
Citation for published version:

Digital Object Identifier (DOI):
10.1088/0957-0233/26/1/015305

Link:
Link to publication record in Edinburgh Research Explorer

Document Version:
Peer reviewed version

Published In:
Measurement Science and Technology

General rights
Copyright for the publications made accessible via the Edinburgh Research Explorer is retained by the author(s) and / or other copyright owners and it is a condition of accessing these publications that users recognise and abide by the legal requirements associated with these rights.

Take down policy
The University of Edinburgh has made every reasonable effort to ensure that Edinburgh Research Explorer content complies with UK legislation. If you believe that the public display of this file breaches copyright please contact openaccess@ed.ac.uk providing details, and we will remove access to the work immediately and investigate your claim.

Jiabin Jia\textsuperscript{b}, Mi Wang\textsuperscript{a} and Yousef Faraj\textsuperscript{a}

\textsuperscript{a} School of Chemical and Process Engineering, University of Leeds, Leeds, LS2 9JT, UK
\textsuperscript{b} School of Engineering, University of Edinburgh, Edinburgh, EH9 3JL, UK
jiabin.jia@ed.ac.uk, m.wang@leeds.ac.uk, y.faraj@leeds.ac.uk

Abstract: In the aqueous-based two-phase flow, if the void fraction of dispersed phase exceeds 0.25, the conventional Electrical Impedance Tomography (EIT) produces a considerable error due to the linear approximation of Sensitivity Back-projection method, which limits the EIT’s wider application in process industry. In this paper, an EIT sensing system which is able to handle full void fraction range in two-phase flow is reported. This EIT system employs a voltage source, conducts true mutual impedance measurement and reconstructs online image with the Modified Sensitivity Back-Projection (MSBP) algorithm. The capability of Maxwell relationship to convey full void fraction is investigated. The limitation of linear sensitivity back-projection method is analysed. The modified sensitivity back-projection algorithm is used to derive relative conductivity change in the evaluation. Series of static and dynamic experiments demonstrate the mean void fraction obtained using this EIT system has a good agreement with reference void fractions over the range from 0 to 1, which would significantly extend the applications of EIT in process measurement.

Keywords: Electrical Impedance Tomography, Two-phase flow measurement, Full void fraction and Voltage source EIT

1. INTRODUCTION

Gas-liquid two-phase flow exists in many process industries. As an imaging technique, Electrical Impedance Tomography (EIT) provides both cross-sectional image of gas distribution and mean gas void fraction of two-phase flow. The gas void fraction in two-phase flow was studied using different tomographic modalities. Shaikh applied a single source $\gamma$-ray Computed Tomography on the 0.0162 m diameter bubble column and the mean gas void fraction at ambient conditions was tested up to 0.32 [1]. The Wire-mesh Sensor (WMS) was used to characterise the radial gas void fraction profiles on the 0.067 m diameter and 6 m length vertical pipe [2]. The maximum gas volume fraction presented on the centre of the pipe was 0.92 when the superficial velocity of water and gas were 0.20 m/s and 3.32 m/s respectively.
The mean gas void fraction was measured up to 0.70. In the previous study of using EIT for two-phase flow measurement, the void fraction range measured by EIT was much narrower. For instance, the maximum oil volume fraction was 0.23 on Li’s experiment [3]. The maximum gas void fraction in Jin’s study was below 0.25 [4]. The gas void fraction reached 0.64 in Dong’s study [5], but the void fraction was estimated based on the polynomial regression of measurement voltage values.

A comparison study between the Leeds FICA EIT system [6] and the Wire-mesh sensor (WMS) [7] was conducted to validate the accuracy of EIT measurement for air void fraction in air-water two-phase upwards flows [8]. The image reconstruction algorithm used was Modified Sensitivity Back-Projection (MSBP). As shown in Figure 1, the air void fractions obtained from two tomographic systems had very good agreement when the air void fraction was less than 0.25. However, compared with WMS, the air void fraction was gradually underestimated by EIT when it is more than 0.25. The error trend for air void fraction higher than 0.45 was not examined due to the limitations of the experimental flow loop, but a further underestimation was predicted. Therefore, it is worthwhile to investigate this phenomenon and expand the capability of EIT to handle full void fraction range of the dispersed phase from 0 to 1 in two-phase flow.

![Figure 1](image_url)

**Figure 1.** Comparison of overall air void fraction between EIT and WMS [7].

Electrical Impedance Tomography (EIT) was initially invented for medical imaging applications [9-10]. The alternating current source was applied to drive the electrodes, because the magnitude of current injected into human body can be restricted within the safety limit. Later, the applications of EIT technique were utilized for industrial process measurement, but the majority of EIT systems still kept current as excitation source and sensed voltages as shown in Figure 2 (a). For industrial applications, the EIT with current source has following disadvantages. When aqueous continuous phase is not very conductive, for example distilled water, the magnitude of response voltages on the sensing electrodes could exceed the
maximum input range of the analogue to digital converter, particularly after the addition of non-conductive dispersed phase. The saturated voltage signals cannot reflect any change of two-phase flow. When continuous phase is highly conductive like sea water, the equivalent mutual impedance is in the order of a few ohm, only using large driving current in order of hundreds mA can increase the magnitude of response voltage on the electrodes for measurement. However, it is rather difficult to design a current source having more than 75mA output in the typical EIT frequency range 1 kHz~1 MHz. Moreover, the output of current source does not maintain constant while the load varies. In SPICE simulation of an EIT’s current source [6], the load impedance is swept from 5Ω to 1255Ω and the output amplitude of the current source has 5.93% decrease, which brings in additional error for EIT measurement if this defect of current source is not taken into account. These limitations of current source deteriorate the performance and accuracy of EIT.

A recently developed EIT system [11] applies voltage to electrodes as excitation source. As illustrated in Figure 2 (b), the output current from the voltage source and voltages across electrodes are monitored simultaneously to calculate mutual impedance (Z=V/I) in the voltage source EIT, which is the variable of the image reconstruction algorithm in section 3 rather than the voltage values in the current source EIT system. Figure 2 (a) and (b) illustrate two structures of EIT. The mechanism of the voltage source EIT overcomes the limit of current source associated with the conventional EIT systems.

![Figure 2. Schematic of EIT measurement](image)

2. CAPABILITY OF MAXWELL RELATIONSHIP FOR FULL VOID FRACTION

In EIT, by solving the inverse problem, a tomographic image showing the electrical conductivity contrast is reconstructed using $N$ mutual impedance data acquired from all the impedance projections to visualise the distribution of the dispersed phase. One frame of image consists of $M$ square pixels. More information can be deduced from the conductivity images, for instance, the local and overall void fraction of the
dispersed phase. Different correlations were proposed to convert electrical conductivity on each image pixel into the corresponding void fraction of the dispersed phase [12]. The Maxwell relationship [13] formulated in equation (1) is mostly used to derive void fraction from conductivity.

\[
\alpha = \frac{2\sigma_1 + \sigma_2 - 2\sigma_{mc} + \sigma_1 \sigma_2}{\sigma_{mc} - \frac{\sigma_2}{\sigma_1} + 2(\sigma_1 - \sigma_2)}
\]  

(1)

where \(\sigma_1\) is the conductivity of aqueous continuous phase (water), \(\sigma_2\) is the conductivity of the dispersed phase (air or oil), \(\sigma_{mc}\) is the mixture conductivity obtained from EIT and \(\alpha\) is local void fraction of the dispersed phase. \(\alpha, \sigma_1, \sigma_2\) and \(\sigma_{mc}\) in equation (1) are the vectors with \(M\) elements (\(M=316\) in authors’ case). Each element of the vector represents the value in the square pixel. If the dispersed phase is non-conductive, \(\sigma_2\) is approximated as 0 S/m and equation (1) is simplified further

\[
\alpha = \frac{2\sigma_1}{\sigma_{mc} + 2\sigma_1}
\]  

(2)

Rearrange equation (2), the conductivity ratio \(\sigma_{mc}/\sigma_1\) becomes the only variable in equation (3) to determine the void fraction \(\alpha\).

\[
\alpha = \frac{2 - 2\sigma_{mc}}{\sigma_1}
\]  

(3)

Equation (3) describes the correlation between two vectors \(\alpha\) and \(\sigma_{mc}/\sigma_1\). Each individual element of \(\alpha\) and \(\sigma_{mc}/\sigma_1\) satisfies the equation as well. In air-water or oil-water two-phase flows, the mixture conductivity \(\sigma_{mc}\) must be in the range of \(0 \leq \sigma_{mc} \leq \sigma_1\). Then, the conductivity ratio \(\sigma_{mc}/\sigma_1\) is \(0 \leq \sigma_{mc}/\sigma_1 \leq 1\). On one extreme condition, if the flow pipeline is filled with non-conductive dispersed phase, like air or oil, the mixture conductivity \(\sigma_{mc}\) becomes 0 and the conductivity ratio \(\sigma_{mc}/\sigma_1\) equals to 0. Therefore, void fraction \(\alpha\) in equation (3) is 1. On another extreme condition, if the flow pipeline is full of aqueous continuous phase, like water, the mixture conductivity \(\sigma_{mc}\) is identical with \(\sigma_1\), and the conductivity ratio \(\sigma_{mc}/\sigma_1\) becomes 1 and \(\alpha\) in equation (3) is 0, which means no dispersed phase presents in the mixture at all. For simplicity, Figure 3 graphically illustrates the correlation between one element of \(\sigma_{mc}/\sigma_1\) and the corresponding \(\alpha\). Although \(\sigma_{mc}/\sigma_1\) and \(\alpha\) do not follow linear relationship with respect to equation (3), the void fraction
obtained from equation (3) falls in the range of 0~1, provided that the conductivity ratio $\sigma_{mc}/\sigma_1$ is known. Two algorithms of calculating $\sigma_{mc}/\sigma_1$ will be compared in next section.

![Figure 3. Correlation between the conductivity ratio $\sigma_{mc}/\sigma_1$ and void fraction $\alpha$](image)

### 3. IMAGE RECONSTRUCTION ALGORITHM

The process of image reconstruction in EIT is to determine the unknown electrical conductivity based on the known voltage sensed on the electrodes or mutual impedance in our case. This is a nonlinear process in electrical tomography, because the number of the known mutual impedance $N$ is much less than the number of unknown conductivity $M$. These challenges make finding the precise unknown electrical conductivity very difficult. There are many image reconstruction algorithms were developed for EIT [14]. They are separated into two categories, qualitative non-iterative algorithm and quantitative iterative algorithm. Non-iterative algorithm only involves the multiplication between a matrix and a vector. Although the image resolution from non-iterative algorithm has low resolution, its computational speed is so fast that only non-iterative algorithm can be implemented in EIT to conduct on-line measurement and control for multiphase flow. Iterative algorithm can deliver relatively better image but in the cost of longer computational time. This algorithm is suitable for the applications requiring higher quality to the off-line images, for instance medical imaging. Since the aimed application in this paper is dynamic multiphase flow measurement, only non-iterative algorithms are discussed.

Due to the addition of the dispersed phase, the change of mutual impedance $\Delta Z$ and the change of conductivity $\Delta \sigma$ in the medium are respectively defined as

$$\Delta Z = Z_{mc} - Z_1$$  (4)

$$\Delta \sigma = \sigma_{mc} - \sigma_1$$  (5)
where $Z_1$ is the baseline mutual impedance measured from EIT sensor containing only single continuous phase with conductivity $\sigma_1$. $Z_{mc}$ is mutual impedance after two-phase mixture presents and conductivity is altered to $\sigma_{mc}$.

Computing the change of mutual impedance $\Delta Z$ from the known conductivity change $\Delta \sigma$ is a forward process and described as

$$\Delta Z = F(\Delta \sigma) \tag{6}$$

where $F$ is a forward operator and can be solved by the finite element methods.

An alternative approach to solve equation (6) is to use Taylor series in equation (7)

$$\Delta Z = \frac{\partial F}{\partial \sigma}(\Delta \sigma) + O((\Delta \sigma)^2) \tag{7}$$

Based on the condition of $\Delta \sigma \ll \sigma_1$, high order terms $O((\Delta \sigma)^2)$ is omitted and equation (7) is linearized into equation (8). If the condition of $\Delta \sigma \ll \sigma_1$ cannot be satisfied, large numerical error will occur.

$$\Delta Z = -S' \cdot \Delta \sigma \tag{8}$$

where $S' = \partial F(\sigma_1)/\partial \sigma_1$ is defined as sensitivity matrix and $\sigma_1$ is the baseline conductivity. The minus sign of equation (8) indicates conductivity and mutual impedance have opposite change direction. The normalised form of equation (8) is expressed as:

$$\frac{\Delta Z}{Z_1} = -S \cdot \frac{\Delta \sigma}{\sigma_1} \tag{9}$$

where $S$ is the normalised sensitivity matrix. The element $s_{ij}$ of matrix $S$ in $i^{th}$ row and $j^{th}$ column is formulated as equation (10). $s'_{ij}$ is the corresponding element of sensitivity matrix $S'$, $k$ is the pixel number and $M$ is the total number of pixels in one frame of image.

$$s_{ij} = \frac{S'_{ij}}{\sum_{k=1}^{M} S'_{ik}} \tag{10}$$

To find the relative conductivity changes $\Delta \sigma/\sigma_1$ from the relative mutual impedance changes $\Delta ZZ_1$ is the inverse process of equation (9), which still remains a challenge to find the exact inverse matrix of $S$ in EIT imaging. Kotre [15] developed the Sensitivity Back-Projection (SBP) algorithm based on the Linear Back-Projection (LBP) principle, where inverse $S'$ is approximated to its transpose matrix $S'^T$ as shown in equation (11), because $S$ is not a square matrix. This approximation gives the best fit from the least square point of view, but it could not be the best operator for all the applications [16].
\[
\frac{\Delta \sigma}{\sigma_1} = -S^{-1} \cdot \frac{\Delta Z}{Z_1} \approx -S^T \cdot \frac{\Delta Z}{Z_1} \quad (11)
\]

Substitute equation (4) and (5) into equation (11), the first method of calculating \( \sigma_{mc}/\sigma_1 \) is illustrated in equation (12).

\[
\frac{\sigma_{mc}}{\sigma_1} \approx 1 - S^T \cdot \frac{Z_{mc} - Z_i}{Z_1} \quad (12)
\]

In equation (13), the modified Sensitivity Back-Projection (MSBP) based on the nonlinear approximation [17] was proposed as an alternative approach to gain \( \sigma_{mc}/\sigma_1 \).

\[
\frac{\sigma_{mc}}{\sigma_1} \approx \frac{1}{S^T \cdot \frac{Z_{mc}}{Z_1}} \quad (13)
\]

Substitute equation (12) and (13) into equation (3) individually, the ultimate correlations between void fraction \( \alpha \) and mutual impedance ratio \( Z_{mc}/Z_1 \) are expressed in equation (14) and (15).

\[
\alpha \approx \frac{2S^T \cdot \frac{Z_{mc}}{Z_1} - 2S^T}{3 - S^T \cdot \frac{Z_{mc}}{Z_1} + S^T} \quad (14)
\]

\[
\alpha \approx \frac{S^T \cdot \frac{Z_{mc}}{Z_1} - 2}{2S^T \cdot \frac{Z_{mc}}{Z_1} + 1} \quad (15)
\]

\( \alpha \) in equation (14) and (15) contains \( M \) elements representing the void fraction of the dispersed phase in local image pixel area. The mean cross-sectional void fraction \( A \) is the average of \( M \) elements of vector \( \alpha \).

\[
A = \frac{\sum_{i=1}^{M} \alpha_i}{M} \quad (16)
\]

In order to visualise the correlation between mean void fraction \( A \) and mutual impedance ratio \( Z_{mc}/Z_1 \) in an ideal and simply perspective, it is assumed that the vector \( Z_{mc}/Z_1 \) has \( N \) elements with the same value. Two correlations are plotted in Figure 4. The logarithm scale is applied for the x-axis \( Z_{mc}/Z_1 \) to demonstrate a wider \( Z_{mc}/Z_1 \) range. The red dashed curve in Figure 4 illustrates that in MSBP algorithm, the mean void fraction does not exceed the range of 0~1 with respect to the variation of \( Z_{mc}/Z_1 \) from 1 to 1000, despite the correlation is not in linear relationship. On the contrary, the blue solid curve indicates the correlation of SBP algorithm is not a monotonic function. Figure 4 suggests the SBP algorithm only can present
meaningful and valid results when the ratio of $Z_{mc}/Z_1$ is within a small range. Other values of $Z_{mc}/Z_1$ result in the mean void fraction beyond the range of 0–1.

![Figure 4. Correlation of mutual impedance ratio $Z_{mc}/Z_1$ and mean void fraction $A$](image)

To compare two correlations only in the valid range of SBP algorithm, as shown in Figure 5, Figure 4 is re-plotted only when the conductivity ratio $Z_{mc}/Z_1$ is from 1 to 2.2. Both mean cross-sectional void fraction $A$ are when $Z_{mc}/Z_1$ equals to 1, however, the divergence of SBP and MSBP is dramatically increased. It is concluded that the MSBP algorithm is a better correlation than the SBP algorithm. In next section, only MSBP algorithm is applied for the computation of void fraction.

![Figure 5. Valid $Z_{mc}/Z_1$ range of SBP in Figure 4](image)

### 4. EXPERIMENTS

To validate the validity of the voltage source EIT system and MSBP algorithm on void fraction measurement, series of experiments were carried out and the results are discussed in this section.
4.1 Dynamic Experiment: Air-Water Two-Phase Flow

The dynamic experiment was conducted in a Perspex flow loop with 0.058 m inner diameter and 3.0 m vertical section. The detailed schematic of the experimental flow loop is referred to literature [7]. The mean air void fractions obtained from the voltage source EIT system [11] and Wire-mesh sensor (WMS) are compared in Table 1.

<table>
<thead>
<tr>
<th>Flow condition</th>
<th>Air void fraction</th>
</tr>
</thead>
<tbody>
<tr>
<td>Water flow rate (m³/s)</td>
<td>Air flow rate (m³/s)</td>
</tr>
<tr>
<td>2.04x10⁻²</td>
<td>8.33x10⁻⁵</td>
</tr>
<tr>
<td>9.32x10⁻⁴</td>
<td>8.33x10⁻⁵</td>
</tr>
<tr>
<td>2.04x10⁻³</td>
<td>8.33x10⁻⁴</td>
</tr>
<tr>
<td>9.32x10⁻⁴</td>
<td>8.33x10⁻⁴</td>
</tr>
</tbody>
</table>

4.2 Static EIT Vessel Experiment: Packed Particles

Due to the capability of the existing laboratory flow loop, it is difficult to create a flow regime with air void fraction larger than 0.5. In order to create two-phase mixture having larger void fractions, a number of static setups with the packed particles were used. A 50.8 mm diameter static EIT vessel was filled up with 305.0 mL tap water for the reference baseline taken by EIT. Later, non-conductive yellow spherical particles with 6.00 mm diameter were gradually poured into the vessel. At the same time, water was carefully removed and collected from the vessel, until the mixture reaches the same water level as the reference setup, to keep the total volume of mixture the same as 305.0 mL. The volume of water repelled by particle was 175.0 mL. As shown in Figure 6(a), particles were randomly packed and the mixture was regarded as homogenous. The true void fraction of particles was calculated as 0.5738 (175.0 mL/305.0 mL). The measured void fraction of EIT using equation (15) was 0.5922. Since particles are homogenous packed, the 2D cross-sectional void fraction measured by EIT can represent the real 3D void fraction estimated by the volumetric ratio of particles and water.

To further increase the void fraction, the previous experiment procedure was repeated. The only difference was the second type of non-conductive blue particles with 0.72 mm diameter were carefully poured into the vessel as well while the 6.00 mm particles were poured into the vessel as shown in Figure 6 (b). These fine purple particles filled in the space between the larger yellow particles, so a larger void
fraction was expected. At this time 222.5 mL tap water was repelled. The actual void fraction of particles was calculated as 0.7295 (222.5 mL/305.0 mL). Whereas, the void fraction measured by EIT was 0.7216.

![Figure 6](image)

**Figure 6.** Spherical non-conductive particle randomly packed in the static EIT vessel
(a) 6.00mm (b) 6.00mm and 0.72mm.

The radial void fraction profiles of two static experiments are demonstrated in Figure 7. Both black and blue curves exhibit the uniform particle distribution and void fraction cross the centre to the boundary of the tube. Because the particles are scattered into the tube manually, it might cause the minor fluctuation on the void fraction profiles.

![Figure 7](image)

**Figure 7.** Radial void fraction profile

4.3 *Static EIT Vessel Experiment: Full and Empty*
Two extreme conditions, void fraction 0 and 1, were tested in this experiment. When the vessel was full of tap water, the void fraction shown from the EIT was 0.0006. Later, tap water was drained out completely. The EIT system indicates void fraction 0.9878 for this setup.

The void fractions of the dispersed phase from all pervious experiments are plotted against reference void fractions in Figure 8. The standard deviation of each experiment group is displayed in form of error bar. The first and last black points are referred to the static tests of full and empty EIT sensor respectively. Four blue points represent the void fraction from dynamic air-water flow experiments and referred to the Wire-mesh sensor in the experiment of section 4.1. Two red points are referred to the volumetric ratio between non-conductive particles and total mixture in the experiments of section 4.2. In general, a strong linear relationship between the measured void fraction by EIT and reference void fraction presented in Figure 8.

**Figure 8.** Void fractions presented by EIT from different experiments vs. reference void fraction.

### 4.5 Dynamic Experiment: Bubble column

A qualitative dynamic air-water flow experiment was carried out on a 50.8 mm bubble column mounted with EIT sensors. The variation of the air void fraction was recorded by the EIT system. Figure 9 shows the dynamic change of the air void fraction during whole process. The column was empty up to frame number 172. The EIT system showed 0.9918 air void fraction. Tap water was perfused from the bottom of the column. From frame number 215 to 428, there was full water in the column, so the air void fraction dropped down to 0.0006. Then, air was freely blown from the bottom into the water column until frame 922. From frame 923 to 1101, there was no air injection and the column remained water only condition. Finally, water was drained out and the column was empty from frame 1129.
Future work will focus on verifying the air void fraction measurement on dynamic two-phase flow against other sensing modalities. The authors infer that the measurement accuracy of the voltage source EIT system and MSBP algorithm depends on the flow regime. Homogeneous and quasi-homogenous flow regime will be the ideal application scenario, however it is also worthwhile to investigate the validity of measuring the horizontal two-phase flow, in particular the horizontal stratified flow, which still remains a challenge for EIT measurement.

5. CONCLUSIONS

The conventional Electrical Impedance Tomography (EIT) with current source tends to underestimate the void fraction of the dispersed phase in two-phase flow measurement when it is larger than 0.25. The EIT system with the voltage source simultaneously measures voltage and current then calculates the mutual impedance of two-phase flow, which overcomes the limit of the conventional current source EIT. The Maxwell relationship has the capability to represent the correlation between relative conductivity change and void fraction in the full 0 to 1 range. The Sensitivity Back-Projection (SBP) algorithm works only when the conductivity has minor change which restricts the application of EIT to wider flow regimes. The Modified Sensitivity Back-Projection (MSBP) algorithm is a better conversion from impedance to conductivity. The performance of the voltage source EIT system over a full void fraction range is evaluated. The experimental results demonstrate the full void fraction range of two-phase flow can be managed by the EIT system with voltage source.
REFERENCES


