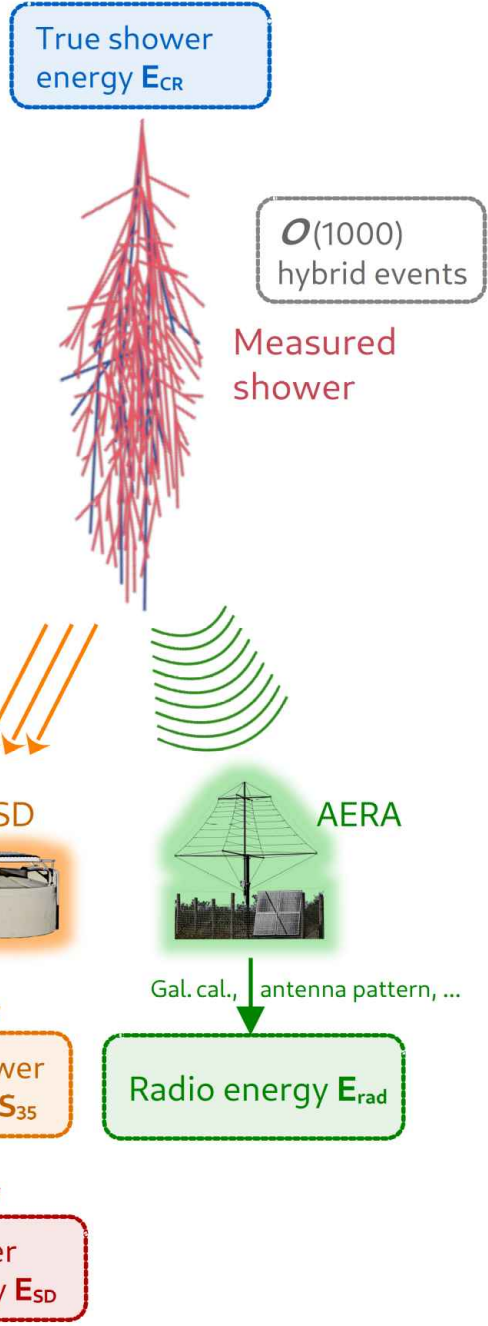


Comparing **FD** and **Radio** energy scales

- „Top-down“-like approach
- Hybrid **SD** – **AERA** events
 - $E > 3 \cdot 10^{17}$ eV, $\theta < 55^\circ$

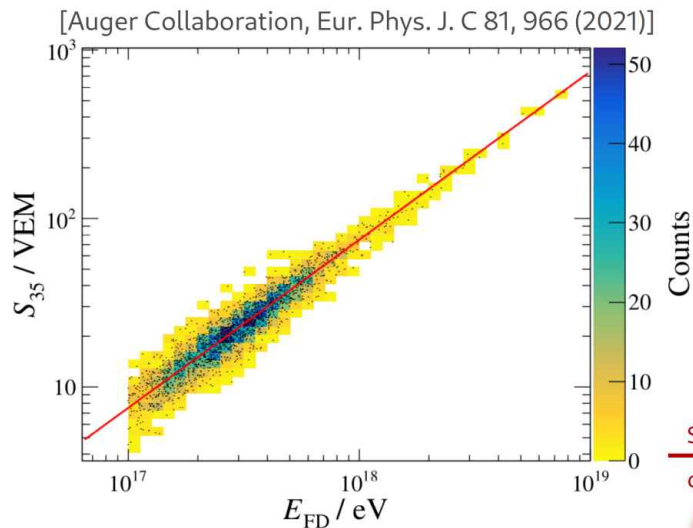


FD energy scale based on **fluorescence yield** measurement

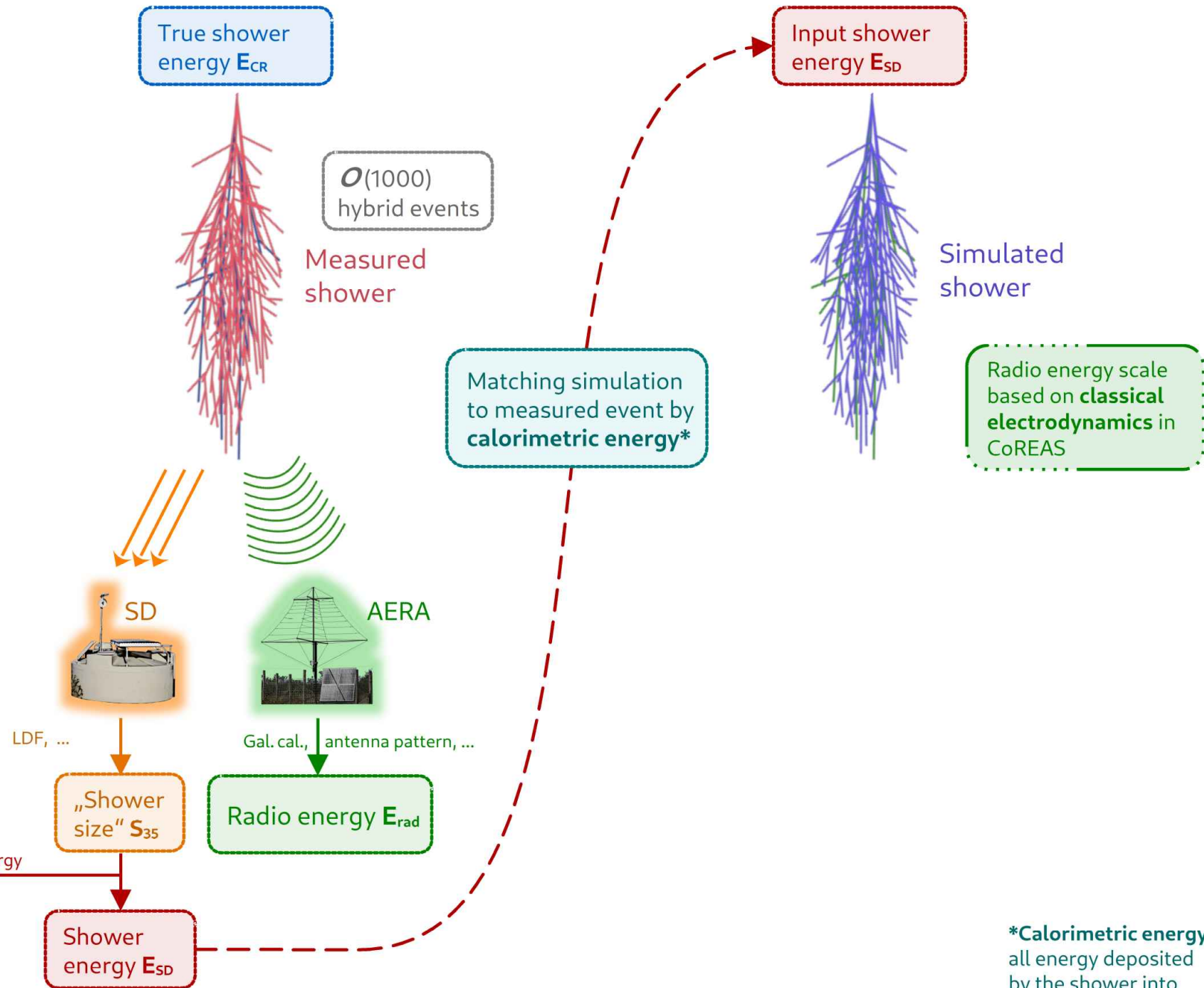


Comparing **FD** and **Radio** energy scales

- „Top-down“-like approach
- Hybrid **SD** – **AERA** events
 - $E > 3 \cdot 10^{17}$ eV, $\theta < 55^\circ$
- Event simulations CORSIKA + CoREAS



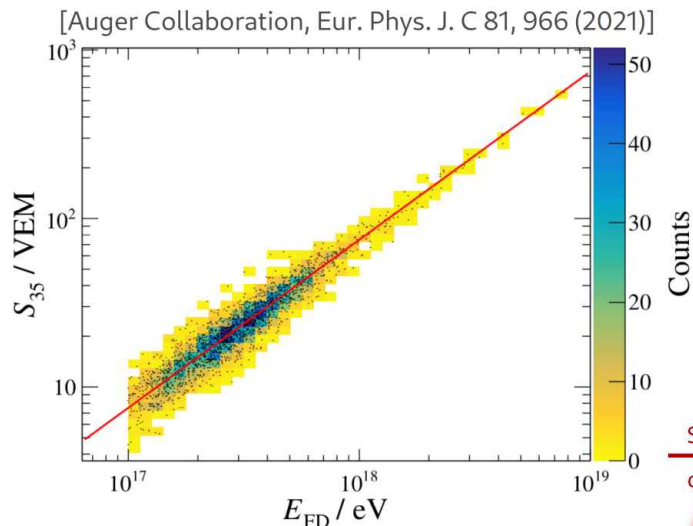
FD energy scale based on **fluorescence yield** measurement



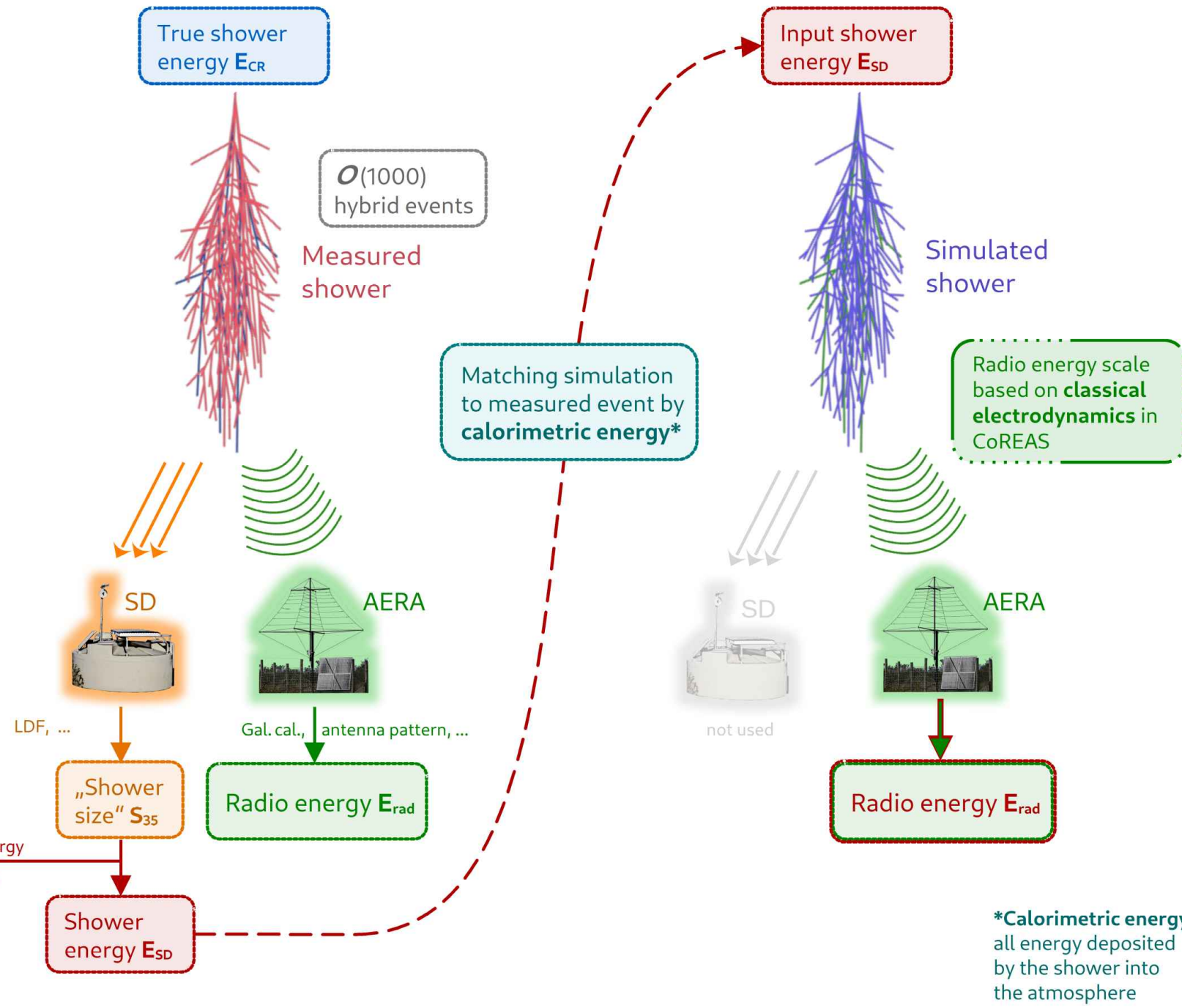
***Calorimetric energy:** all energy deposited by the shower into the atmosphere

Comparing **FD** and **Radio** energy scales

- „Top-down“-like approach
- Hybrid **SD** – **AERA** events
 - $E > 3 \cdot 10^{17}$ eV, $\theta < 55^\circ$
- Event simulations CORSIKA + CoREAS

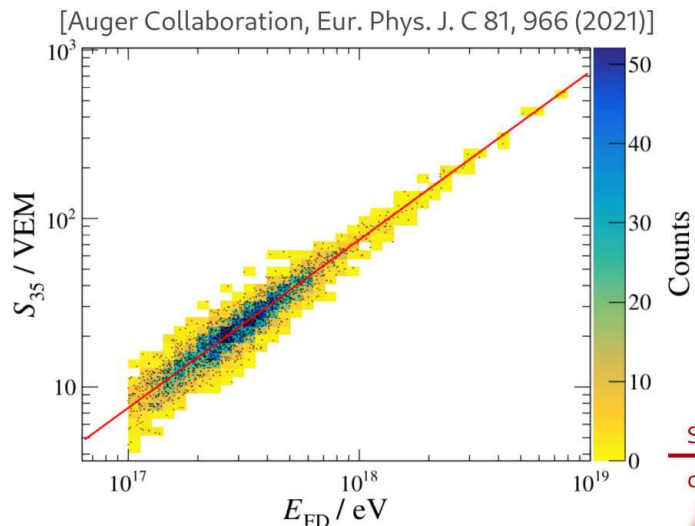


FD energy scale based on **fluorescence yield** measurement

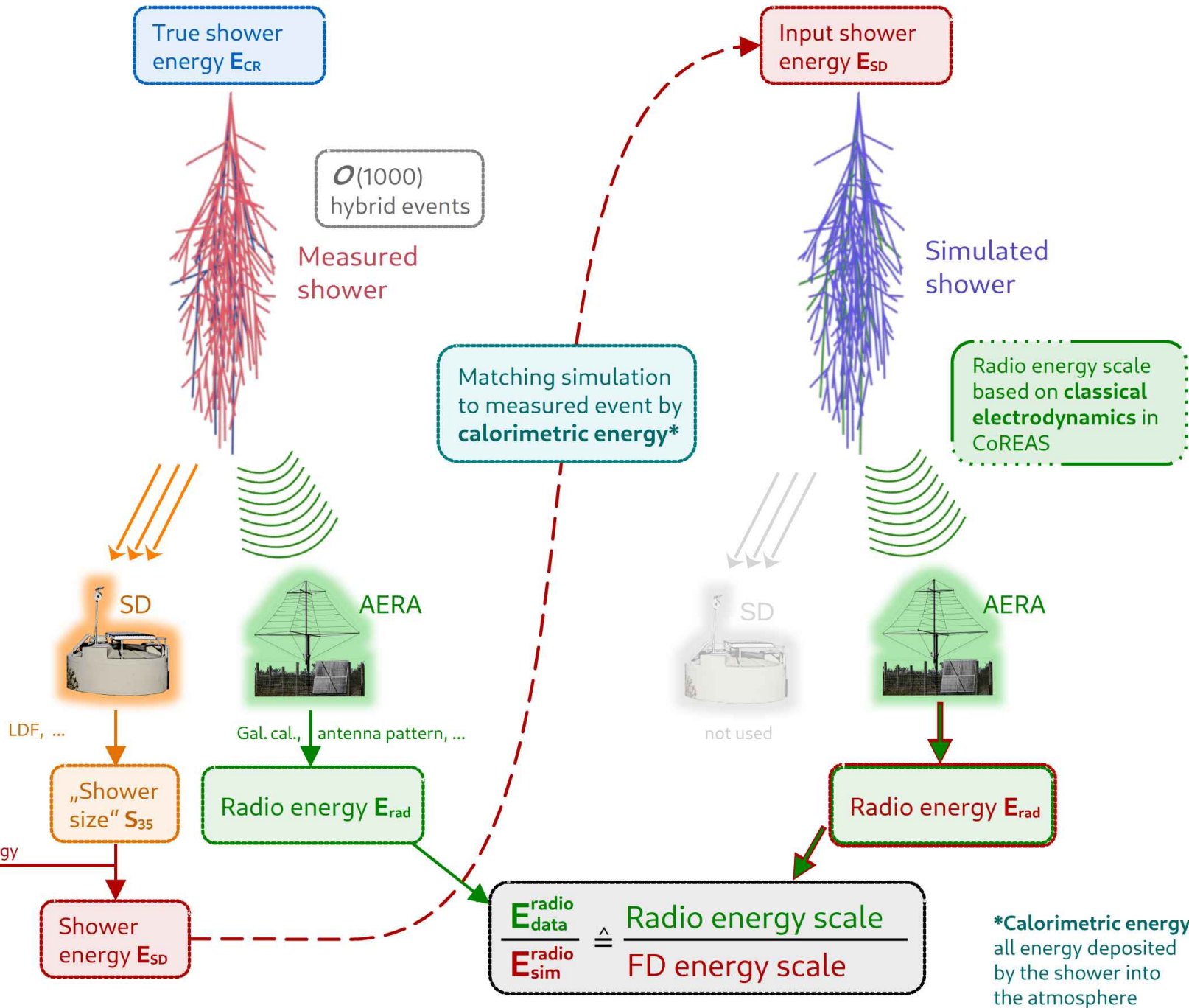


Comparing **FD** and **Radio** energy scales

- „Top-down“-like approach
- Hybrid **SD** – **AERA** events
 - $E > 3 \cdot 10^{17}$ eV, $\theta < 55^\circ$
- Event simulations CORSIKA + CoREAS



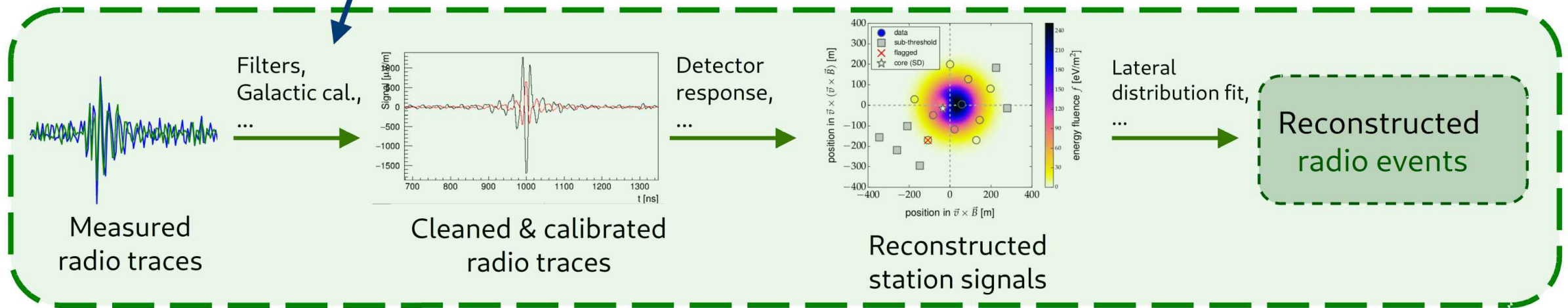
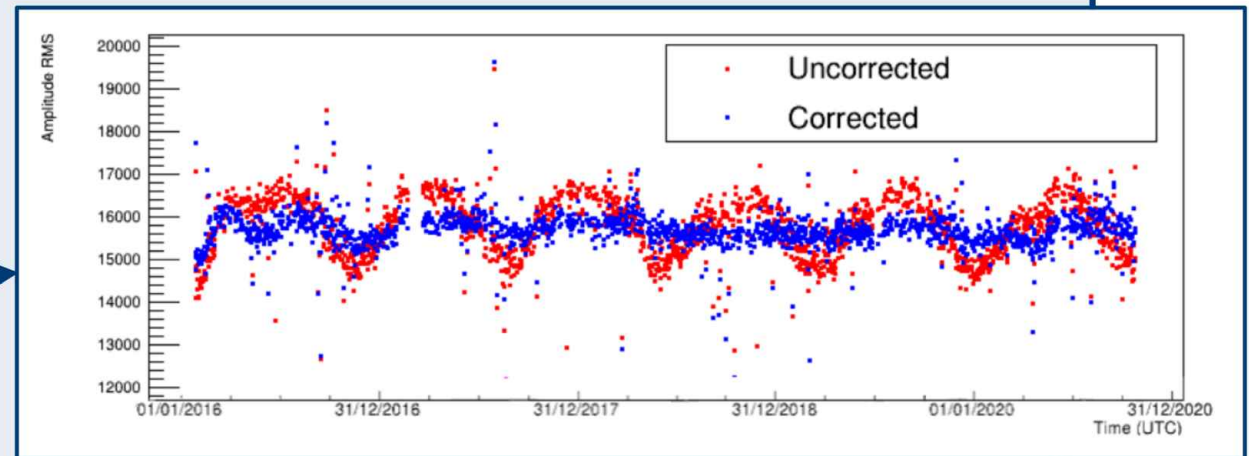
FD energy scale based on **fluorescence yield** measurement



Radio event reconstruction with AERA

Correcting temperature dependence of amplifier gains

- Temperature-dependent amplifier gains
- Event-by-event fluctuations on CR energy $\sim 4\%$
- Dependency measured and corrected with temperature data from nearby sensors
 - Fluctuations reduced to $\sim 1\%$ level

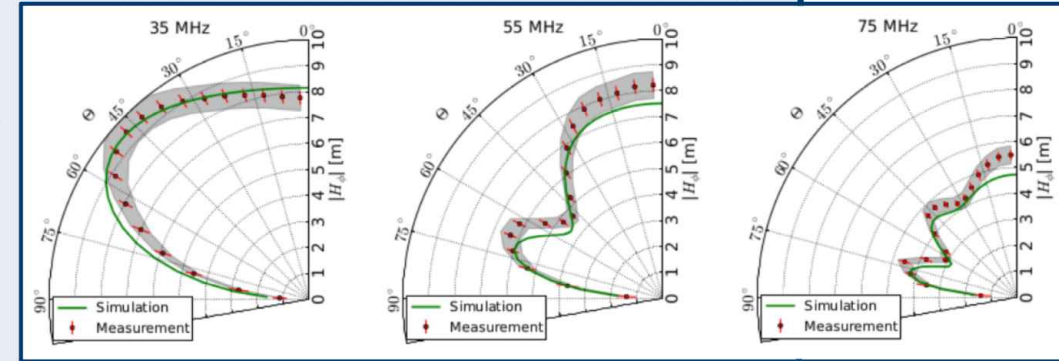


Radio event reconstruction with AERA

AERA detector response

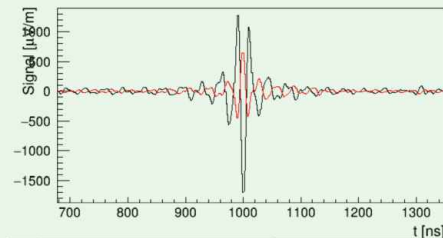
- Signal chain (filters, amplifiers, ...) measured in lab
 - Incorporated in signal reconstruction
- Directional antenna response (antenna pattern)
 - LPDA: measured, Butterfly: simulated
 - Verification of patterns with drone-based measurements
 - Small-scale mismatches average out
 - Absolute offsets absorbed in Galactic calibration

[Auger Collaboration, 2017 JINST 12 T10005]



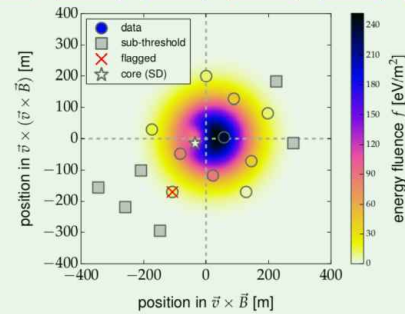
Measured radio traces

Filters,
Galactic cal.,
...



Cleaned & calibrated radio traces

Detector response,
...



Reconstructed station signals

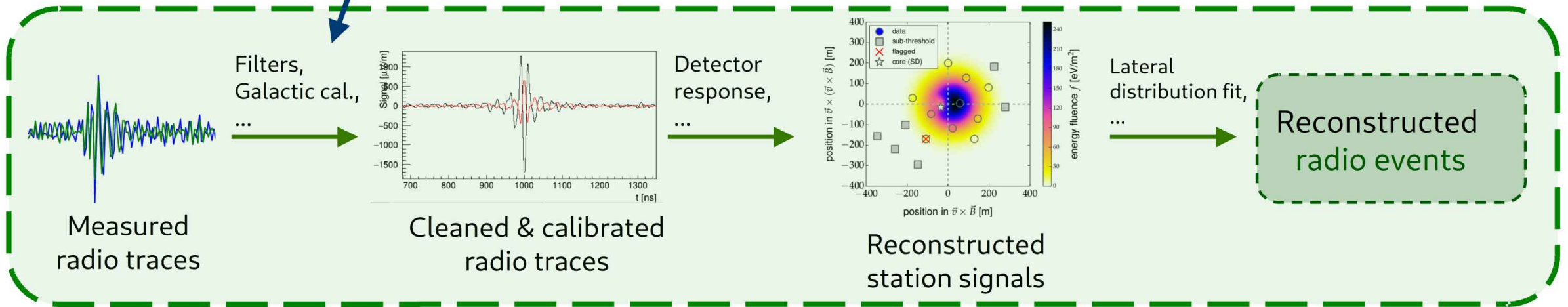
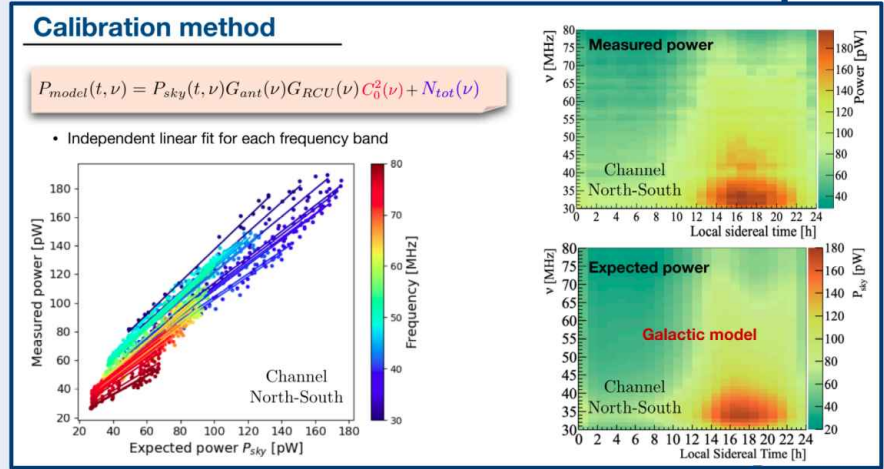
Lateral distribution fit,
...

Reconstructed radio events

Radio event reconstruction with AERA

Galactic calibration (see ARENA talk by D. Correia dos Santos / T. Huege)

- Galaxy dominates background signal
- Sky models predict Galactic radio emission
 - Earlier estimate for absolute scale uncertainty: $\sim 6\%$
[MB, T. Fodran & T. Huege, A&A, 679 (2023) A50]
- Fit measured background to prediction
 - Calibrate each channel of each station per freq. & month
 - Including signal chain and AERA detector response
 - Systematic uncertainty of absolute energy scale: $\sim 6\%$



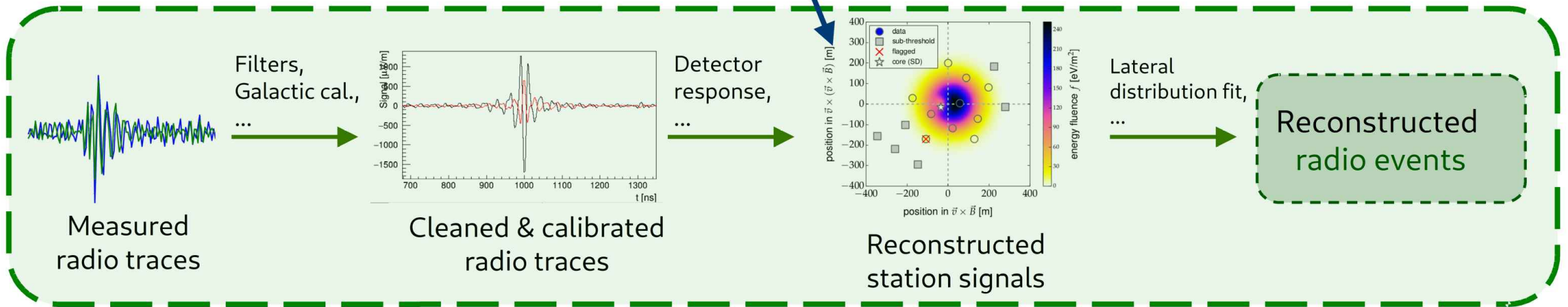
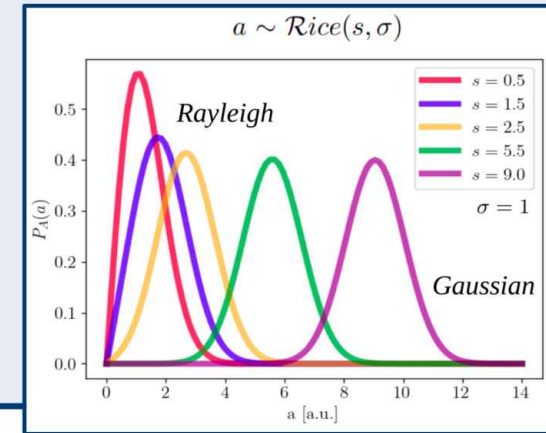
Radio event reconstruction with AERA

Station-signal estimation

Estimation of energy fluence:

- Currently: simple noise subtraction approach
 - Bias (especially for low signals) → SNR cut necessary
- New development: signal estimation based on Rice distributions (see ARENA talk by S. Martinelli)
 - Lower SNR cut possible with significantly reduced bias

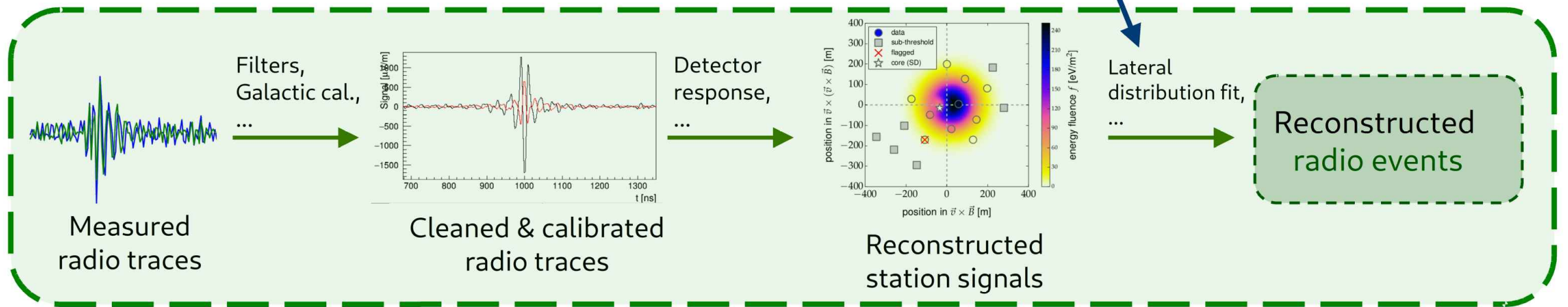
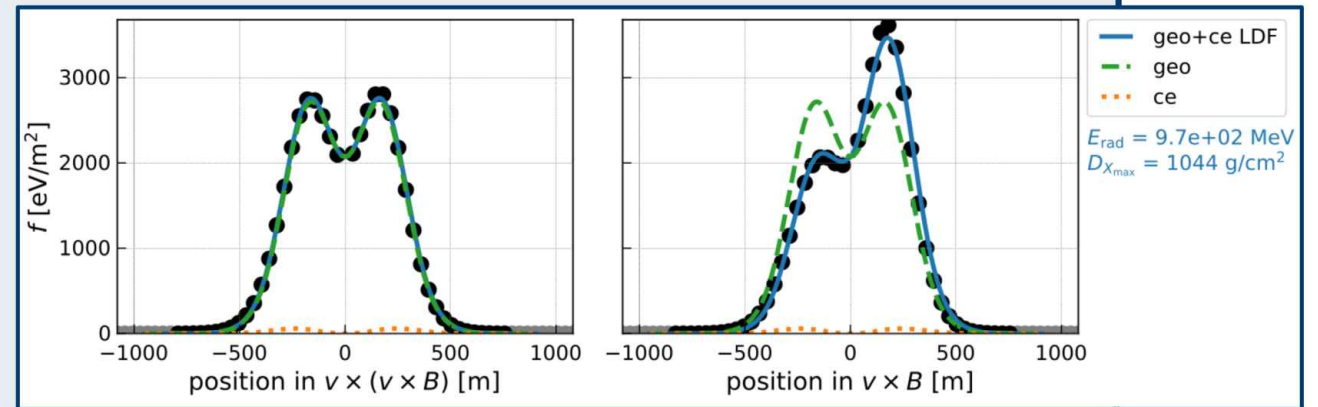
$$f = \epsilon_0 c \left(\Delta t \sum_{t_1}^{t_2} |\vec{E}(t_i)|^2 - \Delta t \frac{t_2 - t_1}{t_4 - t_3} \sum_{t_3}^{t_4} |\vec{E}(t_i)|^2 \right)$$



Radio event reconstruction with AERA

GeoCE LDF [C. Glaser et al. Astropart. Phys. 104 (2019) 64 – 77]

- Fit of signal distribution with model from geomagnetic and charge-excess contributions
- Yields best-fit radiation energy and core pos.
 - Safe against bias in ext. core estimates
- No mass-bias found
- Energy resolution: 2% on CR energy



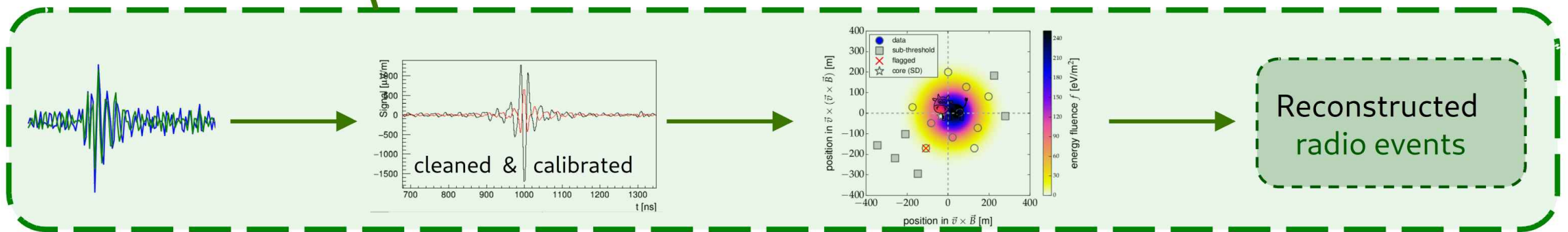
Radio event reconstruction with AERA

Equivalence of data reconstruction & simulation reconstruction

- During reconstruction, biases may be introduced
 - Pulse cleaning, signal estimation, ...
 - Effects checked to be the same when reconstructing data and simulations
- Expect biases to cancel out in event-by-event comparison of data and simulations

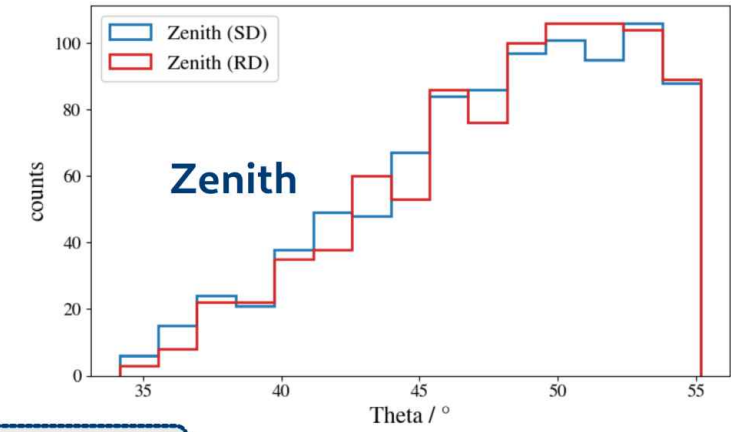
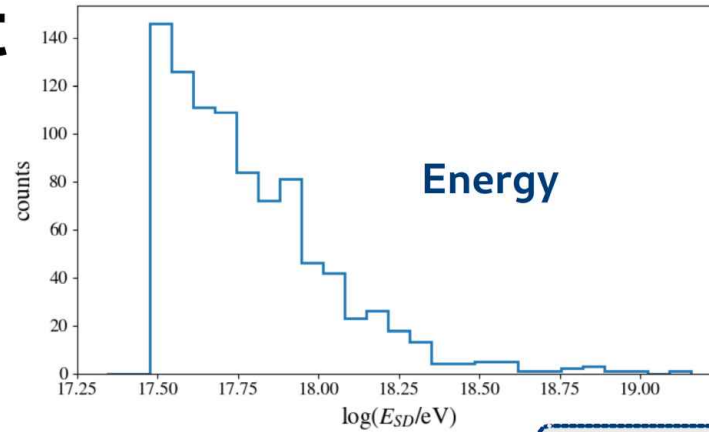
Event simulations (CORSIKA + CoREAS)

- Matching as close as possible to measured events:
 - Real AERA grid
 - Add measured noise taken close to time of event
 - GDAS atmosphere (time resolution: 3h)
- High-precision:
- Thinning 10^{-6} and STEPFC 0.05
 - Per event: 1x proton, 1x iron

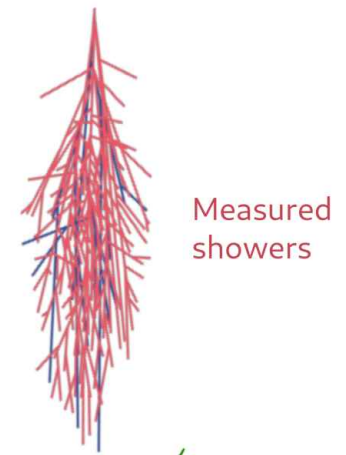
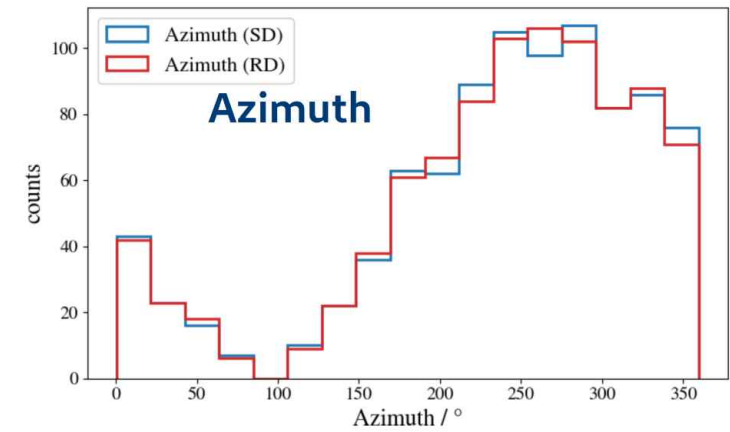
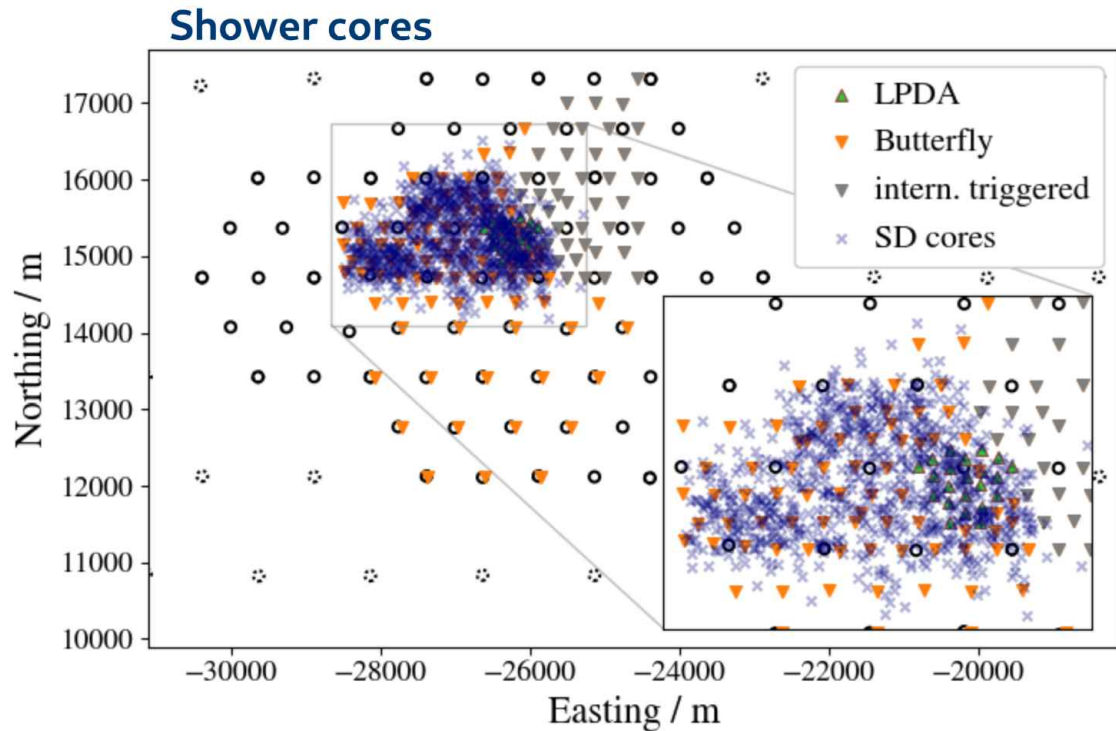


Hybrid SD-AERA dataset

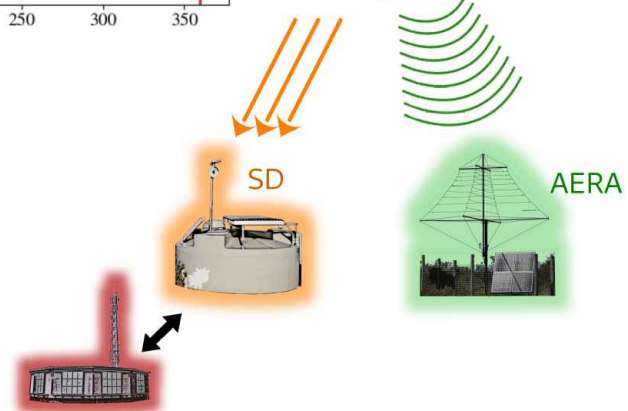
- Years 2013 – 04/2019 are processed
- 05/2019 – 12/2022 to be added soon
 - End of Auger Phase I
- Quality SD cuts (6T5) + quality AERA cuts
 - 5 signal stations + successful LDF fit
 - 925 high-quality events (+ 50~100% more)
- SD dataset will have defined FD energy scale



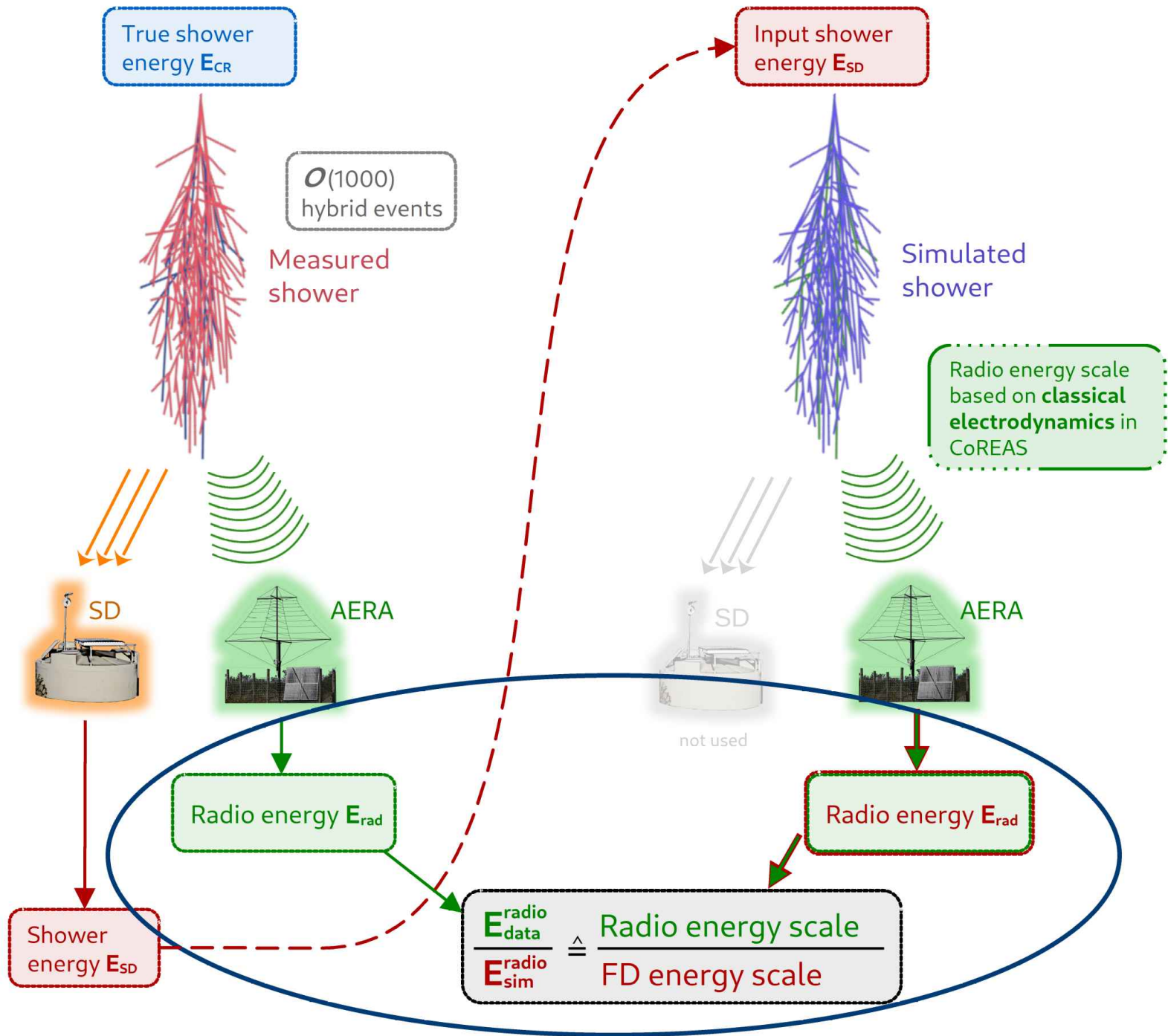
looking as expected



- Event cuts:
- $E_{SD} > 3e+17$ eV
 - #Stations(signal) ≥ 5
 - distance between SD and RD cores < 400 m
 - $\theta > 0.0^\circ$
 - $\theta < 55.0^\circ$



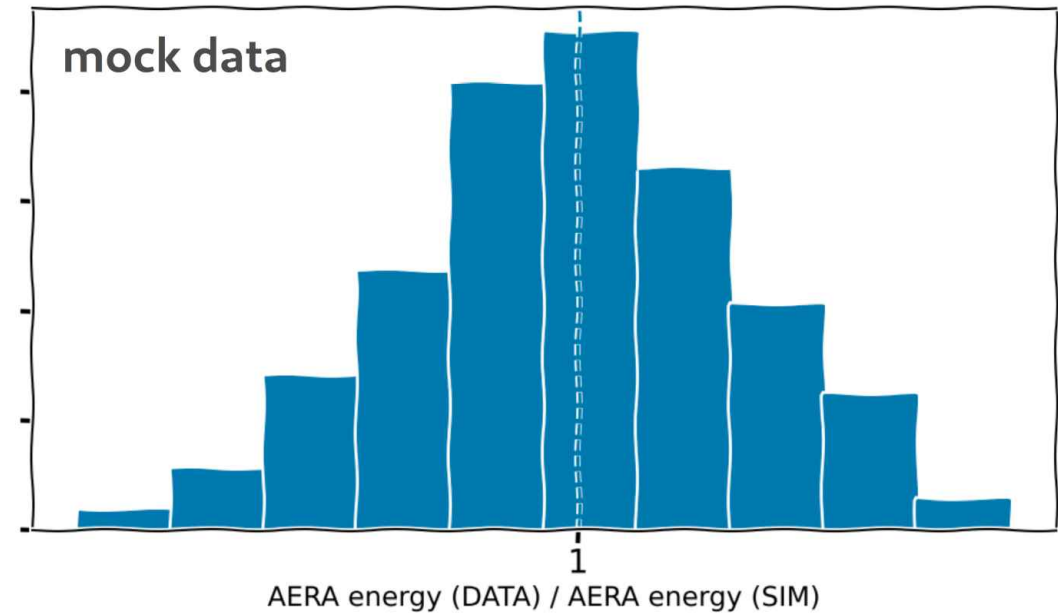
Comparing **FD** and **Radio** energy scales



OUTLOOK: Comparison of energy scales

With complete dataset and simulations:

- Currently working on best metric to determine **FD-Radio** energy scale agreement
- Good statistics will allow to study potential biases and dependencies
 - Antenna type (LPDA-only vs. Butterfly-only)
 - Long-term stability
 - Seasonal variation
 - Frequency, zenith, energy
 - ...
- Unfortunately can't show preliminary work



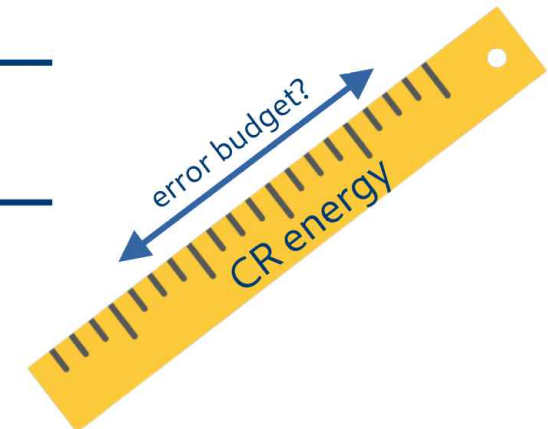
OUTLOOK: Systematic uncertainties of the **radio energy scale**

- Earlier uncertainty estimate of **radio energy scale**: 14%

[Auger Collaboration, PRL 116, 241101 (2016)]

→ Aim: reach 10%, competitive with **FD**

Ingredient	Status	Comment
Radio emission MC	✓	Good CoREAS / ZHAireS agreement ~3%
AERA detector calibration	✓ ✓ ✓	<ul style="list-style-type: none">• Lab-calibration of detector response• Amplifier temperature correction• Galactic calibration: ~6% uncertainty
Signal reconstruction	✓ ⚠	<ul style="list-style-type: none">• GeoCE LDF resolution 2%• Hopefully soon: improved signal estimation method
Dataset	✓ ⚠	<ul style="list-style-type: none">• 925 (+50~100%) high-quality SD-AERA events• Complete dataset very soon
Event simulations	✓ ✓ ✓	<ul style="list-style-type: none">• Matched to measured events• Measured AERA noise• GDAS atmospheres



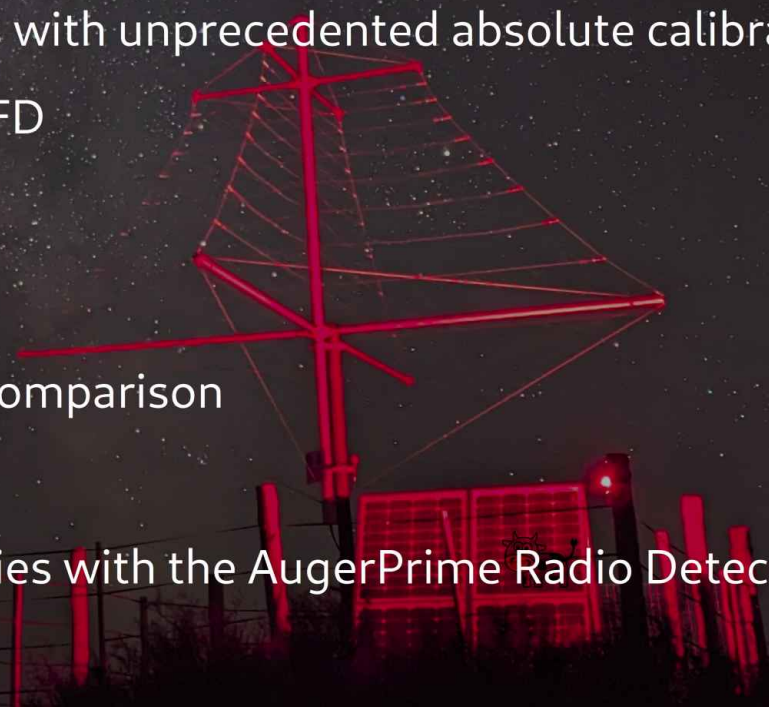


Summary

- Analysis of CR energy scale with radio
 - Comparison of energy scales at Auger from FD and AERA
 - Hybrid dataset since 2013 → $\mathcal{O}(1000)$ events
 - „Top-down“ like analysis with high-precision event simulations
- Matured AERA event reconstruction
 - Many ingredients coming together to get events with unprecedented absolute calibration
 - Aim: systematic uncertainties competitive with FD

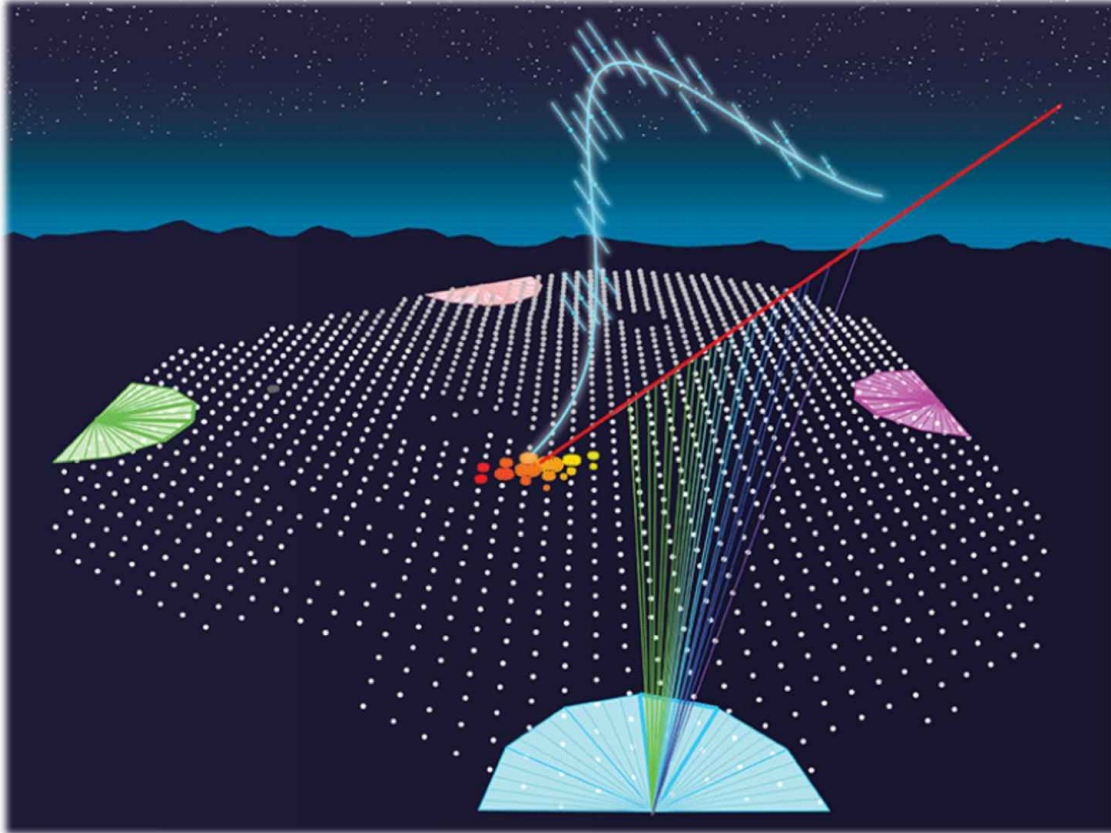
Outlook

- Preparing simulations → working on metric for comparison
- Results to come!
- **Future:** expanding analysis to the highest energies with the AugerPrime Radio Detector (RD)



Backup

FD Auger energy scale – systematic uncertainties



Systematic uncert. in energy scale	
Fluorescence yield	3.6%
Atmosphere	3.4% – 6.2%
FD calibration	9.9%
FD profile recon.	6.5% – 5.6%
Invisible energy	3% – 1.5%
Energy scale stability	5%
TOTAL	14%

Table 1: Current energy scale systematic uncertainties [4]. A range refers to the change in systematic from 3×10^{18} eV to the highest energies.

Radio event reconstruction with AERA

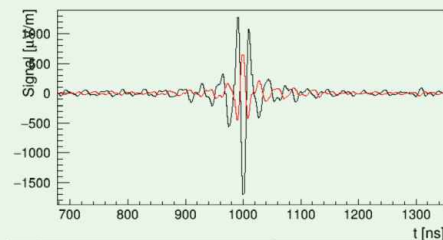
New in-situe drone calibration (see ARENA talk by A. Reuzki)

- Sophisticated drone campaign with ext. transmission antenna
- Measurement of directional antenna response
- Expected result:
 - Verification or adjustment of simulated antenna response patterns (LPDA & Butterfly) that are used in station-level signal reconstruction



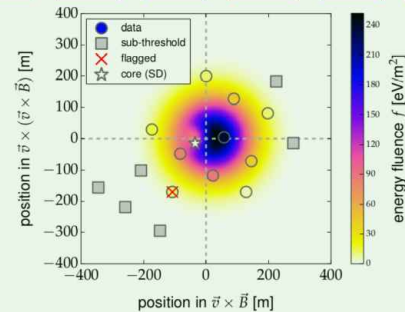
Measured radio traces

Filters,
Galactic cal.,
...



Cleaned & calibrated radio traces

Detector response,
...

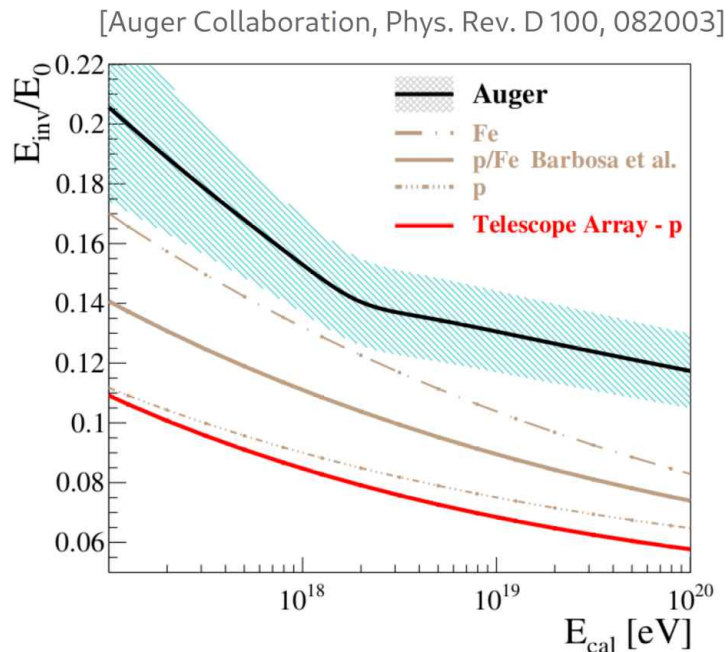


Reconstructed station signals

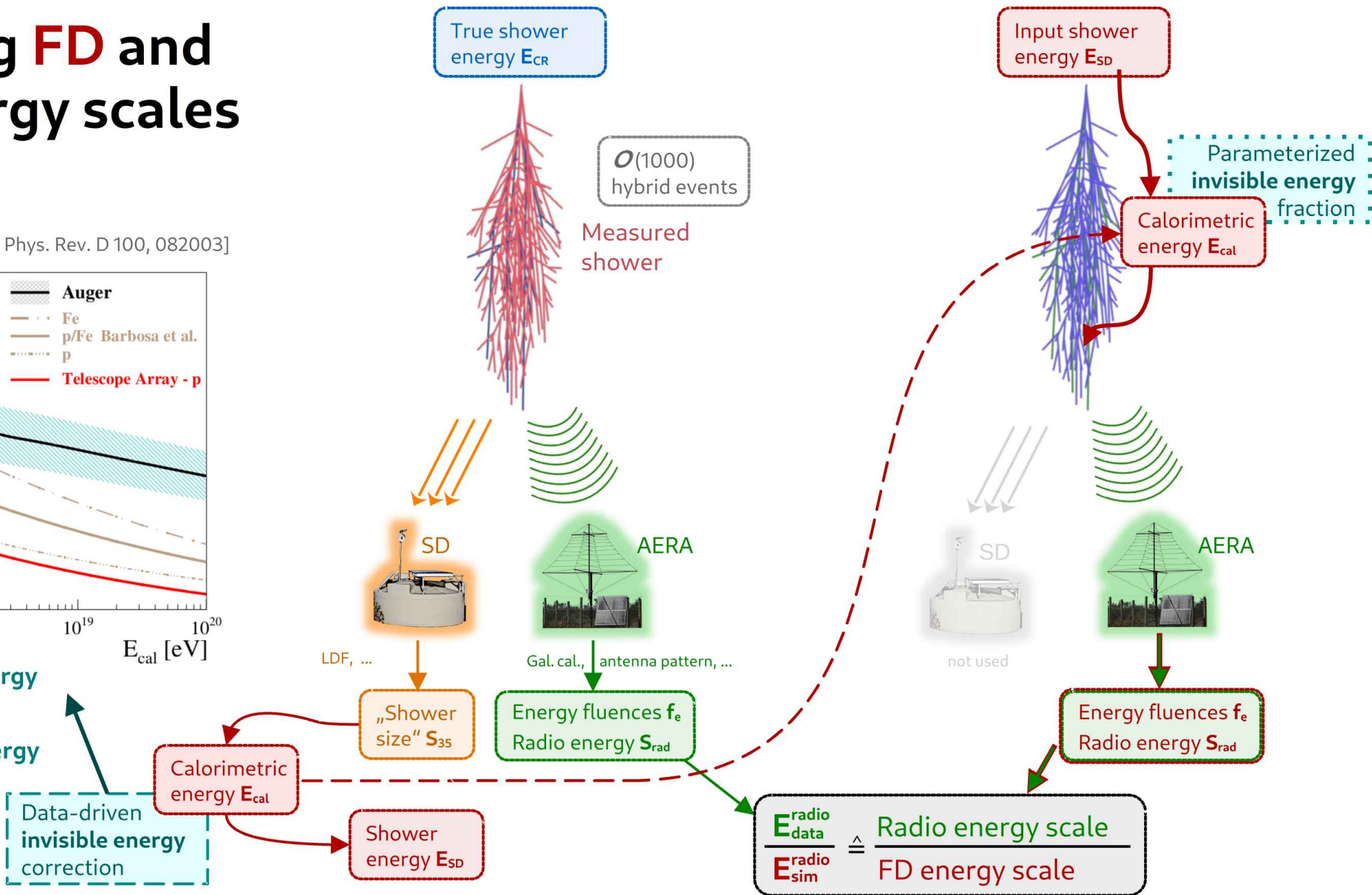
Lateral distribution fit,
...

Reconstructed radio events

Comparing **FD** and **Radio** energy scales



- Take out **invisible energy** correction **in data**
- Factor in **invisible energy** **in simulations**

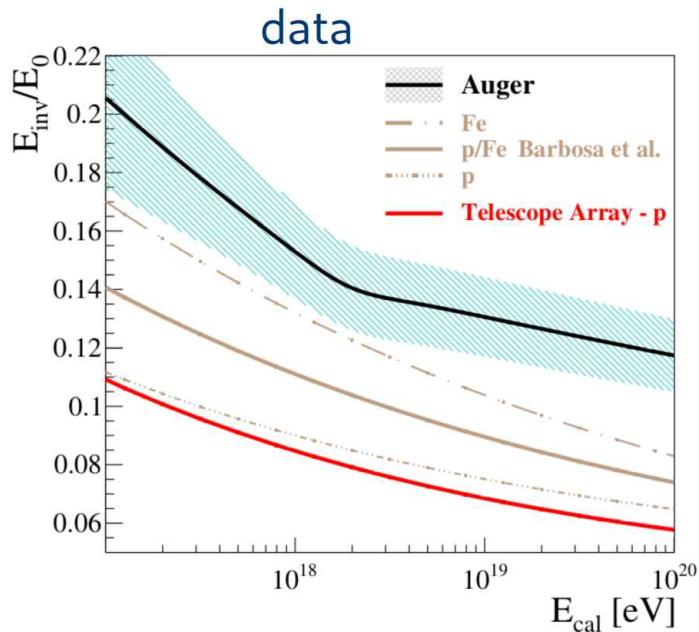


Event simulations

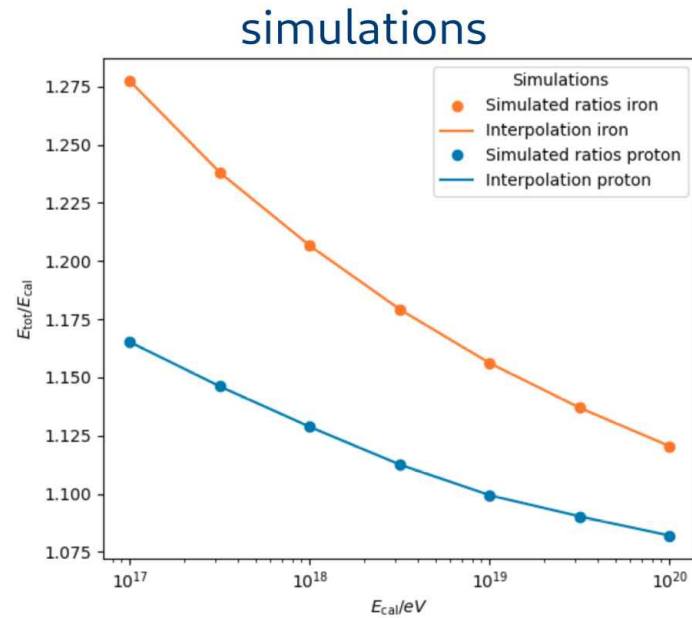
- **CORSIKA + CoREAS** event simulations
 - SD energy as input
 - SD shower geometry as input
 - ↪ No dependency on radio reconstruction
 - Sibyll 2.3d + UrQMD
 - THINNING 1e-6

- STEPFC 0.05
- GDAS atmosphere
- 2 simulations per shower: p + Fe
- AERA station grid

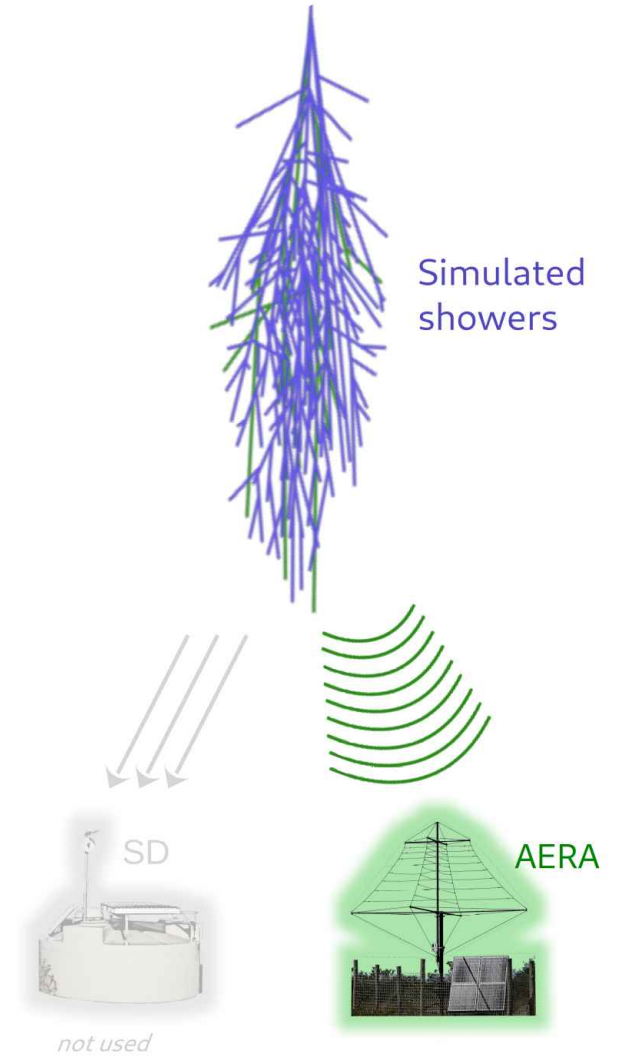
invisible energy



Data-driven
invisible energy
correction

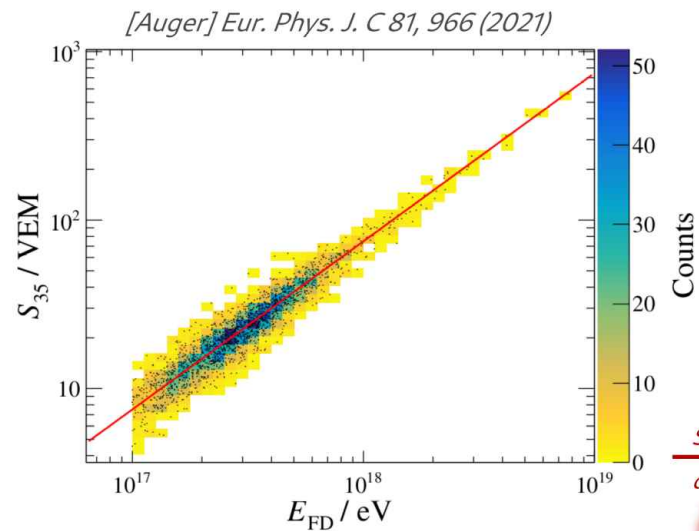


Parameterized
invisible energy
fraction

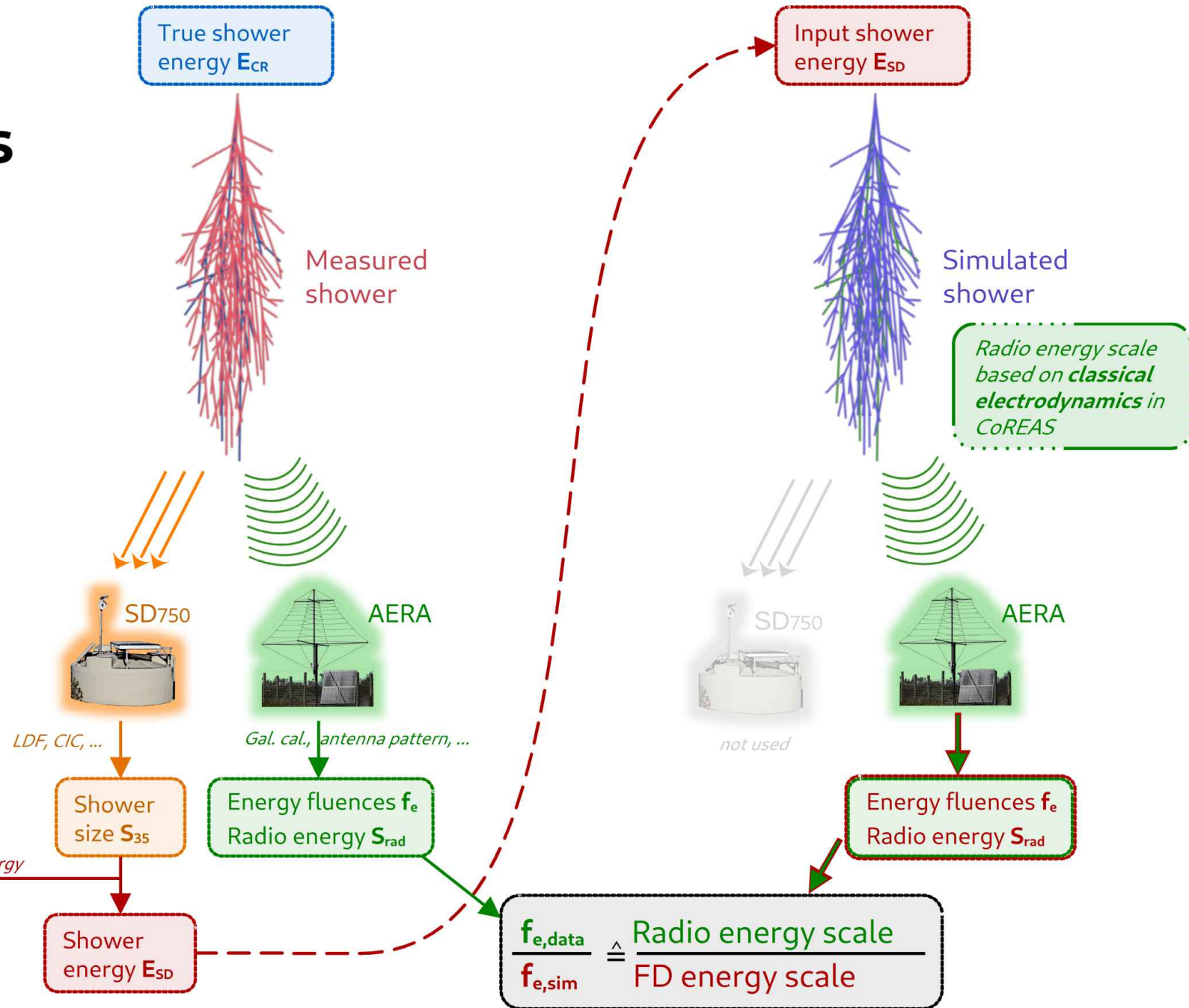


Hybrid Showers – Data and Simulations

- Proposed methodology for comparing FD & Radio energy scales
- Hybrid SD750 – AERA events
 - $\theta < 55^\circ$
- Event simulations CORSIKA + CoREAS
- Ratio/difference of radio energy (data/sim)



FD energy scale based on fluorescence yield measurement



Hybrid Showers – Data and Simulations

Potential source for a bias?

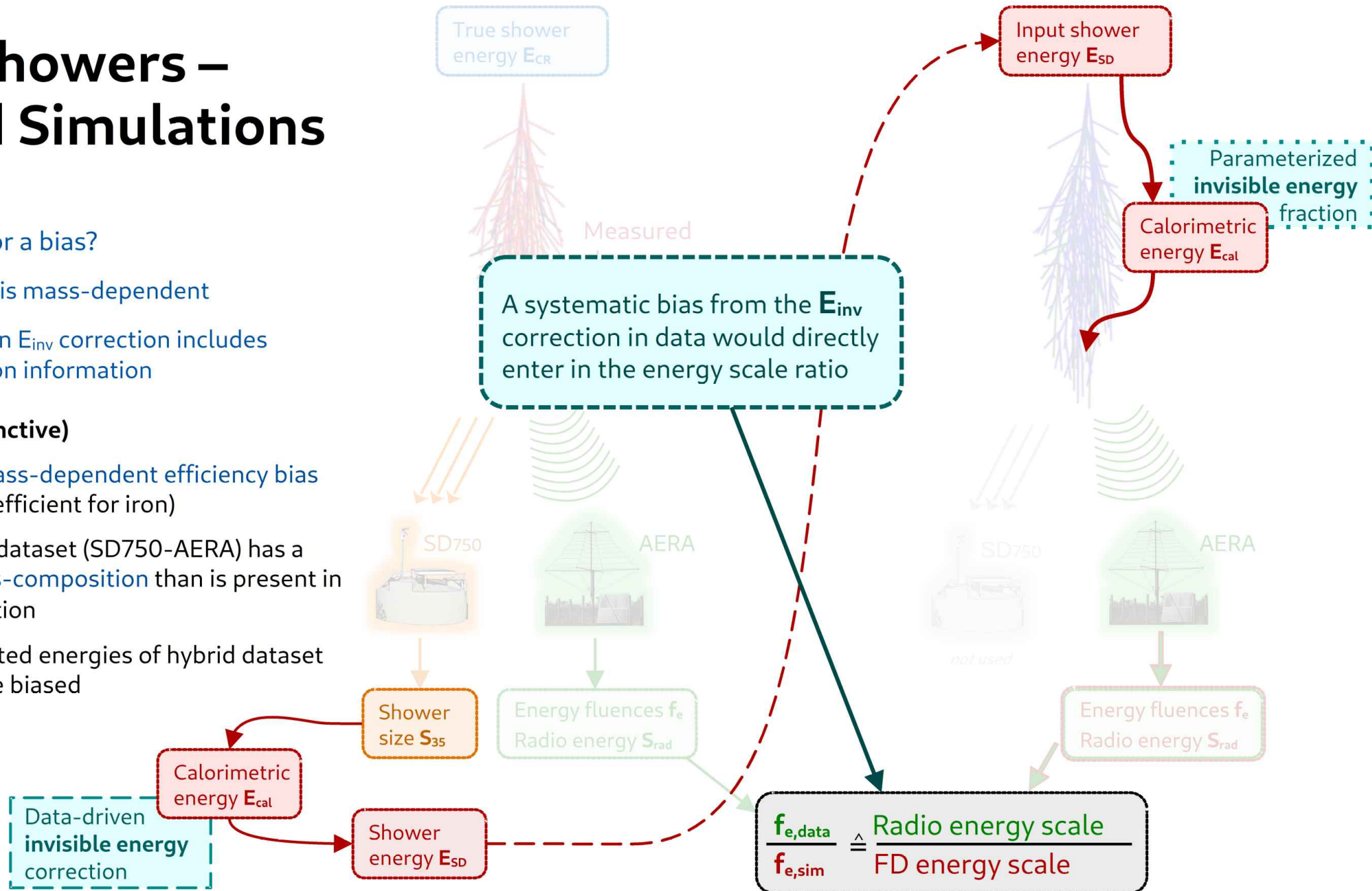
- E_{inv} / E_{CR} fraction is mass-dependent
- Auger data-driven E_{inv} correction includes mass-composition information

Scenario: (subjunctive)

AERA has a mass-dependent efficiency bias (e.g. not fully efficient for iron)

→ The hybrid dataset (SD750-AERA) has a different mass-composition than is present in the E_{inv} correction

→ Reconstructed energies of hybrid dataset are on average biased



Hybrid Showers – Data and Simulations

Potential source for a bias?

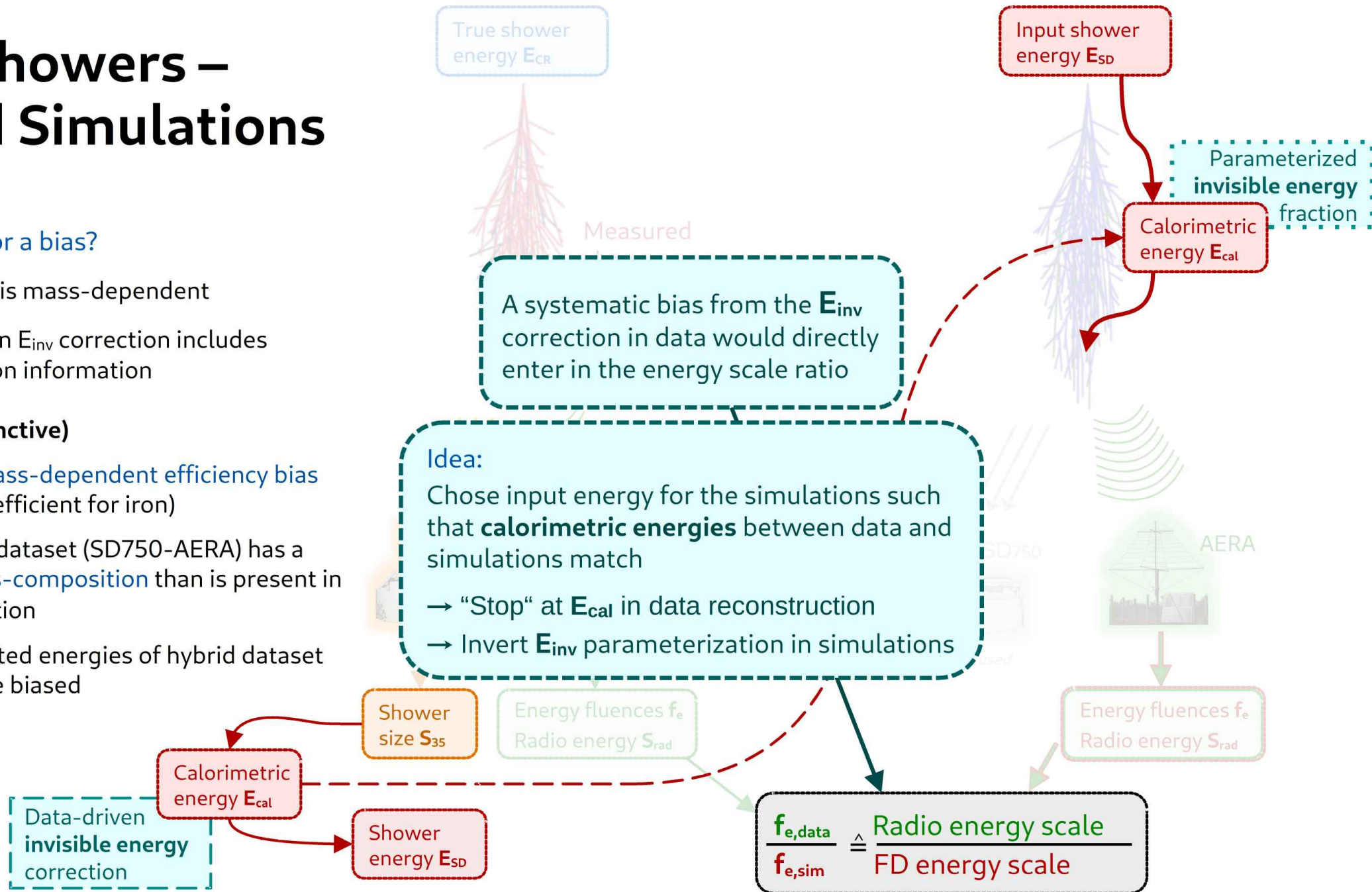
- E_{inv} / E_{CR} fraction is mass-dependent
- Auger data-driven E_{inv} correction includes mass-composition information

Scenario: (subjunctive)

AERA has a **mass-dependent efficiency bias** (e.g. not fully efficient for iron)

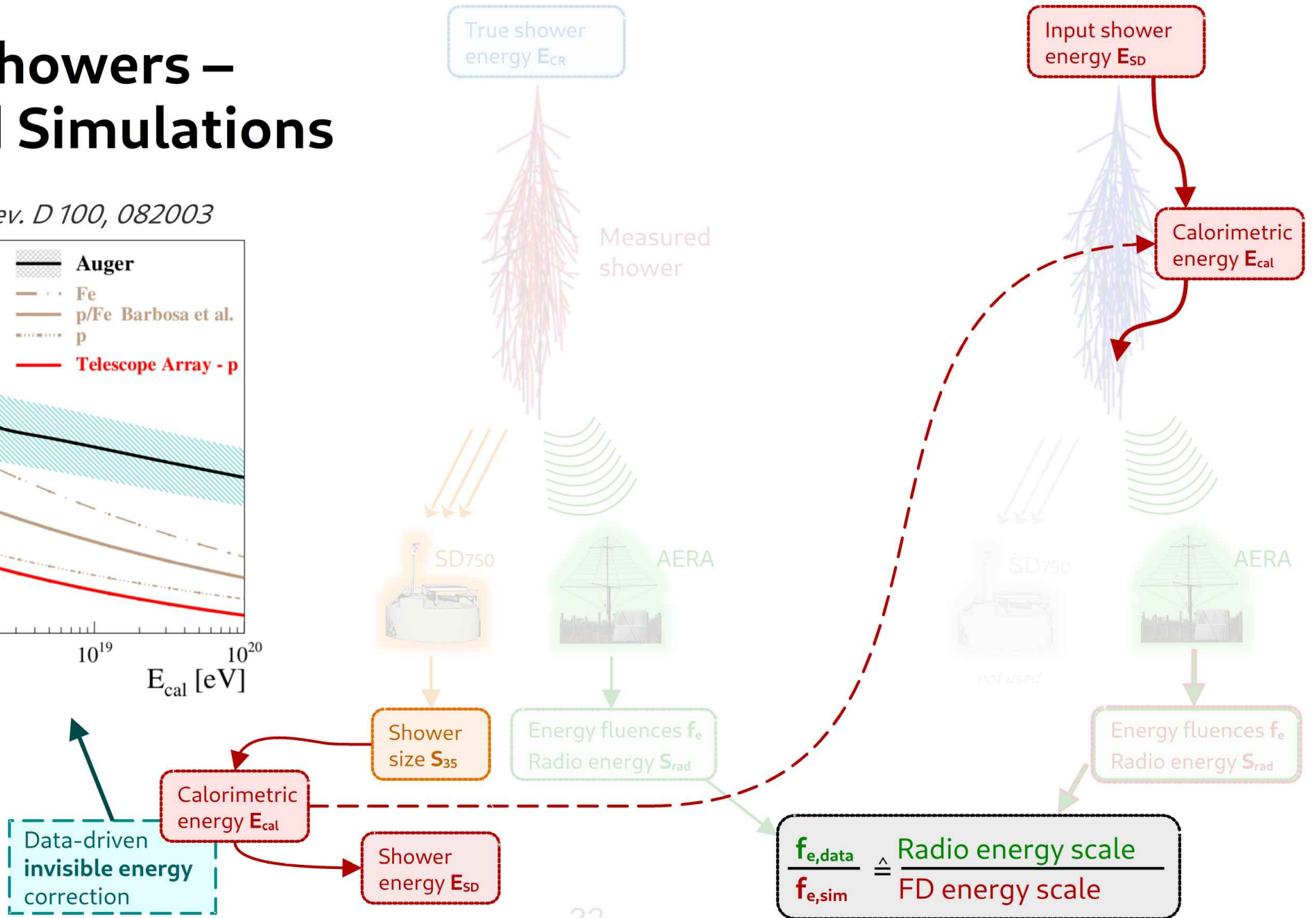
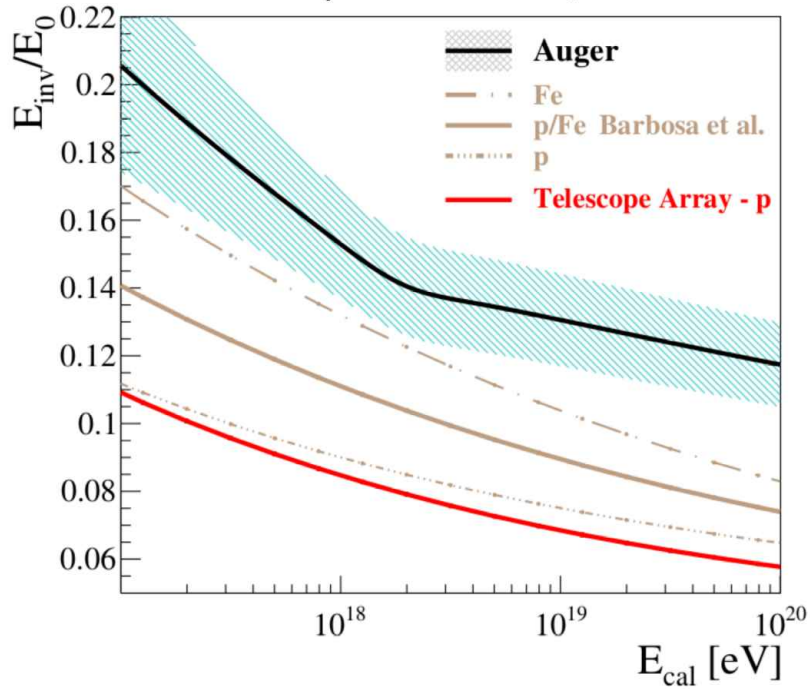
→ The hybrid dataset (SD750-AERA) has a **different mass-composition** than is present in the E_{inv} correction

→ Reconstructed energies of hybrid dataset are on average biased



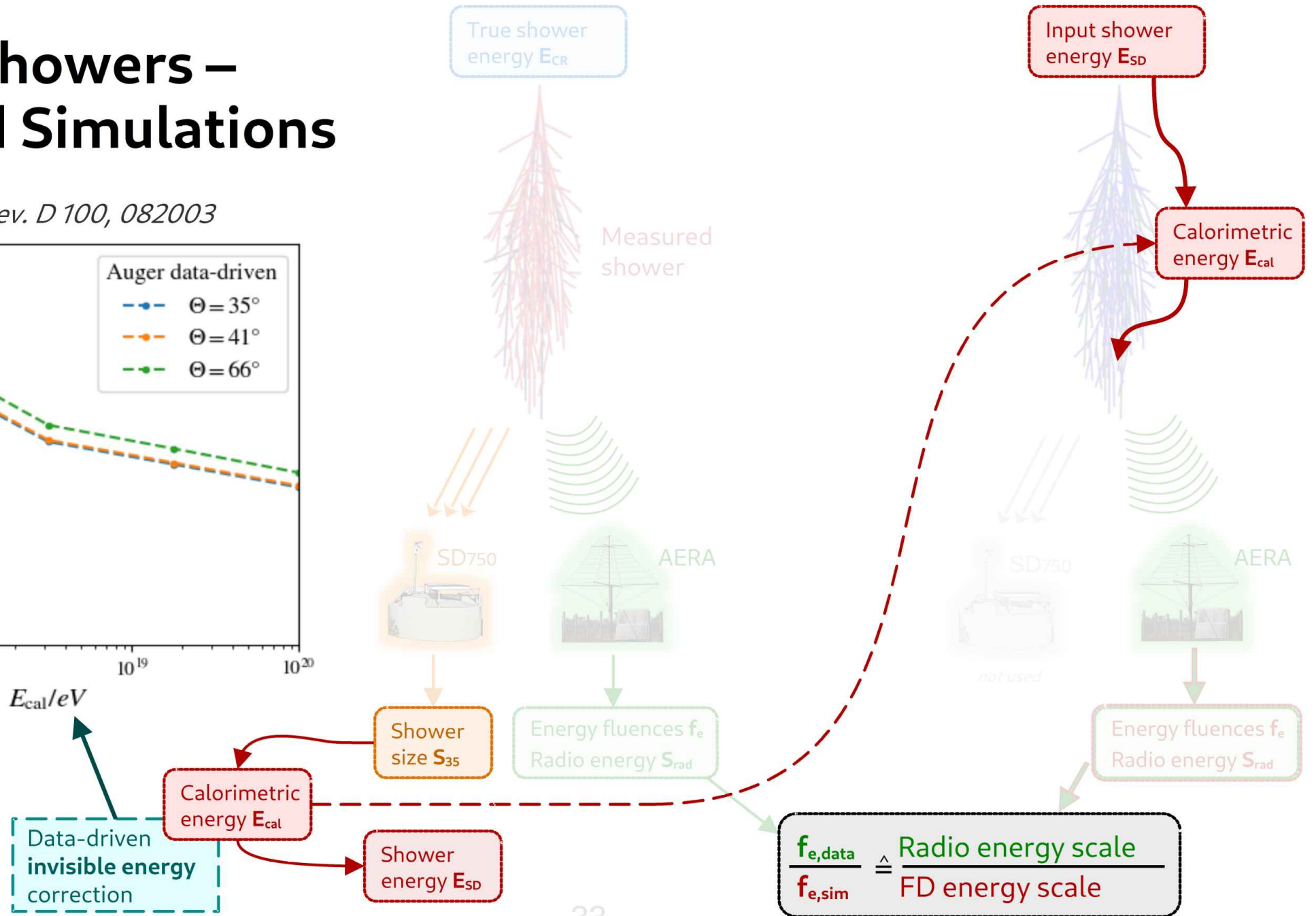
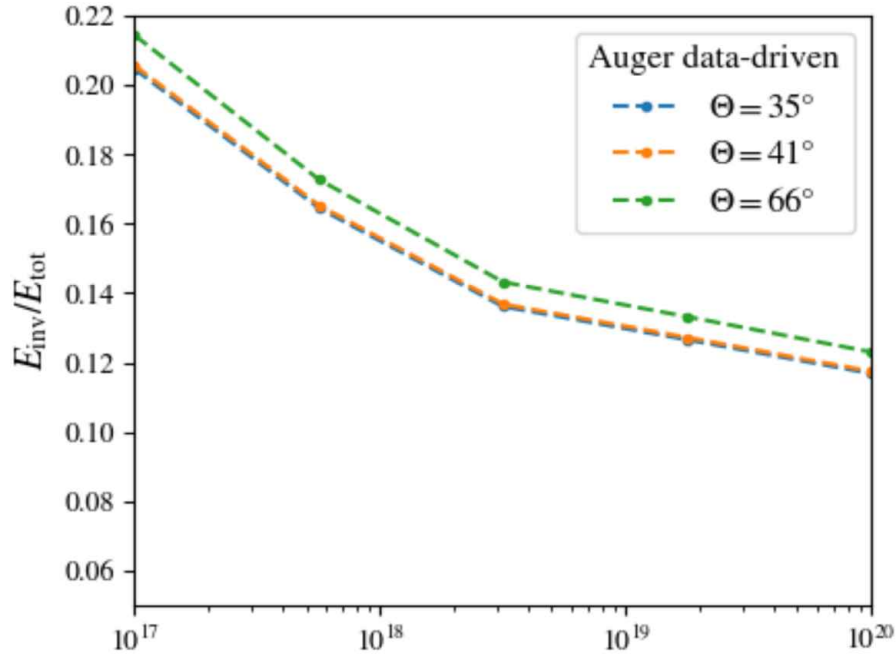
Hybrid Showers – Data and Simulations

from *Phys. Rev. D* 100, 082003



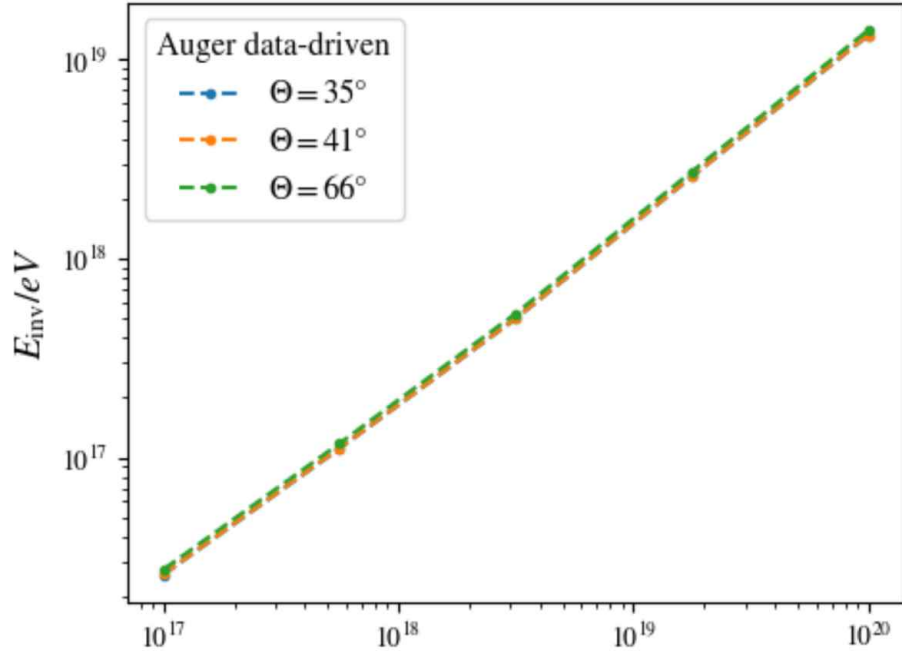
Hybrid Showers – Data and Simulations

from *Phys. Rev. D* 100, 082003



Hybrid Showers – Data and Simulations

from *Phys. Rev. D* 100, 082003



E_{cal}/eV

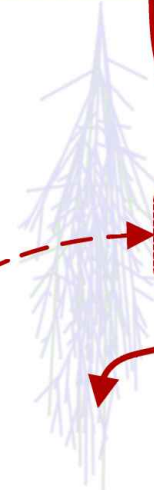
Data-driven invisible energy correction

True shower energy E_{CR}



Measured shower

Input shower energy E_{SD}



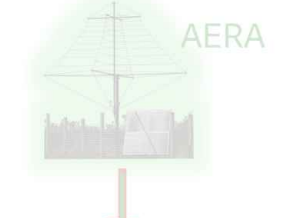
Calorimetric energy E_{cal}

did not dare to try analytic inversion

$$E_{inv} = f(\theta) E_{inv}^l + f(\theta) \frac{1}{2} \left[1 + \tanh \left(K \log_{10} \frac{E_{cal}}{E_{cal}^A} \right) \right] (E_{inv}^h - E_{inv}^l)$$

$$E_{inv}^l = a \left(\frac{E_{cal}^A}{10^{18} \text{ eV}} \right)^b \left(\frac{E_{cal}}{E_{cal}^A} \right)^{b_{extr}}$$

$$E_{inv}^h = a \left(\frac{E_{cal}}{10^{18} \text{ eV}} \right)^b$$



Shower size S_{35}

Energy fluences f_e
Radio energy S_{rad}

Energy fluences f_e
Radio energy S_{rad}

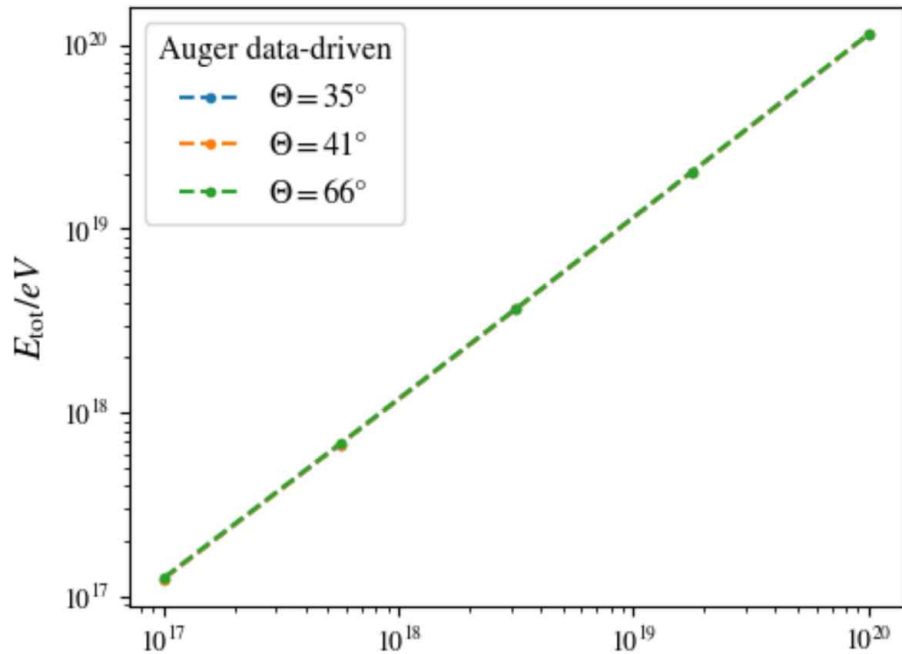
Calorimetric energy E_{cal}

Shower energy E_{SD}

$$\frac{f_{e,data}}{f_{e,sim}} \triangleq \frac{\text{Radio energy scale}}{\text{FD energy scale}}$$

Hybrid Showers – Data and Simulations

from *Phys. Rev. D* 100, 082003



interpolate inverse relation to “recalculate” E_{cal}

$$\hookrightarrow E_{cal}(E_{tot})$$

E_{cal}/eV

Data-driven invisible energy correction

Calorimetric energy E_{cal}

Shower size S_{35}

Shower energy E_{SD}

Energy fluences f_e
Radio energy S_{rad}

$$\frac{f_{e,data}}{f_{e,sim}} \triangleq \frac{\text{Radio energy scale}}{\text{FD energy scale}}$$

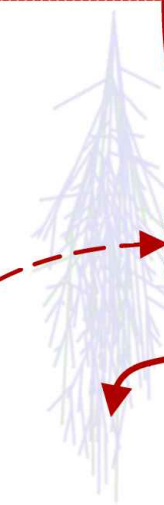
True shower energy E_{CR}



Measured shower



Input shower energy E_{SD}



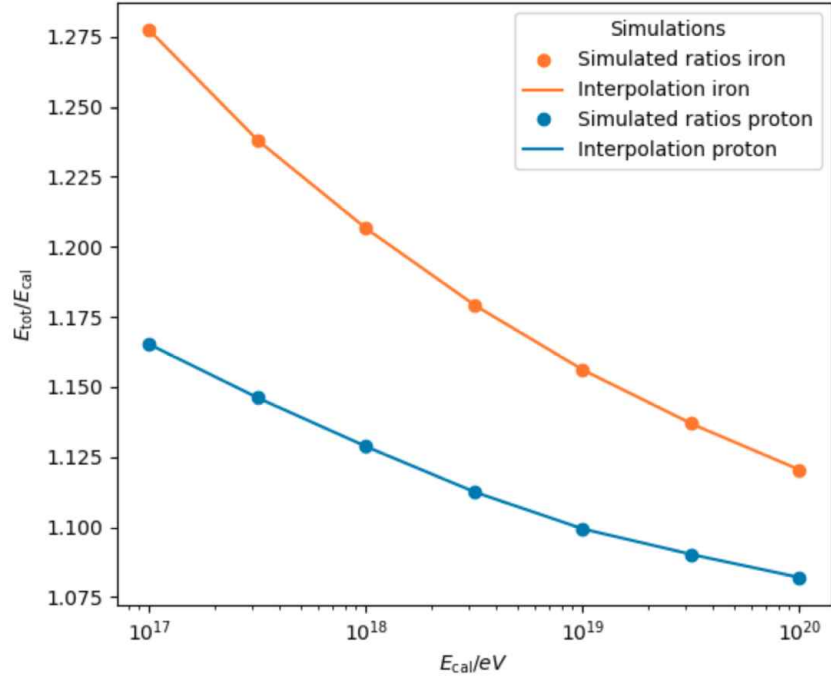
Calorimetric energy E_{cal}



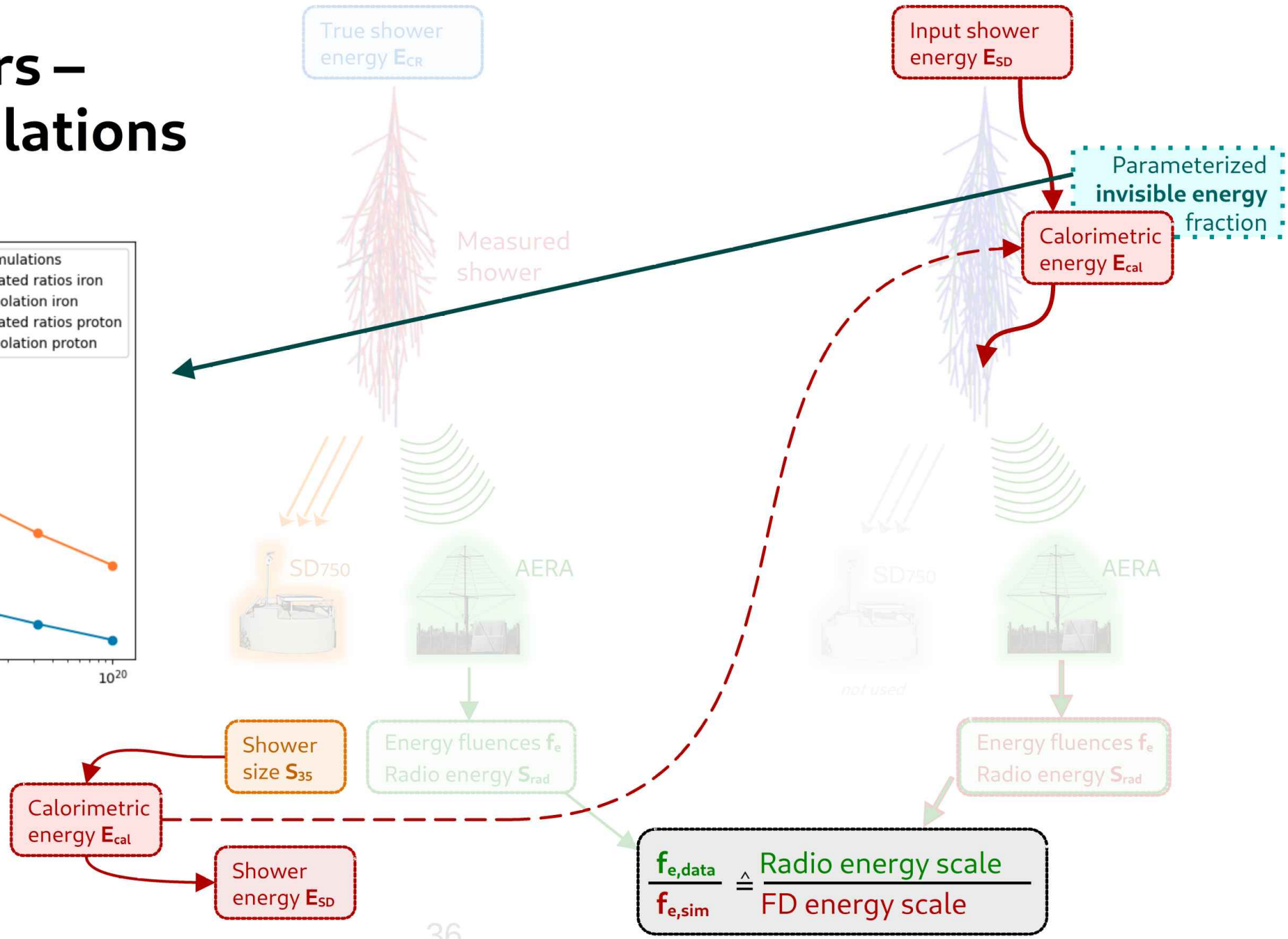
Energy fluences f_e
Radio energy S_{rad}

Hybrid Showers – Data and Simulations

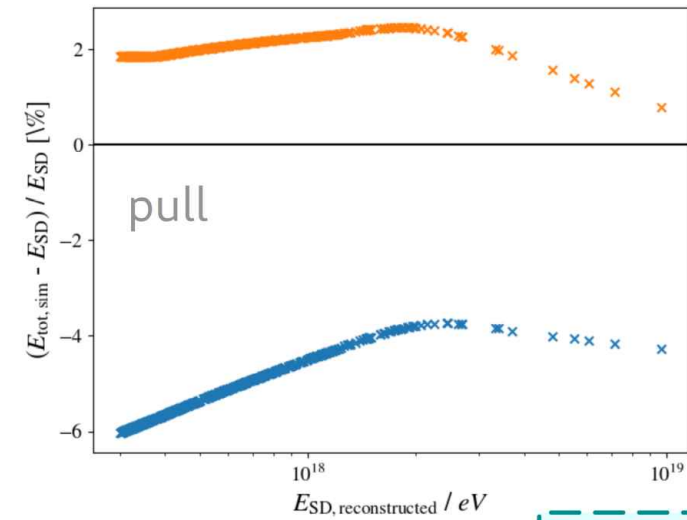
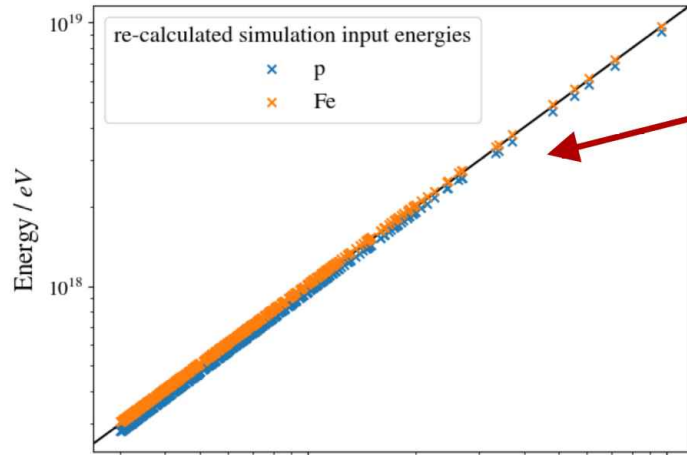
provided by T. Pierog



interpolate to calculate E_{tot} , which is expected to produce desired E_{cal} (separate for proton and iron)

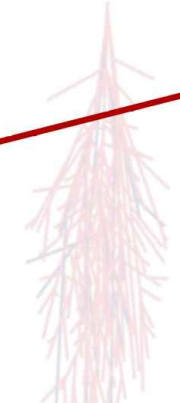


Hybrid Showers – Data and Simulations

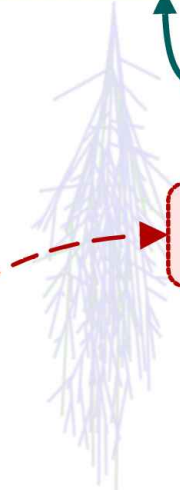


Calculated simulation input energies (p/Fe) vs. Original SD-reconstructed shower energies (incl. data-driven E_{inv} correction)

True shower energy E_{CR}



Input shower energy E_{SD}



Parameterized invisible energy fraction \leftrightarrow *inverted*

Calorimetric energy E_{cal}

AERA



SD750



AERA



Shower size S_{35}

Energy fluences f_e
Radio energy S_{rad}

Energy fluences f_e
Radio energy S_{rad}

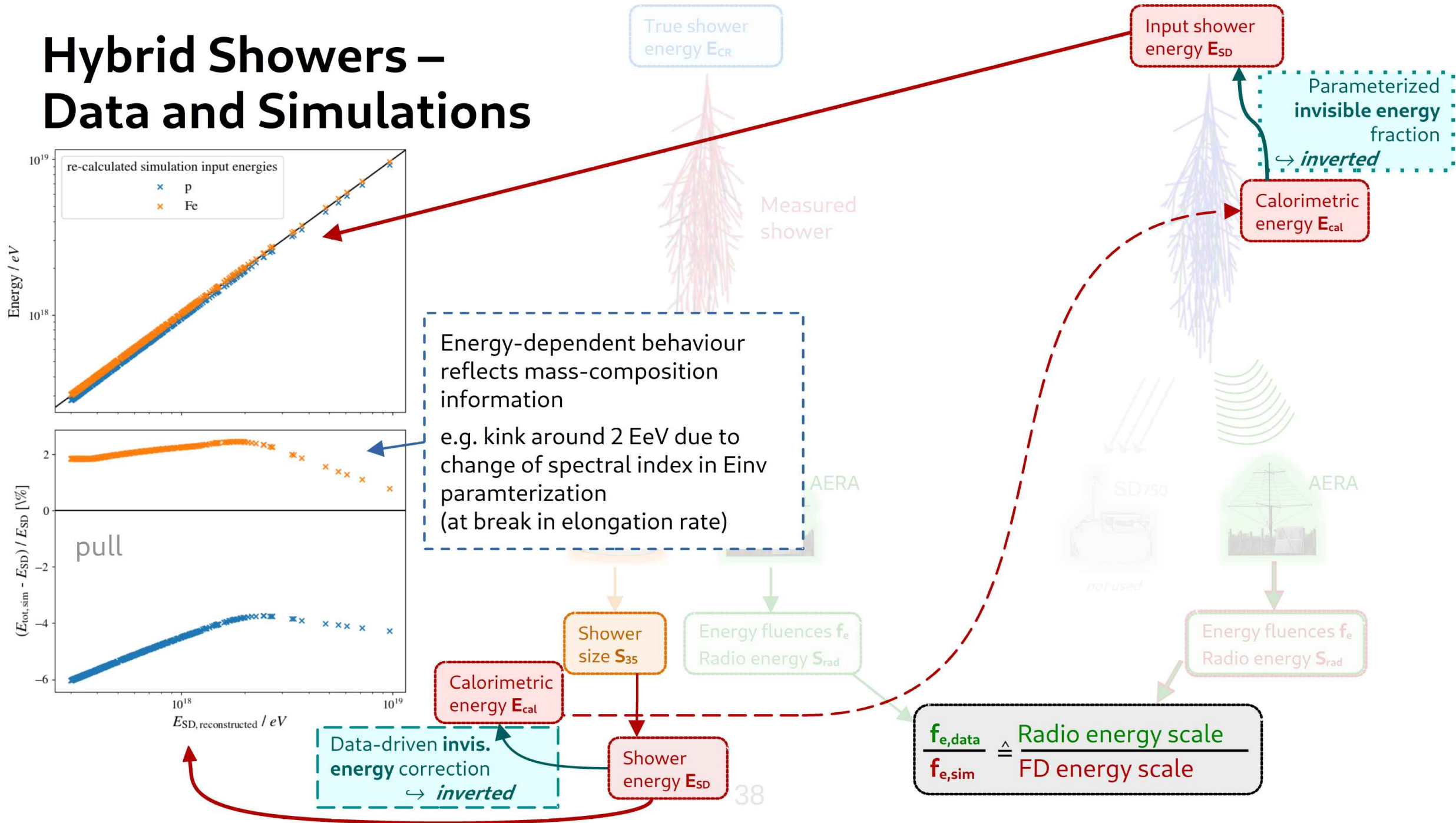
Calorimetric energy E_{cal}

Shower energy E_{SD}

Data-driven invis. energy correction \leftrightarrow *inverted*

$$\frac{f_{e,data}}{f_{e,sim}} \triangleq \frac{\text{Radio energy scale}}{\text{FD energy scale}}$$

Hybrid Showers – Data and Simulations

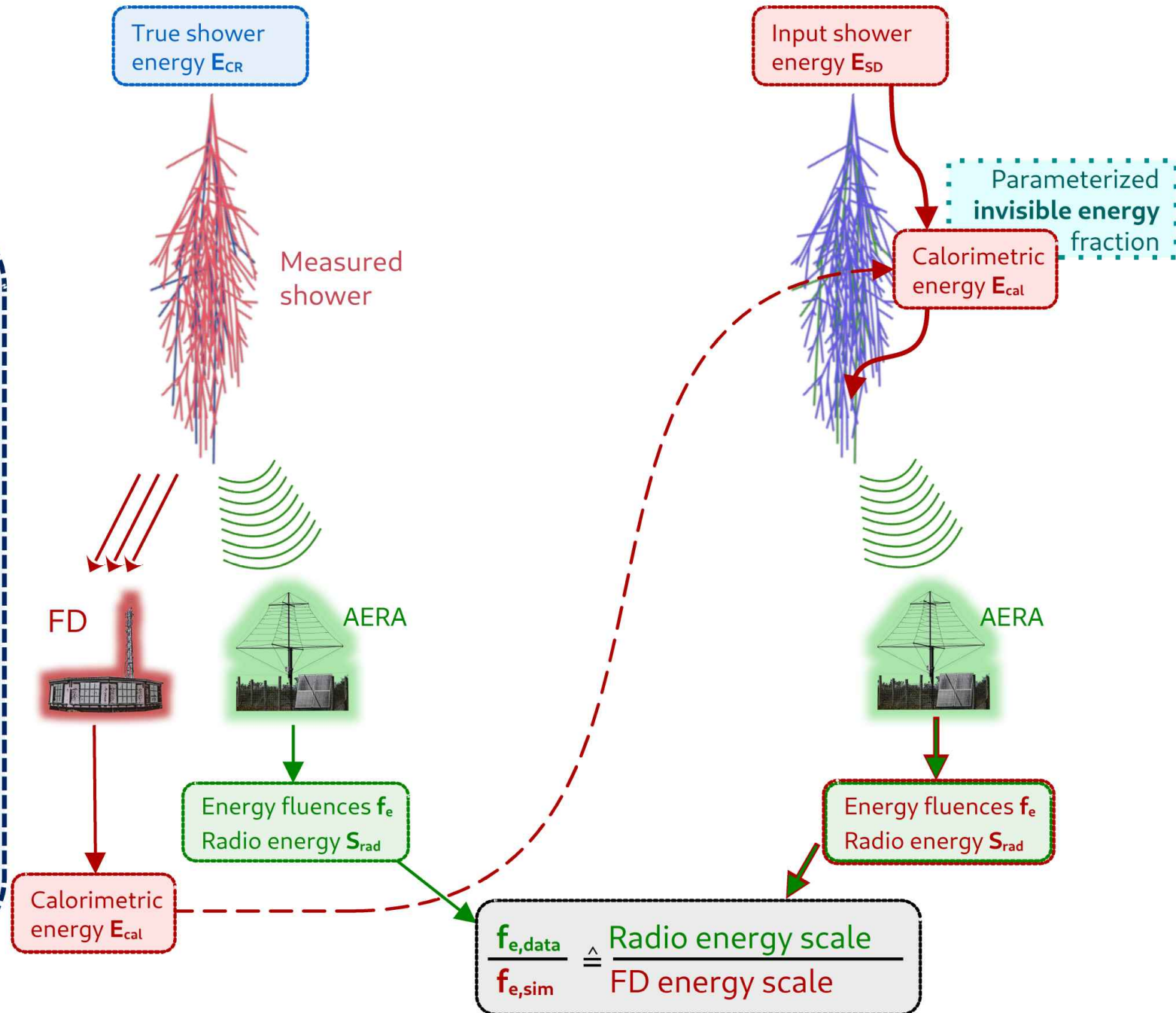


Hybrid Showers – Data and Simulations

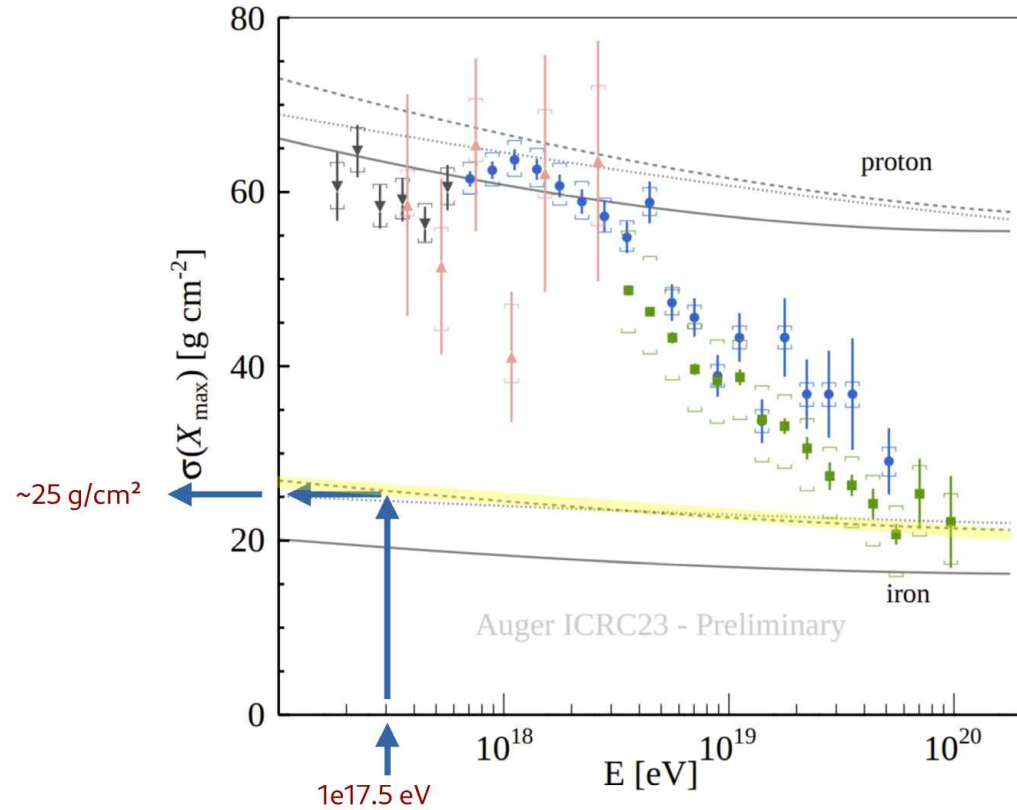
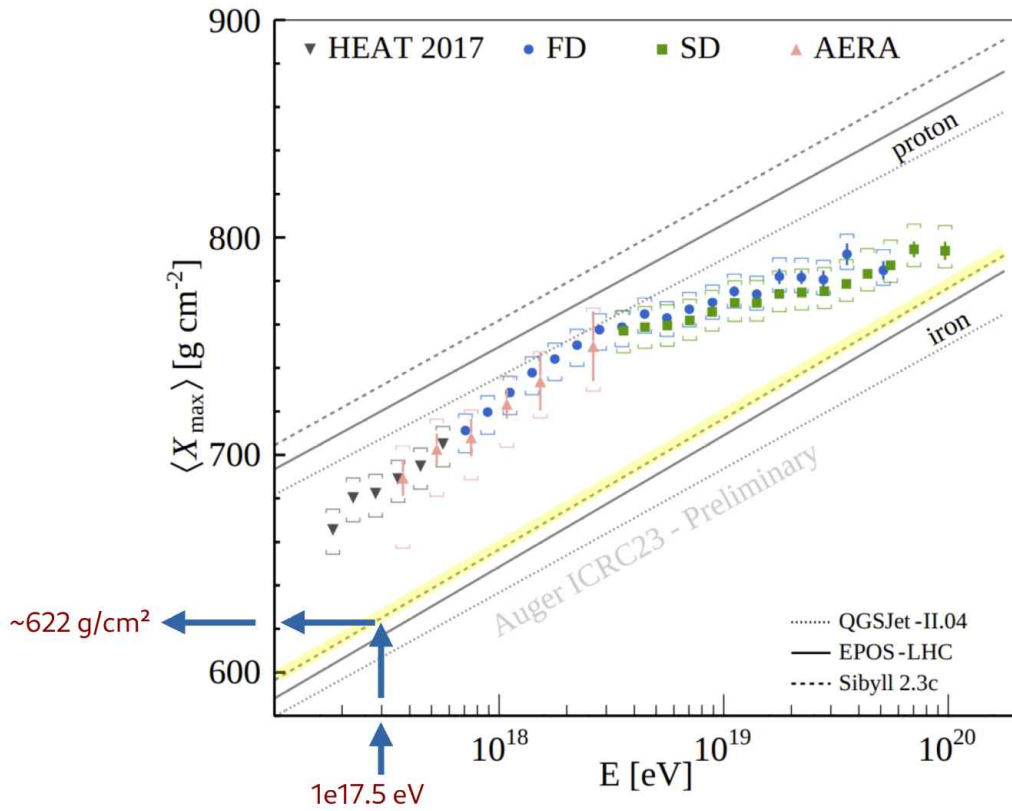
Plan B?

Using hybrid FD-AERA events would simplify the logic and maybe save us some sources of systematics

- Downside: low statistics
 - How many events available?
- ↓
- Hybrid AERA-GoldenInfill events 2013 – 04/2019
 - standard SDInfill cuts (6T5)
 - energy calibration FD cuts (with some relaxations)
 - quality radio cuts
- ↔ ~16 events remaining + ~50-100% with newer data



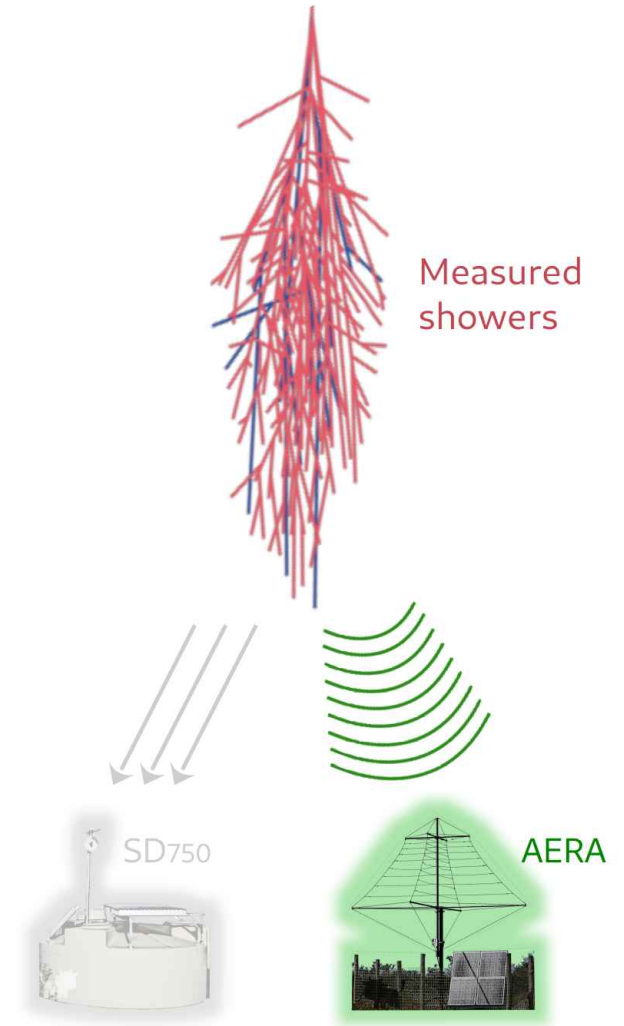
AERA station selection for CoREAS simulations



Lowest expected Xmax value in considered E range: $\sim 622 \text{ g/cm}^2 \pm 25 \text{ g/cm}^2 \rightarrow$ use 600 g/cm^2 for station cut

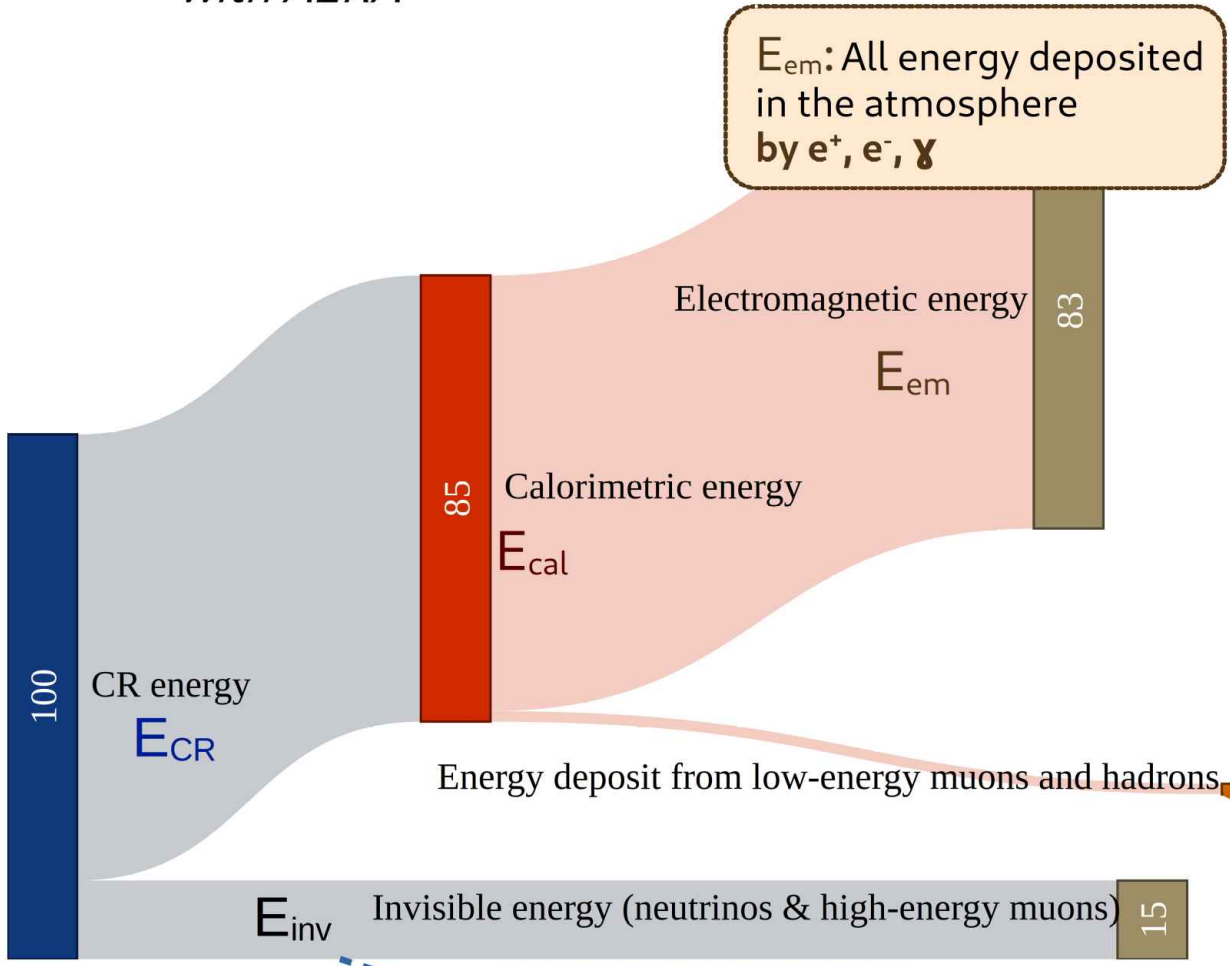
Hybrid data – GeoCeLDFitter performance

- 2013 – 2018:
 - 18111 events
 - 595 events (3%) without converged GeoCeLDF fit → no E_{rad} estimate
 - 5437 events (30%) without uncertainty estimate on E_{rad}
 - 11297 events (62%) without Rd core fit in GeoCeLDF fit
- Allowing events with 5+ signal stations (RD) only: (vs. 3+)
 - 2% without converged GeoCeLDF fit → no E_{rad} estimate
 - 19% without uncertainty estimate on E_{rad}
 - 2% without Rd core fit in GeoCeLDF fit

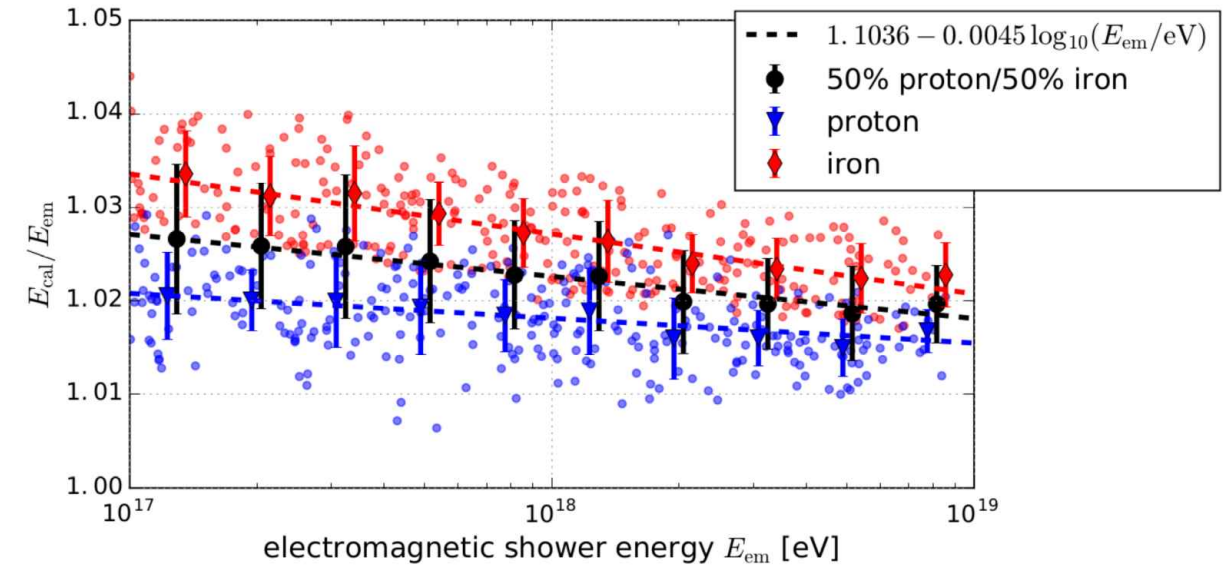


Accessing the cosmic-ray energy scale

with AERA



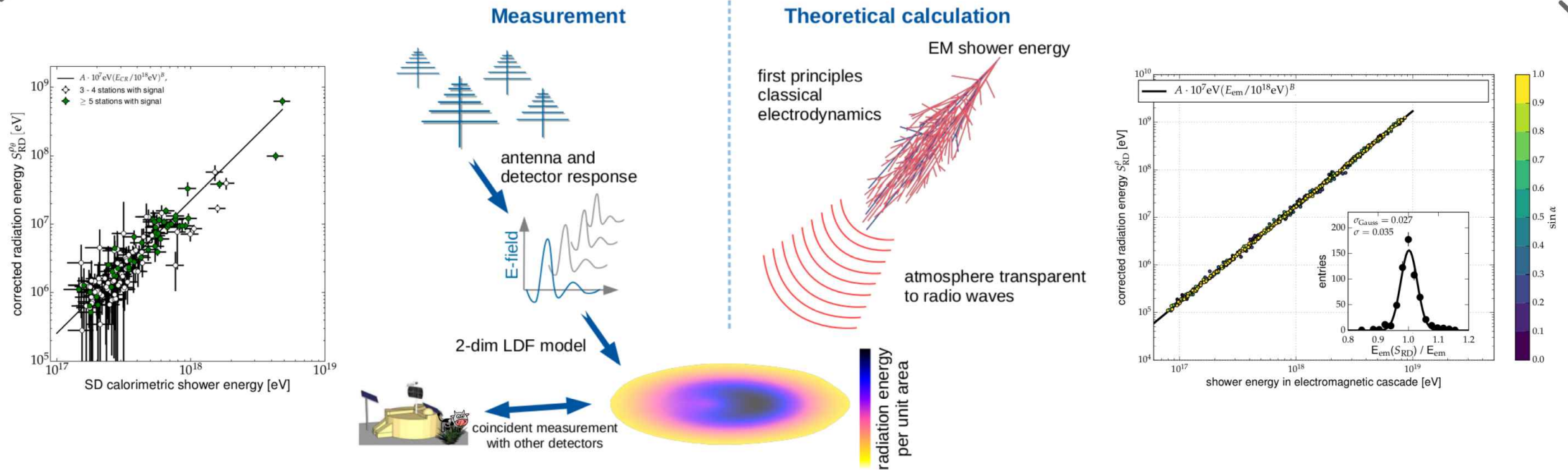
Can be corrected for
Phys. Rev. D 100, 082003 (2019)



Difference between E_{cal} and E_{em}
► can be corrected for:
2.3% @ 10^{18} eV

Comparing FD and radio energy scales

Recipe introduced by C. Glaser (PhD thesis, 2017)



$$S_{RD}^{\rho\theta} = A \times 10^7 eV \left(\frac{E_{SD,cal}}{10^{18} eV} \right)^B$$

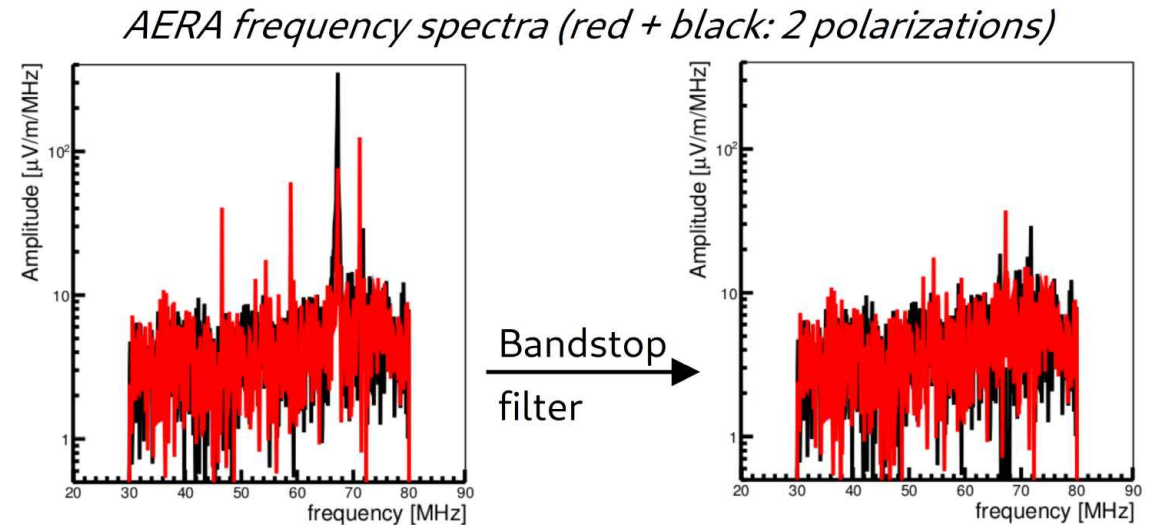
Allows to compare CR energy scales from FD and radio

$$S_{RD}^{\rho\theta} = 1.639 \times 10^7 eV \left(\frac{E_{em}}{10^{18} eV} \right)^{1.978}$$

Aiming to determine a universal/academic radio energy scale

Reconstruction biases in data and simulations

- Steps in AERA reconstruction with multiple choices:
 - Noise filter
 - Signal estimation method (energy fluence)
 - ...
- Tested SD-AERA calibration fit with fixed $B=1.98$
 - Check **relative change in fitted A**
 - Changes **very similar for data and simulations**



by C. Glaser

Test	Description	Relative change in A (data)	Relative change in A (simulations)
Noise filters	no filter	-	-
	Bandstop	-12.2%	-11.6%
	Sinewave suppressor	-2.9%	-1.9%
Signal estimation methods	Offline method	-	-
	Method with background subtraction	-5.2%	-6.2%