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## Perspectives on multiparametric high-frequency impedance spectroscopy characterization of anatase TiO<sub>2</sub> nanotubes with nanoelectrode array sensors

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### ABSTRACT

Titanium dioxide nanotubes (TiO<sub>2</sub> NTs) are highly versatile materials for energy, sensing, environmental, and biomedical applications. This paper explores TiO<sub>2</sub> nanotube characterization and electrical imaging by high-frequency impedance spectroscopy (HFIS) with nanoelectrode array sensors. HFIS offers promising alternatives to traditional methods to characterize nanoscale objects, as it detects distinctive electrical and morphological features.

This work integrates: i) measurements with an advanced HFIS nanoelectrode array platform; ii) physics-based numerical simulations of the HFIS signal transduction mechanisms; iii) compact models for the estimation of geometrical and morphological parameters, to provide outlooks for the multiparametric characterization of single TiO<sub>2</sub> nanotubes at the platform sensitivity and resolution limits.

### 1. Introduction

Titanium dioxide nanotubes (TiO<sub>2</sub> NTs) have attracted considerable attention for several applications in the energy, sensing, environmental, and biomedical domains [1–5]. For instance, remarkable transduction capabilities of TiO<sub>2</sub> NTs for gas sensing have been extensively demonstrated [5,6]. In particular, the large surface area generated by the tubular morphology enhances the electrodes' sensitivity to gases, and the modification of the NT band structure through the incorporation of dopants improves the catalytic properties [5]. TiO<sub>2</sub> NTs also demonstrated technologically relevant properties for energy storage, including micro-batteries, supercapacitors, fuel cells [4], and dye-sensitized solar cells [7]. Last but not least, their utility extends to the biomedical domain, where they have been used as coatings for biomedical implants. In this context, TiO<sub>2</sub> NT layers have shown good adhesion, proliferation properties, and biocompatibility, making them suitable for applications in dental and cardiovascular stent applications [3,8]. Moreover, in powder form, TiO<sub>2</sub> NTs have shown efficacy for microbial disinfection and the degradation of pollutants [9]. The lack of fast, accurate, and low-cost, physical/morphological characterizations of single TiO<sub>2</sub> NTs is a notable limitation to their widespread use [10].

Indeed, achieving a good control of the TiO<sub>2</sub> electrical properties is fundamental for applications such as sensing and energy. Electrical and geometrical properties are usually characterized separately, and with traditionally bulky and expensive imaging technologies [11]. Robust and accurate multiparametric technologies simultaneously providing morphological and physical features would be extremely useful.

High-frequency impedance spectroscopy (HFIS) with nanoelectrode arrays [12] is an interesting option for multiparametric characterization of single TiO<sub>2</sub> nanotubes. HFIS with nanoelectrodes array enables spatially distributed detection, capacitance measurement, and imaging. Moreover, it has already proven its ability to detect distinctive

impedance fingerprints, such as the conductive vs dielectric nature and the permittivity of single spherical analytes, and their dimensions down to decananometer scales [13–18].

The spectrally resolved high-frequency regime mitigates the AC potential decay in electrolytes (Debye screening). Indeed, in the field of impedance measuring systems with electrode arrays, where numerous recent studies have made significant contributions [19–29], the platform of this work remains one of the best in terms of array density, electrode size, spatial and capacitance resolution, and maximum measurement frequency [12,30].

The challenge is to characterize large aspect ratio TiO<sub>2</sub> NTs with dimensions and electrical response comparable to the spatial and capacitance detection limits of the technology.

Our study provides preliminary analysis and perspectives for TiO<sub>2</sub> nanotubes morphological and geometrical characterization integrating and matching physics-based numerical simulations and experimental results. Compact formulas are provided to estimate the NT projected length and in-plane rotation on the array. Physics-based numerical simulations with electrical parameters from the scientific literature and geometrical parameters extracted from SEM images are carried out and matched to the experimental results.

In the following, Section 2 describes the NT fabrication process, and the experimental and numerical simulations setups. The methods for the geometrical characterization are reported in Section 2.4. Results are reported and discussed in Section 3. Conclusions are drawn in Section 4.

### 2. Materials and methods

#### 2.1. TiO<sub>2</sub> nanotube fabrication

The NTs were fabricated by the electrochemical anodization method [4]. First, 10 × 10 mm titanium foils were cleaned in an ultrasonic bath

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with acetone and ethanol. Anodization was carried out in a conventional two-electrode cell at room temperature, where titanium served as the working electrode and platinum as the counter electrode. The electrolyte was glycerol containing 0.5 wt%  $\text{NH}_4\text{F}$  and 2M  $\text{H}_2\text{O}$ . Anodization voltage and time were 20 V and 30 min, respectively. As-prepared samples were annealed at 400 °C for 3 hours. Morphological analysis of prepared material was carried out using field emission scanning electron microscopy (Carl-Zeiss, AURIGA Compact FIB-SEM). Structural characterization of materials was performed by Raman spectroscopy (Jasco NRS5100 confocal Raman microscope equipped with an excitation laser diode, laser wavelength 785 nm).

## 2.2. Experiments

The HFIS nanoelectrode (NE) array platform, based on a chip by NXP Semiconductors [12], is used to analyze nominally monodisperse solutions of the anatase  $\text{TiO}_2$  NTs. The key features of the platform are summarized in the following.

Fig. 1a shows the experimental setup and the NE array chip. The latter features  $256 \times 256$  individually addressable NEs, with a radius of 90 nm and pitch  $p_x \times p_y = 600 \times 890$  nm. Once calibrated with the procedure described in Ref. [12], the platform measures the capacitance variation at each electrode ( $\Delta C(i,j)$ ) induced by the NTs:

$$\Delta C = C_{w\text{-analyte}} - C_{w/o\text{-analyte}} \quad (1)$$

where  $C_{w\text{-analyte}}$  and  $C_{w/o\text{-analyte}}$  are the measured capacitance values with and without the analyte, respectively. Both are time average values over  $\approx 100$  consecutive measurements before and after the arrival of the NT, respectively. The platform has two main operation modes:

- i) single frequency, when the capacitance is measured overtime for each of the  $256 \times 256$  electrodes at one operating frequency (typically 50 MHz), resulting in a sampling rate of the entire array of  $\approx 5.6$  Hz.
- ii) multi-frequency, when each NE capacitance is measured with  $N_F$  sequential frequency values within one frame. In this case, the frame rate is  $\approx 0.075$  Hz, depending on  $N_F$  and the frequency range considered.

The system implements temperature control (Peltier cell model ET-127-10-13-RS by Adaptive, PID temperature controller PR-59 by Laird Technologies) and the custom microfluidics described in Ref. [32], which is used to carry the sample in the measurement chamber. Fig. 1b sketches an NT over a portion of the NE array and defines the main

geometrical and physical parameters of the system.

The  $\theta$  and  $\phi$  are the rotation angles in the vertical (x-z) and horizontal (x-y) plane and they span the  $[0, 90]^\circ$  and  $[90, 90]^\circ$  ranges, respectively. The NTs were detached from the Ti foil substrate and dispersed in 2 mL of deionized water and 2 mL of NaCl 150 mM solution, sonicated, and then introduced into the microfluidics chamber for the measurements. We employed an ultrasonic homogenizer CPX-750 by Cole Parmer with an operating frequency of 20 kHz at  $\approx 500$  W for 2 minutes. Analytes were detected as capacitance steps at each electrode by applying a moving-average algorithm to the time series of each electrode as in Refs. [13,17,32]. 85-th percentile outliers were removed based on the experimental cumulative distribution function of the 14 outermost electrodes (first and last rows) noise (experimental standard deviation) of the  $7 \times 7$  sub-array around the detected object [17]. Additionally, the average  $\Delta C$  of the 14 outermost electrodes in the  $7 \times 7$  sub-array has been subtracted from the experimental data to eliminate unwanted drifts and offsets [17]. Finally, we verified the presence of single nanotubes in the analyzed solution. The 10  $\mu\text{L}$  of the analyzed samples were dried on a  $\text{SiO}_2$  substrate and cleaned with IPA to remove saline residues, this procedure was repeated 3 times to increase the nanotubes concentration on the substrate. For this analysis we employed the scanning electron microscope of a dual beam FIB-SEM FEI Strata DB235M, results are reported in Section 3.1.

## 2.3. Simulations

Numerical simulations of the sensor response were run with ENBIOS, an in-house, accurate CVFEM simulator that self-consistently solves the Poisson-Boltzmann equation and the coupled Poisson-Drift-Diffusion equations for all ion species in the electrolyte across the 3D domain of the NE array chip [33]. The effectiveness of the simulator in reproducing, predicting, and supporting the interpretation of experimental results has been widely explored and demonstrated [12,13,15,16,32,34]. The simulated 3D domain reproduces a portion of the experimental one (typically a  $9 \times 11$  array, to reduce the impact of boundary conditions). The capacitance variation in the switching regime (according to the hardware measurement principle [12]) is derived from the AC numerical simulations as described in Ref. [12]. The values of the main geometrical and physical parameters (see Fig. 1b) are those in Table 1, if not otherwise stated. An important sanity check for the validation of the numerical simulation setup is that the capacitive response of the sensor to small (spherical) particles is expected to depend linearly on the analyte's volume ( $\Omega$ ) [37]. Fig. 2 shows numerical simulations of NTs with different wall-thickness  $T_{NT}$  and constant outer radius  $R_{NT}$ , thus

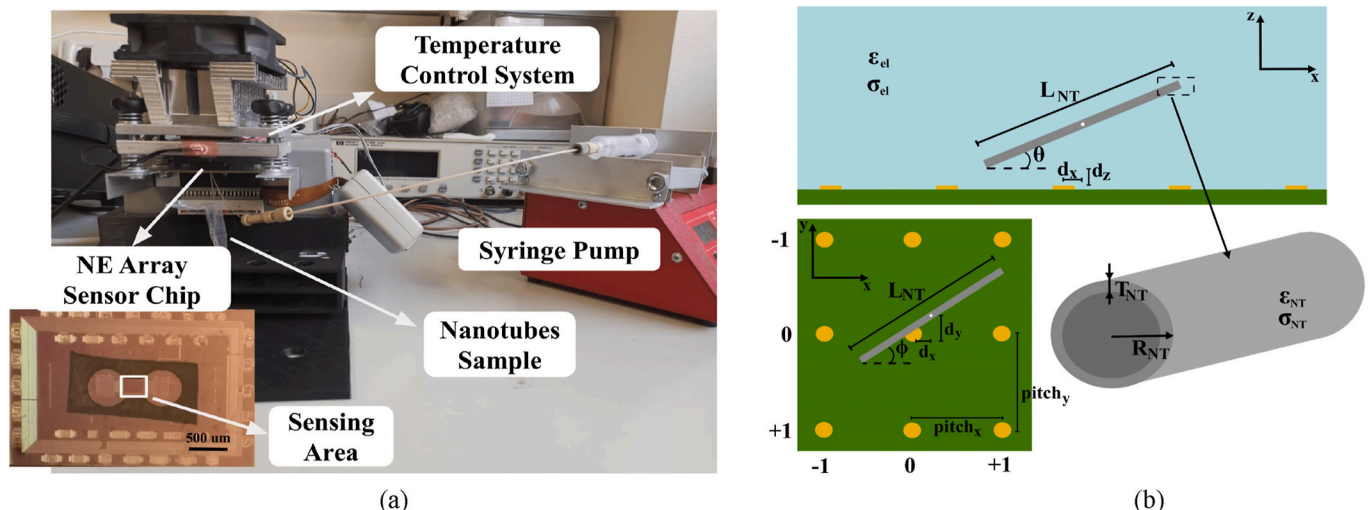


Fig. 1. (a) HFIS nanoelectrode array sensor platform. (b) Sketch of a nanotube over a  $3 \times 3$  sub-array. The main geometrical and physical parameters are reported.

**Table 1**  
HFIS parameters used in experiments and simulations.

Electrolyte	NaCl 150 mM, H <sub>2</sub> O
Electrolyte relative permittivity ( $\epsilon_{r,e}$ )	80
Single Frequency	50 MHz
Multi-Frequency	2–70 MHz, $N_F = 10$
NT relative permittivity ( $\epsilon_{r,NT}$ )	48 (anatase TiO <sub>2</sub> ) [35]
NT conductivity ( $\sigma_{NT}$ )	2 S/m [36]
NT length ( $L_{NT}$ )	1200 nm (Fig. 3)
NT radius ( $R_{NT}$ )	25 nm (Fig. 3)
NT wall thickness ( $T_{NT}$ )	7 nm (Fig. 3)

**Table 2**  
Ensemble average of the estimated parameters in NaCl and H<sub>2</sub>O. Complete histograms are reported in Fig. 9.

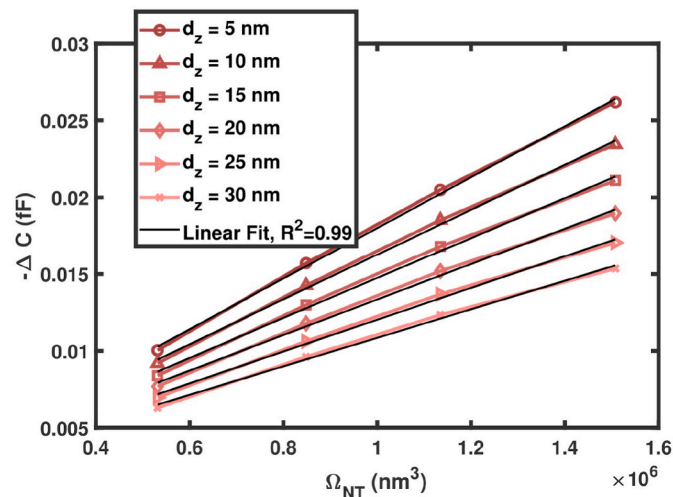
	$\overline{L_{p,est}}$ (nm)	$\overline{\phi_{est}}$ (°)	$\overline{\theta_{est}}$ (°)
NaCl	900	14	41
H <sub>2</sub> O	958	30	37

resulting in different NT volumes at constant NT centroid and  $d_z$ . The responses nicely follow straight lines that project to an extremely small  $\Delta C \sim 1$  aF (smaller than the platform noise limit) for  $\Omega_{NT} = 0$ , as expected. These results confirm the validity of the simulation setup and support the use of the compact model of [37] also with non-spherical, high aspect ratio analytes such as the NTs of this work.

Numerical simulations were also used to gain insights into whether the detected objects are single NTs or a cluster of NTs (Cluster-NT). Due to limited computational resources, we focused on those clusters that are more difficult to discriminate from single nanotubes. Consistently, we calculated the sensor response approximating the cluster with a cylinder of the same length  $L$  as a single NT. The cylinder radius is computed as  $R_{cluster} = \sqrt{V_{cluster}/\pi L}$  where  $V_{cluster} = N \cdot \Omega_{NT}$ ,  $N$  is the number of NTs in the cluster and  $\Omega_{NT}$  is the single NT volume. According to this choice, the cylinder has the same volume as the cluster; hence, at first order, the same response [37].

#### 2.4. Approaches for multi-parametric characterization

Due to the higher sampling rate (see Section 2.2) single frequency electrical images are more suitable than multifrequency ones for extraction of key geometrical parameters, such as the NT projected



**Fig. 2.** Simulated nanoelectrode response ( $-\Delta C$ ) at 50 MHz in NaCl 150 mM as a function of the analyte volume  $\Omega_{NT}$  for different vertical displacements ( $d_z$ ). The volumes correspond to  $T_{NT} = 3, 5, 7, 10$  nm and constant  $R_{NT} = 25$  nm. ( $d_x, d_y = (0,0)$  nm). Other parameters are reported in Table 1.

length on the array. To this end,  $3 \times 3$  sub-array electrical images (at 50 MHz) of individual NT ( $i$  and  $j \in \{-1,0,1\}$ ) are analyzed. The choice for the sub-array size is justified according to results reported in Section 3.2.

The central electrode (0, 0) of the chosen sub-array is by definition the one with the largest (in absolute value)  $\Delta C$  response. The center of the central electrode is by definition the origin of the cartesian reference system. The NT projected length ( $L_{p,est}$ ) on the array plane is estimated by averaging the pixel distances by the corresponding measured  $\Delta C(i,j)$ :

$$L_{p,est} = \sqrt{\frac{\sum_{ij} \Delta C(i,j) \cdot d(i,j)^2}{\sum_{ij} \Delta C(i,j)}} \quad (2)$$

$$\text{with : } d(i,j)^2 = (i \cdot p_x)^2 + (j \cdot p_y)^2$$

where  $p_x = 600$  nm, and  $p_y = 890$  nm for this work. According to (2) the estimation is in principle independent of  $\phi$ , because the equations leverage on the known electrodes' position in the 2D plane. This condition has been verified by applying (2) to numerical simulations with varying  $\phi$  ( $\pm 30^\circ, \pm 60^\circ, 90^\circ$ ). The variation in  $L_{p,est}$  is limited to lower than 2 %.

The rotation angle in the horizontal plane  $\phi$  can be estimated (with bias) by exploiting the array's central symmetry and by knowing the array geometry. In particular, for each electrode  $(i,j) \neq (0,0)$ , the angle between the axis passing through the center of electrode  $(i,j)$  and the center of electrode (0,0) and the positive horizontal axis ( $\phi_{ij}$ ) is weighted by the  $\Delta C$  at electrode  $(i,j)$ , thus finding  $\phi_{est}$  as:

$$\phi_{est} = \frac{\sum_{ij} \Delta C(i,j) \cdot \phi_{ij}}{\sum_{ij} \Delta C(i,j)} \quad (3)$$

$$\text{with : } \phi_{ij} = \begin{cases} \phi(i,j) = \tan^{-1} \left( \frac{j \cdot p_y}{i \cdot p_x} \right) \\ \phi(-i,-j) = \phi(i,j) \end{cases}$$

The central electrode  $(i,j) = (0,0)$  is excluded from the summation since it is assumed that rotations of the NT around the electrode of maximum response (hence, minimum distance from the NT) do not affect the  $\Delta C(0,0)$ .

For a  $3 \times 3$  array and  $(p_x, p_y) = (600, 890)$  nm:

$$\phi_{ij} = \begin{pmatrix} -56^\circ & 90^\circ & 56^\circ \\ 0^\circ & \text{excl.} & 0^\circ \\ 56^\circ & 90^\circ & -56^\circ \end{pmatrix} \quad (4)$$

As regards the electrical properties of a single NT (highly relevant for energy and sensing applications), HFIS has already been shown by experiments and simulations to discriminate relative dielectric permittivity of the analyte [15,18]. In this work, the physical and geometrical properties in Table 1 are confirmed by direct comparison between measured and simulated capacitance spectra for single-NTs in NaCl solution, see Section 3.4.

### 3. Results and discussion

#### 3.1. TiO<sub>2</sub> nanotubes fabrication results

Morphological observations (Fig. 3a and b) indicate the synthesis of well-oriented NTs with an average diameter of approximately 50 nm and wall thickness of 7 nm. The average length of the tubes is 1200 nm. Fig. 4 illustrates the Raman spectrum of the NTs. It shows Raman active modes at  $144 \text{ cm}^{-1}$ ,  $399 \text{ cm}^{-1}$ ,  $516 \text{ cm}^{-1}$ , and  $639 \text{ cm}^{-1}$ , which can be ascribed to the anatase crystalline phase of TiO<sub>2</sub> [31].

Fig. 5 shows a representative image of a single nanotube observed in

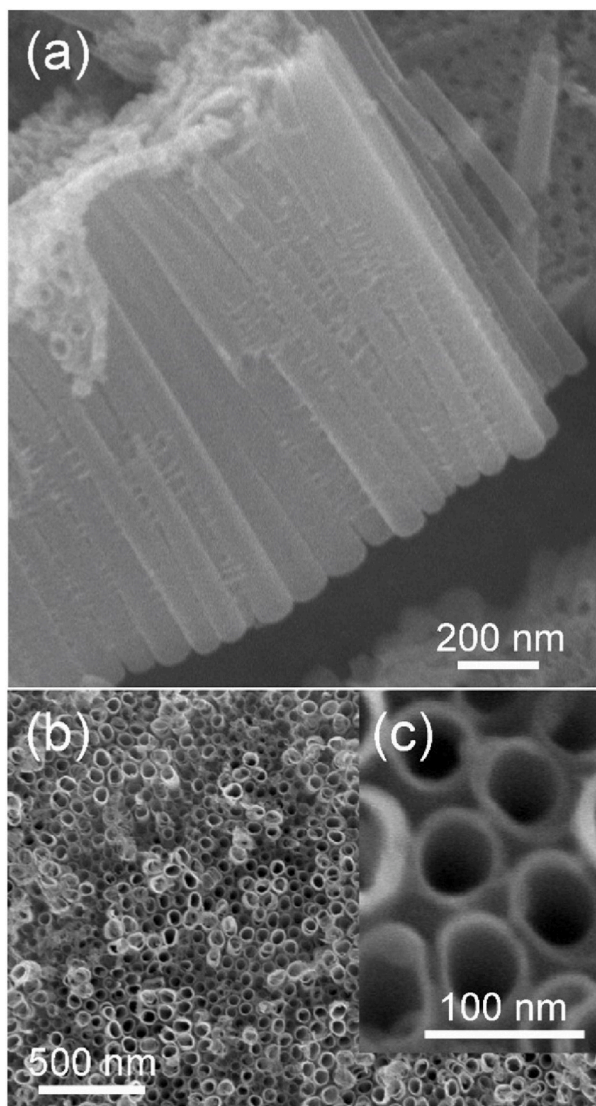


Fig. 3. SEM images of the fabricated  $\text{TiO}_2$  NTs: (a) lateral image of  $\text{TiO}_2$  NTs; (b) and (c) surface images of  $\text{TiO}_2$  NTs at different magnifications.

the analyzed solution.

### 3.2. Estimated detection limits for $\text{TiO}_2$ nanotubes

In this section, we explore by simulation the implications of the nanoelectrode array platform noise floor (about 1–2 aF) on the accuracy of the NT detection and physical/geometrical parameter extraction procedures outlined in Sect. 2. The main novelty we encounter is the combination of extremely small diameter and wall thickness with the large aspect ratio of the NTs. The expected large value of the relative dielectric permittivity also reduces the image contrast with respect to the electrolyte. As a result, the order of magnitude of the  $\Delta C$  is only a few tens of aF, which is close to the noise limit of the system [12,13].

The simulated  $\Delta C$  for anatase  $\text{TiO}_2$  NTs with the material parameters of Table 1 and different wall thickness,  $T_{NT}$ , elevation,  $d_z$ , electrolytes, and measurement frequencies, is always negative, as expected for uncharged dielectric materials [12,13,15,32], see for instance Figs. 2, 6a and 6b.

In order to identify the optimum size of a single NT image for parametric characterization, we start observing that the nominal length of the NTs (1200 nm) exactly matches the  $2 \cdot p_x$  value, and it is lower than  $2 \cdot p_y$ . If we set the electrode with maximum response in the center of the

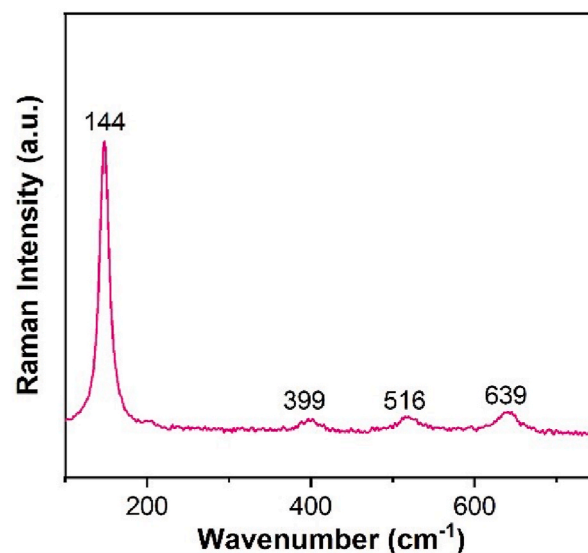


Fig. 4. Raman spectrum of fabricated  $\text{TiO}_2$  NTs, which shows peaks that correspond to the anatase crystalline phase of  $\text{TiO}_2$ .

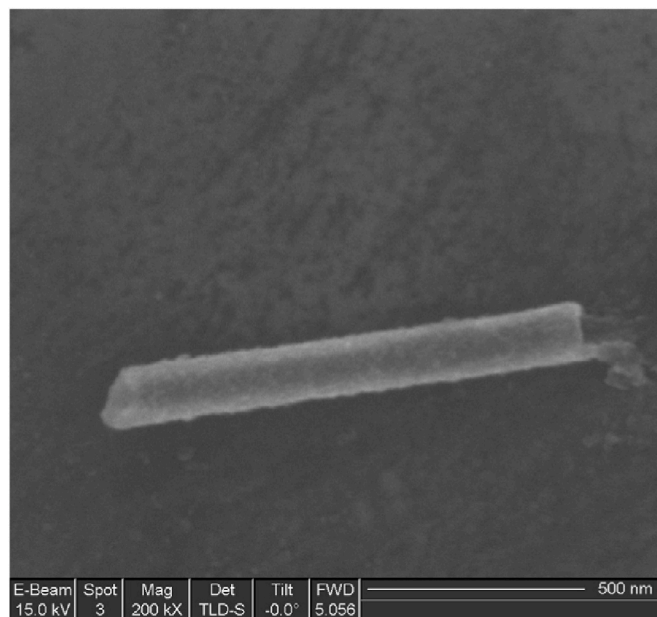


Fig. 5. SEM image of a single-nanotube identified in the analyzed solution.

NT capacitance image, then a  $3 \times 3$  sub-array is always sufficient to enclose the NT. Larger sub-arrays would only introduce unwanted noise in the NT image; hence, in the parameters extracted with Eqs. (2) and (3), as discussed below.

Fig. 6a confirms the validity of this choice by showing the mean and the minimum (highest response, since  $\Delta C < 0$ ) response of the electrodes at the edge of a  $5 \times 5$  array having an NT inclined at different  $\phi$  angles for deionized  $\text{H}_2\text{O}$  and 150 mM NaCl solution. The  $|\Delta C|$  is  $\leq 0.15$  aF, i.e. one order of magnitude lower than the typical measurement noise [12, 13].

Additional simulations with varying  $\theta$  bring to the same conclusion. Indeed, Fig. 6b shows the simulated  $\Delta C$  for the worst case scenario of a single NT at  $\phi = 0^\circ$ ,  $L_{NT} = 2 \cdot p_x$ ,  $(d_x, d_y, d_z) = (0, 0, 20)$  nm, and  $\theta \in [0, 25]^\circ$ . For  $\theta \geq 5^\circ$  the central electrode of the original sub-array is no more the one with the largest  $|\Delta C|$ , as evident from the green line (electrode (0,0)) approaching zero faster than the red line (electrode (0, -1)).

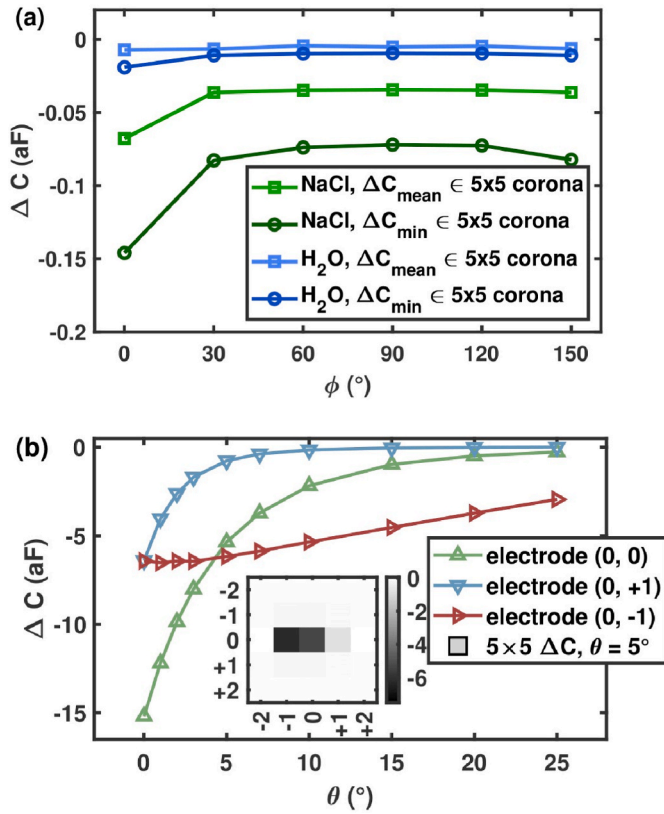


Fig. 6. Simulated  $\Delta C$  for a single NT at 50 MHz,  $(d_x, d_y, d_z) = (0, 0, 20)$  nm and parameters as in Table 1. (a) Mean and minimum of values of the electrodes surrounding the  $3 \times 3$  central sub-array for deionized water and 150 mM NaCl solution. (b)  $\Delta C$  as a function of  $\theta$  at electrode (0, -1), (0, 0), and (0, +1). The inset shows a typical  $5 \times 5$  sub-array response at  $\theta = 5^\circ$  (with 150 mM NaCl electrolyte).

Therefore the  $3 \times 3$  sub-array shifts one position to the left. When this happens, however, the  $|\Delta C|$  for the electrode (0, +1) is already  $< 0.7$  aF, essentially undetectable in real measurements. Simulations with  $\phi = 45^\circ$  and  $90^\circ$  (not shown), lead to the same conclusion.

Therefore, consistently with previous investigations on spherical nanoparticles of comparable size [13,32], we conclude that a  $3 \times 3$  sub-array centered on the electrode (pixel) with maximum response is sufficient to investigate individual NTs of the explored length, regardless of their in-plane and out-of-plane orientation.

Fig. 10 shows the simulated capacitance response as a function of the Cluster-NT size. As expected the  $|\Delta C|$  is higher as the NT cluster size increases. The mean measured value is compatible with the numerical simulation of single NT or tiny clusters, the outliers are indeed more likely to be cluster-NT up to  $5 \times 5$  size.

### 3.3. Extraction of geometrical features

The object detection and data elaboration procedures described in Section 2 led to identify 15 samples in H<sub>2</sub>O and 15 samples in NaCl solutions, respectively, having a  $|\Delta C(0,0)|$  larger than  $2 \times$  the experimental standard deviation of the capacitance signals and a pixelated  $\Delta C$  response attributable to a cylindrical-shape analyte. Fig. 7 shows the distributions of the measured  $\Delta C$  values. We see that, on average, the  $\Delta C$ s are larger (in absolute value) for NaCl solution than for deionized water, as expected.

Fig. 8 shows typical  $3 \times 3$   $\Delta C$  maps of two NTs (sketched in red according to the estimated  $L_{p,est}$  and  $\phi_{est}$ ) over the nanoelectrode array for NaCl and H<sub>2</sub>O solutions.

Fig. 9 reports the estimated projected length  $L_{p,est}$  and in-plane

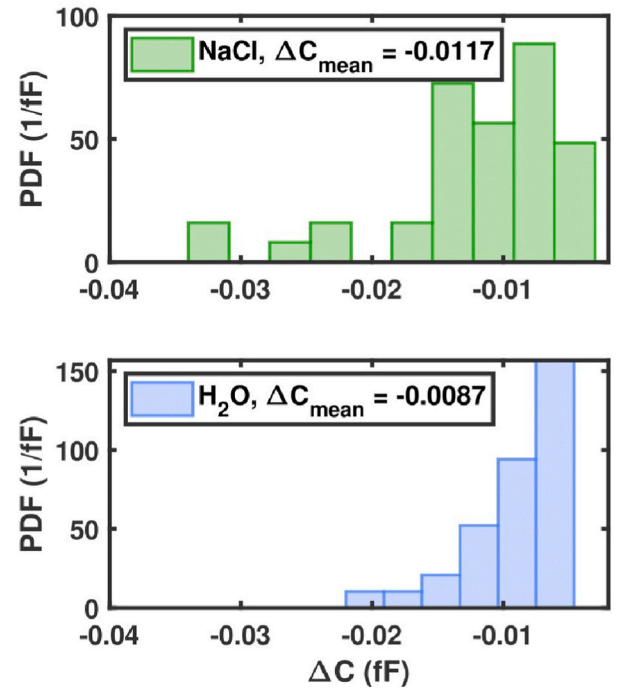


Fig. 7. PDFs of the experimental  $\Delta C$  in NaCl and H<sub>2</sub>O solution in single frequency (50 MHz) operation mode, after data elaboration and outliers exclusion described in Section 2.2.

rotation angle  $\phi_{est}$  using Eqs. (2) and (3) on experimental data, respectively. The mean value of  $\phi_{est}$  is close to the expected one ( $\approx 20^\circ$ , i.e. mean value of the  $\phi_{ij}$  matrix in (4)). As for the  $L_{p,est}$ , similar values are found for both electrolyte solutions, which are smaller than the nominal  $L_{NT}$  measured from Fig. 3. This result can be due to: a non-zero tilt of the NTs in the vertical direction ( $\theta \neq 0$  on average), a rupture of the NTs (upon detachment from the substrate or during the solution sonication phases), or both.

Considering the former hypothesis ( $\theta \neq 0$ ), from a simple geometrical analysis of Fig. 1b we can estimate the elevation angle  $\theta_{est}$  according to:

$$\cos(\theta_{est}) = \frac{L_{p,est}}{L_{NT}} \quad (5)$$

Equation (5) then yields  $\theta \approx 37^\circ$  and  $41^\circ$  for H<sub>2</sub>O and NaCl solutions respectively, as reported in Table 2.

Note that an inherent ambiguity exists for elongated nanoscale objects with a size comparable to the array's pitch, between the centroid position  $(d_x, d_y)$  and the vertical orientation angle,  $\theta$ . Indeed, two such objects, one with elevation angle  $\theta \neq 0$  and  $(d_x, d_y) = (0, 0)$  nm, and the other with  $\theta = 0$  and  $(d_x, d_y) \neq (0, 0)$  nm, can produce very similar single frequency capacitance images. In fact, the  $\Delta C$  depends on both the volume of the NT's portion in proximity of the examined electrode and the unperturbed electric field at the analyte's position [37]. The elevation of one of the object's extremes and the horizontal displacement of the object independently affect both these quantities, resulting in highly similar pixelated capacitance responses. The analysis of large sets of capacitive spectra with advanced statistical methods such as, for instance, Bayesian inversion and machine learning, could possibly address this issue.

### 3.4. Comparison between measured and simulated spectra

Figs. 11 and 12 show the nanotubes' experimental spectra in NaCl solution. Numerical simulations with parameters reported in Table 1 are also reported. In particular, Fig. 11 shows the simulated spectrum of a single-NT, which agrees well with the average measured spectra. Since

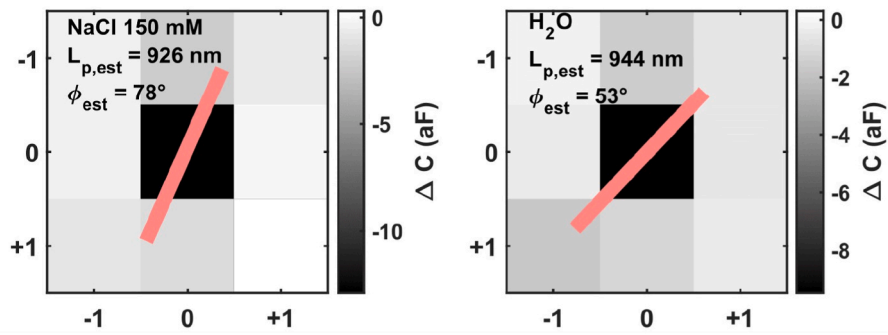


Fig. 8. Typical  $3 \times 3$  results of an NT measured with nanoelectrode array in single frequency (50 MHz) mode in NaCl and  $H_2O$ . The central electrode (0,0) is the one with the highest response by definition. The NT with estimated approximate  $L_p$  and  $\phi$  is depicted.

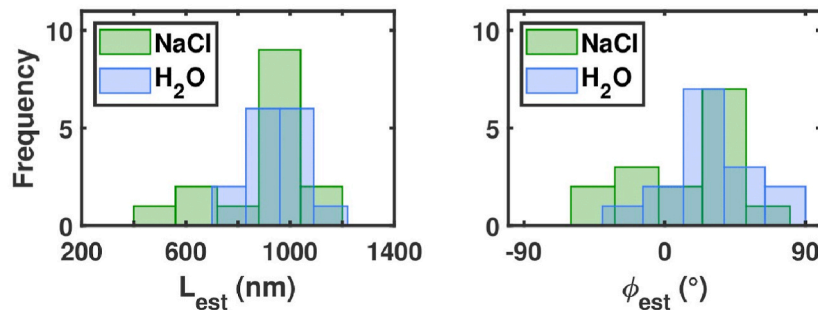


Fig. 9. Histograms of  $L_{p,est}$  and  $\phi_{est}$  from experimental results and Eqs. (2) and (3) respectively, for NTs in NaCl solution and deionized water at 50 MHz. The mean values of these distributions are reported in Table 2.

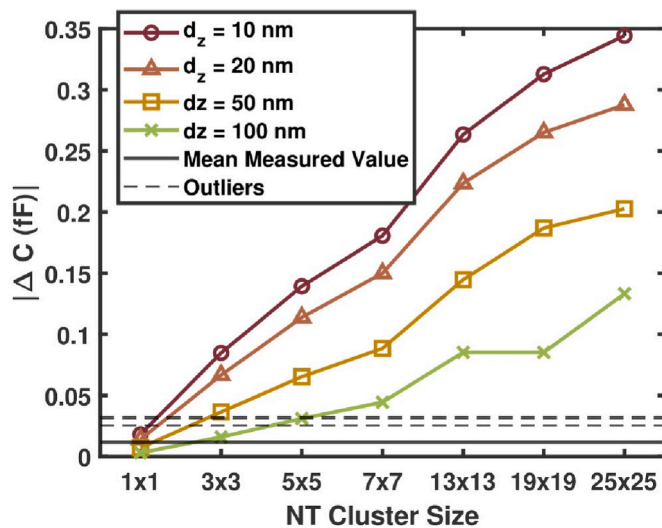


Fig. 10. Numerical simulation of the capacitance response  $|\Delta C|$  as a function of the cluster size for different  $d_z$  values. The mean measured value and the 5th percentile outliers of distributions in Fig. 7 are also shown.

the single-NT simulation was performed with  $d_z = 100$  nm, a cluster-NT would match the experimental results only with a higher  $d_z$  which is unlikely to be the case based on past analysis of  $d_z$  distributions in the sensor [32]. On the other hand, the experimental spectrum in Fig. 12 are less likely to be those of a single-NT, since it agrees with a numerical simulation of a  $3 \times 3$  cluster at  $d_z = 75$  nm, which is comparable to the simulation reported in Fig. 11.

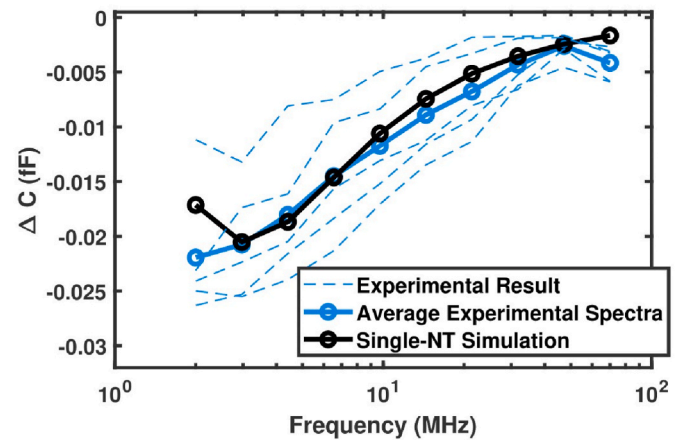
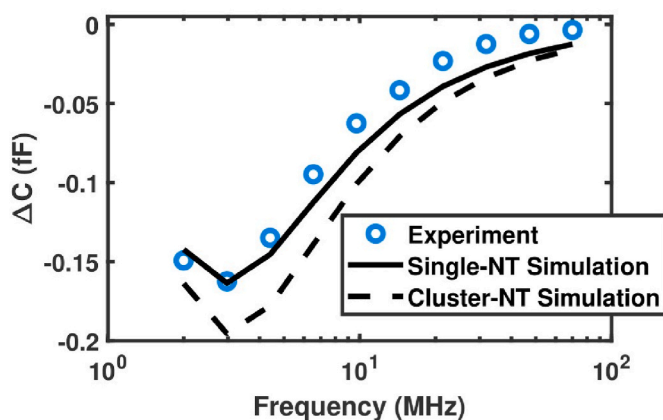


Fig. 11. Experimental results of expected single-NT and numerical simulation matching the average spectra. The simulated  $(\phi, \theta, d_z)$  are  $(0^\circ, 0^\circ, 100$  nm) and parameters reported in Table 1.

#### 4. Conclusion

We report, for the first time to our knowledge, high frequency impedance spectroscopy of single  $TiO_2$  nanotubes featuring a very high aspect ratio. Our work proposes a few simple equations for a first-order characterization of the basic geometrical parameters of these cylindrical analytes. The object detection and estimation procedure avails itself of accurate two-dimensional numerical simulations of the sensor response, which help identify the best conditions (especially image size) for the purpose.

Although this work still lacks a statistically large experimental dataset, and despite inherent parameter correlations (which give rise to non-unique parameter sets matching equally well some of the sensor



**Fig. 12.** Measured and simulated spectra of a single-NT and a  $3 \times 3$  cluster in 150 mM, NaCl solution environment, for  $d_x = d_y = 0$ ,  $\theta = 0^\circ$ . For the single-NT  $(\phi, \theta, d_z) = (0^\circ, 0^\circ, 6 \text{ nm})$ ,  $(\phi, \theta, d_z) = (0^\circ, 0^\circ, 75 \text{ nm})$ , all the other parameters are those reported in Table 1.

responses), this preliminary work suggests that useful indications on the nanotube length, orientation, and clustering can be extracted from capacitance images utilizing nanoelectrode arrays.

Simulations of the spectral response, consistent with the parameters estimated from single frequency data, yield good agreement with experiments, thus indirectly confirming the values of the dielectric properties of single NTs derived from the literature. More extensive measurements and simulations, possibly leveraging Bayesian inversion and machine learning statistical methods, will likely provide new insights on the charge state and the exact positioning of the NTs on the array, both being important for NTs characterization.

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