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Discriminating macromolecular interactions based on an impedimetric fingerprint supported by multivariate data analysis for rapid and label-free *Escherichia coli* recognition in human urine

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ABSTRACT

This manuscript presents a novel approach to address the challenges of electrode fouling and highly complex electrode nanoarchitecture, which are primary concerns for biosensors operating in real environments. The proposed approach utilizes multiparametric impedance discriminant analysis (MIDA) to obtain a fingerprint of the macromolecular interactions on flat glassy carbon surfaces, achieved through self-organized, drop-cast, receptor-functionalized Au nanocube (AuNC) patterns. Real-time monitoring is combined with singular value decomposition and partial least squares discriminant analysis, which enables selective identification of the analyte from raw impedance data, without the use of electric equivalent circuits. As a proof-of-concept, the authors demonstrate the ability to detect Escherichia coli in real human urine using an aptamer-based biosensor that targets RNA polymerase. This is significant, as uropathogenic E. coli is a difficult-to-treat pathogen that is responsible for the majority of hospital-acquired urinary tract infection cases. The proposed approach offers a limit of detection of 11.3 CFU/mL for the uropathogenic E. coli strain No. 57, an analytical range in all studied concentrations (up to 10^5 CFU/mL), without the use of antifouling strategies, yet not being specific vs other *E.coli* strain studied (BL21(DE3)). The MIDA approach allowed to identify negative overpotentials (-0.35 to -0.10 V vs Ag/AgCl) as most suitable for the analysis, offering over 80% sensitivity and accuracy, and the measurement was carried out in just 2 min. Moreover, this approach is scalable and can be applied to other biosensor platforms.

1. Introduction

Developing an electrochemical biosensing platform that is both

industrially scalable and repeatable is a challenging task that requires meeting various requirements. To achieve low limits of detection (LOD) and selectivity, many available technologies rely on complex synthetic

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methods and nanoarchitecture designs, difficult to control when expanding production, thus leading to sub-ideal structural features or loss in their special, surface-related functions (Chen et al., 2022; Sharifi et al., 2019). Additionally, the ability to develop platforms with high sensitivity and selectivity in complex biological samples is of paramount importance (Russo et al., 2021). Popular strategies to reduce fouling are through nanoengineered surfaces (Chapman et al., 2015; Zhou et al., 2009) or the application of nanoporous membranes (Sun et al., 2016), which further increase the complexity and reduce the reproducibility and scale-up potential of the proposed approaches. Another strategy includes developing antifouling coatings to prevent the non-specific molecules adsorption. Here, single-molecule fouling agents after receptor grafting (Niedzialkowski et al., 2020), molecular brushes (Emilsson et al., 2015), zwitterionic coatings (Gui et al., 2013), but also supramolecular hydrogels (Wu et al., 2017) should be considered.

Owing to the high surface area-to-volume ratio and unique electronic and catalytic properties, gold nanoparticles are excellent candidates for enhancing the sensitivity and selectivity of electrochemical biosensors (Xiao et al., 2020). Gold nanocubes (AuNCs) have recently gained particular attention due to their uniform dimensions, higher self-organization predictability, and the ability to finely tune their plasmonic properties, as well as chemical stability (Park et al., 2018). The molecular mechanism of AuNC assembly essentially depends on the electrode substrate, strongly affecting the resultant electrocatalytic effect. Among commonly utilized electrode substrates, AuNCs decorated at GC provide over 65% increase in electrochemically active surface area and 75% increase in heterogeneous rate constant (Niedzialkowski et al., 2022). Voltammetry aptasensors based on AuNCs were used for the determination of chloramphenicol (LOD = 2.8 pM) (Lu et al., 2021), progesterone in diluted blood (LOD = 1 ng/mL) (Velayudham et al., 2021) and even a prostate cancer gene sequence (10 nM), also exhibiting low disturbance in the presence of fouling agents (Abedi et al., 2021). DNA biosensors for pathogenic Vibrio cholerae, responsive even at quantities of 10 CFU/mL, and selective detection in bacterial cultures belonging to the same and distant genera (Ali et al., 2021). Moreover, surface modification of AuNC makes it possible to produce a signal-enhanced interface, such as in the case of the paper-based chikungunya virus platform built based on magnetic Fe₃O₄@AuNC (Singhal et al., 2018), or the hollow Ag@AuNC core-shell for surface-enhanced Raman scattering and non-enzymatic uric acid and ascorbic acid detection (Bhattacharjee et al., 2020).

Human urine is a product of the filtration system – the kidneys – and was conventionally considered as sterile (Kass, 1962). Even though the results of next generation sequencing analyses provide evidence of the existence of the urine microbiome, there are still many controversial aspects to this topic (Frimodt-Møller, 2019; Grine et al., 2019; Shah Utsav et al., 2021) and the common belief is that urine in the bladder of a healthy person is not contaminated with bacteria. However, bacteria can enter the urinary system, causing problems such as infection and inflammation. Urinary tract infection (UTI) is considered the second most common bacterial disease after pneumonia and affects about 150 million people every year worldwide (Flores-Mireles et al., 2015). Annually, UTIs are diagnosed in more than 10% of women and 3% of men, and more than 60% of women will be diagnosed with a UTI in their lifetime (Klein and Hultgren, 2020). The clinical picture of the UTI ranges from a mild self-limiting illness, chronic or acute infection, to urosepsis. Additionally, urosepsis comprises 25% of all adult sepsis cases and is associated with an overall mortality rate of 20-40%. Primary hospitalized patients due to UTIs result in a total cost of \$2.8 billion USD in the United States, annually; epidemiological reports also indicate 1 million visits to the emergency department and 7 million office visits (Klein and Hultgren, 2020). Uropathogenic Escherichia coli (UPEC) is the most common pathogen, responsible for 85% and 50% of community and hospital-acquired UTI cases, respectively, and can form biofilms on urological catheters, making them very difficult to treat and remove due to the high tolerance of biofilm structures to antibiotics.

The standard urine culture protocol represents the primary tool for detecting bacteria in clinical microbiology laboratories with LOD $> 10^5$ CFU/mL (Kass, 1962; Price et al., 2016). Dipsticks and culturing methods take long time (hours, even days), limiting rapid intervention. In turn, the use of some molecular methods as polymerase chain reaction (PCR) could improve the speed and accuracy of UPEC detection; however, their applicability is complicated by the high genomic variability within uropathogenic *E. coli* strains (Brons et al., 2020). Other diagnostic technologies for UTIs are also known, i.e. urinalysis and microscopy, fluorescent in situ hybridization (FISH), MALDI-TOF MS, microfluidics, immunology-based and forward light scattering assays; however, their limiting factors, described recently in detail (Davenport et al., 2017), prevent their use in clinics. A powerful approach to the detection of E. coli via electrochemical biosensors is by immunosensors (Felix and Angnes, 2018). Many electrode modifications were performed to obtain as low limits of detection (LOD) as possible, such as photochemical immobilization of anti-E. coli antibodies on gold (Cimafonte et al., 2020), gold modified by graphene-wrapped copper (II)-assisted cysteine hierarchical structure, and antibodies (Pandey et al., 2017). Wang et al. show a 10 CFU/mL LOD with composite biosensors based on magnetic nanoparticles (NPs) and functionalized gold nanoparticles (AuNPs) conjugated with lead sulfide NPs via oligonucleotide linkage (R. R. Wang et al., 2015; Y. Y. Wang et al., 2015). Another route to use immuno-functionalized magnetic beads is by glucose oxidase (GOx)antibody conjugates at interdigitated microelectrodes (10³ CFU/mL) (Xu et al., 2016). A bionanocomposite based on pencil graphite modified with chitosan, multiwalled carbon nanotubes, polypyrrole and AuNPs offers a LOD of 30 CFU/mL (Güner et al., 2017). The utilization of nucleic acid hybridization or connection to DNA is also used in E. coli biosensors. The gold electrode modified by thiolated capture probes and biotinylated aptamer probes had an 80 CFU/mL E. coli LOD (Wang et al., 2019). Limits of detection under 10 CFU/mL were obtained with biosensors based on metal-organic frameworks functionalized by polyaniline at glassy carbon electrode (GCE) (Shahrokhian and Ranjbar, 2018) and indium-tin oxide (ITO) modified by 3-Aminopropyltrimethoxysilane and DNA genetic markers (Deshmukh et al., 2020).

Detecting analytes in real human urine poses significant challenges due to the potential for unknown interactions to occur between the biosensor surface, the analyte, and other molecules present in the sample (Aitekenov et al., 2021). As a result, only a limited number of studies have proposed electrochemical methods for detecting analytes in urine. Typically, detection in urine is based on the use of antibody-modified electrodes, and the measurements focus on the clinical utility of the biosensors that have been designed. Such examples include a GCE functionalized by a nanocomposite of polyaniline with AuNPs and MoS2 modified by antibodies or Au modified with thin reduced graphene oxide and polyethylenimine (Jijie et al., 2018), both with LODs of 10 to 10⁵ CFU/mL (Raj et al., 2021). The screen-printed carbon electrode with an AuNP-decorated polyaniline film and anti-digoxigenin-labeled horseradish peroxidase was manifested to detect 4 to 4×10^6 CFU/mL E. coli in urine (Shoaie et al., 2018). However, despite the efforts, achieving uniform PANI distribution and volume for scale-up remains a critical challenge (Yang et al., 2023), while quantitative analysis is required in specific sensing scenarios.

In this work, we have developed a novel approach to the detection of large biomolecules using modulated electrostatic interactions induced by electrode polarization, mitigating common biofouling and indirect readout. Simultaneous biosystem perturbations by a package of multiple pre-selected frequency signals was analyzed by the Singular Value Decomposition (SVD) followed by Partial Least Squares Discriminant Analysis (PLS-DA) to effectively discriminate the signal response in the presence or absence of the target molecule. Such a strategy delivers an explicit impedimetric fingerprint of the macromolecular interactions, which is dependent not only on binding moieties but also coulombic interactions at different charge states at the electrode surface. We have demonstrated the functionality of the proposed proof-of-concept at an

aptamer-based biosensor composed of self-organized Au nanocube patterns at a flat glassy carbon electrode, applied for the rapid detection of *E. coli* in real human urine samples through polymerase RNA. Importantly, the measured impedance values were directly used for the analyses, avoiding errors that may accumulate during the standard fitting procedures with electric equivalent circuits.

2. Experimental

2.1. Chemicals and bacteria strains used

All chemicals were of analytical grade and were used as purchased without further purifications. Plates of glassy carbon electrode (GCE), 12x12x3 mm, SIGRADUR G, were purchased from (HTW Hochtemperatur-Werkstoffe GmbH, Germany). All electrochemical measurements were carried out in vessels containing a circular seal with a radius of 7 mm. AuNCs were obtained according to the procedure previously described in the paper (Niedziałkowski et al., 2022), see detailed instruction in the SI file, section 1. The AuNCs were stored in a 1 mM cetyltrimethylammonium bromide (CTAB) solution.

The *E. coli* RNA polymerase holoenzyme (RNAP) used in this study, composed of the core enzyme and sigma factor 70, was obtained from the New England Biolabs company (cat No. M0551S). Both strands of the strong p_{rmG-PI} promoter – nontemplate (coding) strand with -10 and -35 motifs indicated in bold: 5'-CGA TAA AGT TTT TAT ATT TTT CGC **TTG TCA** GGC CGG AAT AAC TCC C**TA TAA T**GC GCC ACC A-3', and template (noncoding) strand: 5'-TGG TGG CGC ATT ATA GGG AGT TAT TCC

GGC CTG ACA AGC GAA AAA TAT AAA AAC TTT ATC G-3' – were synthesized by Genomed SA. The nontemplate strand was also modified at its 5' end using thiol linker: 5'-SH-(CH₂)₆-CGA TAA AGT TTT TAT ATT TTT CGC TTG TCA GGC CGG AAT AAC TCC CTA TAA TGC GCC ACC A-3'. The RNAP holoenzyme is solely capable of unwinding the dsDNA helix (Bae et al., 2015; Glyde et al., 2017).

The nonpathogenic *E. coli* B strain BL21(DE3) (Clock et al., 2008) (EC-B) was obtained from the collection of the Department of Molecular Biology of the University of Gdańsk (Poland). The uropathogenic *E. coli* strain No. 57 (UPEC-57) was identified in the urine of a 14-year-old male patient from the Nephrology Clinic and donated with an antibiogram for research from the Department of Microbiology of the Regional Hospital in Kielce, Poland, in 2017. All liquid bacterial cultures were grown in Luria-Bertani medium (LB; EPRO, Poland) with aeration at 37 °C in a shaking incubator (200 RPM). Details on bacterial strain growth and suspension preparation are given in the **SI file, section S2**. The Petri dishes with LB solid medium with 1.5% bacteriological agar (LA; BTL Company, Poland) were incubated at 37 °C for approximately 18 h.

2.2. Biosensor electrode modification

All GCEs were cleaned with a polishing cloth and 0.03 μm aluminum oxide powder (Buehler, USA) before use. AuNCs dissolved in a 0.001 M CTAB solution were deposited onto the GCE surface using a 10 μL drop casting method (see SEM micrograph in Fig. 1b). The solution was allowed to dry on the electrode surface for 30 min at room temperature, then the electrodes were washed with warm water to remove the CTAB

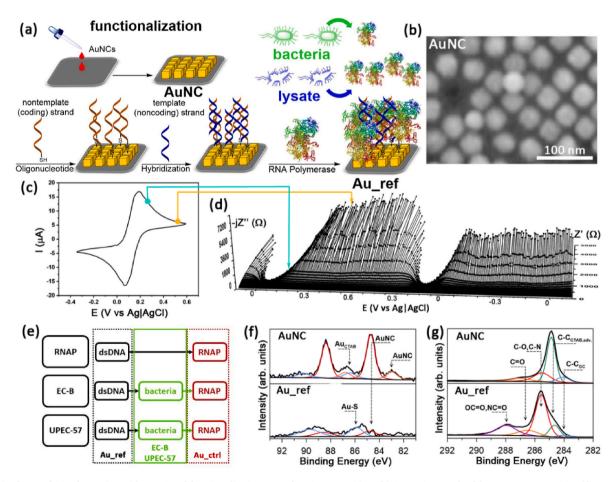


Fig. 1. (a) scheme of GCE decoration with AuNC and functionalization toward RNAP recognition; (b) SEM micrograph of drop-cast AuNC at GCE; (d) exemplary CV and (e) DEIS impedance plot obtained during the CV scan, with arrows identifying individual spectra collected at a given polarization; (e) identification of electroanalytical experiment labels; (f,g) high-resolution XPS spectra with proposed deconvolution for AuNCs at GC before and after functionalization with dsDNA: (f) *Au* 4f and (g) *C* 1s.



residue. A homogeneous GCE surface modified with AuNCs was obtained according to the previously described procedure (Niedzialkowski et al., 2022).

For the functionalization, as schematically presented in Fig. 1a, we used the sequence of one of the P1 promoters, $p_{\rm rmG-P1}$, allowing for the transcription of rRNA genes of the rmG operon. The selected promoter sequence enabled the binding of E. coli RNAP and thus was effectively used as a biosensor receptor. AuNCs were modified by applying 200 μ L of 0.2 μ mol/L nontemplate (coding) oligonucleotide strand dissolved in TRIS-HCl buffer, pH 7.56. After a 12-h modification at room temperature, the electrode surface was thoroughly rinsed with Tris HCl buffer, pH 7.56. Then, a hybridization process was performed using an oligonucleotide with a complementary sequence. The 200 μ L of 0.1 μ mol/L template (noncoding) oligonucleotide stand dissolved in TRIS-HCl buffer, pH 7.56, was placed on the electrode surface and left for 2 h at room temperature. Such functionalized electrodes served for RNAP detection.

2.3. Biorecognition methodology

The Multiparametric Impedance Discriminant Analysis (MIDA) combines multisine impedimetric monitoring with singular value decomposition of raw impedance data, followed by partial least squares discriminant analysis. No electric equivalent circuit was used during impedance data analysis. All electrochemical measurements were performed in the three-electrode setup, with AuNC drop-cast and functionalized at GCE as the working electrode (0.38 cm² electrolyteexposed area), silver chloride-coated silver wire (150 x 1.5 mm) as the reference electrode, and coiled platinum wire (100 x 0.5 mm) as the auxiliary electrode. The impedance monitoring was performed using an AC signal consisting of a package of 21 elementary sinusoids, ranging from 3 to 4500 Hz, superimposed on a DC voltammetry scan, from -0.35 V to 0.60 V, scan rate 2 mV/s. The exact procedure was previously described by the authors (Brodowski et al., 2022; Niedzialkowski et al., 2020). Exemplary impedance spectra recorded during a voltammetry scan are given in Fig. 1c and d. An Autolab (PGSTAT30) potentiostat/galvanostat by Metrohm, The Netherlands, was linked to a computer equipped with a 24 Bit, 204.8 kS/s, PCI-4461 card by National Instruments, USA, and used to generate the AC perturbation signal package.

In the analysis, each impedance dataset at a specific bias (among the 1890 applied biases), is given by the measured complex impedance, expressed as follows (eq. (1)):

$$\mathbf{Z}_{\text{bias}} = \mathbf{Z}_{\text{bias}}' + \mathbf{j} \mathbf{Z}_{\text{bias}}'' \tag{1}$$

where \mathbf{Z}_{bias} is a total impedance, $\mathbf{Z'}_{bias}$ and $\mathbf{Z''}_{bias}$ are the real and imaginary parts of \mathbf{Z}_{bias} , respectively, and $j^2 = -1$. Thus, \mathbf{Z}_{bias} is a complex number matrix with dimensions of 18 (number of independent tests) \times 21 (number of elementary frequencies in a single measurement). The 18 tests include six replicates for each condition (EC-B and UPEC-57 strains) assisted by a reference Au_ref study and control Au_ctrl study in excess of RNAP. In this manner, 1850 matrices were prepared for each experiment (the first 30 and last 10 measurements were discarded). No data centering or scaling was applied to the datasets.

To treat a large amount of collected data, singular value decomposition (SVD) is applied to complex impedance datasets. Let Z_{bias} be the above-reported $18{\times}21$ matrix, which can be decomposed with SVD into 3 matrices (eq. (2)):

$$\mathbf{Z}_{\text{bias}} = \mathbf{U} \mathbf{\Sigma} \mathbf{V}^{\text{T}} \tag{2}$$

where Σ is a matrix with real, nonnegative entries, σ_i , on the diagonal and zeros off the diagonal, organized so that $\sigma_1 > \sigma_2 > \ldots > \sigma_r$; and U and V are unitary orthonormal matrices. Different experimental conditions (e.g. the presence/absence of the analyte) were arranged in a matrix with each column containing all the measurements at a given frequency.

Thus, if the columns of \mathbf{Z}_{bias} are analyte measurements at a frequency, then \mathbf{U} distinguishes the analyte patterns, and \mathbf{V} encodes the frequency patterns. Hence, the right singular vectors could be interpreted as an EIS spectrum, or a linear combination of any, so it would be possible to reconstruct the original EIS by linear combinations of the singular EIS. Then, two different paths are followed.

<u>Path 1:</u> PLS Discriminant Analysis (PLS-DA) is a discrimination method based on PLS regression. A dummy response variable, y, was added to the dataset, which is equal to +1 for positive samples, and -1 for the control group. Now, considering the linear system of equations $\mathbf{y} = \mathbf{Z}_{bias} \mathbf{x}$, the goal is to determine the weighting \mathbf{x} that relates to the presence of the bacteria, restricted to the first two components. For this aim, a truncated SVD (to the first three singular values) was employed. This path can provide useful information about the frequencies most involved in the sensing mechanism (Pierpaoli et al., 2022).

<u>Path 2</u>: Linear regression is performed on both real and imaginary (treated as real) parts of \mathbf{u}_1 and \mathbf{u}_2 , using the same response variable, \mathbf{y} .

Finally, in order to evaluate the ideal polarization potential intervals (PPI) to better discriminate between control and positive samples, the conventional metrics, such as accuracy, sensitivity and specificity, were calculated as follows (eqs (3)–(5)) (Van Stralen et al., 2009):

$$accuracy = (TP + TN)/(TP + TN + FP + FN)$$
(3)

sensitivity =
$$TP/(TP + FN)$$
 (4)

specificity =
$$TN/(TN + FP)$$
 (5)

where TP= true positive, TN= true negative, FP= false positive, and FN= false negative.

Two strains of bacteria labeled, EC-B and UPEC-57, were presented in the form of suspended intact bacterial cells or bacterial lysate solution and studied in artificial and real human urine at a volume ratio of 1:1 with 0.01 M PBS containing 1 mM Fe(CN)₆^{3-/4}. Real human urine was obtained from a healthy 37-year-old woman, co-author of this publication. The analysis was carried out in a medical laboratory of Diagnostyka SA, Poland. The parameters of the urine tested are presented in the SI file, Table S1. The reference measurements (Au_ref) were carried out on the dsDNA functionalized electrode in the absence of the analyte. Each time, a control measurement (Au ctrl) was also performed, admixing 1 CFU E. coli RNAP to the previously used solution, see Fig. 1e for experiment scheme. Prior to electrochemical measurements, the solution was heated to 37 °C using an Eppendorf ThermoMixer. By spiking the real human urine with 3 different concentrations of UPEC-57, and using above described, LOD was estimated using the median and standard deviation of the blank samples using the following equation (6):

$$LOD = CFU_{median} + 3 \times SD_{CFU}$$
 (6)

2.4. Physicochemical analyses

X-ray photoelectron spectroscopy (XPS) analyses were carried out in the core-level binding energy range of C 1s, Au 4f, O 1s and N 1s to investigate the surface chemistry of the biosensor surface after consecutive functionalization steps, i.e. AuNC drop-casting at GCE and dsDNA grafting. These studies were carried out on an Escalab 250Xi (Thermo-Fisher Scientific), utilizing an AlK α X-ray source, spot diameter of 250 μ m and pass energy of 20 eV. Low-energy electron and low-energy Ar⁺ ion bombardment were used for charge compensation purposes. Avantage v5.9921(Thermo-Fisher Scientific) was used for deconvolution and peak calibration using adventitious carbon C 1s (284.6 eV).

Atomic force microscopy (AFM) studies were performed with NTgra Prima (NT-MDT) and using NSG30 probes with geometric parameters 125x40x4 μ m, resonant frequency 320 kHz, and spring constant 40 N/m. A set of 25 approximation curves were made in a rectangular area (side – 3.5 μ m) for statistical processing purposes. The static technique



was used. These measurements were conducted in the electrolyte used for the electrochemical studies, under a potentiostatic regime at three different polarization potentials, namely: -0.3~V, +0.1~V and +0.5~V vs Ag/AgCl, before and after RNAP exposure to dsDNA-functionalized AuNC at GCE. The scanning electron microscopy (SEM) analysis was performed using Quanta 250 FE-SEM (FEI), with the operating electron beam at a 20 kV accelerating voltage.

3. Results and discussion

3.1. dsDNA immobilization on gold nanocubes

The efficacy of consecutive electrode functionalization steps was verified directly by means of XPS analysis, and indirectly through impedimetric changes analysis. Fig. 1f and g reveal the high-resolution XPS spectra registered in the core-level binding energy range of the Au4f and C1s peaks, respectively. Following Fig. 1f, one can observe a strong $Au4f_{7/2}$ component at 84.7 eV, testifying the presence of AuNC at the GC surface. Two more peak doublets were identified, the one shifted at -1.5 eV is likely ascribed to an AuNC surface component

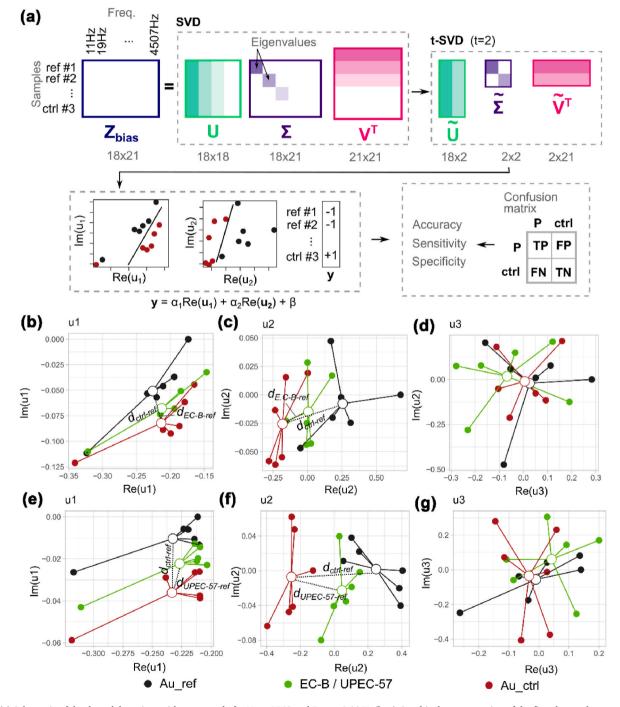


Fig. 2. (a) Schematic of the data elaboration, with an example for $N_p = 1760$ and $E_p = -0.28$ V; (b–g) Graphical representation of the first three columns of U: (b–d) for the EC-B, and (e–g) UPEC-57 datasets.



(Niedzialkowski et al., 2022; Passiu et al., 2020), while the one at +1.6 eV should be interpreted as Au-C moieties, thus testifying to Au complexing by surfactant, CTAB, as discussed in more detail in another report on AuNC chemistry (Niedzialkowski et al., 2022). Anchoring the thiol-functionalized oligonucleotide strand and hybridizing the complementary strand to obtain the dsDNA receptor led to an increase in the layer thickness, suppressing the Au signal. Notably, after surface functionalization, the primary constituent is the peak at 85.8 eV, which is characteristic of Au species involved in the Au-S bond (Laomeephol et al., 2020; Vitale et al., 2011). In the case of the GCE surface with drop-cast AuNCs, the major constituents of the C 1s spectra are the 284.8 and 285.6 eV peaks, attributed to aliphatic C-C and C-N/C-O bonds, respectively, from the presence of CTAB and adventitious carbons, with a smaller component from the sp²-C within the GCE substrate (Dwivedi et al., 2015; Qu et al., 2019). Anchoring the dsDNA receptor significantly alters the surface chemistry of the sensor. The strongest signal originates from the C-O/C-N bonds and OC=O, NC=O bonds, present within the hydrocarbon chains in nucleic acid bases. This observation is typical of DNA anchored at electrode surfaces (Niedzialkowski et al., 2020; Silva-Moraes et al., 2018). A significant drop in the share of sp²-C corroborates the increase in the functionalization layer.

Consecutive steps of surface functionalization, depicted in Fig. 1a, were routinely controlled by electrochemical impedance spectroscopy and cyclic voltammetry; see the data in the SI file, Fig. S1 and Table S2. As a general rule, the next functionalization steps lead to an increase in the thickness of the layer functionalized at the electrode surface, which successively increases the charge transfer resistance, R_{CT} .

3.2. Data analysis and RNA polymerase recognition in real bacteria cultures

The impedimetric data treatment is schematically reported in Fig. 2a. The first step in analyzing the data was to perform SVD for each polarization step. In the first part of the experiment, the recognition of real bacteria cultures was carried out in artificial urine. As an example, the real against the imaginary part of the first three columns of U are

reported, for both the EC-B and UPEC-57 datasets, at $N_p = 1760$ ($E_p =$ −0.28 V) in Fig. 2b-g, showing that the greatest separation between control and positive samples is given both by the real and imaginary part of the first component and by the real part of the second component. No distinction is provided by the third component (as also reported by the low explained variance). For this reason, the PLS-DA was conducted with truncated SVD (t-SVD), with r = 2. Moreover, the Euclidean distances d_{ctrl-ref}, d_{E.coli-ref} and d_{UPEC-ref} have been defined as the distance between the centroids. A similar observation can be made regardless of whether the analysis is done on suspended bacteria or bacterial lysate (see SI file, Fig. S2 for details). Since the first column, u₁, carries most of the dataset information, it is possible to see that the individual points are characterized by high dispersion, which may be related to the characteristics of the single electrode, which results from the fabrication steps. On the other hand, in u2, the different tests are well-clustered, suggesting that this component may be connected to the bacteria identification, independently of the different electrode characteristics. Indeed, minor features that distinguish the different impedance measurements are common and will most likely be represented by components different from the first. This behavior can be observed for both the EC-B and UPEC-57 datasets.

By performing the SVD analysis reported above at all the 1850 polarization steps (N_p) , it was possible to observe how the sample clustering varies with the application of a polarization potential (E_p) . The variation of the specificity, accuracy, and sensitivity as a function of N_p is shown in Fig. 3a for EC-B and Fig. 3b for UPEC-57. It is possible to see, for EC-B, the more pronounced presence of some intervals in which a dramatic drop in the sensitivity is present, which corresponds with the second component, showing a slight increase of the explained variance (Fig. 3c and d). By computing the previously defined Euclidean distances between centroids, it is possible to see distances maximization occurring at negative potentials (Fig. 3e and f). Similarly, to highlight the polarization potential intervals (PPIs) at which the distinction between sample sensitivity, accuracy, and specificity is most noticeable were calculated as functions of E_p (Fig. 3g,i). In particular, it is possible to observe the presence of three different behaviors at different electrode polarization

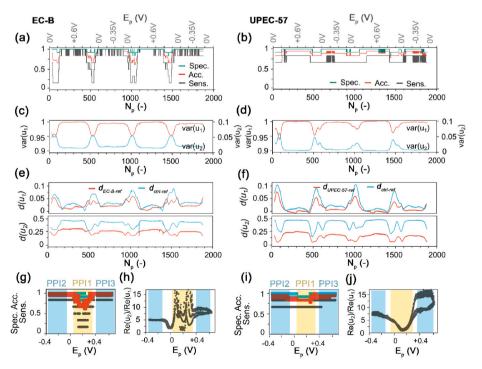


Fig. 3. Plot of specificity, accuracy and sensitivity as a function of N_p , for both (a) EC-B and (b) UPEC-57 datasets. Total variance explained by the first two columns of U for (c) EC-B and (d) UPEC-57. (e,f) Euclidean distance between the centroids given by the different test conditions, for $\mathbf{u_1}$ and $\mathbf{u_2}$. (g,i) plot of the specificity, accuracy and sensitivity as a function of E_p . (h,j) ratio between the real part of $\mathbf{u_1}$ and $\mathbf{u_2}$.



conditions:

- 1) PPI1 ($-0.1~V < E_p < +0.3~V$). Interval in which the oxidation (or reduction) of the redox probe is not suitable for analyte detection.
- 2) **PPI2** ($E_p<-0.1$ V): Optimal interval for the bacteria detection, excluding the measurement performed close to the inversion potential. The Euclidean distance between the samples' (reference vs. control) centroids is slightly higher, suggesting better discrimination.
- 3) PPI3 ($E_p>+0.4\ V$): Suitable interval for the bacteria detection.

A conclusion may be drawn from the above analysis, suggesting that polarization with low overpotentials should be avoided due to its vicinity to the redox potential of the $[Fe(CN)]_6^{3-/4}$ probe used in this study. The redox potentials may be subject to slight changes in-between particular experiments due to inevitable differences in the electric properties and, as an effect, the reversibility of the redox process at receptor-functionalized surfaces. This effect will exacerbate the accuracy and sensitivity drop of the biosensor when comparing results from many experiments. Identification of the decreased accuracy and sensitivity of the impedimetric analyses in **PPI1** is of paramount importance, since not only the redox potentials but also the formal potential E_F lies in the above interval. E_F is estimated based on anodic (E_a) and cathodic (E_c) voltammogram peaks, $E_F = (E_a - E_c)/2$ and is defined as the reduction potential applying to a half-reaction under a specific set of conditions, therefore it is typically considered to be electrode polarization conditions in the vast majority of impedimetric biosensor studies. The indepth SVD analysis shown here suggests that the accuracy and sensitivity of EIS biosensors may be suboptimal at low overpotentials (PPI1 polarization range). On the other hand, the necessity to meet the stationary condition in classic EIS studies makes it impossible to perform studies at higher anodic or cathodic overpotentials.

The cathodic (**PPI2**) or anodic (**PPI3**) overpotentials must be applied to efficiently distinguish between the control and positive samples. The detection may be related to diffusion-surface kinetic processes, since the contributions of frequencies in the low range are predominant (see SI file, Fig. S3, in particular the interval FI1 for frequencies below 20Hz), where studies by Settu et al. (2015) suggest a maximum relative changes measured at 10 Hz. At negative polarization potential, the same Re (u_2)/Re(u_1) ratio for both anodic and cathodic scan may suggests the existence of the same electrochemical behaviour, while, at positive polarization, the presence of an hysteresis loop may be indicator of two different behaviours for anodic and cathodic scans, as reported in Fig. 3h,j.

In light of the above considerations, Fig. 3e and f shows the distance between centroids for the first two columns of U, that the samples with real bacterial cultures find a place between the control and the reference. By using the same coefficients determined for the PLS-DA, the detection of UPEC-57 in artificial urine was performed, resulting in an averaged sensitivity, accuracy and specificity of 80, 90, 93% respectively, for the negative polarization interval (Fig. 3i). In general, the effect of electrode polarization potential on differentiating between the absence and presence of bacteria is more pronounced for EC-B than for UPEC-57. In particular, this is strongly penalized within the range bounded by the reduction and oxidation potentials of the redox probe; however, UPEC-57 is less affected (Fig. 3b). In conclusion, no significant differences in signal response were observed between EC-B and UPEC-57, which means that the proposed biosensor is not specific towards a given E. coli bacteria strain. Importantly, in the light of current diagnostic recommendations (Hay et al., 2016; Nicolle et al., 2019), the specificity of the method used to detect bacteria in the urine is not crucial. According to the medical dogma (Kass, 1962), the human urine of a healthy person should be sterile and UTI is typically thought to be caused by the presence of bacteria in the urine of a symptomatic patient.

3.3. UPEC-57 detection in real human urine

Detection in real media, such as human urine, is significantly more difficult compared to synthetic electrolytes, as it is characterized by chemical and biological diversity, containing up to 3000 different organic compounds and metabolites, including proteins, carbohydrates, and blood cells (Sarigul et al., 2019). To verify the utility of the developed methodology in the human urine environment, a procedure analogous to that described in the previous section was carried out. As expected, the studies in a real environment, with an unknown concentration of fouling agents, such as proteins and metabolites (Hanssen et al., 2016) led to a decrease in the averaged sensitivity, accuracy and specificity, now on the level of 83, 80 and 83%, respectively (averaged values at negative polarization potential) (Fig. 4a). When PLS regression was performed using t-SVD in real urine, PPI2 was found to be superior to PPI3 for UPEC-57 detection, see Fig. 4c and d, in the first polarization cycle, and that the sensing ability worsened with the increasing N_p . Indeed, after the first scan, it is possible to appreciate a loss in R² probably due to some irreversible processes taking place on the electrode surface (Fig. 4b).

The estimated LOD of UPEC-57 in human urine reaches 11.3 CFU/ mL when studied at negative overpotentials of PPI2 range. This result matches or surpasses most other available reports, while obtained using simple electrode surface architecture. A comparative study of different E. coli sensors in human urine is presented in Table 1, while electrochemical biosensors in other electrolytes are also given in the SI file, Table S3. Moreover, we have confirmed that the LOD of the method proposed here is 10x lower compared to the commonly used bacteria cultivation technique in which the detection of bacterial colonies is performed by plating of the bacterial solution onto Petri dishes with solid LA medium and overnight incubation. With this culture protocol, we were able to detect UPEC-57 bacteria in a solution that contained at least 10² bacterial cells per 1 mL (CFU/mL). The illustrative plates with bacterial colonies obtained by using the cultivation-based detection method are shown in Fig. 4f. For comparison, the proposed approach shows a limit of detection of 11.3 CFU/mL for the uropathogenic E. coli strain No. 57. Indeed, a similar LOD can be reached by using an enrichment procedure followed by molecular detection, however, this approach will take much more time (around 24 h) than the proposed by us method. On the other hand, our impedimetric analysis takes as little as 2 min, which results from polarization in the **PPI2** range (-0.35 to -0.10 V, with 2 mV/s), while no conditioning in real media was necessary.

It should be noted that, unlike in the artificial electrolyte, carrying out the analysis of several studied samples under deep anodic polarization have led to irreversible changes occurring at the biosensor surface. This process is associated with the accumulation of compounds present in urine (i.e. carbohydrates, proteins, and leukocytes) at the electrode surface, passivating it and blocking the electrode. In approx. 60% of these events, the surface passivation led to biosensor damage, as shown in Fig. 4e and SI file, Fig. S4. The voltammograms presented in the SI file, Fig. S5, reveal additional redox processes associated with the oxidation of uric acid. It should be noted that such behavior did not occur when the biosensor was subjected only to cathodic polarization in the PPI2 range. Even when the passivation is incomplete, the above-described behavior explains the significantly lower biosensor accuracy when studied in the anodic polarization range, as shown in Fig. 4b, c and 4e

The DEIS and PLS-DA approach provides valuable information about measurement conditions that could lead to electrode degradation, enabling users to take preventive measures. The analytical limits of any sensor can be adjusted to the individual needs by varying the applied polarization (in this case, PPI2) or frequency range. The utilization of adjusted frequency has been demonstrated to enhance sensor performance and improve the efficiency of machine learning algorithms, as previously observed (Kokabi et al., 2023; Xu and Hong, 2022). The



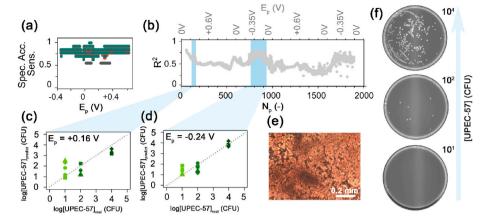


Fig. 4. Plot of (a) the specificity, accuracy and sensitivity and (b) R^2 as a function of E_p for UPEC-57 in real urine; difference between real and predicted values of UPEC-57 concentrations at (c) positive and (d) negative polarization potential; (e) optical microscope image of damaged surface; (f) illustrative plates with bacterial colonies obtained by using the cultivation-based detection method.

 Table 1

 F. coli LOD and detection time in real urine using different detection methods

Detection method	Type of substrate	Detection time	LOD (CFU/ mL)	Ref.
Spectrofluorometry	Receptor-binding proteins on MNPs	1.5 h	~10 ⁷	Costa et al. (2022)
PCR	Marker genes	1 h	10 ⁴	Brons et al. (2020)
Bacteria cultivation	Bacterial colony number per 1 mL suspension	16–20 h	~10 ²	This work
Electroporation	Segregation of nonreplicating plasmid pGTR902	22 min	10 ²	Forsyth et al. (2018)
Microfluidic capillaric circuit	Antibody- functionalized microbeads	<7 min	120	Olanrewaju et al. (2017)
Fluorescence	Bacterial nuclease activity	1 h	< 500	Flenker et al. (2017)
Fluorescence	Mannose-modified polyethyleneimine copolymer particles	~1 h ^a	265	Li et al. (2019)
CV-DPV	Au@MoS ₂ –PANI on GCE	30 min	10	Raj et al. (2021)
CV	PANI/AuNP composite on SPCE	~60 min ^a	4	Shoaie et al (2018)
EIS	Interdigitated Au microelectrode	1–12 h	7	Settu et al. (2015)
LSV	Unspecified carbon electrode	35 min	24	Safavieh et al. (2012)
CV-DPV	rGO/ polyethyleneimine- modified Au	~35 min ^a	10	Jijie et al. (2018)
CV	Thionine dye (Th) on MWCNT/ chitosan coated on GCE	1 h	50	Gayathri et al. (2016)
MIDA	AuNC drop-cast on GCE	\sim 2 min	11.3	This work

^a information not available directly, the detection time is speculated based on the experimental steps provided.

utilization of Arduino microcontrollers enables the implementation of a multi-frequency approach, offering a user-friendly monitoring tool for therapy that can be easily operated by inexperienced individuals. (Merli et al., 2020; Murillo-Ortiz et al., 2020; Romero Coripuna et al., 2021; Wang, 2015).

A detailed understanding of the altered biosensor response depending on the applied overpotential is extremely difficult due to the complexity of the electrode surface, both in terms of the macromolecular

structure and resultant, instantaneous surface charge distribution. To shed light on the role played by the charged-up electrode surface, we calculated the electrostatic potential based on the Poisson-Boltzmann equation for the macromolecules functionalized at the AuNC surface and conducted spectroscopic AFM studies of the proposed biosensors. Notably, neither the AuNC surface charge nor the solvent could be considered in these calculations. Fig. 5a shows a model of dsDNA attached covalently to AuNC and the RNAP. Since DNA bears a highly negative formal charge, due to the presence of negatively charged phosphate moieties linking neutral nucleosides, one can assume that upon oligonucleotide immobilization, the surface of the functionalized gold cubes becomes highly negative and remains negative upon DNA hybridization. On the other hand, RNAP is a complex system with some domains bearing a total negative and some positive charge, although most of the RNAP subunits have more negatively charged amino acids (D/E) than positively charged (K/R), resulting in a theoretical value of isoelectric points in the range of 4.5–5.2. In particular, the RNAP domain responsible for DNA binding is highly positive, so upon DNA binding, the DNA-protein complex is stabilized not only via specific van der Waals interactions and hydrogen bonds but also electrostatic interactions. Upon binding, the entire complex has an excess of negative charge and most of the protein domains binding DNA also become negatively charged due to the presence of dsDNA (Fig. 5b). However, our modeling predicts some RNAP domains (composed mostly of subunit alpha) that are positioned close to the gold surface, and that bear only a slightly negative electrostatic charge. As a result, upon RNAP binding, the electrostatic charge in the vicinity of the gold surface changes from highly negative to less negative/neutral, which is likely detected in the experimental setup.

The spectroscopic AFM mode is based on force imaging of the probe positioned on the sample surface, registering the change in the selected physical quantity. In this particular case, we registered the approach curves of the AFM probe to the functionalized electrode surface at electrode potentials falling in the PPI1, PPI2 and PPI3 range. The approach makes it possible to register the mechanical characteristics of dependence between the interaction force as a function of the probe-sample separation (Cappella and Dietler, 1999), where the process of transition between the non-contact and the contact mode of interaction can manifest via different shapes of the approach curves (Wu, 2010). In the first stage, the AFM probe approaches the surface, and when the attractive forces prevail over the spring constant of the lever, the probe jumps to a set-up position in the vicinity of the tested surface, marking the probe-sample distance, as illustrated in Fig. 5c. The AFM probe elongation, h, is inversely proportional to the thickness of the functionalized film. It should be noted, however, that neither the current



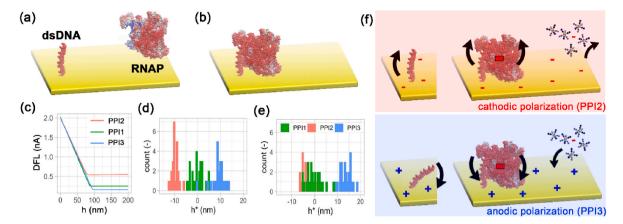


Fig. 5. (a) calculated electrostatic potential for DNA model on AuNC and RNAP sigma70 complex; and (b) RNAP-DNA complex model on AuNC. Red color corresponds to the negative electrostatic charge; the more intensive the color, the stronger the negative/positive charge. (c) Exemplary AFM approach curve for the dsDNA functionalized Au_ref sample; piezoelectric elongation of: (d) Au_ref and (e) Au_ctrl at various electrode polarizations. (f,g) Scheme of coulombic forces between the functionalization film and the AuNC substrate, affecting charge transfer process at differently polarized electrode surface.

deflection of the AFM probe nor the current height of the sample at the contact point is known a priori, thus the approach curves provide only an indirect measure of changes in the conformation of the studied system depending on the applied polarization potential. Therefore, the probe-sample distance was normalized, setting the sample studied in the **PPI1** range as the reference ($h^* = 0$). The h^* value should be considered in terms of changes in the strength of interatomic interactions between the macromolecules and the atoms of the microscope tip. Fig. 5d shows the results of a statistical analysis from 25 approach curves to the Au ref electrode surface. When these data are taken only in the context of changes in the conformation of the macromolecular film at the electrode surface, it can be concluded that polarization in the anodic PPI2 range reduces the film thickness (compared to PPI1), while polarization in the cathodic direction (PPI3) causes the opposite effect. Similar changes in the orientation of dsDNA in the electric field were reported previously (Meunier et al., 2015; Niedzialkowski et al., 2020). The final effect on the macromolecule's conformation is visible upon RNAP interaction with the dsDNA at the electrode surface, as in Au_ctrl (Fig. 5e). The presence of coulombic repulsion between a negatively charged RNAP-DNA complex and the negatively charged electrode surface (PPI2) produces a similar effect to the one discussed above, but the h* decrease is much smaller, possibly due to the steric hindrance effects by the RNAP-DNA complex.

The processes discussed may have a multidimensional influence on the measured impedimetric parameters. The most commonly used indicator, R_{CT}, will notably increase upon RNAP-DNA interaction, developing the functionalized layer thickness, and hindering the diffusion of the negatively charged ferrocyanide redox probe. It should also be noted that the higher the functionalized layer thickness, the smaller the measured capacitance. The change in electrode conformation has an immediate effect on the frequency dispersion of the capacitance, as previously discussed (Niedzialkowski et al., 2020). The effect of electrode polarization under PPI2 and PPI3 conditions is schematically illustrated in Fig. 5f, suggesting a possible mechanism of molecular interactions in the electric field that allows one to distinguish the impedimetric signal in the presence and in the absence of the RNAP. Due to the complexity of the studied interphase, however, any experimental or simulation technique will provide an impaired and incomplete interpretation of the studied process. Nevertheless, the combined DEIS with PLS-DA approach makes it possible to effectively identify the unique impedimetric fingerprint of the biosensor studied.

4. Conclusions

We proposed a new methodology for biosensor operation, which utilizes real-time impedimetric monitoring combined with partial least squares discriminant analysis. The principle of its operation is to distinguish the presence of the analyte not only by strong intermolecular forces but also by weak coulombic forces, when measured under different polarization conditions, to obtain the explicit impedimetric fingerprint of the macromolecular interactions.

As a proof-of-concept of the methodology, we selected the aptameric recognition of RNAP for two different E. coli strains, including uropathogenic UPEC-57. The approach discriminates the presence of the analyte at very low concentrations directly in the real human urine environment, despite the presence of an unknown amount and concentration of fouling agents. The impedimetric analysis was carried out on raw data, without fitting with electric equivalent circuits. The study revealed that the detection is most accurate at negative overpotentials (-0.35 to -0.10 V vs Ag/AgCl), where the interaction between negatively charged [Fe(CN)]₆^{3-/4-} species and negatively charged RNAP-DNA complexes at AuNC should result in the increase of charge transfer resistance and introduce frequency dispersion of capacitance effects. Our study shows the capability of UPEC-57 identification with a LOD reaching 11.3 CFU/mL after only 2 min and using a simple glassy carbon electrode architecture with drop-cast, self-organizing Au nanocube patterns. Although there are differences between the data collected for EC-B and UPEC-57, the biosensor is not capable of distinguishing between two strains of E. coli.

CRediT authorship contribution statement

Adrian Koterwa: Validation, Formal analysis, Investigation, Data curation. Mattia Pierpaoli: Methodology, Software, Validation, Formal analysis, Investigation, Data curation, Writing – original draft, Visualization. Bożena Nejman-Faleńczyk: Methodology, Writing – original draft, Writing – review & editing. Sylwia Bloch: Validation, Investigation, Writing – original draft. Artur Zieliński: Investigation, Writing – original draft. Wioletta Adamus-Białek: Resources, Writing – review & editing. Zofia Jeleniewska: Investigation, Writing – original draft, Writing – review & editing, Visualization. Robert Bogdanowicz: Conceptualization, Writing – original draft, Writing – review & editing. Grzegorz Węgrzyn: Resources, Writing – review & editing. Paweł Niedziałkowski: Methodology, Investigation, Resources, Writing – original draft, Writing – review & editing, Supervision. Jacek Ryl: Conceptualization,



Methodology, Investigation, Writing – original draft, Writing – review & editing, Visualization, Supervision, Funding acquisition.

Declaration of competing interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

Data availability

Data will be made available on request.

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Appendix A. Supplementary data

Supplementary data to this article can be found online at https://doi.org/10.1016/j.bios.2023.115561.

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