



The University of British Columbia
Geophysical Inversion Facility



3D TEM-IP inversion workflow for galvanic source TEM data

Seogi Kang and Douglas W. Oldenburg

IP workshop 2016

6th June 2016

IP2016/4th International Workshop
on Induced Polarization

gif.eos.ubc.ca

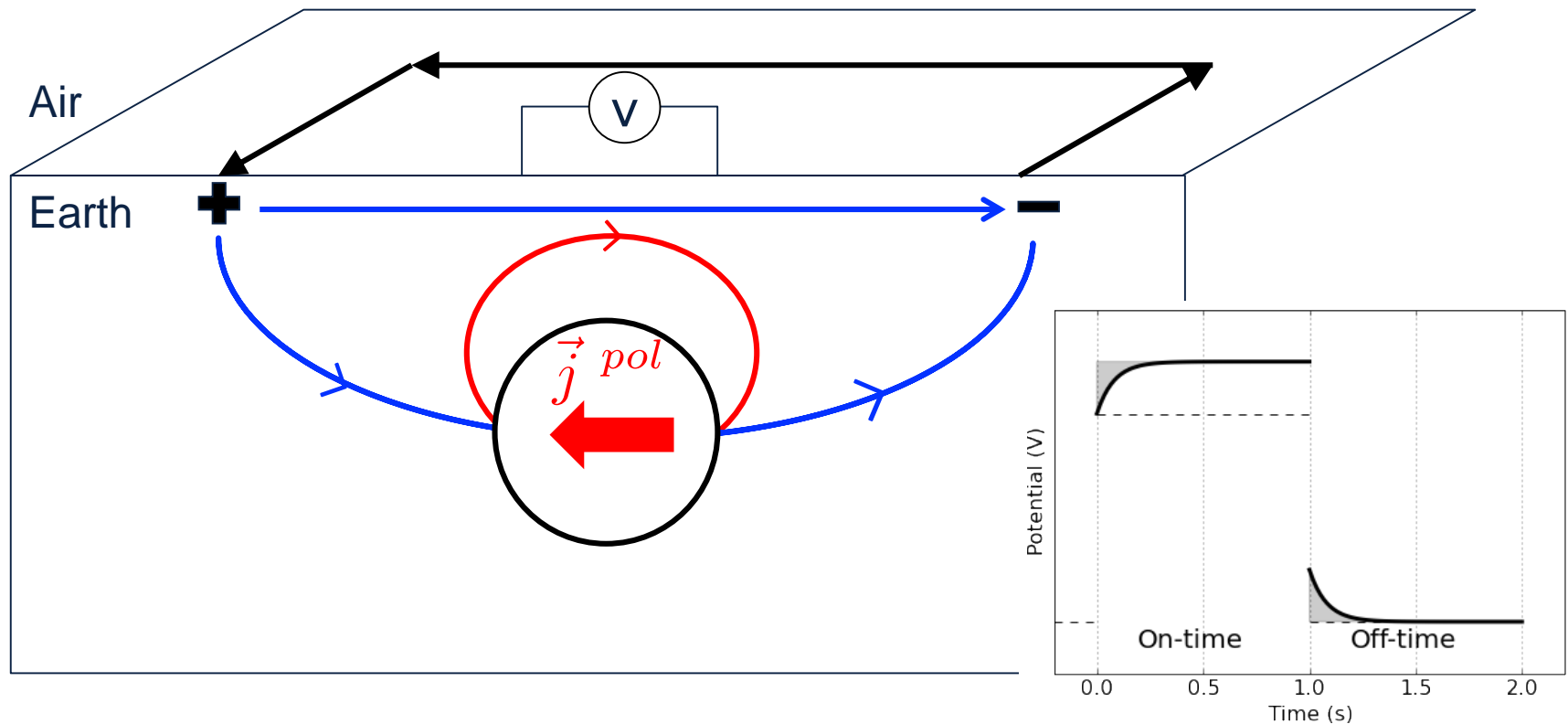


a place of mind
THE UNIVERSITY OF BRITISH COLUMBIA

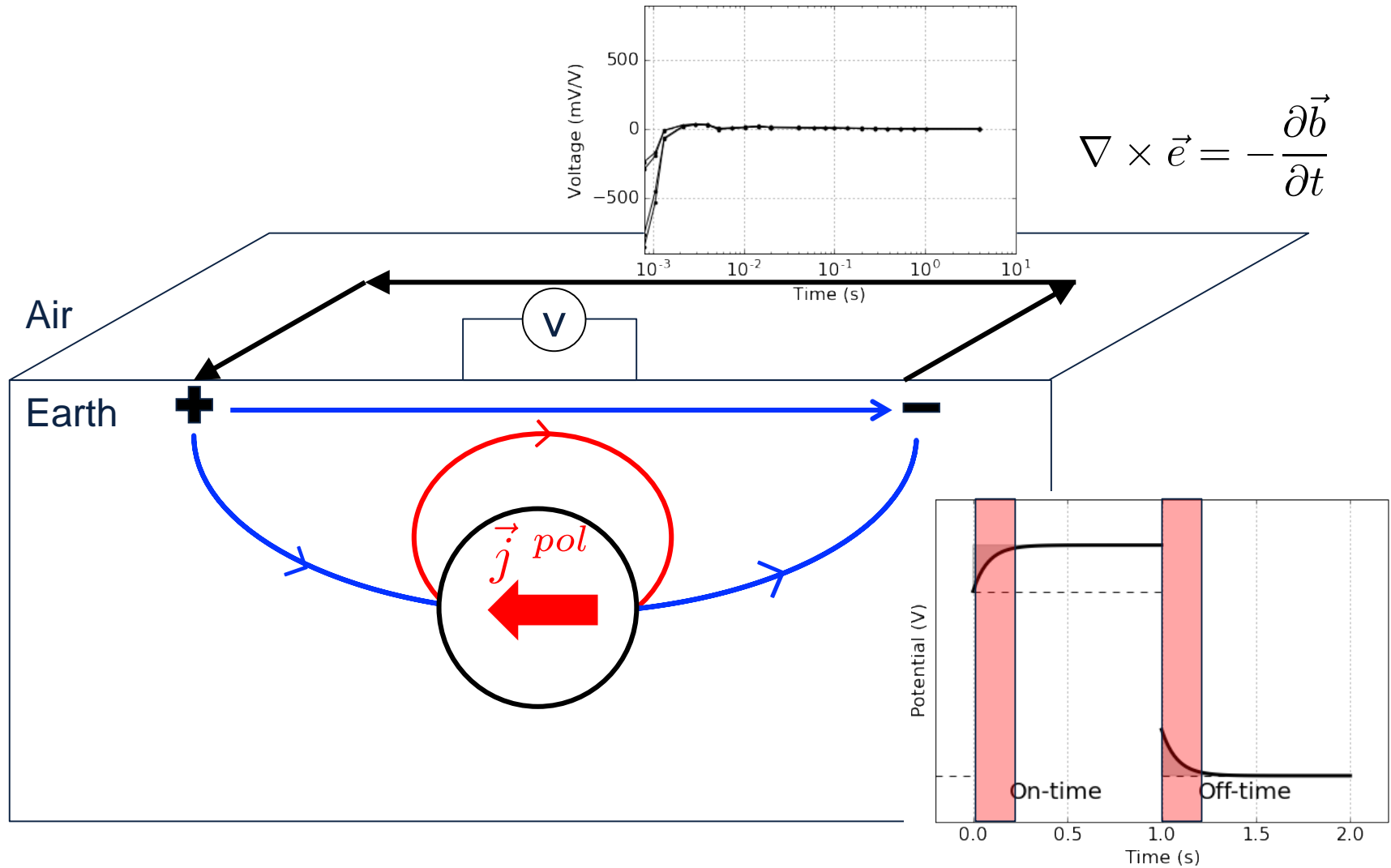


Earth and Ocean Sciences

Conceptual model for IP response



EM coupling?



Questions?

- Measured voltage includes both EM and IP effects
 - How are we recovering conductivity and chargeability?
 - Are we okay with EM-contamination when recovering chargeability?

Simulation of TEM data

- Maxwell's equations:

Frequency domain

$$\begin{aligned}\vec{\nabla} \times \vec{E} &= -i\omega\vec{B} \\ \vec{\nabla} \times \mu^{-1}\vec{B} - \vec{J} &= \vec{J}_s\end{aligned}$$

Ohm's law in **frequency** domain

$$\vec{J} = \sigma\vec{E}$$

Time domain

$$\begin{aligned}\vec{\nabla} \times \vec{e} &= -\frac{\partial \vec{b}}{\partial t} \\ \vec{\nabla} \times \mu^{-1}\vec{b} - \vec{j} &= \vec{j}_s\end{aligned}$$

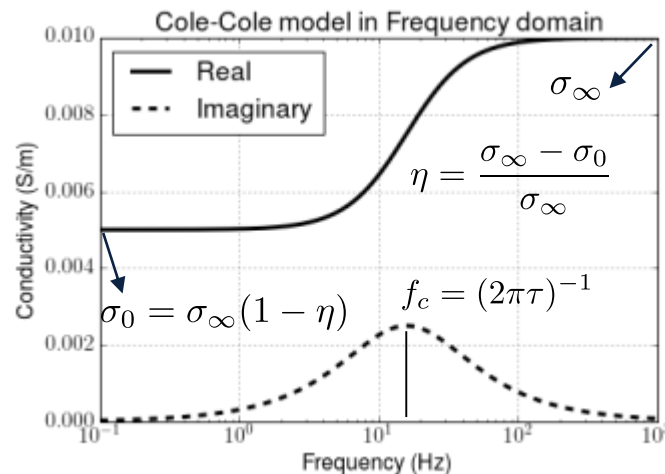
Ohm's law in **time** domain

$$\vec{j} = \sigma\vec{e}$$

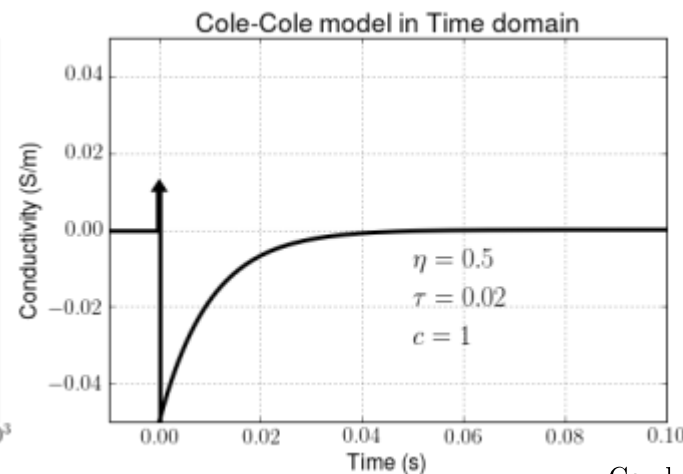
Complex conductivity

- Cole-Cole model (Pelton et al., 1978)

Frequency domain



Time domain



Inverse Fourier transform

$$\sigma(\omega) = \sigma_\infty + \sigma_\infty \frac{\eta}{1 + (1 - \eta)(i\omega\tau)^c} \longrightarrow \mathcal{F}^{-1}[\sigma(\omega)] = \sigma(t)$$

σ_∞ : Conductivity at infinite frequency
 σ_0 : Conductivity at zero frequency
 η : Chargeability
 τ : Time constant (s)
 c : Frequency dependency

Simulation of TEM data **with IP**

EMTDIP code
(Marchant et al., 2015)

- Maxwell's equations:

Frequency domain

$$\begin{aligned}\vec{\nabla} \times \vec{E} &= -i\omega \vec{B} \\ \vec{\nabla} \times \mu^{-1} \vec{B} - \vec{J} &= \vec{J}_s\end{aligned}$$

Ohm's law in **frequency** domain

$$\vec{J} = \sigma(\omega) \vec{E}$$

Time domain

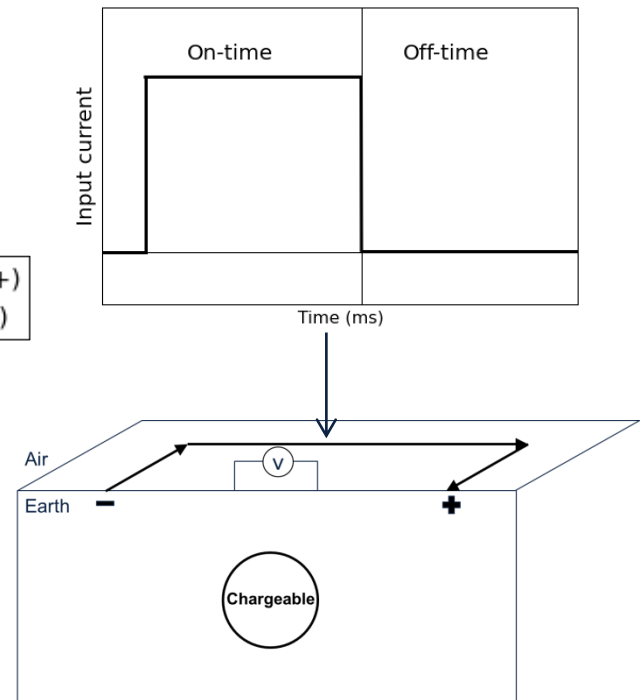
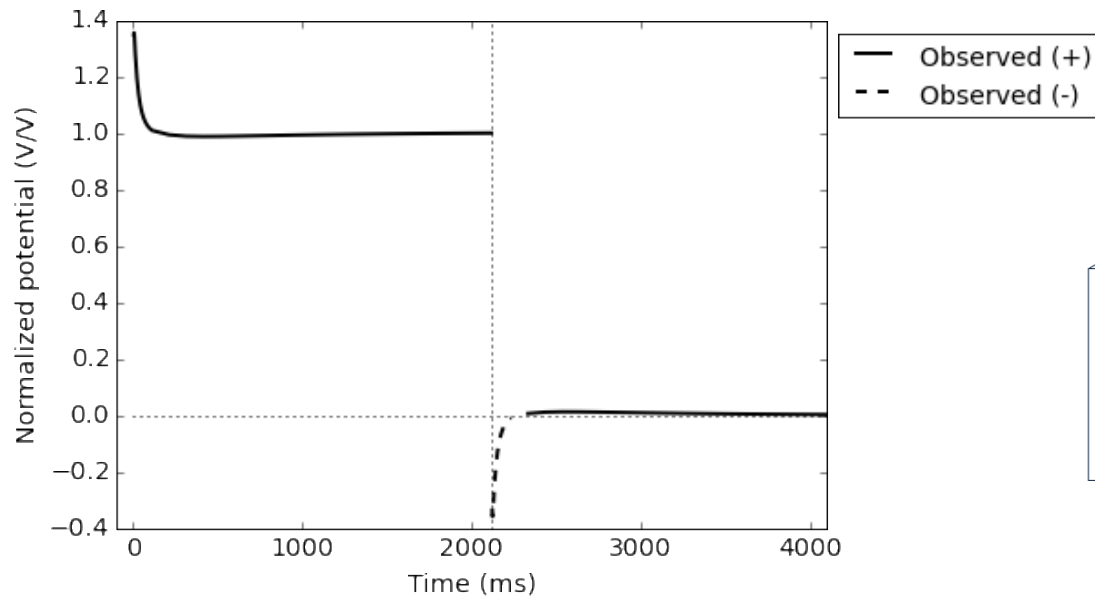
$$\begin{aligned}\vec{\nabla} \times \vec{e} &= -\frac{\partial \vec{b}}{\partial t} \\ \vec{\nabla} \times \mu^{-1} \vec{b} - \vec{j} &= \vec{j}_s\end{aligned}$$

Ohm's law in **time** domain

$$\begin{aligned}\vec{j} &= \sigma(t) \otimes \vec{e}(t) \\ \otimes &: \text{convolution}\end{aligned}$$

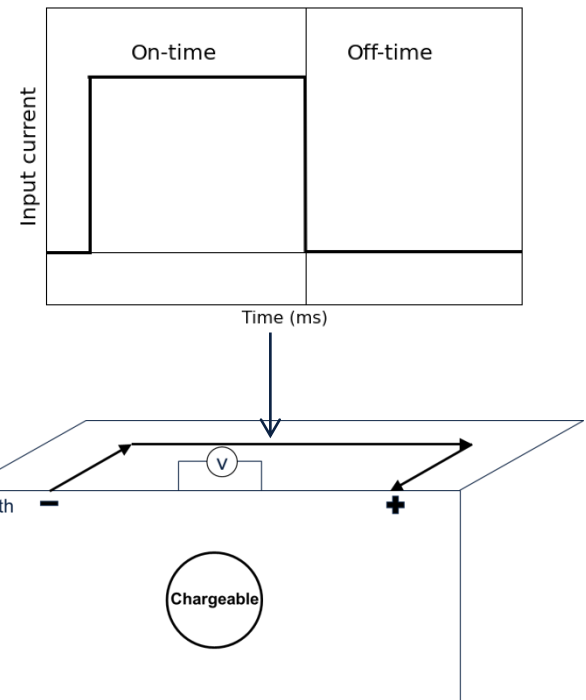
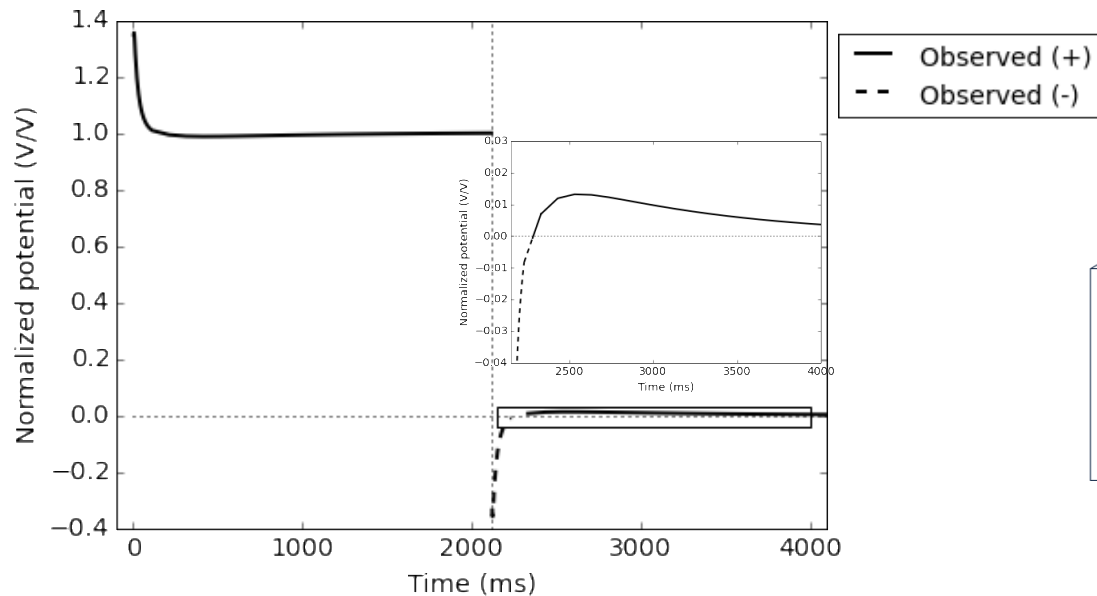
Observed response?

- Voltage



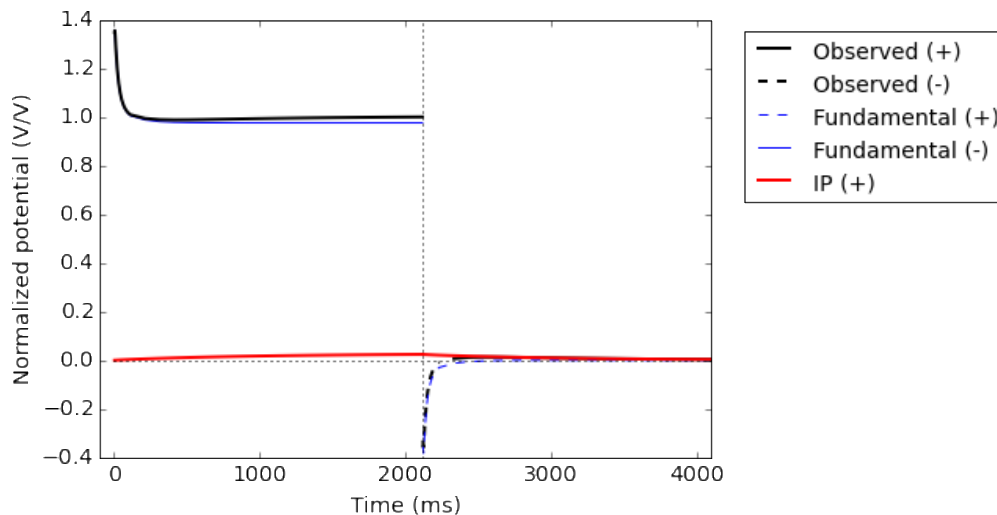
Observed response?

- Voltage



Define IP datum

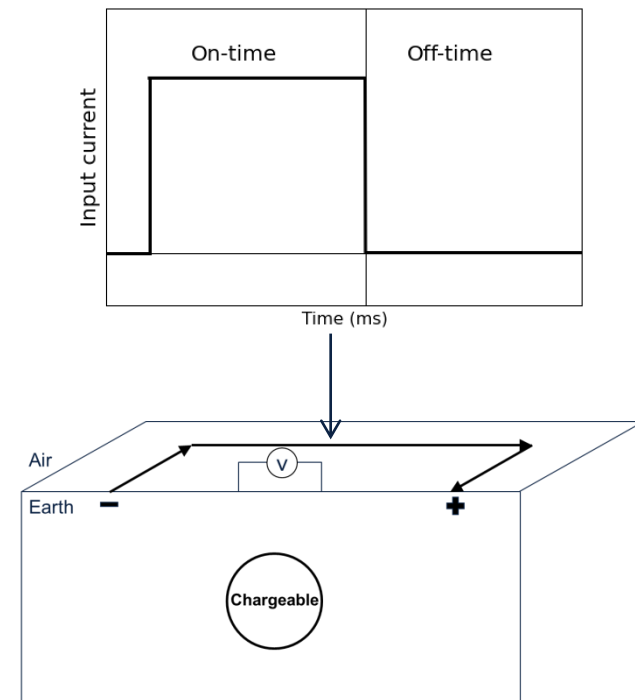
- Voltage



- IP datum:

IP = Observation - Fundamental

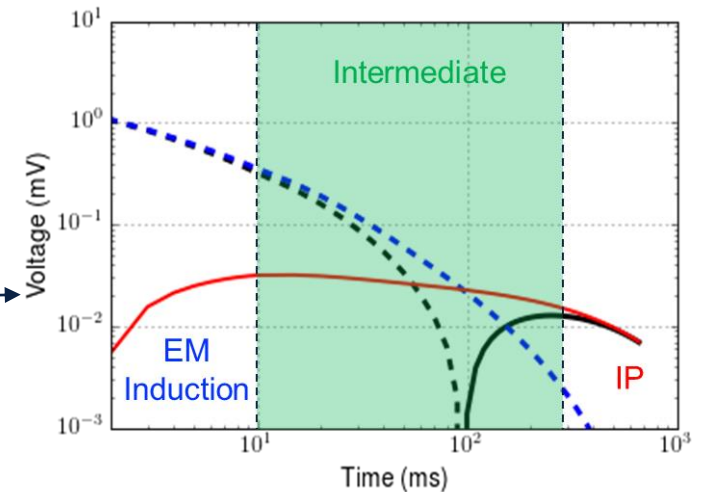
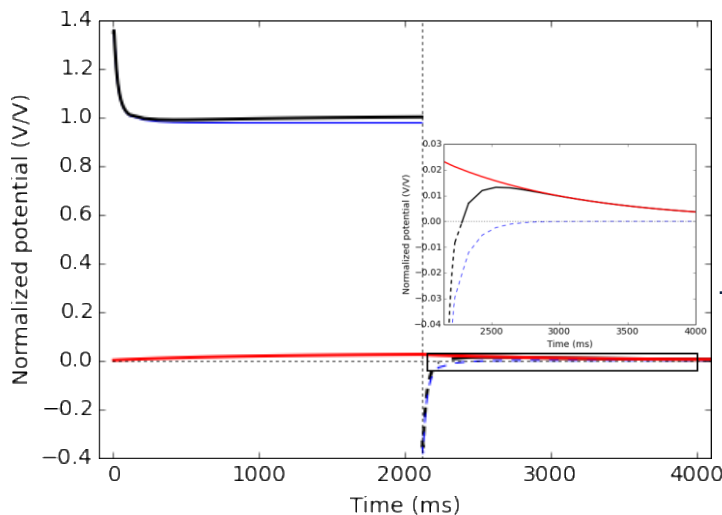
$$d^{IP}(t) = F[\sigma(t)] - F[\sigma_{\infty}]$$



$F[\sigma(t)]$ Observation
 $F[\sigma_{\infty}]$ Fundamental
 $F[\cdot]$: Maxwell's operator

Define IP datum

- Voltage



- IP datum:

IP = Observation - Fundamental

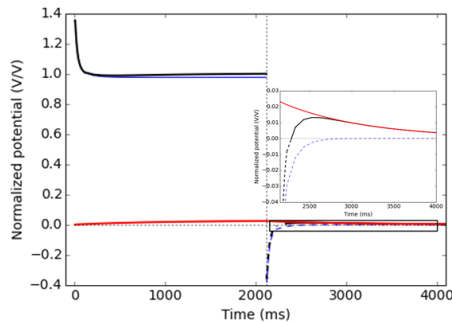
$$d^{IP}(t) = F[\sigma(t)] - F[\sigma_{\infty}]$$

$F[\sigma(t)]$ Observation
 $F[\sigma_{\infty}]$ Fundamental

$F[\cdot]$: Maxwell's operator

Two stage IP inversion workflow

- Oldenburg and Li (1994)



Invert DC data,
to recover σ_{∞}

Linearized equations

Invert d^{IP} data,
recover pseudo-chargeability

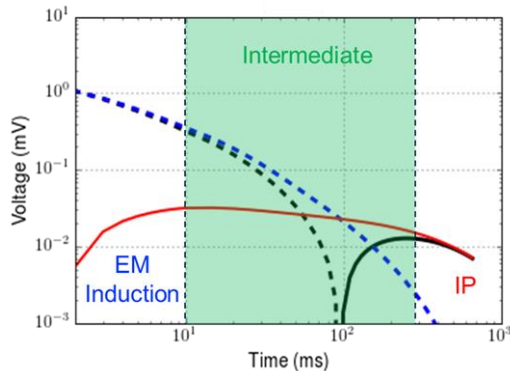
$$d^{IP}(t) = G\tilde{\eta}(t)$$

$G(\sigma_{\infty})$: Sensitivity function
 $\tilde{\eta}$: Pseudo-chargeability

Seigel (1959)

3D TEM-IP inversion workflow

- Kang and Oldenburg (2015)



Invert TEM data,
to recover σ_{∞}

Compute IP datum
Remove EM responses

Linearized equations

Invert d^{IP} data,
recover pseudo-chargeability

Estimate intrinsic
IP parameters

IP = Observation - Fundamental

$$d^{IP}(t) = F[\sigma(t)] - F[\sigma_{\infty}]$$

$F[\cdot]$: Maxwell's operator

$$d^{IP}(t) = G\tilde{\eta}(t)$$

$G(\sigma_{\infty})$: Sensitivity function

$\tilde{\eta}$: Pseudo-chargeability

An objective

- Decouple EM induction effects in the observed data

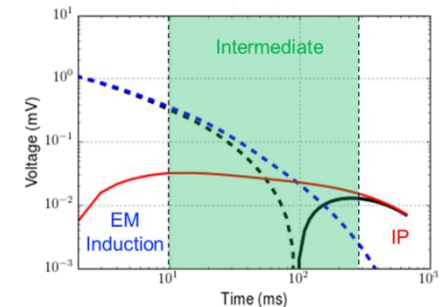
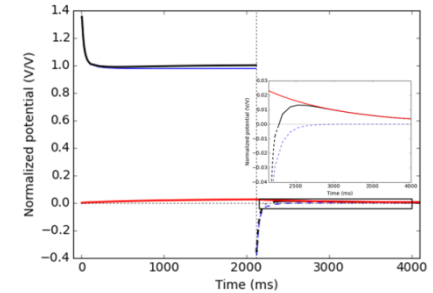
IP = Observation - Fundamental

$$d^{IP}(t) = F[\sigma(t)] - F[\sigma_{\infty}]$$

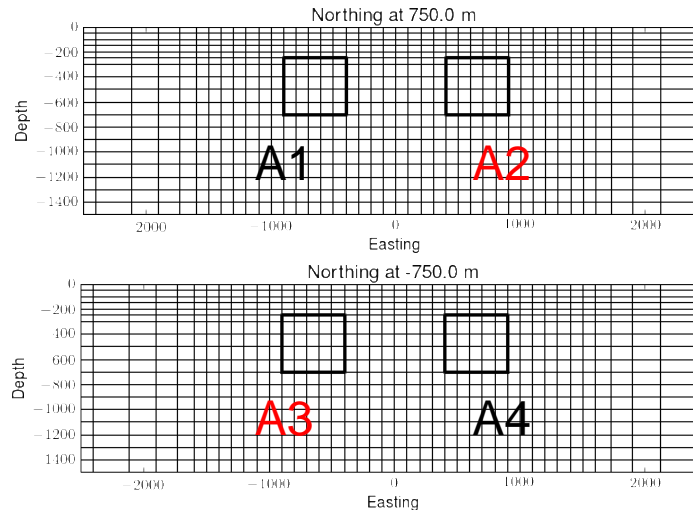
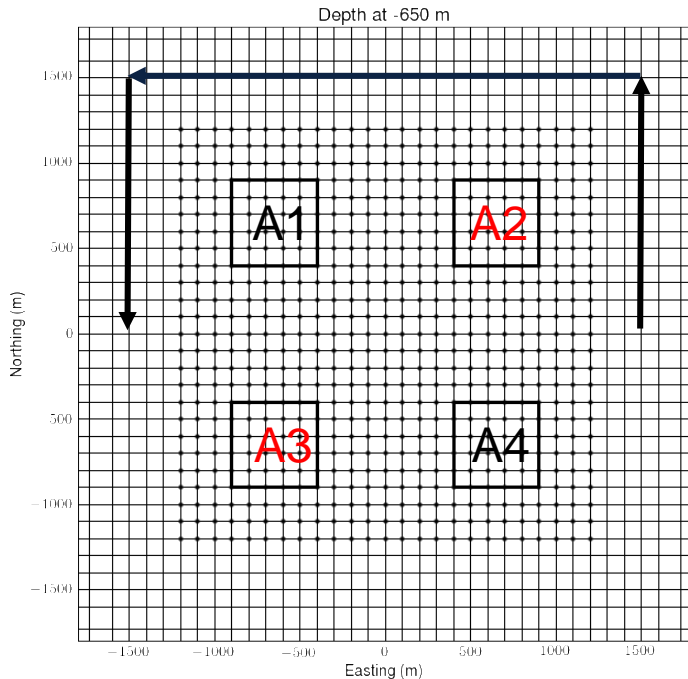
– What conductivity?

- Half-space σ_{∞}^{half}
- Recovered σ_{est}^{DC} by inverting DC data,
- Recovered σ_{est}^{EM} by inverting TEM data

- Invert IP datum, recover 3D chargeability



Forward modelling set up



3D mesh:

- Core cells:
100mx100mx50m
100mx100mx100m
- # of cells:
52x52x55

Measure potential difference (Easting direction)

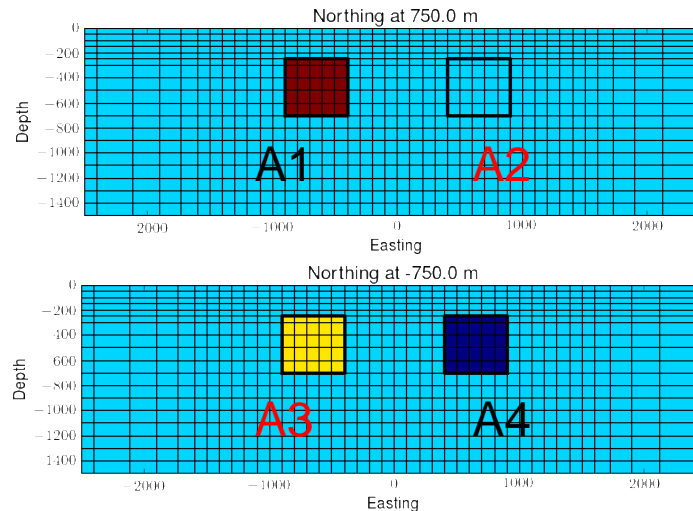
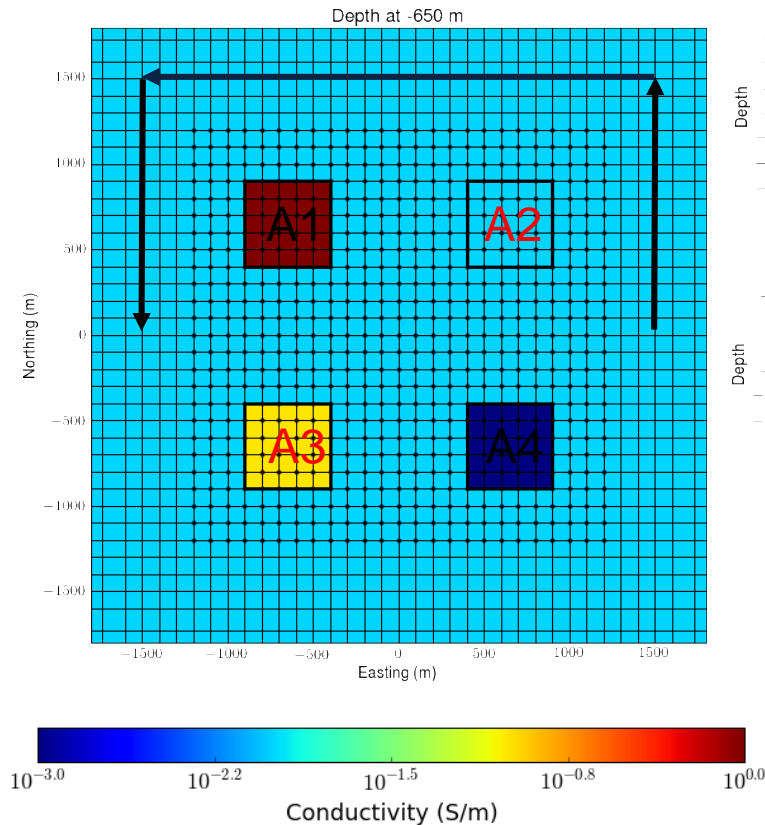
- 200 m bi-pole (625 mid points)

Time range: 1 – 600 ms

Chargeable objects: A2 and A3

- Cole-Cole parameters: $\eta = 0.1$
 $\tau = 0.5 \text{ s}$
 $c = 1$

Forward modelling set up



Conductivity at
Infinite frequency:

$$\begin{aligned}\sigma_{\infty}^{half} &= 0.01 \text{ S/m} \\ \sigma_{\infty}^{A1} &= 1 \text{ S/m} \\ \sigma_{\infty}^{A2} &= 0.01 \text{ S/m} \\ \sigma_{\infty}^{A3} &= 0.1 \text{ S/m} \\ \sigma_{\infty}^{A4} &= 0.001 \text{ S/m}\end{aligned}$$

Measure potential difference (Easting direction)

- 200 m bi-pole (625 mid points)

Time range: 1 – 600 ms

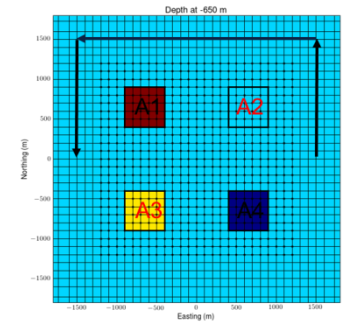
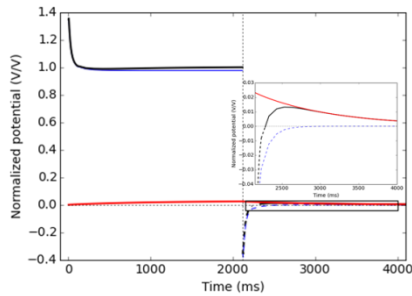
Chargeable objects: **A2** and **A3**

- Cole-Cole parameters: $\eta = 0.1$

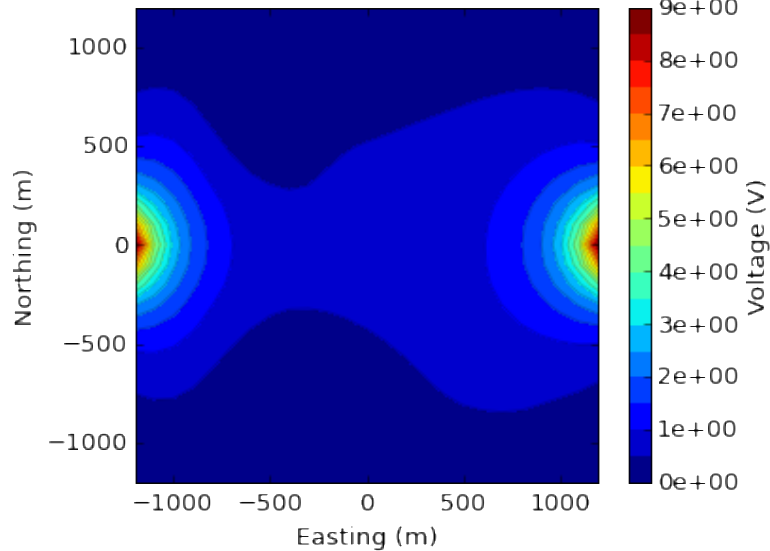
$\tau = 0.5 \text{ s}$

$c = 1$

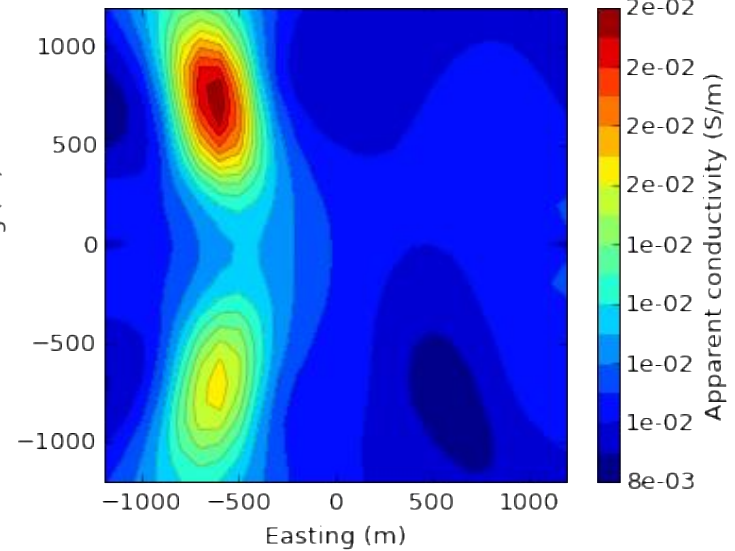
Observed DC data



Voltage

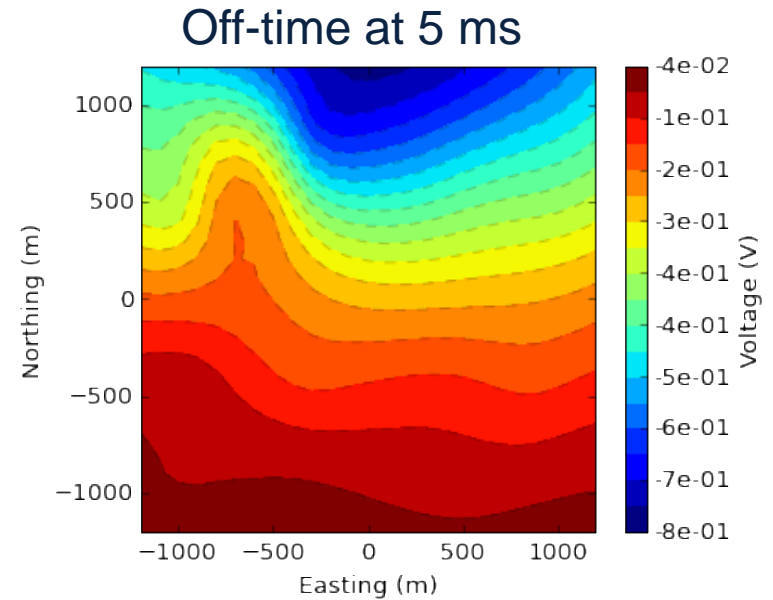
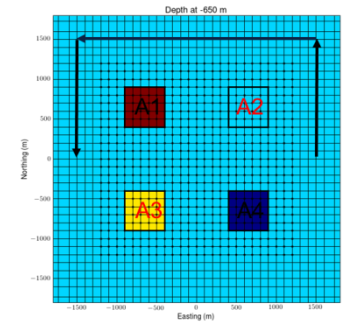
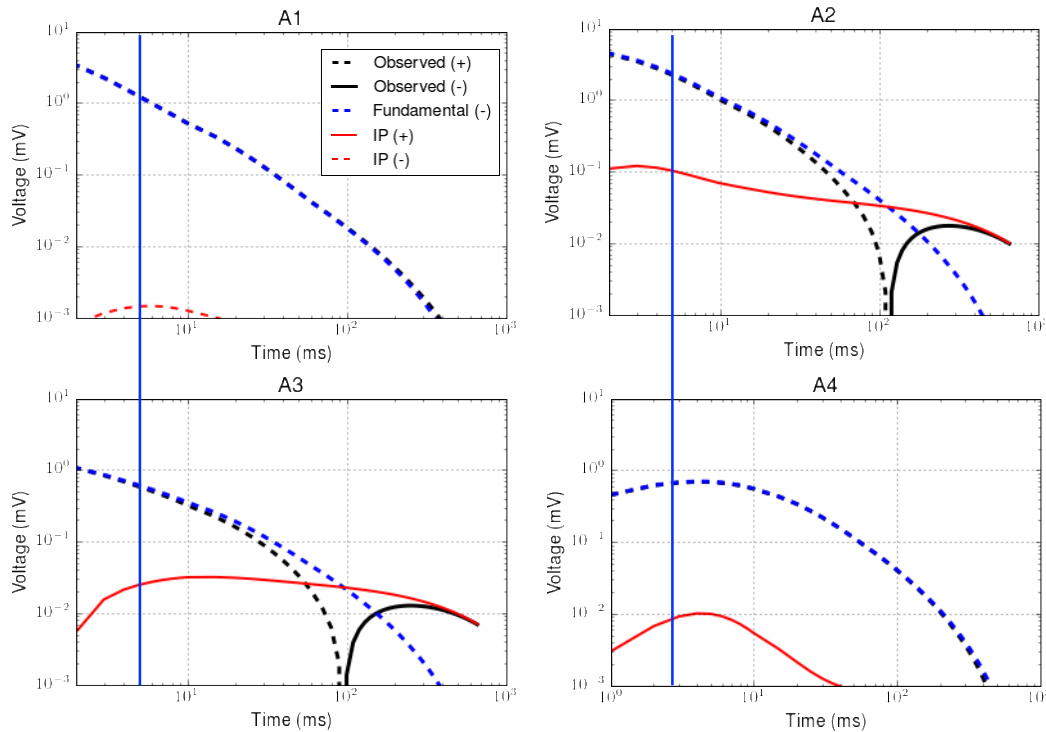


Apparent conductivity



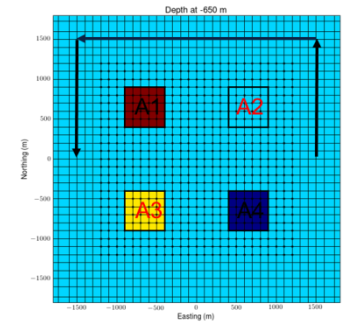
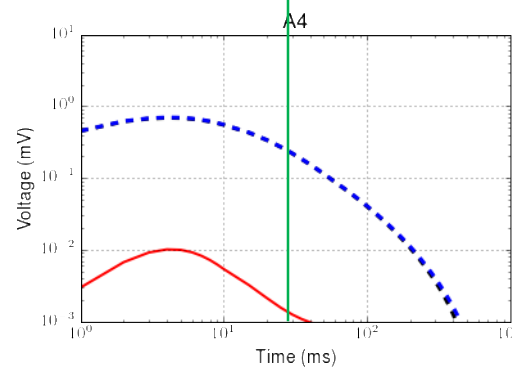
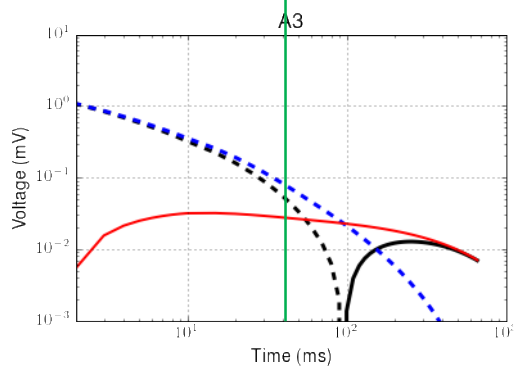
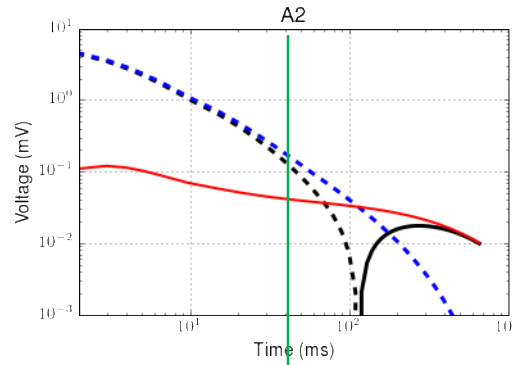
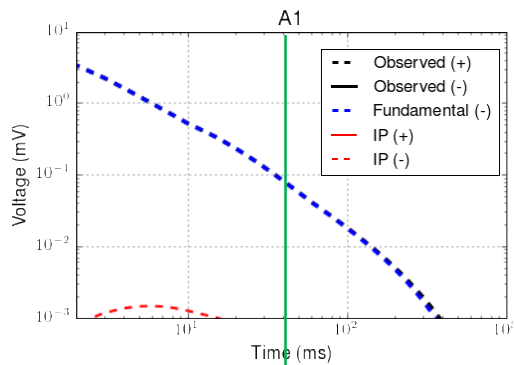
Observed data (off-time)

- Decaying curves at A1-A4

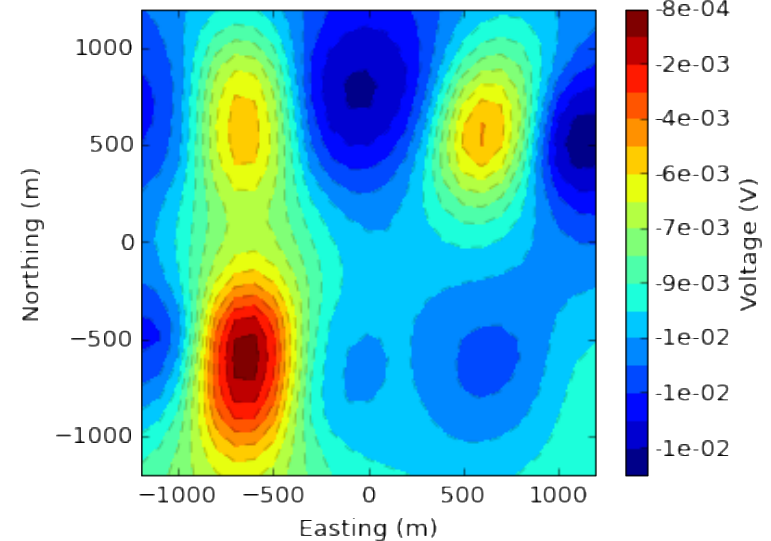


Observed data (off-time)

- Decaying curves at A1-A4

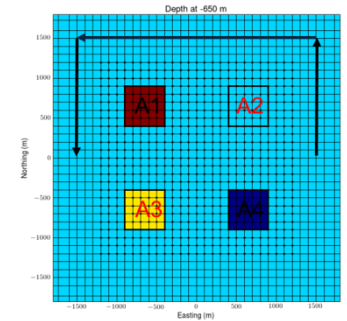
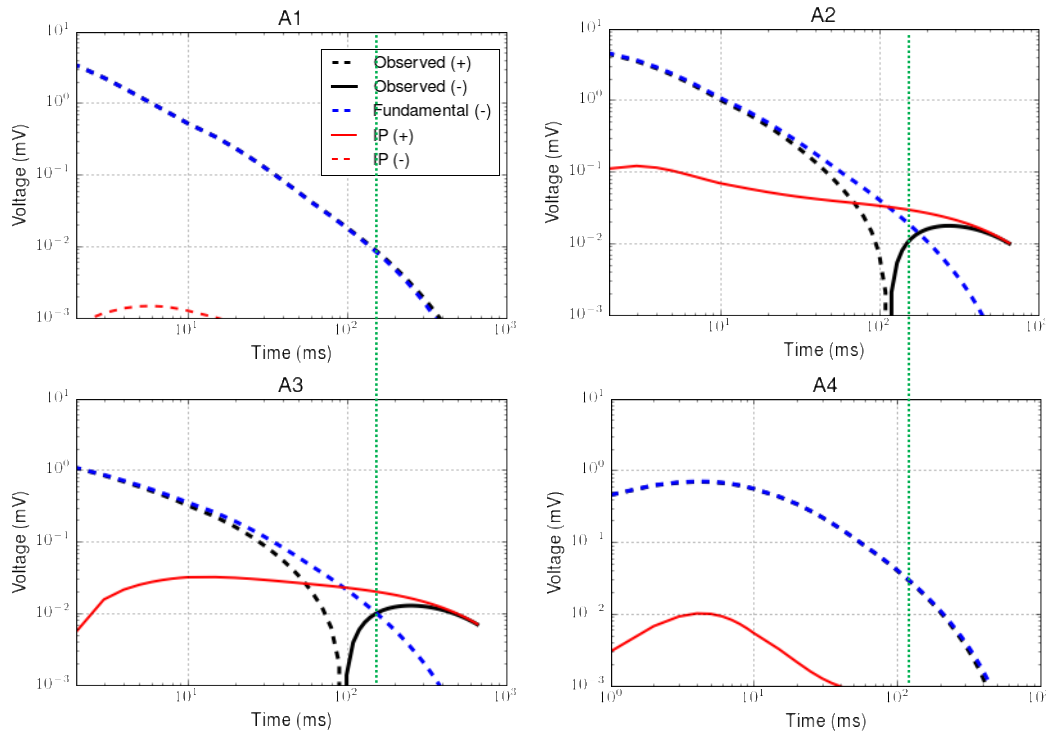


Off-time at 80 ms

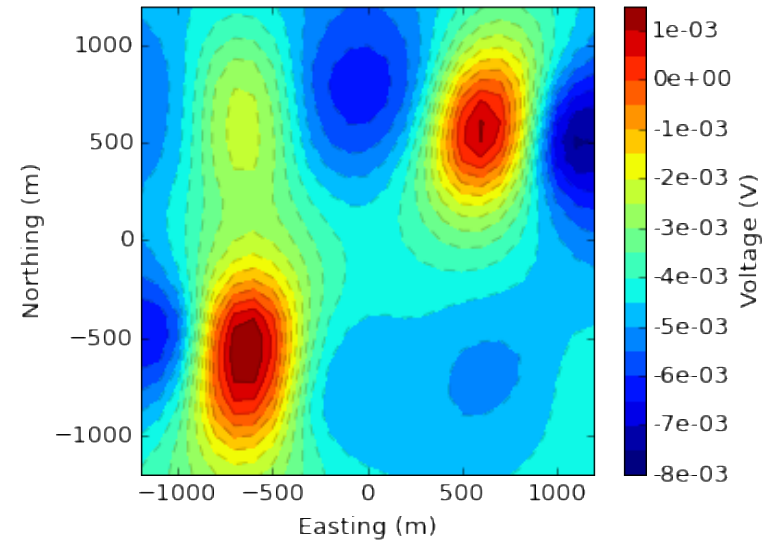


Observed data (off-time)

- Decaying curves at A1-A4

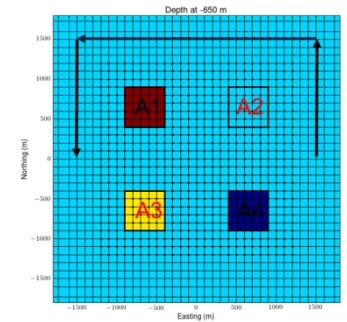
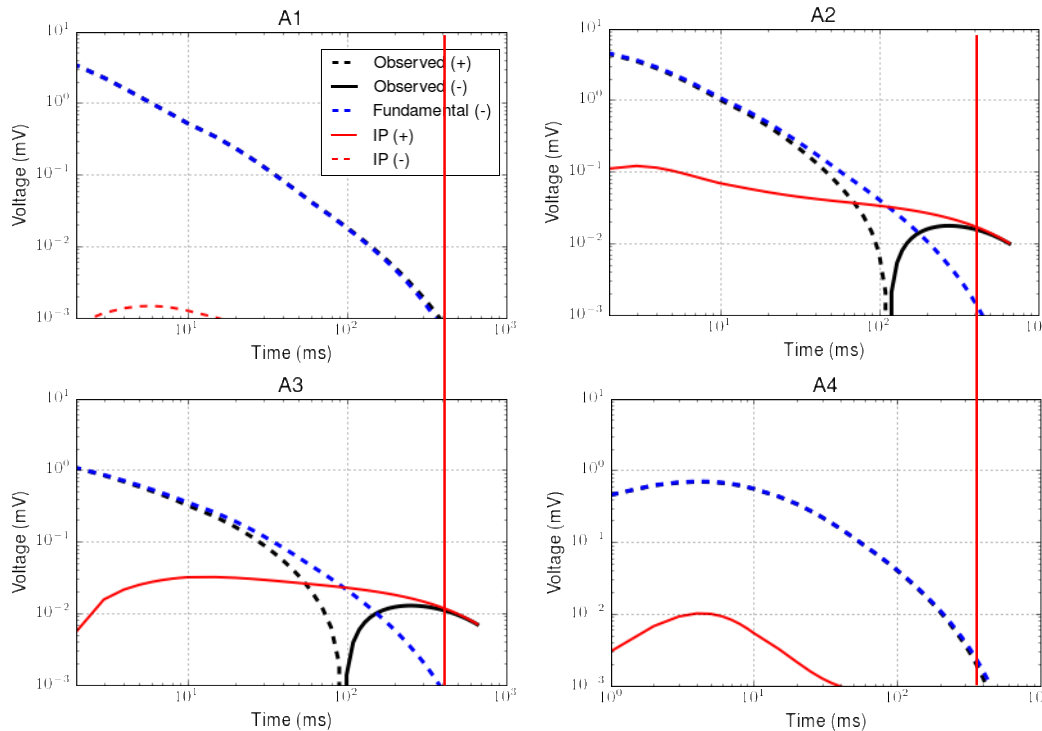


Off-time at 130 ms

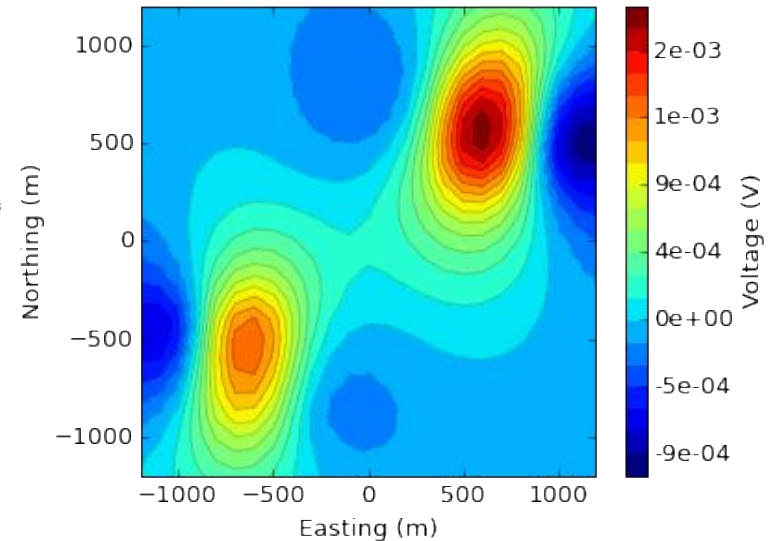


Observed data (off-time)

- Decaying curves at A1-A4

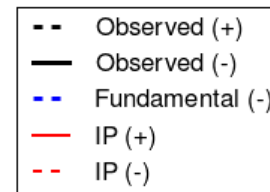
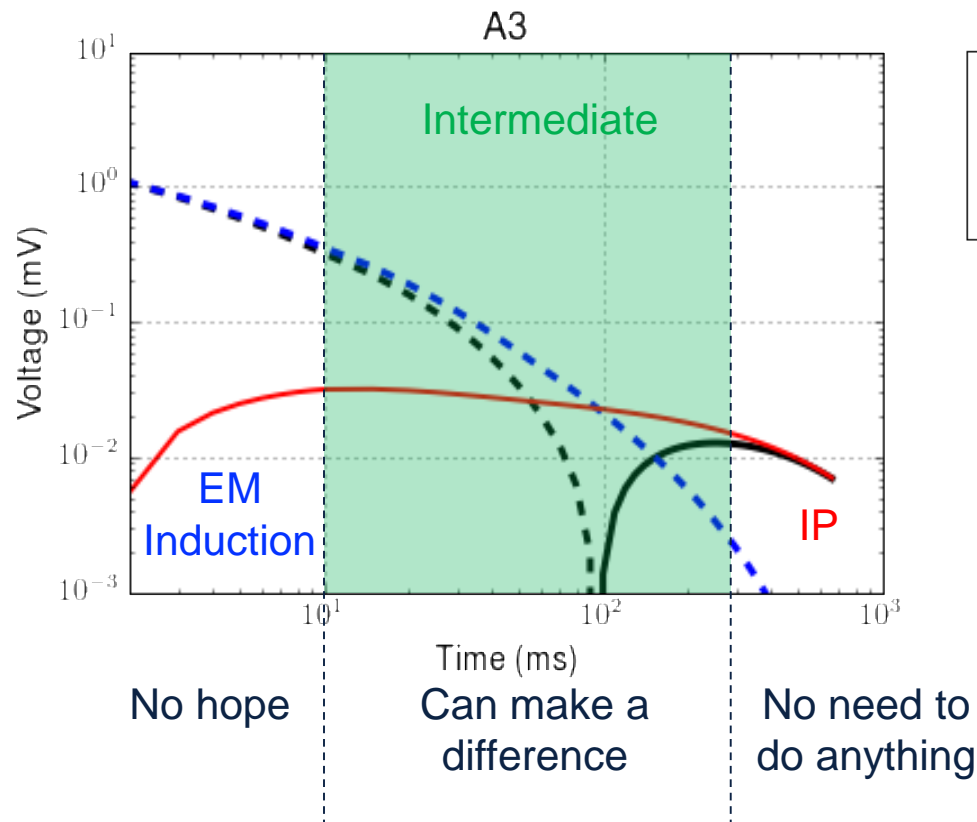
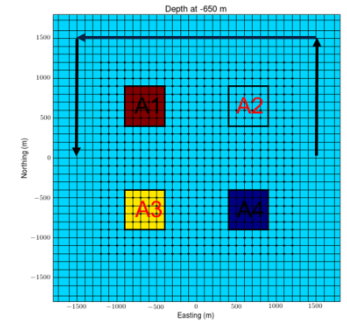


Off-time at 650 ms



EM decoupling

- Time decaying curves (off-time)



$$IP = \text{Observation} - \text{Fundamental}$$

$$d^{IP}(t) = F[\sigma(t)] - F[\sigma_{\infty}]$$

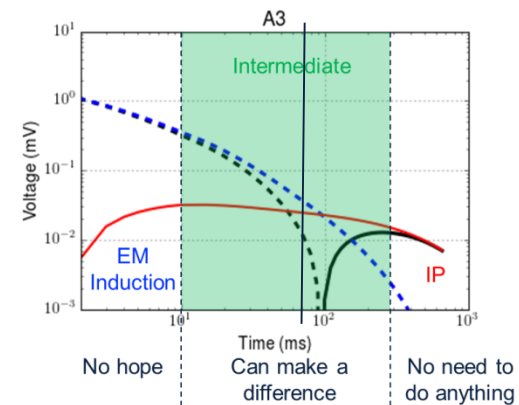
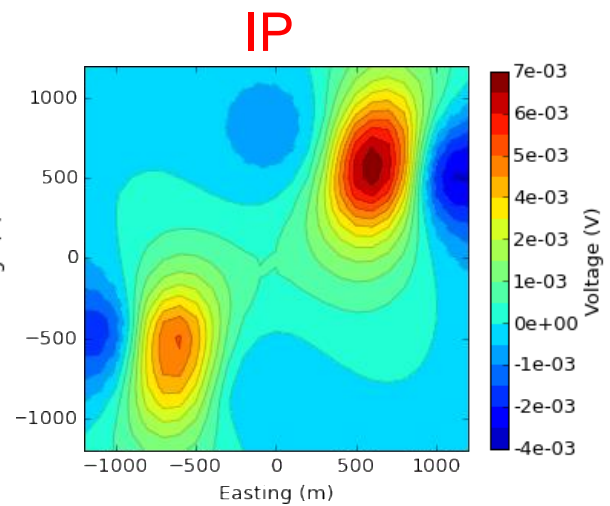
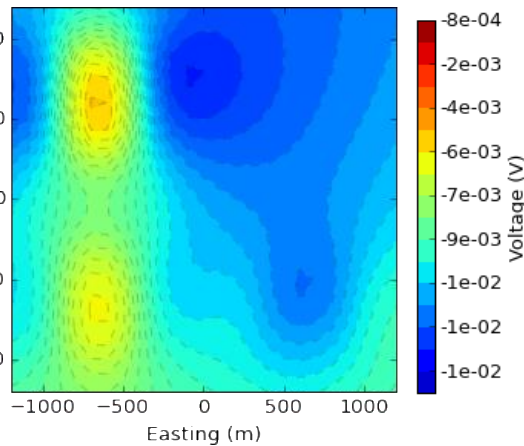
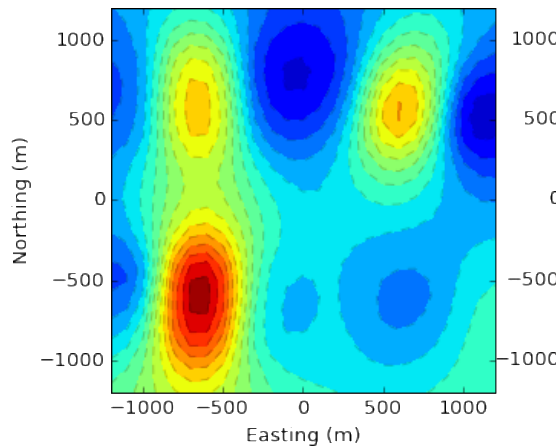
EM decoupling: true σ_{∞}

- Off-time at 80 ms

$$d^{IP}(t) = F[\sigma(t)] - F[\sigma_{\infty}]$$

Observation

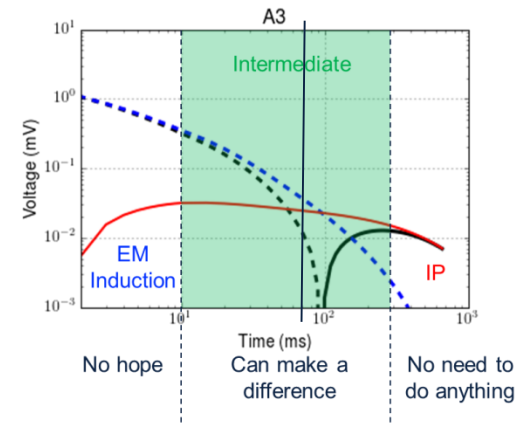
Fundamental



EM decoupling: true σ_{∞}^{half}

- Off-time at 80 ms

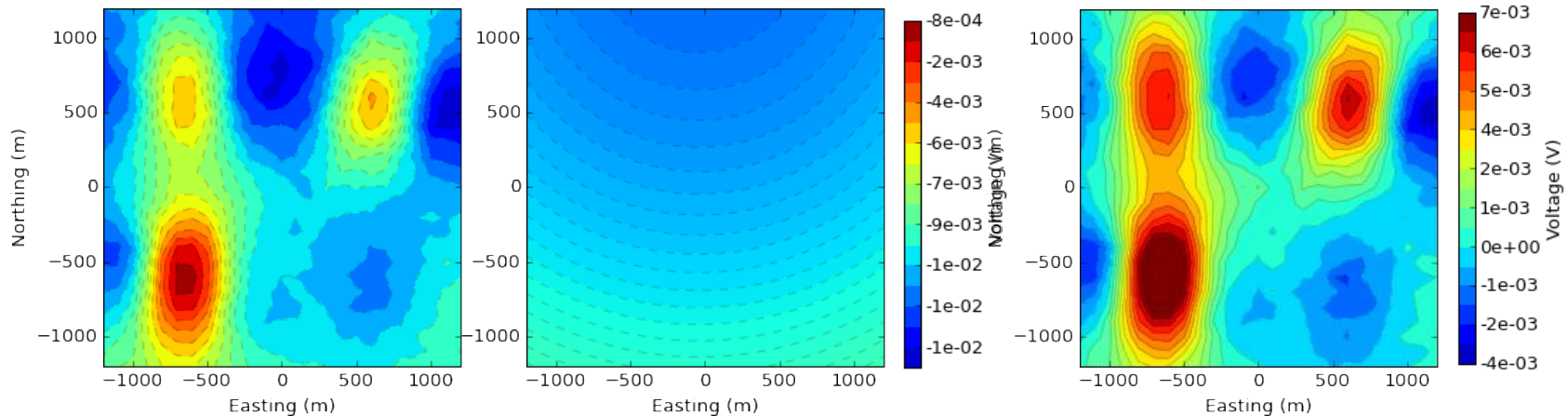
$$d_{raw}^{IP}(t) = F[\sigma(t)] - F[\sigma_{\infty}^{half}] + noise(t)$$



Observation

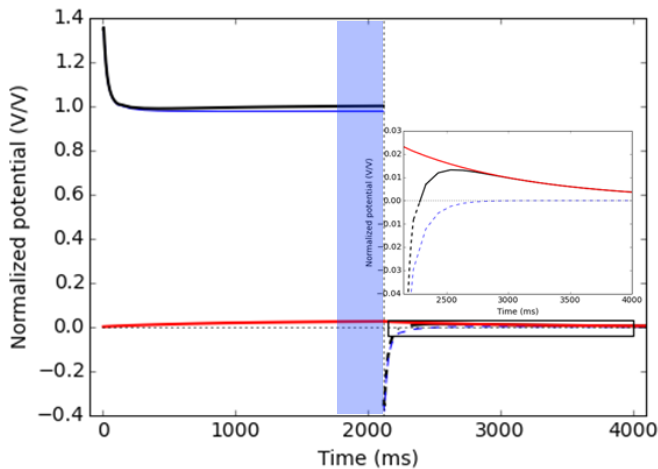
Fundamental

IP

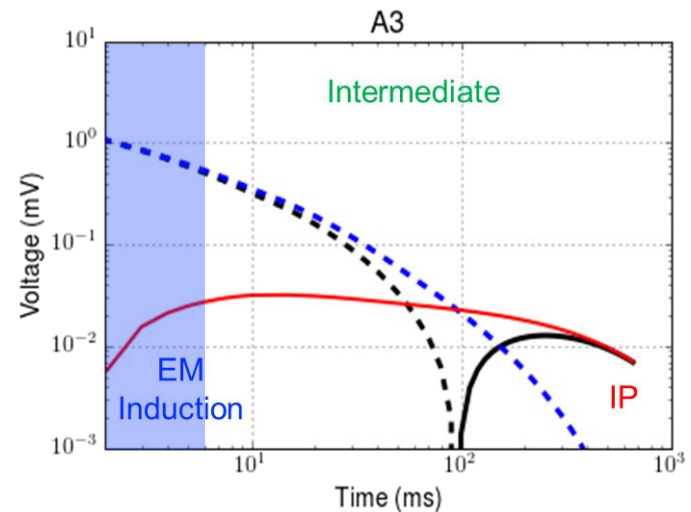


What data we have?

Late on-time data (DC)



Early off-time data (TEM)



3D inversion methodology

- Data misfit:

$$\phi_d = \|\mathbf{W}_d(\mathbf{A}\mathbf{m} - \mathbf{d}^{obs})\|_2^2 = \sum_{j=1}^N \left(\frac{\mathbf{d}_j^{pred} - \mathbf{d}_j^{obs}}{\epsilon_j} \right)^2,$$

- Tikhanov style regularization:

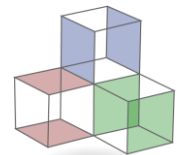
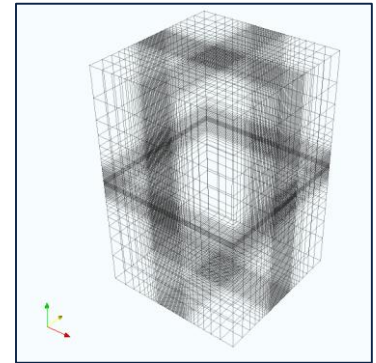
$$\phi_m = \alpha_s \|\mathbf{W}_s \mathbf{W}(\mathbf{m} - \mathbf{m}_{ref})\|_2^2 + \alpha_x \|\mathbf{W}_x \mathbf{W}(\mathbf{m} - \mathbf{m}_{ref})\|_2^2 + \alpha_y \|\mathbf{W}_y \mathbf{W}(\mathbf{m} - \mathbf{m}_{ref})\|_2^2 + \alpha_z \|\mathbf{W}_z \mathbf{W}(\mathbf{m} - \mathbf{m}_{ref})\|_2^2,$$

- Statement of the inversion:

$$\text{minimize } \phi = \phi_d(\mathbf{m}) + \phi_m(\mathbf{m})$$

- Depth weight:

$$\mathbf{W} = \text{diag}\left((z - z_0)^\alpha\right)$$



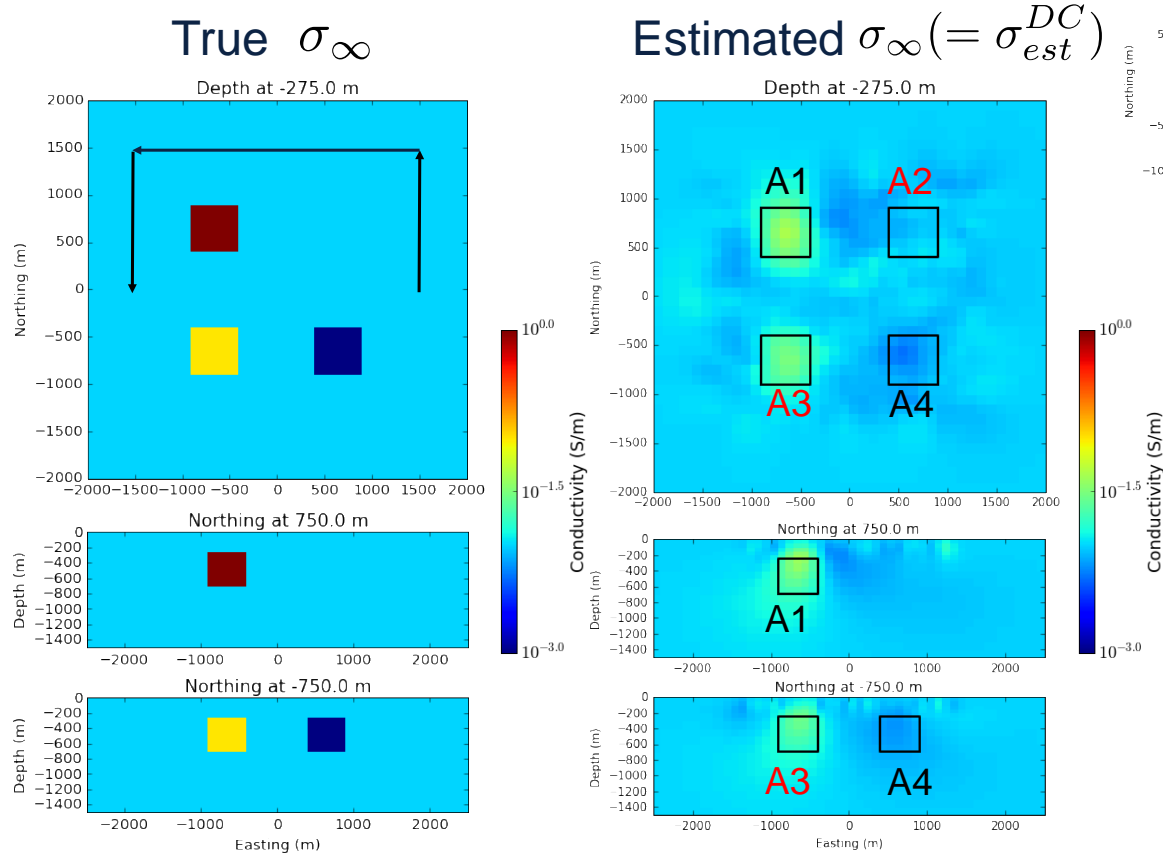
Simulation and Parameter Estimation in Geophysics

DC-IP inversion: SimPEG-DCIP
TEM inversion: UBC-H3DTD code



3D DC inversion

- Recover 3D conductivity



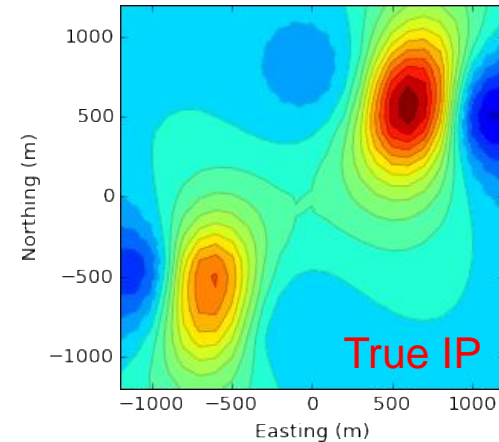
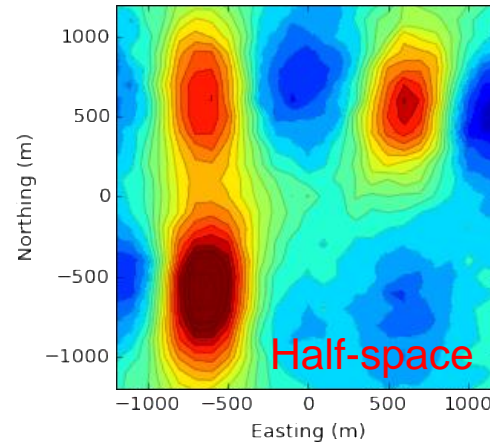
Depth weight:

$$W = \text{diag}((z - z_0)^\alpha)$$

EM decoupling: σ_{est}^{DC}

- Off-time at 130 ms

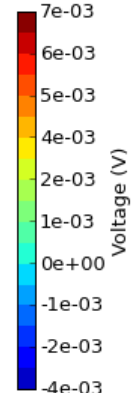
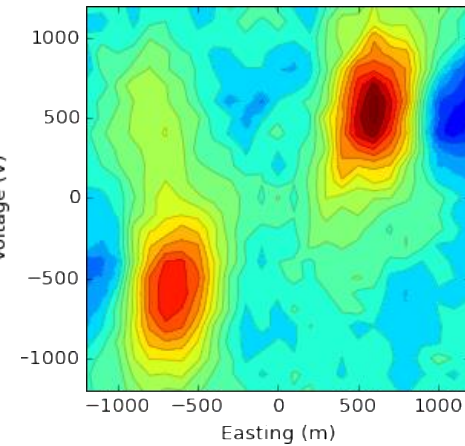
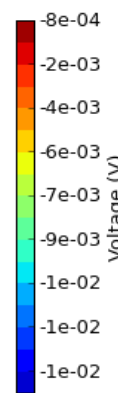
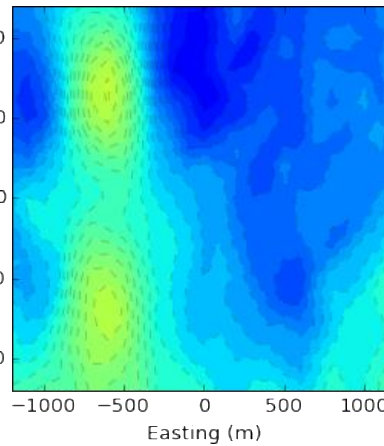
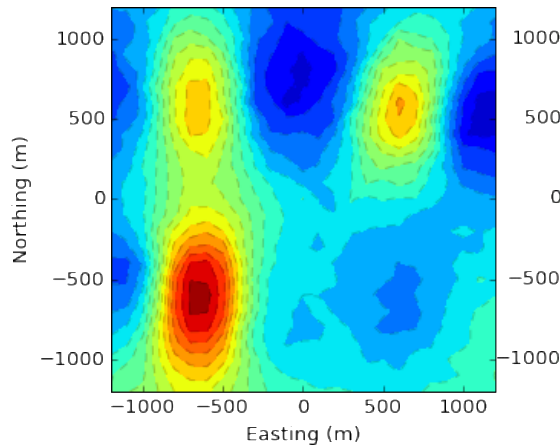
$$d_{raw}^{IP}(t) = F[\sigma(t)] - F[\sigma_{est}^{DC}] + noise(t)$$



Observation

Predicted

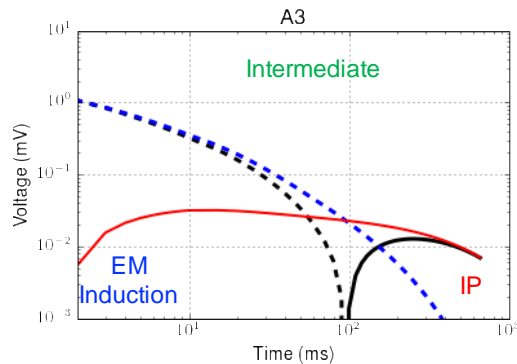
Raw IP



3D TEM inversion

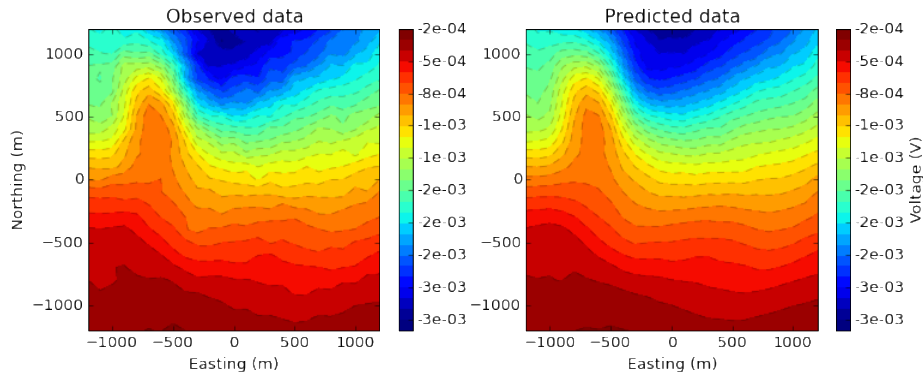
- Recover 3D conductivity

Use uncontaminated EM data

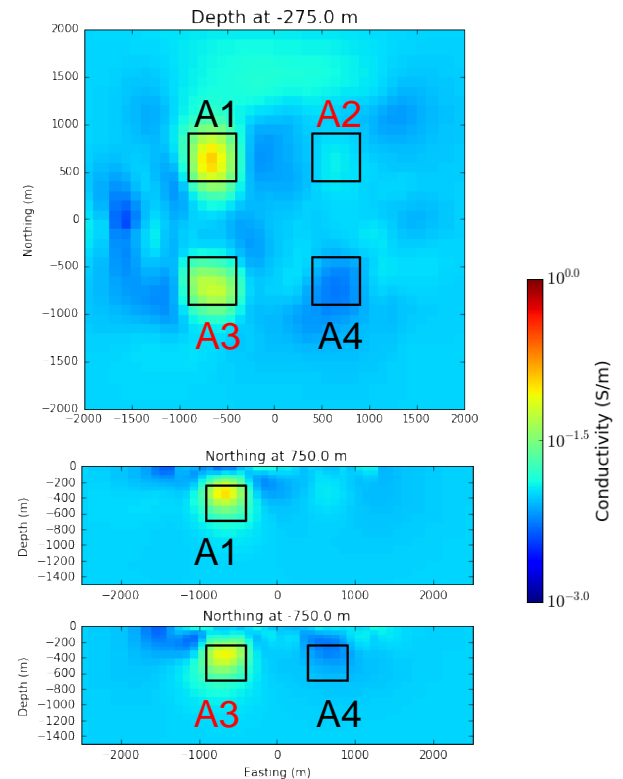


Time range: 1-6 ms
(6 channels)

Observed vs. Predicted



Estimated $\sigma_{\infty} (= \sigma_{est}^{EM})$



EM decoupling: σ_{est}^{EM}

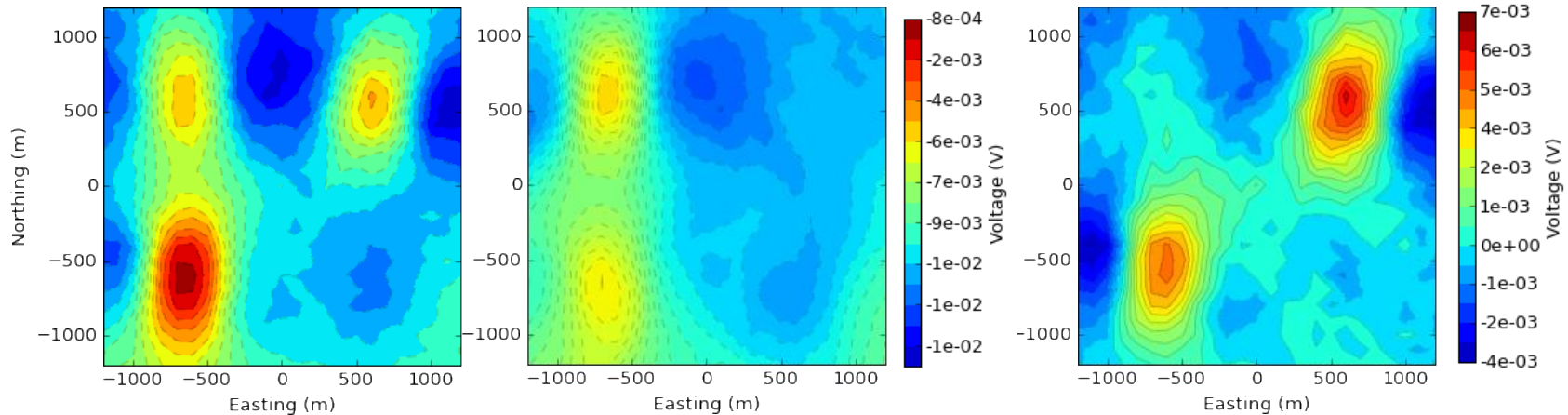
- Off-time at 80 ms

$$d_{raw}^{IP}(t) = F[\sigma(t)] - F[\sigma_{est}^{EM}] + noise(t)$$

Observation

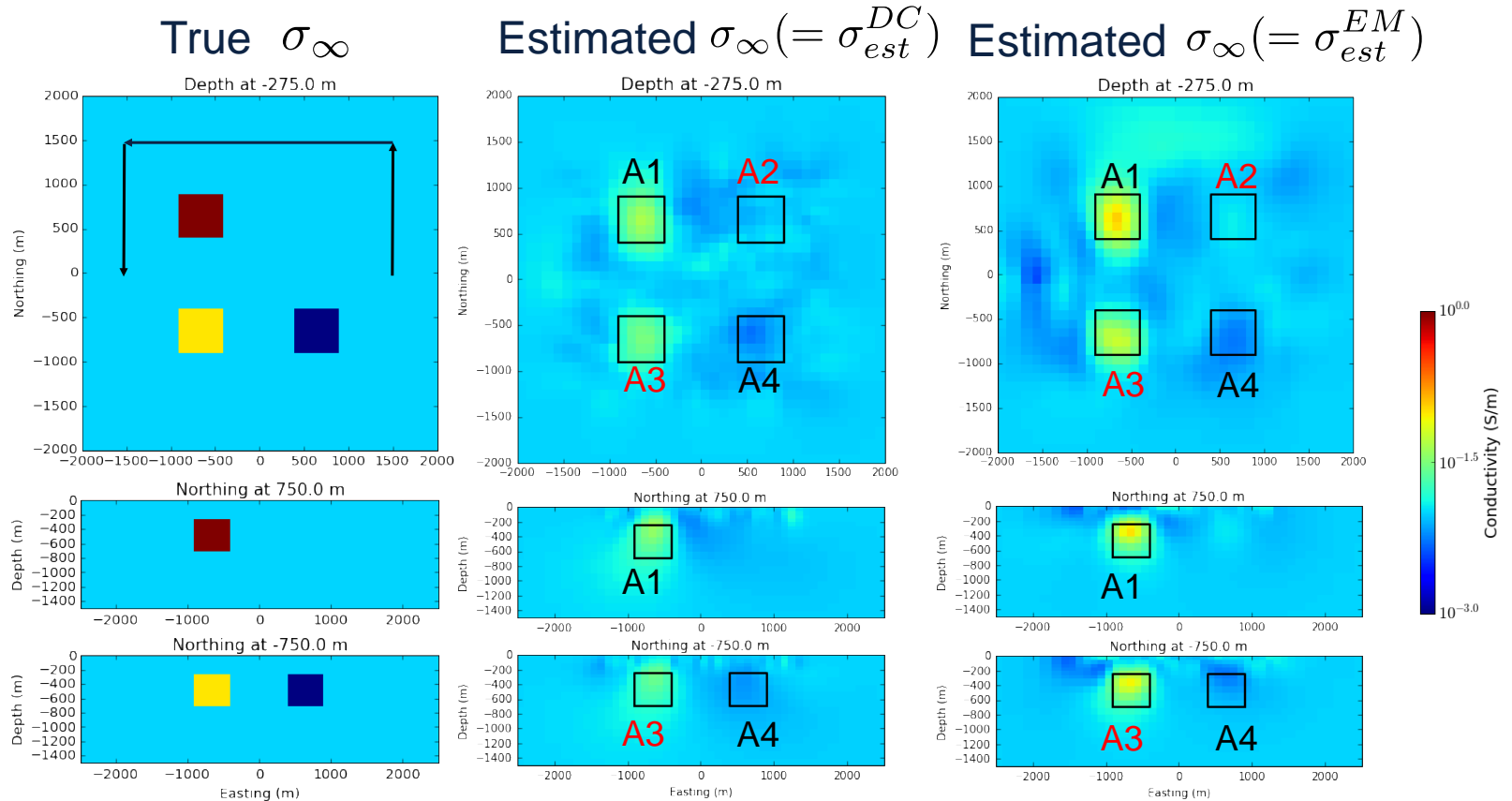
Predicted

Raw IP



Comparison of 3D conductivities

- Recovered 3D conductivity



Comparisons of Fundamental

- Fundamental data at 80 ms

IP = Observation - Fundamental

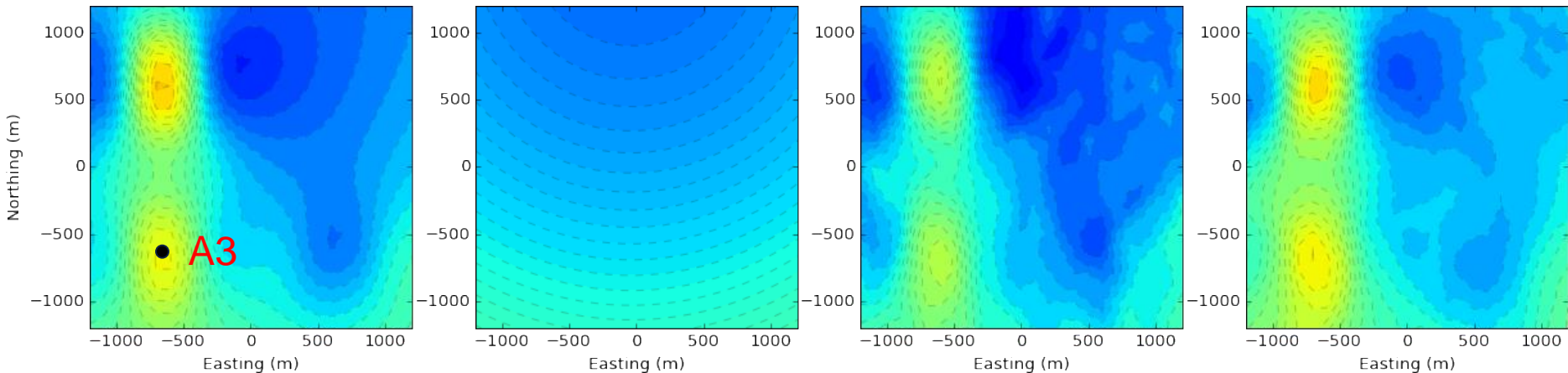
$$d^{IP}(t) = F[\sigma(t)] - F[\sigma_{\infty}]$$

Fundamental

Half-space

DC

TEM



Comparisons of IP

- IP data at 80 ms

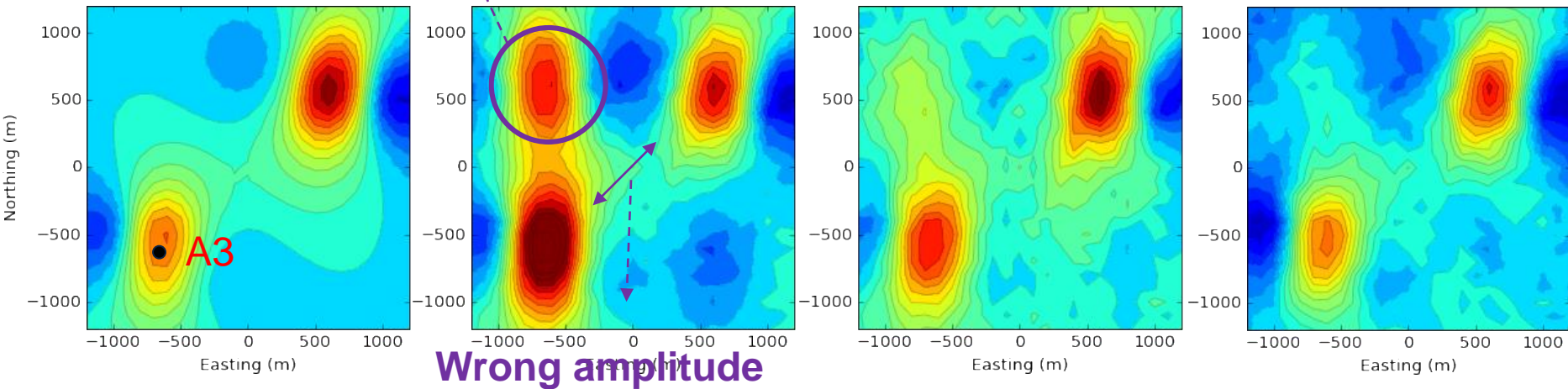
False chargeable target

True IP

Half-space

DC

TEM



3D IP inversion

SimPEG-DCIP code

Depth weight:

$$W = \text{diag}((z - z_0)^\alpha)$$

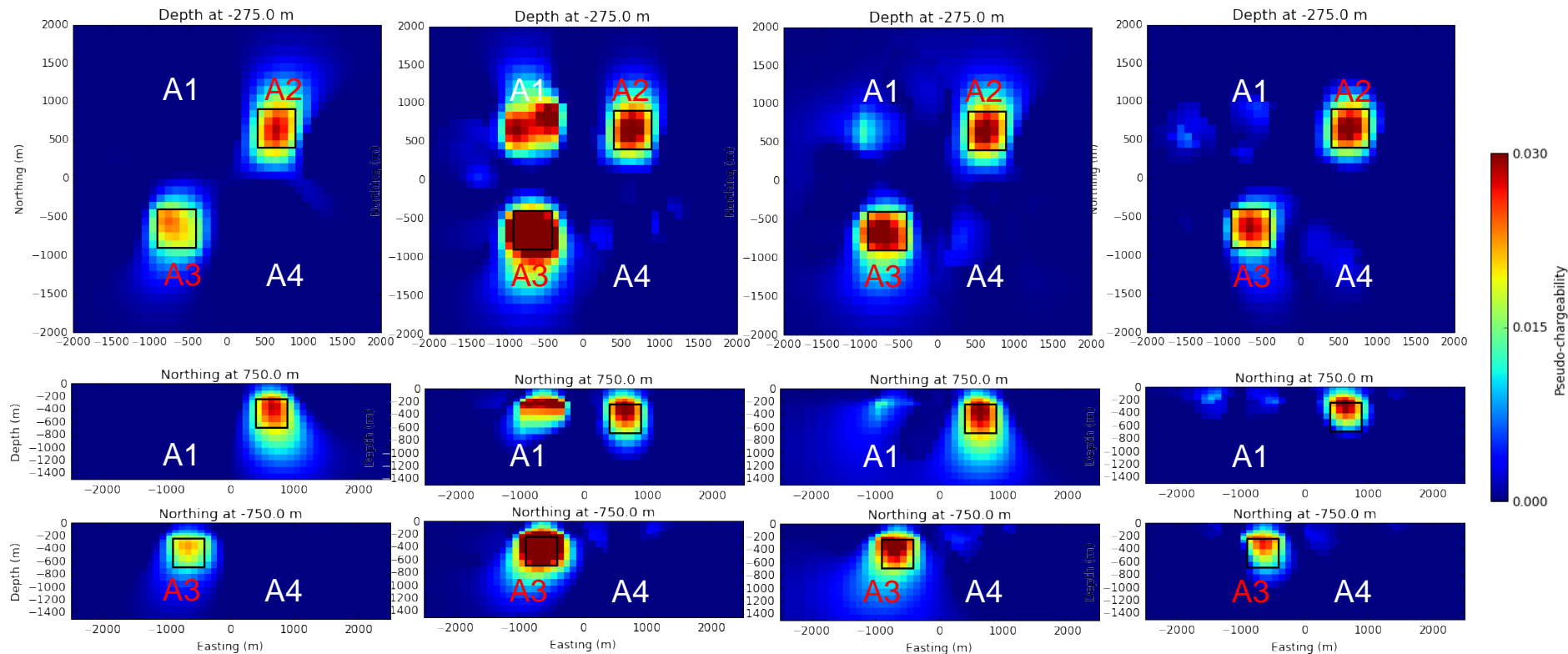
- Chargeability: recovered by inverting:

True

Half-space

DC

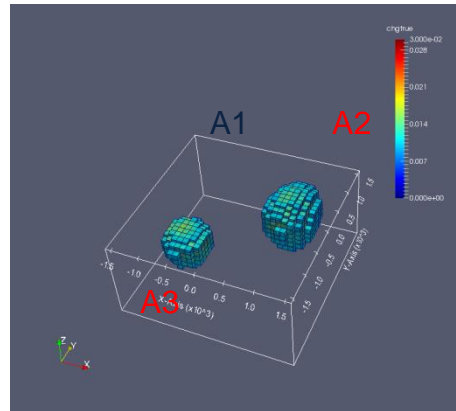
TEM



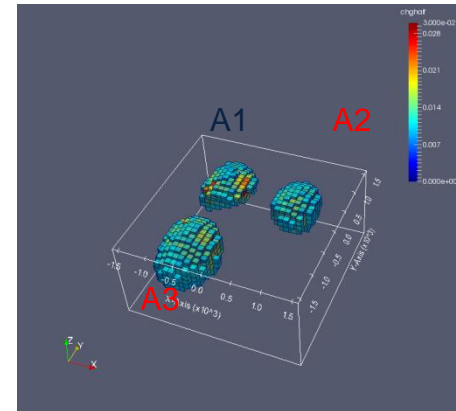
3D cut-off volume

- Pseudo-chargeability > 0.015

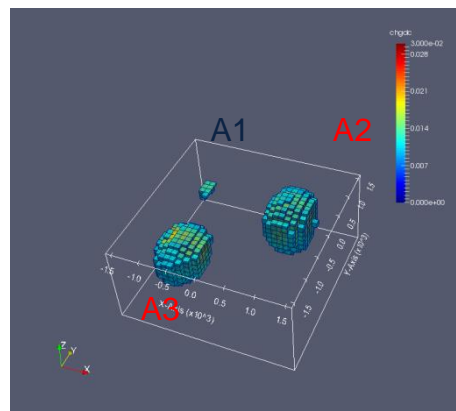
True



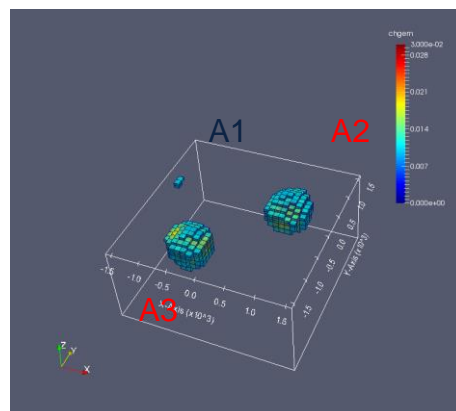
Half-space



DC



TEM



Summary

3D-TEM IP inversion workflow

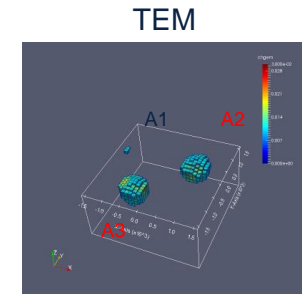
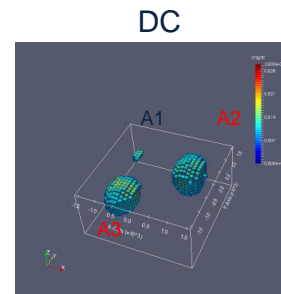
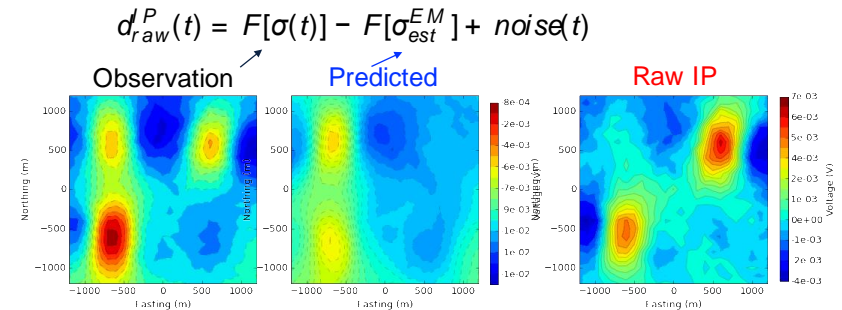
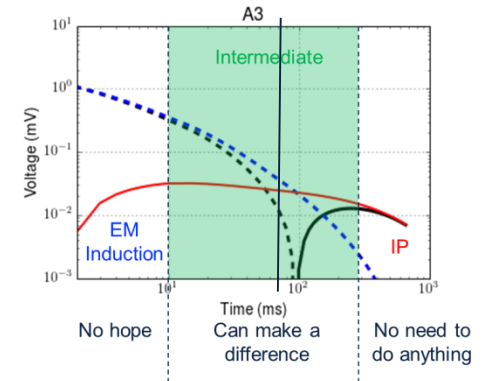
Invert TEM data,
to recover σ_{∞}

Compute IP datum
Remove EM responses

Linearized equations

Invert d^{IP} data,
recover pseudo-chargeability

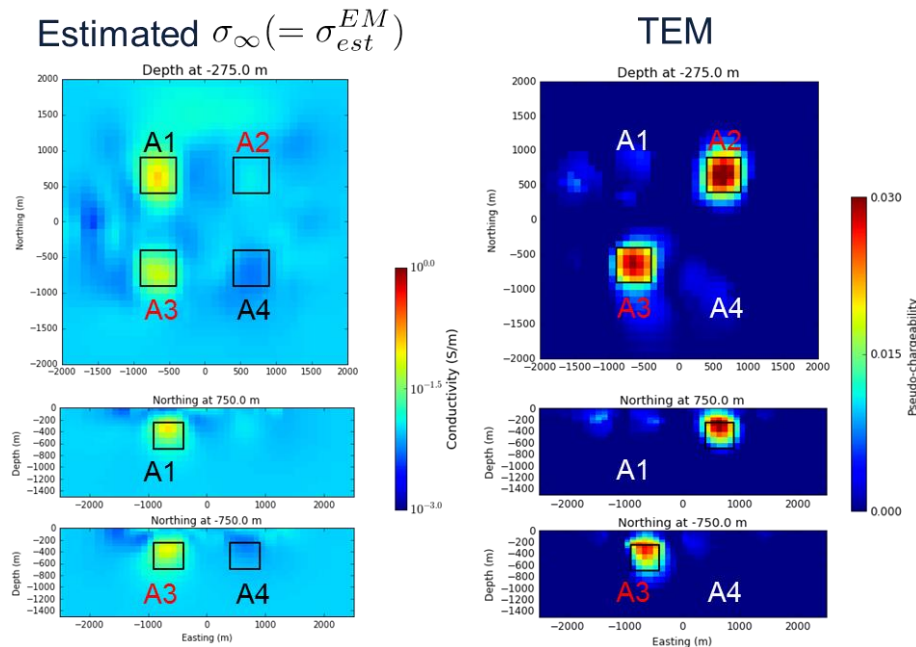
Estimate intrinsic
IP parameters



Take home

“Traditionally, **early time TEM data** has been discarded”

“By using these discarded **TEM** signals we can better estimate both **3D conductivity** and **chargeability**”



Thank you 😊

Acknowledgements

- Special thanks to
 - SimPEG developers for utility codes to make this study, and constructive discussions
 - SimPEG-DCIP package for DC-IP inversions
 - UBC-GIF for allowing us to use H3DTD codes
 - Patrick Belliveau and Eldad Haber for developing time domain IP code

