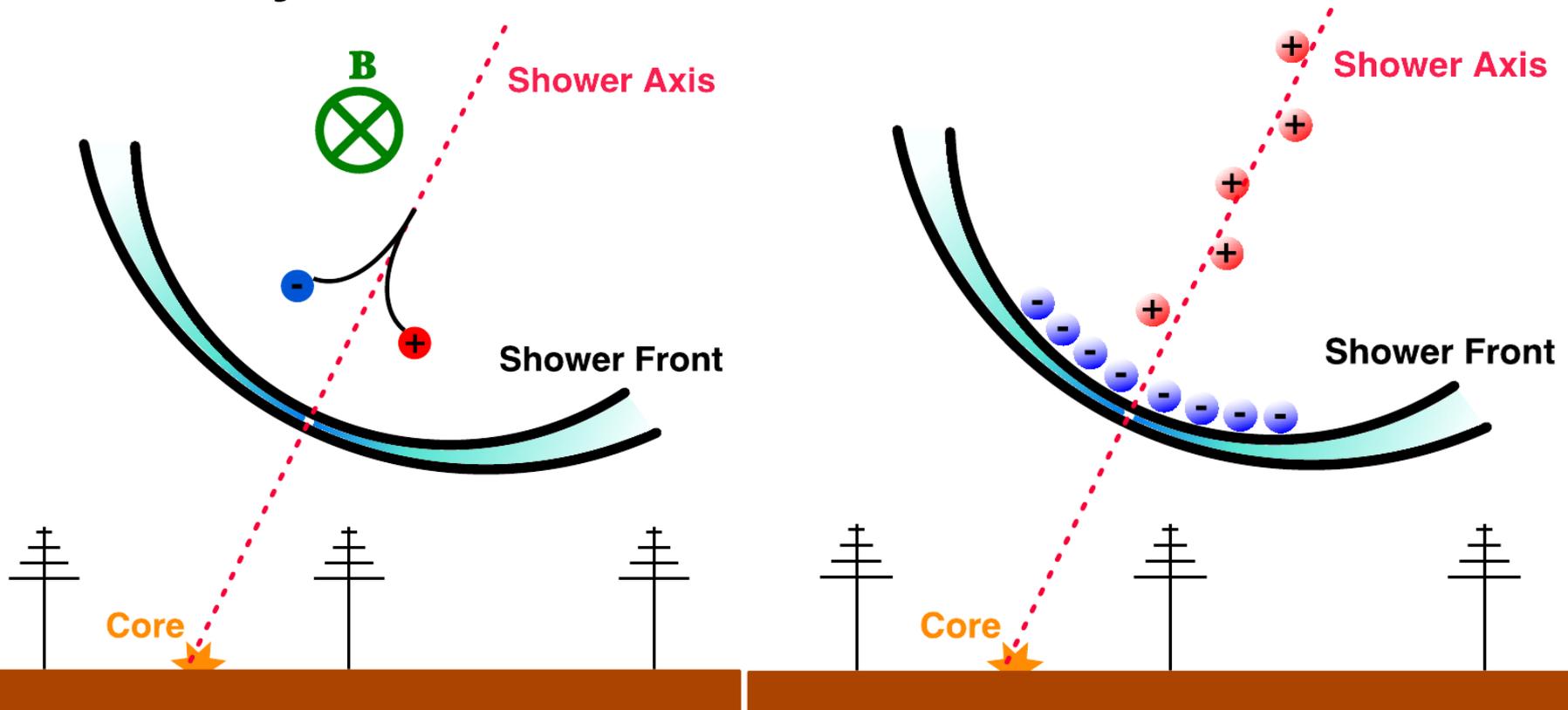


# Tomographic imaging by radio emission of cosmic ray air showers using an information field theory approach

Institut für Kernphysik (IKP)



# Radio analysis



Primary particle  $\rightarrow$  air shower  $\rightarrow$  radio pulse front

Standard observable:  $X_{\max}$ , location of highest electron count

# Radio analysis

- Current radio analysis: MCMC simulation:

$$p(t) = \text{CoREAS}(E_0, X_{max})$$

- Inference:

$$E_0, X_{max} = \text{CoREAS}^{-1}(p(t))$$

# Radio analysis

- Current radio analysis: MCMC simulation:

$$p(t) = \text{CoREAS}(E_0, X_{max})$$

- Inference:

$$E_0, X_{max} = \text{CoREAS}^{-1}(p(t))$$

CPU demand too high  $\rightarrow$   $\chi^2$  fit model functions

# Tomography

- Inference problem involving a line-of-sight integral
- Many degrees of freedom
- Highly degenerate due to cancellation of terms and interference effects
- Simplest form: infer longitudinal development of radio-emitting component

$$N(X) | p(t)$$

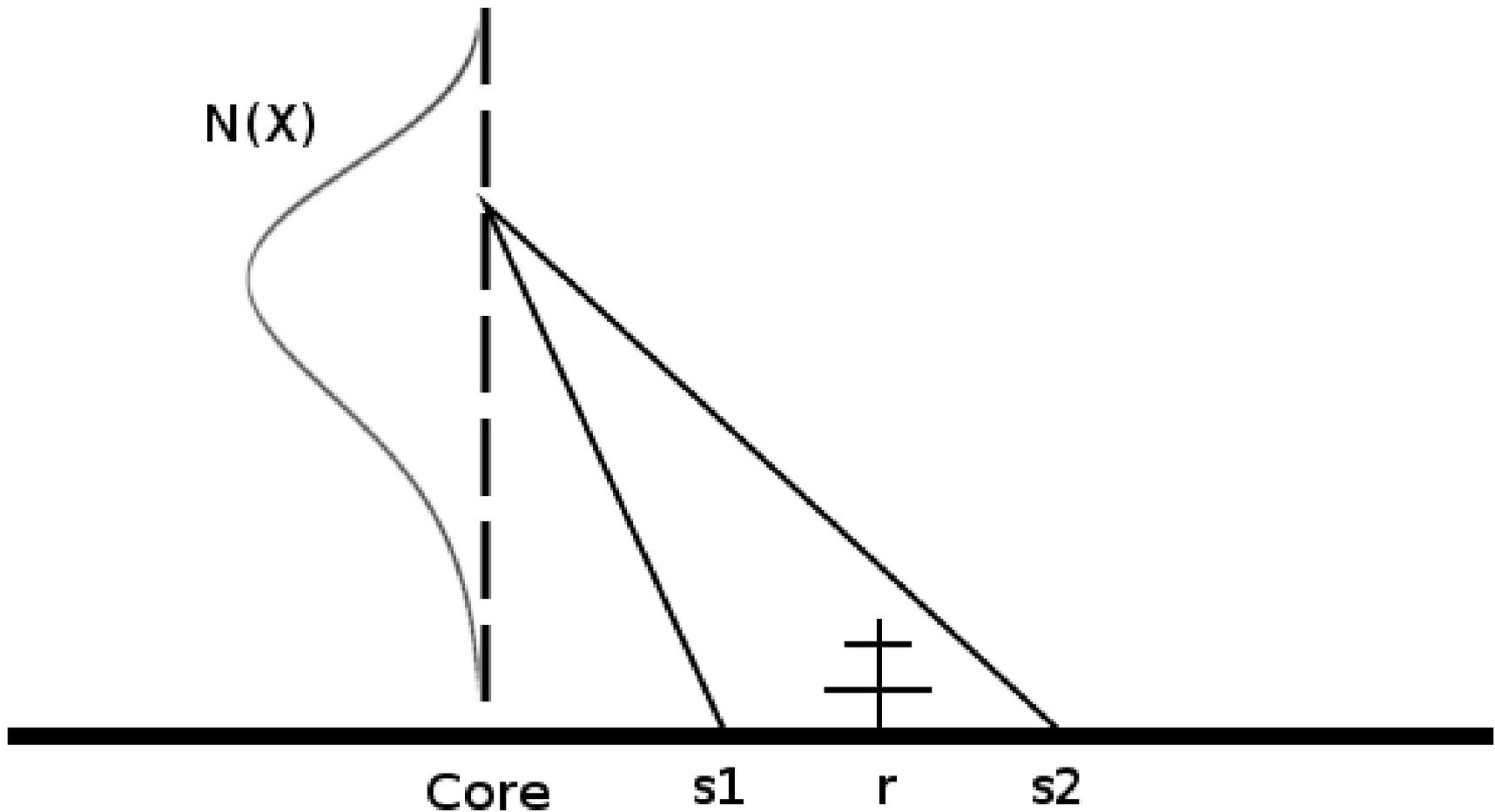
# Bayes Theorem

$$\text{posterior } P(N|p) = \frac{\text{likelihood } P(p|N) \cdot \text{prior } P(N)}{\text{evidence } P(p)}$$

- Mean of **posterior** = "result"
- Covariance of posterior = "uncertainty"
- **Prior** contains knowledge before taking data
- **Likelihood** = forward model

# Forward Model

$$p(r) = f(p(s_1), p(s_2))$$



# Forward Model

- Slice signal contribution by location of emitting particles
- Recombine slices with different weights

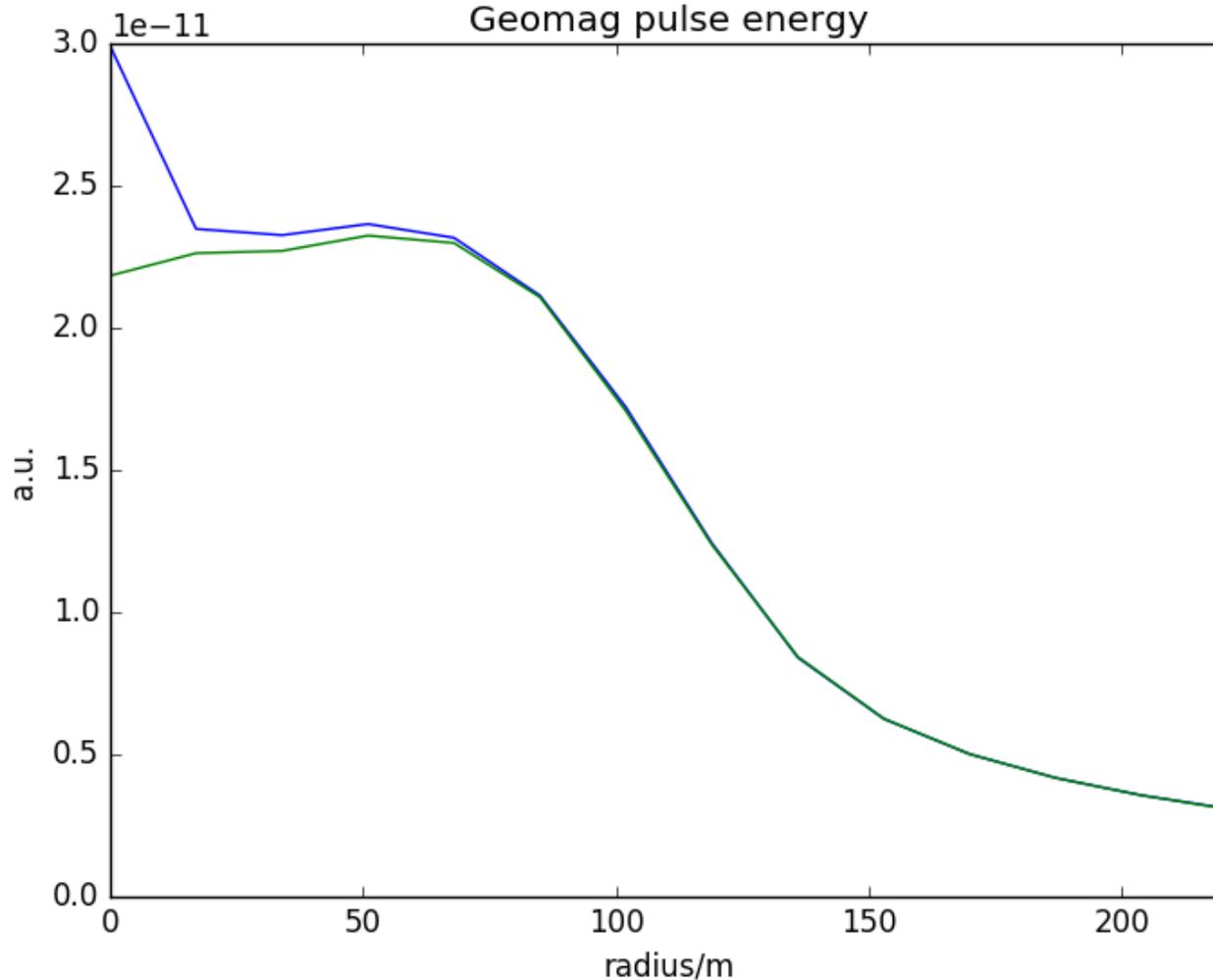
$$p(r) = \sum_X n(X) \cdot f(p(s_1, X), p(s_2, X))$$

- Currently

$$n(X) = \frac{N_{target}(X)}{N_{template}(X)}$$

# Pulse energy

$10^{17}$  eV proton air shower, maximum  $\sim 18$ km above ground



# Forward Model

Ultimate goal: synthesis/lookup table for

- Primary energy
  - Power law scaling?
- Primary species
  - Separate templates necessary
- Longitudinal development  $N(X)$ 
  - Lateral distribution necessary?
- Zenith, azimuth angles
  - Breaks correspondence between atmospheric depth and height
  - Asymmetric refractive index in shower plane
- Full 2D antenna field
  - Rotational symmetry sufficient?

# Tomography

- Massive information loss along the line of sight
  - Requires good prior for reconstruction
  - Numerically highly unstable if undersampled
  - No existing instrument with enough data
  - Computationally demanding
  
- Further open questions:
  - Fast forward model (CoREAS too expensive to run iteratively, sampling unfeasible for SKA)
  - Viability of priors extracted from CoREAS
  - Unprecedented approach, overall viability not demonstrated

**Thank you!**

**Questions?**

# Folientitel: Arial 26pt fett

## 2-zeilig: Arial 22pt fett

Untertitel: Arial 18pt fett  
Auch mehrzeilig möglich.

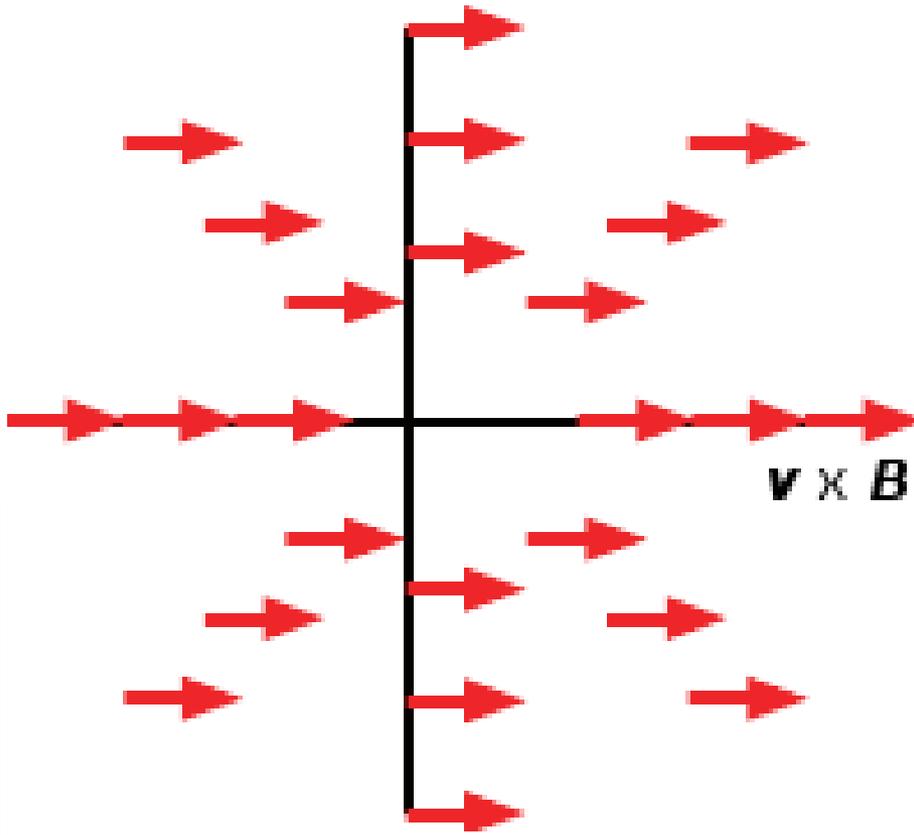
Institut für Kernphysik (IKP)





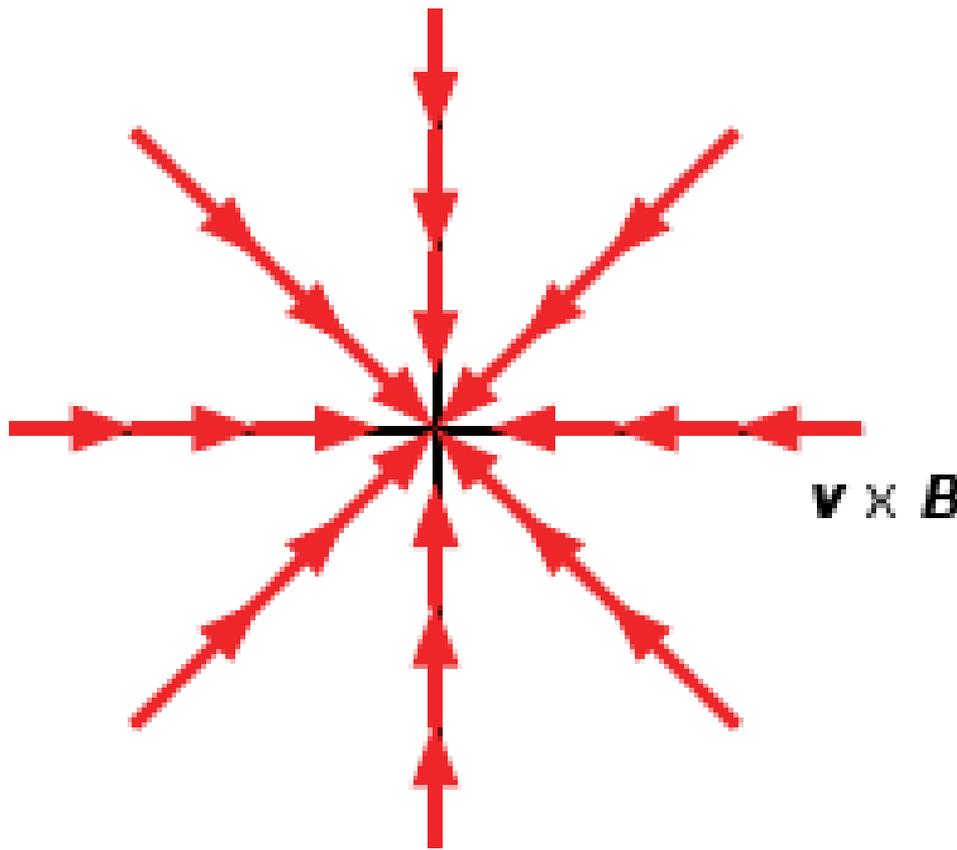
# Radio Polarisation

$$\mathbf{v} \times \mathbf{v} \times \mathbf{B}$$



Geomagnetic

$$\mathbf{v} \times \mathbf{v} \times \mathbf{B}$$

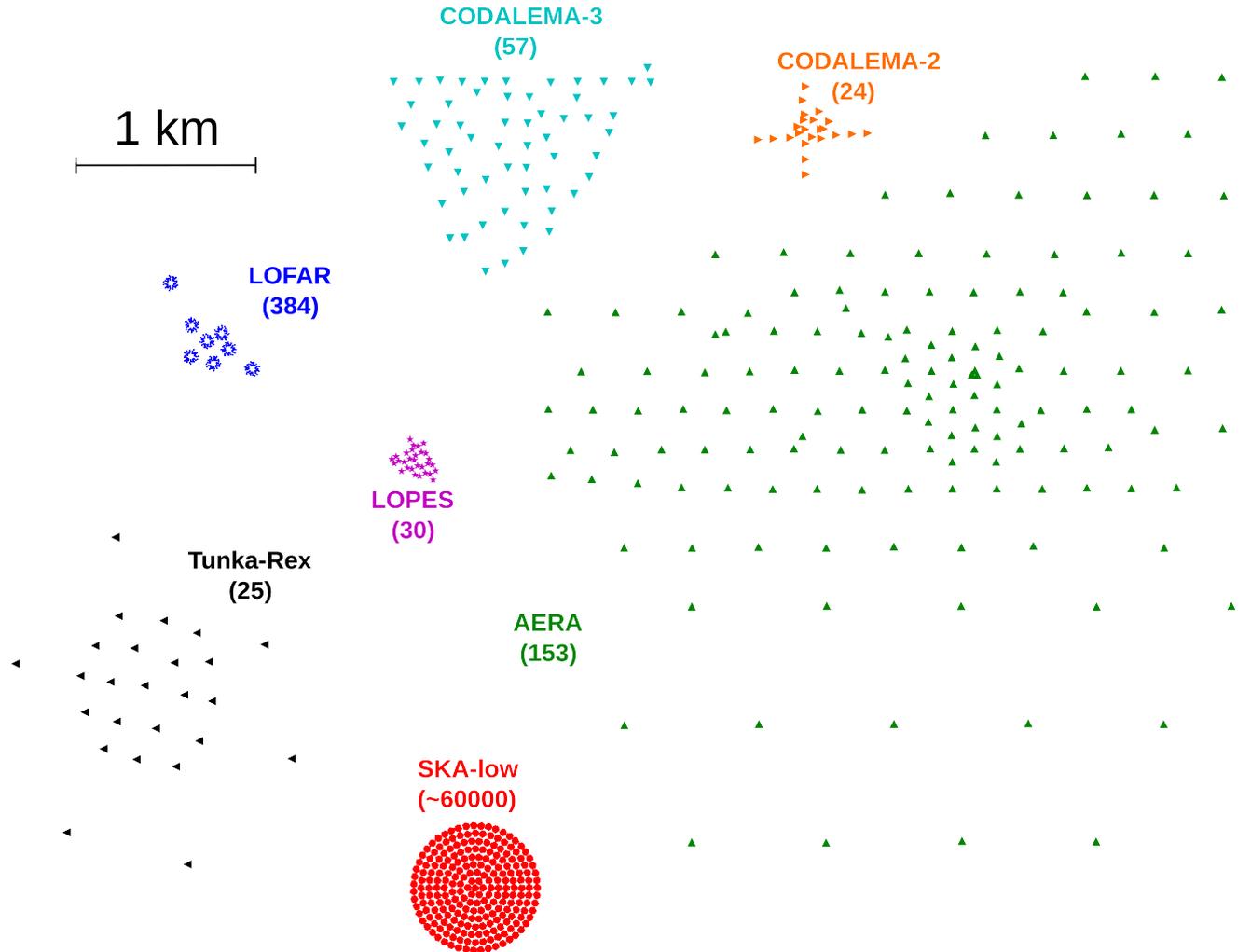


Charge Excess/Askaryan

$$\mathbf{v} \times \mathbf{B}$$

$$\mathbf{v} \times \mathbf{B}$$

# Radio EAS Arrays



# Forward Model

- CoREAS assumed accurate
- Simplified model derived from simulations matching abstract form

$$d = R(s) + n$$

where  $d$  = measured signal,  $s = (E, N, \text{etc.})$ ,

$n$  = measurement uncertainty, noise

# Forward Model

- Interpolation of template pulses in Fourier space:
- Independent linear interpolation of amplitudes and phases

$$y = (1 - w(r)) \cdot y_1 + w(r) \cdot y_2$$

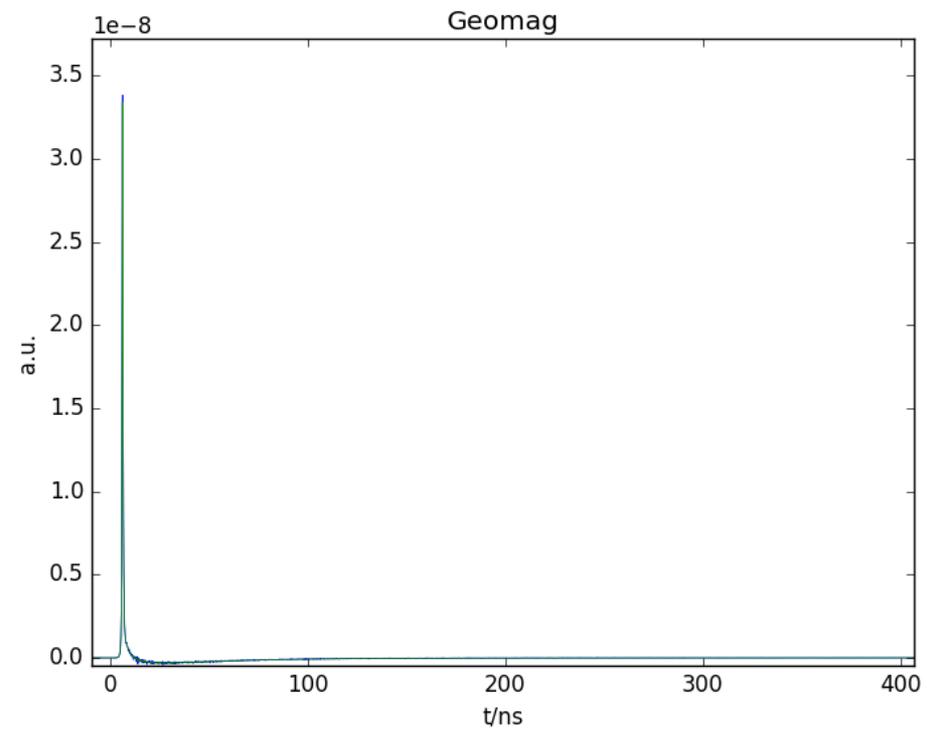
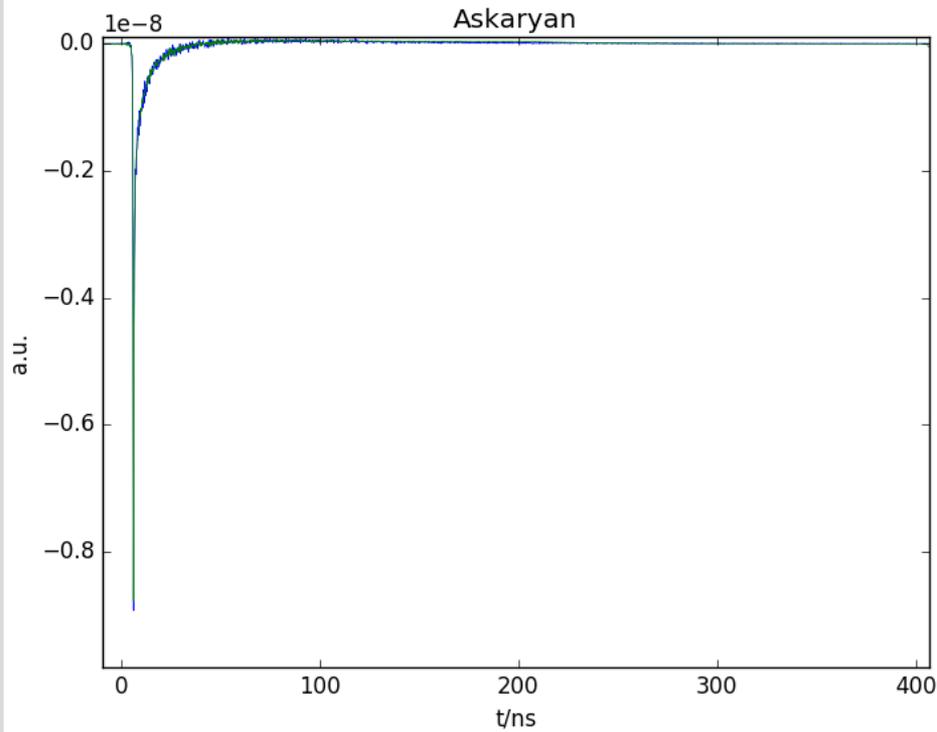
$$w(r) = \frac{r - s_1}{s_2 - s_1}$$

$$y = A, \phi$$

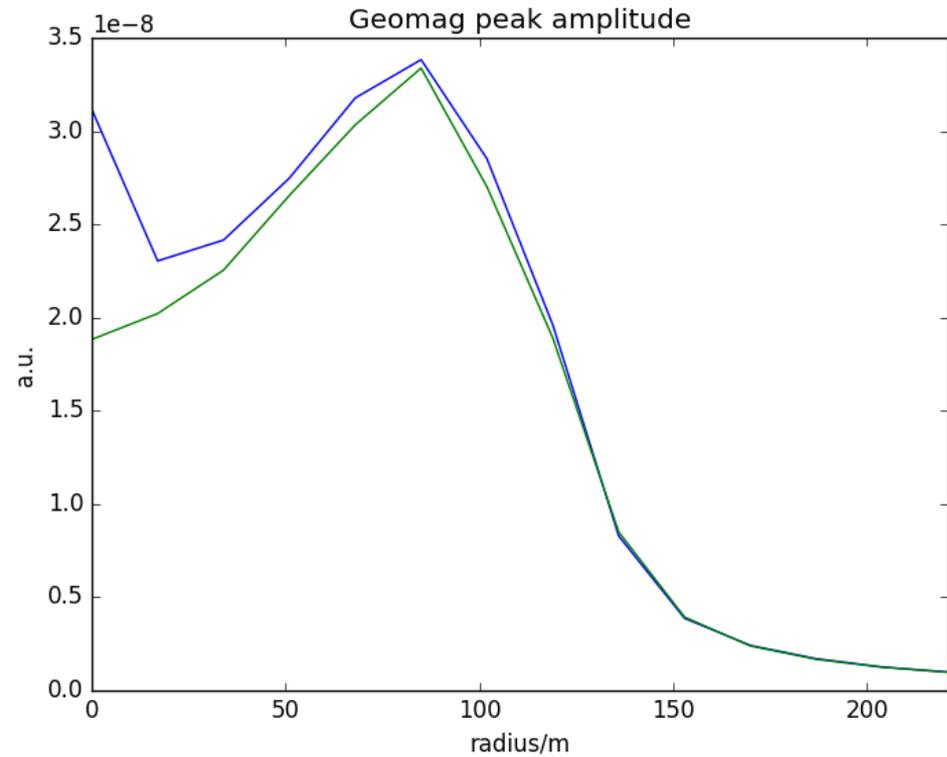
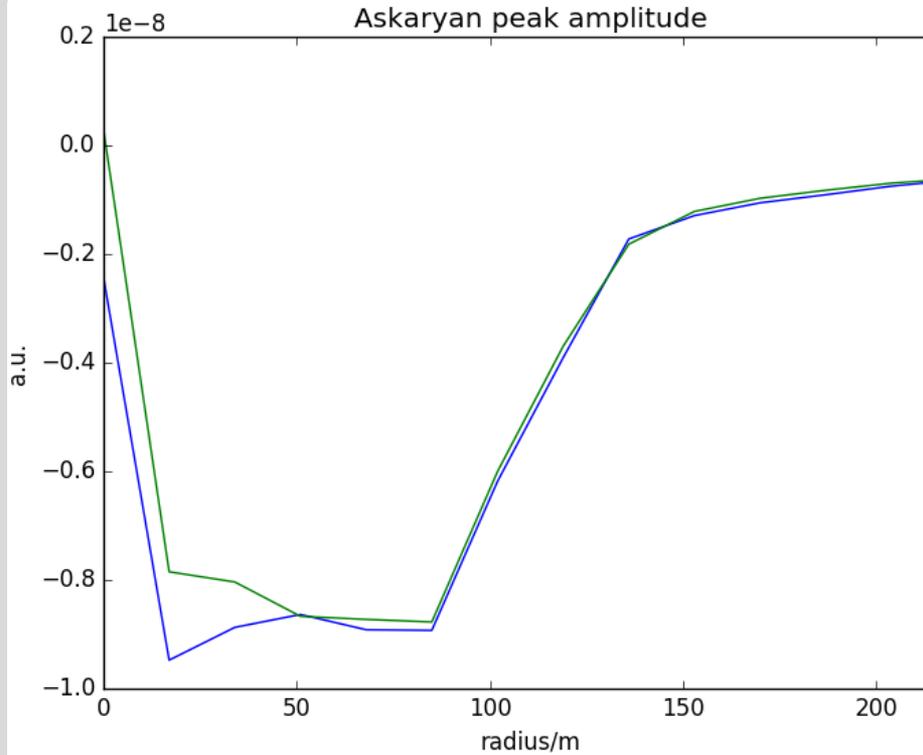
$$p = A \cdot e^{i\phi}$$

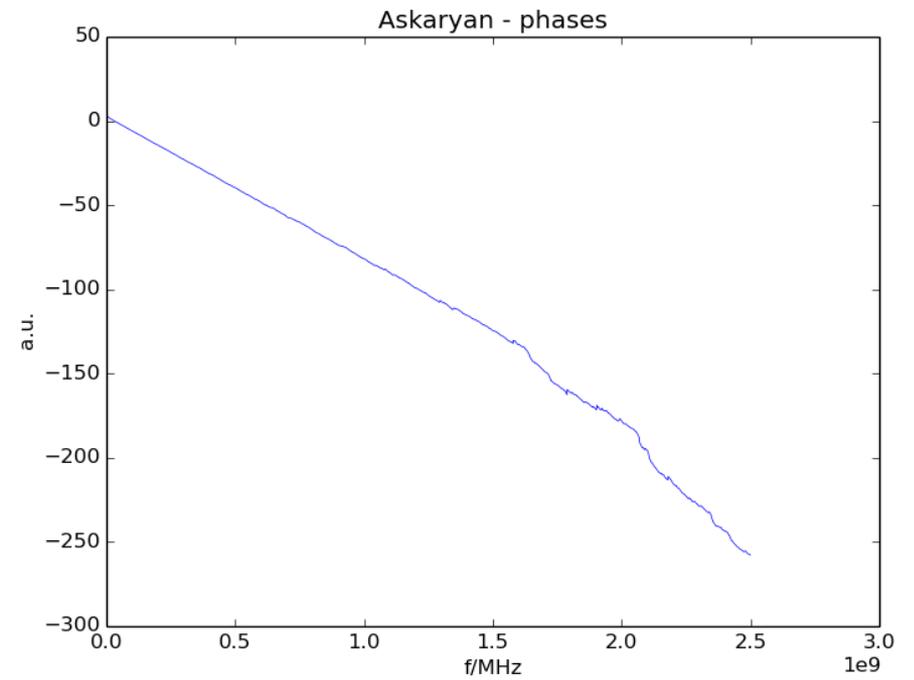
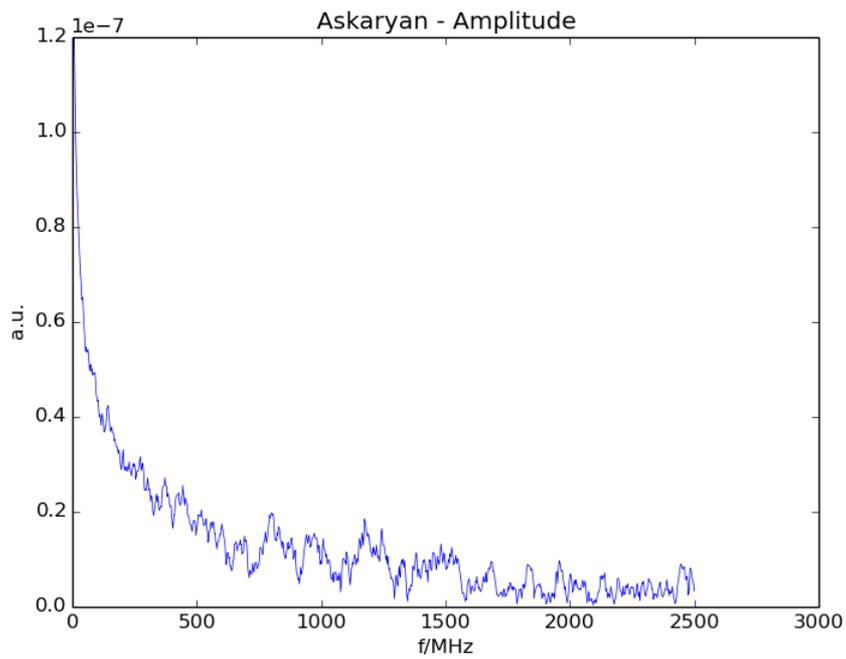
- Unfortunately not linear w.r.t. total pulse

# Time series



# Peak height





# Fourier rounding error

