

1 tTEM20AAR: a benchmark geophysical dataset for 2 unconsolidated fluvio-glacial sediments

3 Alexis Neven¹, Pradip K. Maurya², Anders Vest Christiansen², and Philippe Renard^{1,3}

4 ¹Centre of Hydrogeology and Geothermics, University of Neuchâtel, Neuchâtel, Switzerland

5 ²Department of Earth Sciences, Aarhus University, Aarhus C, Denmark

6 ³Department of Geosciences, University of Oslo, Oslo, Norway

7 *corresponding author: Alexis Neven (alexis.neven@unine.ch)

8 ABSTRACT

9 Quaternary deposits are complex and heterogeneous. They contain some of the most abundant and extensively used aquifers. In order to improve the knowledge of the spatial heterogeneity of such deposits, we acquired a large (1500 hectares) and dense (20m spacing) Time Domain ElectroMagnetic (TDEM) dataset in the upper Aare Valley, Switzerland. TDEM is a fast and reliable method to measure the magnetic field directly related to the resistivity of the underground. In this paper, we present the inverted resistivity models derived from this acquisition. The depth of investigation ranges between 40 to 120m depth, with an average data residual contained in the standard deviation of the data. These data can be used for many different purposes: from sedimentological interpretation of quaternary environments in alpine environments, geological and hydrogeological modeling, to benchmarking geophysical inversion techniques.

10 Background & Summary

11 In most urbanized and agricultural areas of Switzerland, the shallow underground is constituted of
12 Quaternary deposits. The thickness can vary from few meters to hundreds of meters. These recent
13 sediments are deposited by various agents such as rivers, lakes, glaciers or even landslides. Each time, the
14 associated sediment will have a different composition and permeability and a spatial variability that is
15 often higher than expected in such deposits.

16 However, these formations are some of the most solicited: water supply for cities, extraction of
17 construction materials and shallow geothermal exploitation. Often, the construction of geological models
18 using only boreholes can miss most of the spatial heterogeneity, and lead to inadequate models and wrong
19 conclusions. Increasing the number of boreholes to reduce the uncertainty is often difficult and expensive.
20 A good example of these highly exploited Quaternary zones is the upper Aare Valley. (fig. 1). In 60
21 km², the Aare Valley includes 4 quarries, 6350 pumping wells (Shallow geothermic or drinkable water)
22 and 5300 injection wells (re-inject water after geothermal heat pump). A previous valley size model was
23 designed using boreholes and surface data¹, but the model does not represent the internal heterogeneities
24 of the Quaternary formations and can show unrealistic sharp variations due to the nearest neighbors
25 interpolation method used during the workflow. Therefore, there is a need for a better understanding of
26 Quaternary sedimentary heterogeneity, in order to better constrain geological models, knowledge that
27 could be applied in the Aare valley or for any fluvio-glacial filling area.

28 Near-surface geophysics such as DC resistivity, electromagnetic or seismic methods can bring im-
29 portant information in terms of the spatial distribution of facies. However, they are usually carried out
30 in restricted areas to answer specific local questions, and do not help to understand the variations of

31 geology at the valley scale. In order to fill this gap of information, and provide a valley scale fluvio-glacial
32 resistivity map, we conducted in January 2020 a large geophysical survey using tTEM (towed Transient
33 Electromagnetic) system² in the upper Aare Valley, Switzerland. The tTEM-system provides a very
34 detailed (both vertically and horizontally) resistivity model. The *tTEM20AAR* dataset covers a section of
35 the valley of approximately 1-2 km width and 16 km long. The fields were mapped with a line spacing
36 of 20 meters, resulting in about 1500 hectares of covered land (see fig. 1). The raw tTEM data were
37 processed to suppress noisy data parts, and then inverted to a resistivity model using spatially constrained
38 inversion algorithm³. The resulting resistivity model consists of 57'862 1D models of 30 layers. The depth
39 of investigation varies, from 40 to 120 meters depth, primary driven by lithological/resistivity variations.
40 The resulting resistivity model explains (fits) the recorded data well within the estimated data uncertainty.
41 The resistivity model reveals new and very interesting geophysical/geological structures of the subsurface
42 at a fine resolution. At a first sight, they seem to reveal possible paleo river channels, various stages of
43 glacial advances and retreat, as well as landslide lateral deposits. These structures still require a more
44 detailed analysis and geological interpretation. Example of geological interpretations of such data are
45 available in⁴.

46 The *tTEM20AAR* data set can be used for several purposes. It can be used as a benchmark to test
47 and compare geophysical inversion procedures for tTEM-systems. Stochastic inversion^{5,6} using different
48 methods or types of prior knowledge could also be applied on this data set and be compared with the
49 published results. In addition, if other geophysical data are acquired on the same site in the future, they
50 could complement the analysis by performing joint inversion. More generally, quaternary formations are
51 highly heterogeneous and constitute a challenge for geostatistical and uncertainty modeling⁷. Sharing this
52 dataset will allow to test and compare various methods to interpolate the properties of the underground
53 and construct models that can be used for various purposes. The integration of geophysical methods to
54 constrain hydrogeological models is also a very important field of research⁸. The *tTEM20AAR* data set
55 may help testing the development of innovative methods for the construction of groundwater models.
56 It is important to note in this perspective that the Upper Aare Valley has been extensively studied and
57 a consequent amount of additional data are distributed by the Swiss authorities. Improvement in data
58 integration may strongly improve hydrogeological modeling in such environments, subject to high local
59 facies variations.

60 Finally, from a more geological perspective, the *tTEM20AAR* data set could be used to better understand
61 the internal structures of quaternary deposits within alpine valleys. It could be analysed in detail from
62 a sedimentological perspective and used to better constrain the glacial and geological history of the
63 quaternary deposits⁹.

64 **Methods**

65 **The tTEM-system**

66 The tTEM-system used for the data acquisition is developed by the HGG-group at Aarhus University,
67 Denmark². The tTEM-system is a towed, ground-based, transient electromagnetic system, designed for
68 highly efficient data collection and detailed 3D-mapping of the shallow subsurface (the upper 80 m).
69 TEM-methods build on the principle of induction (Faraday's law of induction) for mapping the electrical
70 conductivity (conductivity=1/resistivity) of the subsurface. A detailed description of the TEM principle
71 can be found in¹⁰. The layout of the tTEM-system is shown in Figure 2.

72 The tTEM-system consists of an All-Terrain Vehicle (ATV) carrying the instrumentation and towing
73 the transmitter frame (Tx coil) and the receiver coil (Rx coil) in an offset configuration. The Tx and Rx
74 coils are mounted on sleds for all terrain capability. All frame parts and sleds are built of non-conductive

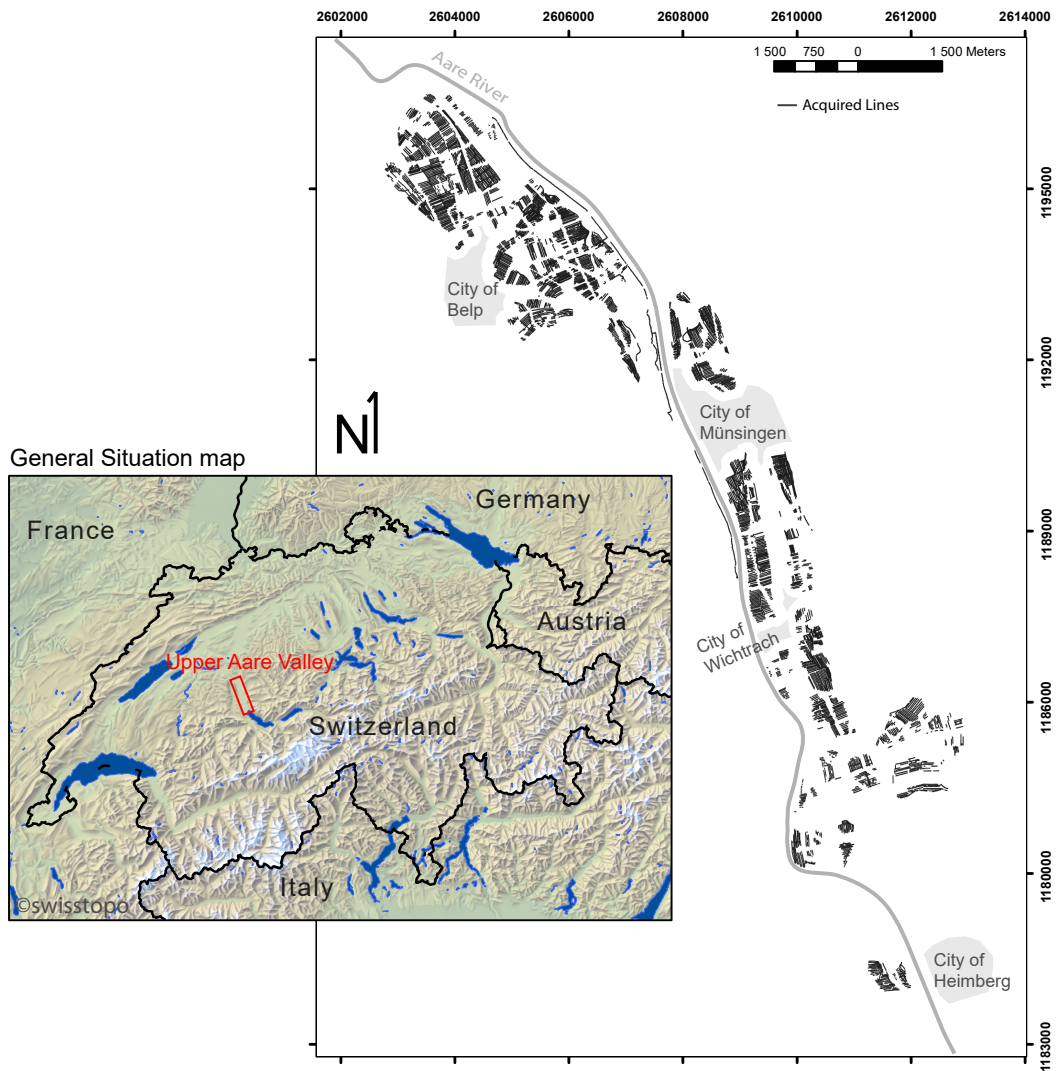


Figure 1. Location of the study area and acquisition lines. Coordinates are in UTM 32N.

75 composite materials. Driving path and various data quality control parameters are monitored in real time
 76 by the driver on a mounted screen. Operation speed is up to 20 km/h. We used an off-set configuration,
 77 where the receiver coil is 7 meters behind the transmitter coil. Both of them are horizontal, allowing to
 78 measure the z component of the secondary magnetic field. A GPS is mounted on the frame to ensure
 79 correct positioning of the data. The transmitter loop consists of one loop of 4x2 m, creating an area of 8 m^2 .
 80 We used a standard dual moment TEM configuration: a high moment (HM) with a high inductive current
 81 of 30 A and a low moment with a lower inductive current of 5 A. Such configuration has the advantage
 82 of being able to resolve shallow targets with the low moment and its associated fast turn off time, and to
 83 reach higher penetration depth with the high moment. Both moments are stacked few hundreds times.
 84 Detailed parameters are summarized in the table 1. The gate is the time interval in which the received
 85 amplitudes are averaged. Due to the signal attenuation, further we get in the listening time, lower is the
 86 signal to noise ratio. In order to partially counterbalance this effect, we used a logarithmic increasing gate
 87 size related to listening time.

88 To ensure the data quality, the tTEM-instrumentation were calibrated prior to the survey at the Danish
 89 national TEM test site following the calibration procedure described by¹¹. The two calibrated parameters

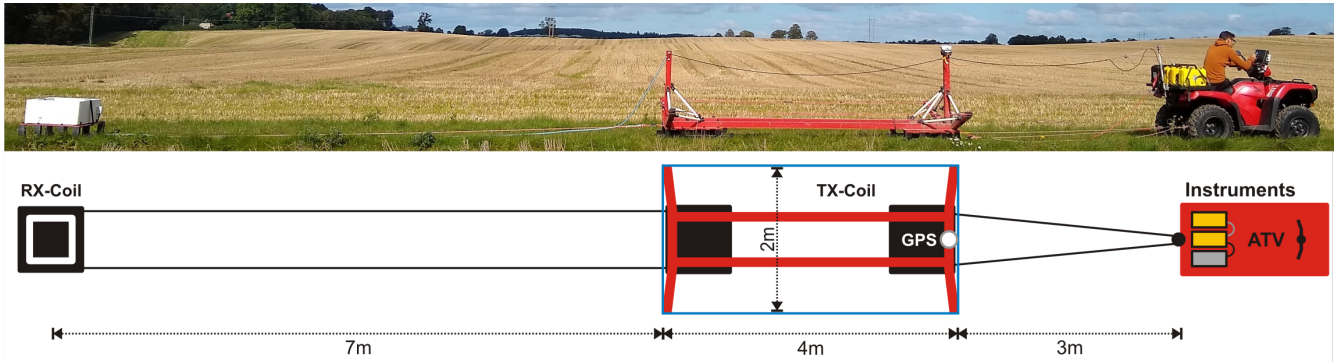


Figure 2. The tTEM-system.

Parameters	LM	HM
Tx No. of turn		1
Tx coil area		8 m^2
Transmitter current	5 A	30 A
Peak moment	30 Am^2	240 Am^2
Repetition frequency	1055 Hz	315 Hz
Stacks	422	252
Total cyclcus time	0.22 s	0.40 s
Tx time	0.2 ms	0.45 ms
Turn off time	$2.8 \mu \text{ s}$	$4.5 \mu \text{ s}$
Number of gates	4	23
Gate size	$4 \mu \text{ s} - 10 \mu \text{ s}$	$10 \mu \text{ s} - 900 \mu \text{ s}$
First gate start	$4.38 \mu \text{ s}$	$10.30 \mu \text{ s}$

Table 1. Specifications of the High and Low moment used in the acquisition. The gate size increases with time in order to counterbalance less good signal to noise ratio due to the wave attenuation.

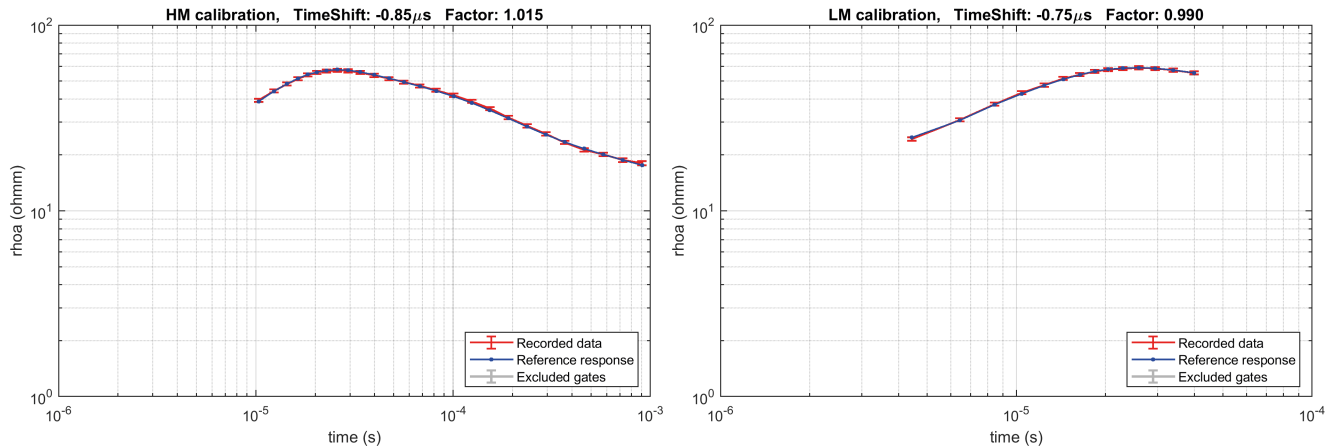


Figure 3. Calibration of the High and Low moment. The resulting time shift and scale factor are respectively $-0.75 \mu\text{s}$ and 0.99 for the LM, and $-0.85 \mu\text{s}$ and 1.015 for the HM.

90 are a time shift and an amplitude factor. The calibration was done with the ATV connected to the equipment
 91 in order to account for any shift caused by it. Figure 3 shows the match between the test site reference
 92 response and the measured tTEM-response after calibration, which results in a fully acceptable match.

93 Field Site

94 The field site is the Upper Aare Valley, in central Switzerland (see figure 1). The survey took place in
 95 January 2020. During approximately 15 working days, we covered all the accessible farming fields in
 96 the valley along a 26 km long section. The driving speed was between 10 to 20 km/h, depending of the
 97 terrain. Since the acquisition rate is time dependant, and not distance triggered, we also lowered the speed
 98 in noisier or less responsive areas in order to acquire a denser dataset. The spacing between the lines
 99 was approximately 20 meters. The average covered surface par day was 112 hectares, for a total of 1425
 100 hectares.

101 Data Processing

102 The voltage data from the receiver is measured continuously, and need to be cleaned of man-made noise and
 103 coupling. Data processing and inversion were carried out with the tTEM processing module in the *Aarhus*
 104 *Workbench* software. The objective of the processing of the tTEM-data is to remove any interference in the
 105 data from man-made installation (coupled data), suppress random noise by stacking, and finally discard
 106 the noisy late time data entering the background noise. Thus, we ensure that the resulting resistivity model
 107 represents geological structures of the subsurface without artifact from man-made installation. Processing
 108 of the dB/dt data comprises of the following steps:

- 109 • Automatic detection of capacitive coupling pattern in the raw data using slope filter as coupling
 110 appears as abrupt slope changes in a sounding curve.
- 111 • Averaging of raw data to suppress random noise. Raw data are averaged using a moving average
 112 filter with narrow time windows in early times and wider in the late times.
- 113 • Creation of vertical soundings every 2.5 s which corresponds approximately to a spacing of 10 m.
 114 The exact distance can vary depending on driving speed.

- 115 • Automatic filtering of the averaged data for removal of late-time data points entering the background
116 noise.
- 117 • Visual assessment of all dB/dt data and manual removal of coupled data not detected by the automatic
118 filtering and validation of automatically detected couplings.
- 119 • Evaluation and adjustment of the data processing based on preliminary inversion results.

120 Furthermore GPS data are lag-corrected to geographical positioned data/models at center between
121 transmitter and receiver coils. The data uncertainty consists of a minimum of 3% as uniform data standard
122 deviation (STD) plus the STD calculated from the data stacking. Averaged data resulting with STD over
123 30% are discarded from inversion.

124 Inversion

125 The electrical resistivities of the underground are then estimated using a series of 3D constrained 1D-
126 inversions. The 1D inversion is based on the *AarhusInv* code^{12,13}. This code is an implementation of a 1D
127 non-linear damped least-squares solution, with a modeled transfer function for the TEM instrumentation.
128 This function takes into account the transmitter waveform, the instrument low pass filters, the receiver
129 bandwidth, the system geometry, the gate widths and the instrument front gate. However, in such an
130 standalone 1D inversion, each model is totally independent of the neighboring ones. To account for the
131 lateral continuity expected in geological environments, the spatially constrained inversion (SCI)³ method
132 was used. It applies 3D constraints to 1D inversion models both along and across the mapping lines, with
133 a weight that is decreasing with distance. All the inversions were carried out with the *Aarhus Workbench*
134 software.

135 The SCI inversion can be used with two different schemes of regularization: smooth or sharp. The
136 smooth scheme tends to minimize abrupt changes in resistivity, in the vertical and horizontal directions.
137 On the other hand, the sharp regularization scheme tends to minimize the number of resistivity changes,
138 but will consequently result in more abrupt resistivity transitions and a potential more blocky model
139 appearance. Both regularizations were used, and are included in the output data.

140 For each resistivity model, we estimate the depth of investigation (DOI) using a method based on
141 the Jacobian Sensitivity matrix¹⁴. This method has the advantage of taking into account the full transfer
142 function, including system geometry, data uncertainty and the resistivity model. Two DOI thresholds
143 values in the sensitivity matrix were used to provide the reported DOI-standard, and the DOI-conservative
144 values. As a guideline, the resistivity structures above the DOI-conservative value are strongly data driven,
145 while resistivity structures below the DOI-standard value are weakly represented in the data. Normally
146 one would blank the resistivity models below DOI-standard value. In addition, the shallowest resolution
147 of the tTEM system is 2 to 3 m, depending of the resistivity.

148 Inversion setup for the smooth and sharp inversions are summarized in the table 2. The figure 4
149 presents some resistivity maps data extracted from the smooth regularization inversion. In addition, the
150 same cross section across the north area from the sharp and the smooth regularization is displayed. Both
151 DOI are also outlined for comparison. The spatial variations of the Quaternary deposits, in both depth
152 intervals and cross-section are clearly visible. Such variations in resistivities also indicates variations in
153 lithologies, and therefore variations in hydrological proprieties.

154 Data Records

155 After the data processing and the inversion, the processed data, the resistivity models and the associated
156 forward responses from the smooth and sharp inversions had been produced. These data¹⁵ are provided in

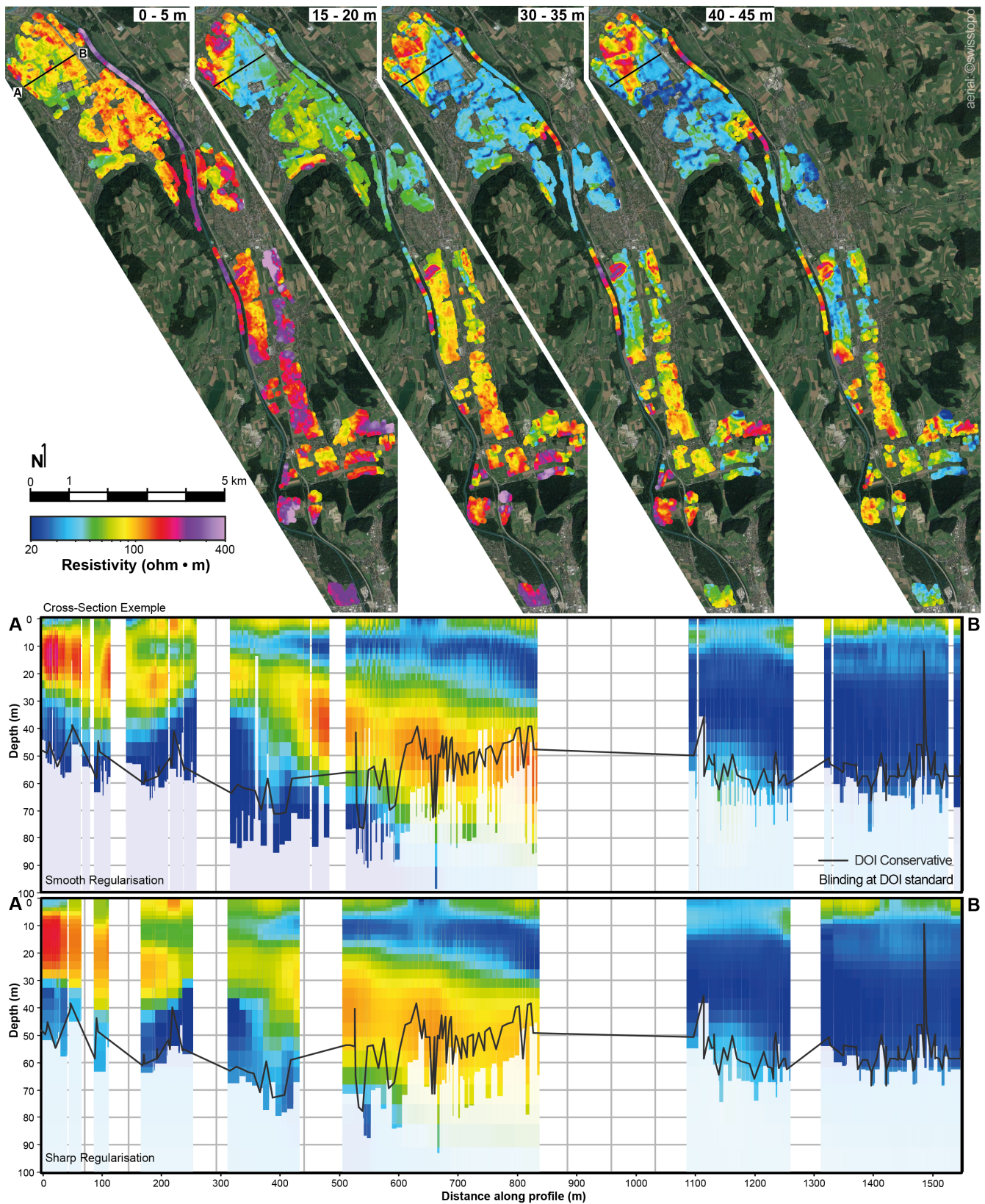


Figure 4. Top : Mean resistivity maps at different depth intervals from the smooth regularization model. Bottom : NE-SW cross section with different regularizations. The models are blinded at the DOI-standard, and the black line represent the DOI-conservative. Base map from Swiss Federal Topographic Office

Item	Parameter	Value
Model Setup	Number of layers	30
	Model resistivity start value (uniform - no prior)	40 ohmm
	Thickness of first layer (m)	1 m
	Depth to last layer (m)	120 m depth
	Thickness of layers	Log increasing with depth
Smooth Constrains	Factor of horizontal constrains on resistivities	1.5
	Factor of vertical constrains on resistivities	2.0
	Reference distance	10 m
	SCI Constraints with distance	$1/distance^{0.75}$
	Prior, thickness	Fixed
	Prior, resistivities	None
	Minimum number of gates per inversion point	2
Sharp Constrains	Factor of horizontal constrains on resistivities	1.12
	Factor of vertical constrains on resistivities	1.08
	Reference distance	10 m
	SCI Constraints with distance	$1/distance^{0.75}$
	Prior, thickness	Fixed
	Prior, resistivities	None
	Minimum number of gates per inversion point	2
	Sharp vertical constrains	500
	Sharp horizontal constrains	300

Table 2. Settings used for the model setup, the smooth and the sharp regularization.

Processed_Data.dat			
Column	Label	Unit	Description
1	RECORD		Global record number. Links the data to the resistivity model in the *.inv files
2	LINE_NO		Line number (Line number 0 = data/model not tacked with a line number)
3	UTMX	(m)	UTMX coordinate, WGS 84 UTM zone 32N (epsg:32632)
4	UTMY	(m)	UTMY coordinate, WGS 84 UTM zone 32N (epsg:32632)
5	ELEVATION	(m)	Surface elevation
6	NUMDATA		Number of data points (gates) in-use for the segment/sounding
7	SEGMENT		Transmitter moment indicator. 1=Low moment, 2=High moment
8-37	DATA_#	(V/(Am ⁴))	Processed z-component dB/dt data value for gate number #. 9999 values = data not in-use/not present
38-66	DATASTD_#	STD	Data uncertainty for DATA_#, stated as a relative STD in log space.

Table 3. Structure of the .dat data file

157 column based ASCII files. Each file structure is outlined in the following sections.

158 **Processed data file**

The `Processed_Data.dat` file contains the processed tTEM data and data uncertainties. Each line in the file corresponds to a low moment (LM) or high moment (HM) data stack for a given location. The RECORD number links the LM and HM data to a given resistivity model in the *.inv files. Number 9999 marks discarded data points or data points not present for the given moment. If all the data points of LM or HM are discarded then the data line is not present in the file. Gate center time and other info is stated in the header lines. The data uncertainty is given as relative in log space. The upper and lower bounds of the data are then defined as :

$$\text{unc}_{\text{down}} = \frac{\text{DATA}}{1 + \text{DATASTD}} \quad (1)$$

$$\text{unc}_{\text{up}} = \text{DATA} \times (1 + \text{DATASTD}) \quad (2)$$

159 with unc_{down} and unc_{up} being the absolute lower and upper uncertainties, DATA the processed z-
 160 component dB/dt data value and DATASTD the relative uncertainty. The structure is outlined in the
 161 following table 3.

162 **Inversion Model File**

163 The `Sharp_Model.inv` and `Smooth_Model.inv` files contain the resistivity models (layer resistiv-
 164 ity and layer thicknesses). Each line hold a 30-layers resistivity model. The RECORD links the model to
 165 the data in the process data and forward data files. The file also contains the DOI, and the data fit. Note
 166 that the last layer (layer 30) does not have a thickness since it continues to infinite depth in the modeling.
 167 Normally, the DOI-standard values are used to blank the models in depths. The detailed file structure is
 168 provided in table 4.

Smooth_Model.inv, Sharp_Model.inv			
Colum	Label	Unit	Description
1	RECORD		Global record number. Links the model the data in the *.inv files
2	LINE_NO		Line number (Line number 0 = data/model not tacked with a line number)
3	UTMX	(m)	UTMX coordinate, WGS 84 UTM zone 32N (epsg:32632)
4	UTMY	(m)	UTMY coordinate, WGS 84 UTM zone 32N (epsg:32632)
5	ELEVATION	(m)	Surface elevation
6	DATAFIT		Data fit (Data residual)
7-36	RHO_I_#	(Ohmm)	Resistivity of layer#.
37-65	THK_#	(m)	Thickness of layer #.
66	DOI_CONSERVATIVE	(m)	Estimated depth of investigation, conservative threshold value used
67	DOI_STANDARD	(m)	Estimated depth of investigation, standard threshold value used

Table 4. Structure of the *.inv datafile

169 Synthetic response file

170 The `Forward_Data_Sharp.dat` and `Forward_Data_Smooth.dat` files contains the forward
 171 responses of the sharp and smooth resistivity models. The structure of the forward data files is the same
 172 as the `Processed_Data.dat` file except that the forward responses does not have associated data
 173 uncertainties. Detailed file structure is provided in table 5.

174 Technical Validation

175 After the removal of coupled structures, the main indicator of geophysical data quality is the fit with the
 176 inverted model. In case of error in the data, such as undetected coupling for example, the data will not be
 177 fitted by any plausible resistivity model and will present an important residual error. Therefore, a good fit
 178 between the theoretical forward response and the field data indicates that the data are representative of the
 179 geology and not affected by errors or noise.

180 The quality of inversion is assessed by a quality control parameter called data misfit. We compare the
 181 forward geophysical response of our final resistivity model, with the field data, normalized by the square
 182 of the standard deviation of our data. The indicator is defined by the following equation 3.

Forward_Data_Smooth.dat, Forward_Data_Sharp.dat			
Column	Label	Unit	Description
1	RECORD		Global record number. Links the data to the resistivity model in the *.inv files
2	LINE_NO		Line number (Line number 0 = data/model not tacked with a line number)
3	UTMX	(m)	UTMX coordinate, WGS 84 UTM zone 32N (epsg:32632)
4	UTMY	(m)	UTMY coordinate, WGS 84 UTM zone 32N (epsg:32632)
5	ELEVATION	(m)	Surface elevation
6	NUMDATA		Number of data points (gates) in-use for the segment/sounding
7	SEGMENT		Transmitter moment indicator. 1=Low moment, 2=High moment
8-37	DATA_#	(V/(Am ⁴))	Model forward response, dB/dt, for gate number #. 9999 values = data not in-use/not present

Table 5. Structure of the *.syn data file

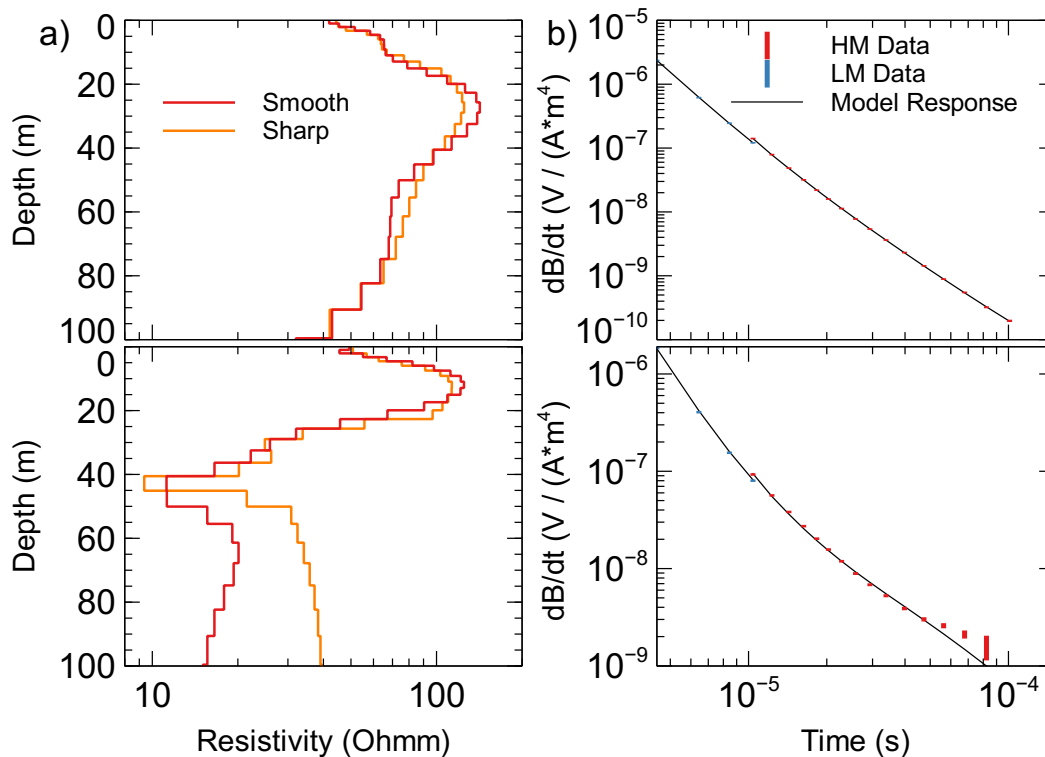


Figure 5. Example of two 1D model at a location, the top one considered as undisturbed and the bottom one as a noisy sounding. Top : Number 44384 on line 20350 at position 384744.1875/5196856 UTM 32 N. Bottom : Number 38407 on line 17610 at position 384313/5195797. a) Resistivity models for two regularizations. b) associated forward response of the smooth model in black, with the LM & HM data point with red & blue error bars. The normalized data fit (see text) for the top model/data curve is 0.27 and 1.36 for the bottom model.

$$\text{Data Misfit} = \sqrt{\frac{1}{N} \sum_{i=1}^N \frac{(d_{obs,i} - d_{frw,i})^2}{\sigma_{d,i}^2}} \quad (3)$$

183 where d_{obs} is the observed data, d_{frw} is the forward data, σ_d is the uncertainty of the observed data and N
 184 is the total number of data point.

185 A data residual below 1 indicates that our final model response is within one standard deviation of
 186 the data, when a value above 1 indicates a response out of one standard deviation. Figure 5b shows, a
 187 single data curve (error bars) and the forward response (line) from the resistivity models in figure 5a.
 188 Both regularization are shown. The first model (top figure) is situated in the middle of a field, when

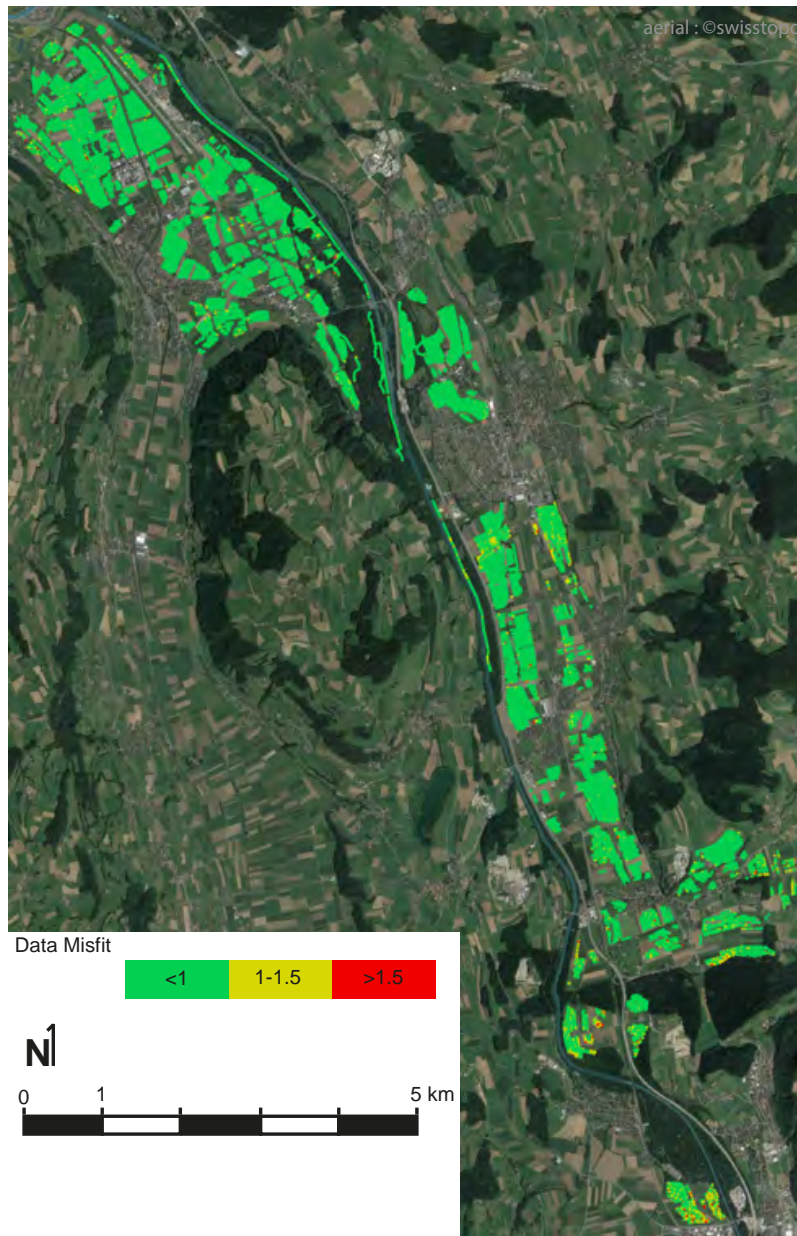


Figure 6. Data Misfit over the acquisition area. Base map from Swiss Federal Topographic Office.

189 the second model (bottom figure) is close to a road, which is a typical source for electromagnetic noise.
190 The associated data-misfit for the first model is 0.27, and 1.36 for the noisier one. Most of the misfit
191 comes from the latest's gates, when the signal to noise ratio is getting small. The data misfit for the all
192 smooth inversion models is plotted in Figure 6. As seen in figure 6, the data misfit is in general well below
193 one and fully acceptable. 95% of the data is within 1 standard deviation, with a global misfit average
194 of 0.65 and 0.52 respectively for the sharp and smooth models. A manual inspection of the high data
195 misfit models revealed that they are all associated to highly resistive models, and/or are close to man
196 made electromagnetic noise such as roads, fences, or train tracks. A good example is the extreme south of
197 the acquisition, that is one of the most resistive areas. This situation logically leads to a lower signal to
198 noise ratio, and due to the spatial constraints of the inversion, it will consequently leads to an higher data
199 misfit. However, they are usually restricted to only a few local data-points, and the models are similar to
200 neighbouring ones that has acceptable misfit. We therefore decided to keep them in the dataset.

201 Finally, users of the data should be aware that the footprint of the equipment is at least 9m at the
202 surface (size of the equipment) and is increasing with depth and wave diffusion. Consequently, a sharp
203 vertical transition in the geology for example, will tend to appear oblique in the resistivity data due to this
204 effect. The resistivity models proposed here are only the one that fits the best our data.

205 Usage Notes

206 Since the file data format is a standard ASCII file, all the files can be used with any program supporting
207 xzy format.

208 Code availability

209 All the data importation, processing and SCI inversions were done using *Aarhus Workbench* commercial
210 software developed by *Aarhusgeosoftware*. The 1D inversion code used is *AarhusInv* developed by the
211 Aarhus University Hydrogeophysics group^{12,13}. The *AarhusInv* code is free to use for research purpose.

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256 **Author contributions statement**

257 A.N. coordinated, conducted and supervised the field work. He performed the data analysis and inversion,
258 prepared the data and wrote the paper. A.V.C. and P.M provided the instruments and software. They
259 participated in the design of the measurements and checked the quality of data treatment and inversion.
260 They edited and corrected the manuscript. P.R. obtained the funding for the survey. He supervised the
261 work, participated to the field acquisition, and was involved in the data preparation, writing, and editing of
262 the paper.

263 **Competing interests**

264 The authors declare no conflicts of interests.