#### SHORT COMMUNICATION



# Quantum dots-based "chemical tongue" for the discrimination of short-length A $\beta$ peptides

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#### Abstract

A "chemical tongue" is proposed based on thiomalic acid-capped quantum dots (QDs) with signal enrichment provided by excitation-emission matrix (EEM) fluorescence spectroscopy for the determination of close structural analogs—short-length amyloid  $\beta$  (A $\beta$ ) peptides related to Alzheimer's disease. Excellent discrimination is obtained by principal component analysis (PCA) for seven derivatives: A $\beta_{1-16}$ , A $\beta_{4-16}$ , A $\beta_{4-9}$ , A $\beta_{5-16}$ , A $\beta_{5-12}$ , A $\beta_{5-9}$ , A $\beta_{12-16}$ . Detection of A $\beta_{4-16}$ , A $\beta_{4-16}$ , and A $\beta_{5-9}$  in binary and ternary mixtures performed by QDs-based chemical tongue using partial least squares-discriminant analysis (PLS-DA) provided perfect 100% accuracy for the two studied peptides (A $\beta_{4-16}$  and A $\beta_{4-16}$ ), while for the third one (A $\beta_{5-9}$ ) it was slightly lower (97.9%). Successful detection of A $\beta_{4-16}$  at 1 pmol/mL (1.6 ng/mL) suggests that the detection limit of the proposed method for short-length A $\beta$  peptides can span nanomolar concentrations. This result is highly promising for the development of simple and efficient methods for sequence recognition in short-length peptides and better understanding of mechanisms at the QD-analyte interface.

Keywords Excitation-emission matrix fluorescence spectroscopy  $\cdot$  2D fluorescence  $\cdot$  Multispectral fluorescence spectroscopy  $\cdot$  Machine learning  $\cdot$  Quantum dots  $\cdot$  Chemical tongue  $\cdot$  Peptide sequence recognition  $\cdot$  A $\beta$  peptides  $\cdot$  Alzheimer's disease  $\cdot$  Short-length peptides

# Introduction

The "chemical tongue" is an attractive sensing strategy to discriminate structurally similar compounds [1, 2]. As opposed to the traditionally applied detection using the lock and key method, its significant advantage is no need for designing specific receptor elements because the detection is realized using multiple cross-reactive receptors or multimodal response of single receptors. The resulting chemical "fingerprints" are then processed using machine learning algorithms to decode useful knowledge from the signal patterns, i.e., to obtain qualitative and/or quantitative

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information [1, 3]. Among many receptors used in "chemical tongues," different nanomaterials are distinguished by favorable physicochemical properties, including tunable optical properties (e.g., plasmonic, photoluminescent) combined with the ease of surface functionalization [4]. Moreover, specially designed nanomaterials may supply multidimensional optical information, which can be beneficial for the analysis's overall time- and cost-effectiveness in chemical tongue approach [5]. The idea of capturing multidimensional optical information may be realized using advanced detection techniques such as excitation-emission matrix (EEM) fluorescence spectroscopy, covering the entire emission spectrum at multiple excitation wavelengths [6]. As we showed in our recent work, the resultant EEM spectrum encodes subtle differences in the impact of the studied neurotransmitters on the fluorescent properties of QDs, which in turn improves the efficiency of the analytes identification, compared to the traditional analysis based on single emission spectrum [7].

Amyloid  $\beta$  (A $\beta$ ) peptides are a family of peptides generated from an amyloid precursor protein (APP). The longer A $\beta$  forms tend to aggregate due to the hydrophobic character

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of the C-terminal fragment, whereas their N-terminal part could bind metal ions, including copper ions, forming highly redox active species. Both processes are believed to be related to Alzheimer's disease (AD), leading to the formation of toxic oligomers and boosting oxidative stress, respectively [8, 9]. Although the most considerable effect on AD development is attributed to  $A\beta_{1-40}$  and  $A\beta_{1-42}$  species, there is a huge diversity of  $A\beta$  peptides in vivo, especially considering the N-truncated forms, such as  $A\beta_{p3-x}$ ,  $A\beta_{4-x}$ ,  $A\beta_{5-x}$ ,  $A\beta_{n11-x}$ , and  $A\beta_{11-x}$ , with a potentially diverse role in the induction of oxidative stress [10-12]. Their amount, especially  $A\beta_{4-x}$ , is at least as large as that of  $A\beta_{1-x}$  [13, 14]. In addition, the content of particular A $\beta$  peptides differs between healthy people and AD patients [15], which could be employed in AD diagnosis. Recent studies also showed that brain enzymes such as neprilysin could further degrade A $\beta$  peptides, resulting in short soluble forms [16]. What is noteworthy, the short length and similarity of amino acid sequences impede the detection of those peptides by standard methods, such as mass spectrometry and antibody-based assays. Thus, short-length A<sup>β</sup> peptides are perfect candidates for testing novel detection methods to discriminate structural analogs.

Recently, chemical tongue methods were proposed as a promising strategy for the detection of different forms of  $A\beta_{1-40}$  and  $A\beta_{1-42}$  aggregates [17–19]. However, the recognition of specific peptide sequences still poses a challenge. Our research group for the first time showed that QDs-assisted EEM fluorescence spectroscopy can be applied to recognize amino acids and several di- and tripeptides [6]. Then, we used a voltammetric chemical tongue to identify peptides within the group of Pro-Gly, carnosine, glutathione,  $A\beta_{4-16}$ , and the  $\alpha$ -factor N-terminus [20]. In our last paper, we showed that voltammetric tongue approach enabled recognition of sequence of  $A\beta_{5-9}$  derivatives, which presents the same Cu(II)-His2 coordination mode, but with modified residues at first and third positions [21].

Herein, we aimed to discriminate short A $\beta$  peptides with high sequence resemblance. We used EEM fluorescence spectroscopy of thiomalic acid capped-CdTe quantum dots [22–24] as a cross-reactive receptor to discriminate various A $\beta$  peptide sequences based on various interactions between the nanocrystals and the peptides.

## **Results and discussion**

As model compounds for testing discrimination ability of quantum dots-based "chemical tongue," we selected seven amyloid  $\beta$  derivatives representing the most commonly studied models of the N-terminal sequences of A $\beta$  peptides (Table 1, all experimental details are provided in Electronic Supplementary Information, ESI).

**Table 1** Short-length Aβ peptides (free N-terminal amines and amidated C-termini)—amino acids sequences and basic properties

Abbrev	Aβ peptide sequence	pI	The charge at pH 7.4
Αβ <sub>1-16</sub>	DAEFRHDSGYEVHHQK-NH <sub>2</sub>	6.36	-1
Αβ <sub>4-16</sub>	FRHDSGYEVHHQK-NH <sub>2</sub>	9.59	+1
Αβ <sub>4-9</sub>	FRHDSG-NH <sub>2</sub>	10.90	+1
$A\beta_{5-16}$	RHDSGYEVHHQK-NH <sub>2</sub>	9.44	+1
Aβ <sub>5-12</sub>	RHDSGYEV-NH <sub>2</sub>	7.50	0
Aβ <sub>5-9</sub>	RHDSG-NH <sub>2</sub>	10.73	+1
Αβ <sub>12-16</sub>	VHHQK-NH <sub>2</sub>	13.91	+2

Their truncation at N- and C-termini resulted in a different number of acidic/basic residues and, in consequence, diverse peptide charges at pH 7.4. By applying QDs capping agent of anionic character, we assumed a possible varied affinity towards the nanomaterial's surface [25]. The EEM spectra of QDs with and without A $\beta$  peptides (details on their acquisition in Supplementary Information) are given in Fig. 1A–D. To more clearly illustrate A $\beta$ -induced changes in QD's fluorescence response, we extracted the fluorescence spectra acquired at the maximum excitation from EEM of each type (Fig. 1E).

Three different effects were observed in the EEMs of QDs influenced by their interaction with analytes at 100  $\mu$ M: slight enhancement of the fluorescence signal at emission maximum ca 290 nm/510 nm ( $\lambda_{ex}/\lambda_{em}$ ) in the case of A $\beta_{5.9}$  (Fig. 1B); fluorescence quenching without any spectral shifts for A $\beta_{4.9}$ , A $\beta_{5-12}$ , and A $\beta_{1-16}$  (Fig. 1C); or fluorescence quenching with red-shift of emission maximum in case of A $\beta_{4.16}$ , A $\beta_{5-16}$ , and A $\beta_{12-16}$  (Fig. 1D). Moreover, the degree of the fluorescence quenching differed depending on the A $\beta$  peptide sequence, in order A $\beta_{4.9} < A\beta_{5-12} < A\beta_{1-16} < A\beta_{4-16}$  (A $\beta_{5-16} < A\beta_{12-16}$  (Fig. 1E). Such varied EEM response of the applied QDs to the A $\beta$  species proves their cross-selectivity and can be utilized as characteristic fingerprints in the chemical tongue approach.

EEM fluorescent data of QDs in the presence of 100  $\mu$ M A $\beta$  peptides were unfolded and processed by principal component analysis (PCA) to implement the chemical tongue approach. PCA detects samples' (dis)similarities by converting the original variables into principal components (PCs), capturing the maximum system variance [26]. PCA score plots (Fig. 2A, B) were used to discern the analytes, while the contribution of the original variables to the following PCs was observed on loadings plots (Fig. 2C–E; data analysis details in Supplementary Information). First of all, we achieved satisfactory discrimination of all investigated targets as the objects representing each A $\beta$  peptide form well-separated clusters against three PCs included in the model (Fig. 2A). It must be underlined that the samples are grouped



**Fig. 1** The influence of  $A\beta$  peptides on the fluorescence spectra of QDs. **A** EEM spectrum of QDs. **B–D** EEM spectra of QDs in the presence of 100  $\mu$ M A $\beta$  peptides showing their varied impact on QD

in PC1-PC2 space itself depending on the type of changes induced in the EEMs (compare Figs. 1 and 2B). The cluster of A $\beta_{5-9}$ , which slightly enhances the fluorescence of QDs, is placed close to the pure QDs cluster. The peptides that quench the fluorescence of QDs with a spectral shift (A $\beta_{4-16}$ , A $\beta_{5-16}$ , A $\beta_{12-16}$ ) are characterized by negative PC1 and PC2, while compounds that only quench the fluorescence are grouped in near PC1  $\approx$  0, having positive PC2 values. It is worth emphasizing that each PC provided complementary information for the analytes discrimination. PC3 is necessary to distinguish A $\beta_{4-16}$  and A $\beta_{5-16}$ , as well as A $\beta_{4-9}$  and A $\beta_{5-12}$  (Fig. 2A), which slightly overlap when considering only PC1-PC2 space (Fig. 2B).

The loadings on PC1 reveal that it describes enhancing or quenching properties of A $\beta$  peptides (Fig. 2C). Analytes that quench the fluorescence to the greatest extent (A $\beta_{1-16}$ , A $\beta_{5-16}$ , A $\beta_{4-16}$ , A $\beta_{12-16}$ ) are characterized by negative PC1, while for remaining samples (A $\beta_{5-9}$ , A $\beta_{4-9}$ , A $\beta_{5-12}$ ) it is positive (Fig. 2A). In turn, PC2 describes the differences in the obtained EEMs over  $\lambda_{ex} \in (250, 300 \text{ nm}), \lambda_{em} \in (490,$ 520 nm), and  $\lambda_{ex} \in (360, 500 \text{ nm}), \lambda_{em} \in (500, 550 \text{ nm}),$ which allow distinguishing A $\beta_{5-12}$ , A $\beta_{4-9}$ , A $\beta_{5-9}$ , and A $\beta_{1-16}$ 

fluorescence signal. **E** Fluorescence emission spectra under optimal excitation conditions ( $\lambda_{ex} = 290$  nm). The spectra in **E** were extracted from respective EEMs in **A**–**D** 

(PC2 > 0) from the samples of A $\beta_{4-16}$ , A $\beta_{5-16}$ , and A $\beta_{12-16}$ (PC2 < 0). PC3 contributes to the discrimination of A $\beta_{5-16}$ , A $\beta_{4-16}$ , A $\beta_{1-16}$ , A $\beta_{5-9}$  with positive values on PC3, and A $\beta_{12-16}$ , A $\beta_{4-9}$ , A $\beta_{5-12}$  exhibiting PC3 < 0 (Fig. 2A). The most influential spectral ranges for PC3 occur for  $\lambda_{ex} \in (250, 350 \text{ nm})$ ,  $\lambda_{em} \in (510, 560 \text{ nm})$ , and  $\lambda_{ex} \in (280, 500 \text{ nm})$ ,  $\lambda_{em} \in (480, 510 \text{ nm})$ , as presented in Fig. 2E. These findings confirm the necessity of using multispectral data to provide valuable discriminatory abilities of the developed QDs-based chemical tongue.

While investigating the mechanism behind the diversity of EEMs (Fig. 1), we first looked at His motifs in the peptide sequences (Table 1). It was reported that histidine-rich ligands are characterized by high electron transfer and metal binding abilities, which could highly alter the fluorescence signal of QDs [27]. Interestingly, all peptides causing the shifts of the fluorescence signal to longer wavelengths contain the *bis*-His motif (two adjacent histidine residues). On the other hand, the interaction of QDs with  $A\beta_{1-16}$ , also containing a *bis*-His motif, did not induce spectral shifts in the resultant EEM. Analyzing the charge of the  $A\beta$  peptides at pH 7.4 (Table 1), it can be suspected that this difference



**Fig.2** PCA model for the recognition of A $\beta$  peptides by QDs-based chemical tongue. **A** Complete discrimination of A $\beta$  peptides at 100  $\mu$ M on the 3D score plot. **B** 2D score plot showing the grouping

of various  $A\beta$  species according to their influence on EEMs of QDs. C–E Loading plots corresponding to PC1, PC2, and PC3, respectively

results from the anionic character of the peptide caused by the presence of acidic amino acids (Glu and Asp residues) at the N-terminus of the  $A\beta_{1-16}$  sequence, which determines that it is the only negatively charged compound under conditions of our measurements. However, despite the negative charge of  $A\beta_{1-16}$ , which should hinder the interaction with anionic QDs surface due to the electrostatic repulsion, this peptide quenches QDs fluorescence the most among all compounds that did not shift the emission maximum. It is also worth noting that the remaining  $A\beta$  peptides are mostly positively charged (only  $A\beta_{5-12}$  has a charge of 0), although they influence the fluorescent response of QDs in different ways (see Fig. 1). These observations imply that the observed effects might be a synergistic result of various types of QDs-A $\beta$  interactions, including nanocrystals aggregation induced by electrostatic forces, and the possible affinity of A $\beta$  peptides to the QDs surface, resulting from the presence of metal binding residues in A $\beta$  sequence (as provided in Table 1).

To experimentally evaluate these hypotheses, we first examined susceptibility of QDs to peptide-induced aggregation with UV/vis spectroscopy (see Supplementary Information). For this purpose, we selected five A $\beta$  peptides: two that quenched the fluorescence of QDs (A $\beta_{1-16}$ , A $\beta_{5-12}$ ) and three that quenched the fluorescence of QDs with a redshift of the emission maxima (A $\beta_{4-16}$ , A $\beta_{5-16}$ , A $\beta_{12-16}$ ). No signs of aggregation were visible when 100 µM of both A $\beta_{1-16}$ and A $\beta_{5-12}$  were added to the solution of QDs (Figure S.1). In turn, the shift of absorbance spectra baseline, resulting from enhanced light scattering, was noted for A $\beta_{4-16}$ , A $\beta_{5-16}$ , and A $\beta_{12-16}$ . We can expect that the observed, A $\beta$  peptide-triggered aggregation of QDs is a result of two phenomena: the overall affinity of a given peptide to the QD surface (which determines its surface adsorption) and the final QDs surface charge (responsible for the loss of colloidal stability).

To further track these effects, we monitored the evolution of  $\zeta$ -potential and the hydrodynamic diameter in the presence of selected A $\beta$  peptides (see Fig. 3 and Supplementary Information, Table S.1). In all analyzed cases, the addition of the peptide resulted in attenuation of the initially strongly negative surface charge of QDs due to terminal carboxylate groups of the capping agent (Table S1). The peptide-induced QDs aggregation was also reflected in the increase of hydrodynamic diameters (Fig. 3). The highest  $\zeta$ -potential shift



Fig. 3 The hydrodynamic diameter and  $\xi\text{-potential}$  evolution caused by the aggregation of QDs in the presence of  $A\beta_{12\text{-}16}$ 

was observed for the cationic peptides  $A\beta_{4-16}$ ,  $A\beta_{5-16}$ , and  $A\beta_{12-16}$ . Interestingly, the neutral peptide  $(A\beta_{5-12})$  and the anionic peptide  $(A\beta_{1-16})$  showed a similar minor capability for colloidal destabilization of QDs. This suggests that the adsorption of the  $A\beta_{1-16}$  peptide remains at an equivalent level to that of the  $A\beta_{5-12}$  due to the counteracting electrostatic effect under the given pH and ionic strength.

Since the applied QDs have a CdTe core, variability of the obtained EEM fluorescent response might also derive from a possible varied affinity of Aß species towards the nanocrystal's surface rich in Cd(II) ions [28], especially given that the bis-His motif enhances the stability of Cd(II) complexes [29]. Therefore, we performed spectrofluorimetric titration experiments with CdCl<sub>2</sub> (see Supplementary Information). For these measurements, we chose the peptides containing a Tyr residue  $(A\beta_{1-16}, A\beta_{4-16}, A\beta_{5-16}, and A\beta_{5-12})$  as the fluorescence spectra were collected at the characteristic Tyr excitation wavelength of 275 nm (similar methods were previously used in Cu(II)-AB coordination studies) [10, 30]. Although the obtained results should be considered as a preliminary description of the potential interaction between A $\beta$  peptides and Cd(II), we noticed significant differences in responses of A $\beta$  peptides to Cd(II). The effect of subsequent additions of Cd(II) ions to the  $A\beta_{5,12}$ sample was negligible (Figure S.2A), suggesting a very weak, if any, interaction between Cd(II) and A $\beta_{5-12}$  (the peptide without the bis-His motif). In contrast, we observed an increase in the fluorescence signal in the course of the titration of  $A\beta_{1-16}$ ,  $A\beta_{4-16}$ , and  $A\beta_{5-16}$ , which suggests the binding of Cd(II) ions to the Aß peptides possessing the bis-His motif (Figure S.2B-E). Thus, we showed that the changes in the EEM spectra (Fig. 1), which are indispensable for recognizing short-length A $\beta$  peptides (Fig. 2), are likely driven by multiple QDs-peptide interactions. We do not exclude other mechanisms that could affect the peptides' discrimination.

The following experiment aimed to evaluate the potential of our method in quantitative analysis of A $\beta$  peptides. As an example, PCA score plot obtained for  $A\beta_{4-16}$  samples at various concentration levels revealed that perfect discrimination in PC1-PC2 space was obtained for concentrations: 100 uM. 10 µM, 1 µM, and 100 nM (see Supplementary Information, Figure S.3A). Hierarchical cluster analysis (HCA) confirmed the same sensitivity at micromolar range (Figure S.3B). The response of QDs-based chemical tongue was similar to pure QDs for  $A\beta_{4-16}$  at nanomolar level. To estimate the limit of detection more precisely, independent PCA for nano- and picomolar concentration range was performed (Figure S.3C) and PC1 score served as an estimate of overall response of the chemical tongue. For the series of concentrations, two-tailed t-tests detected significant differences in PC1 score when comparing with pure QDs (Figure S.3D). In this way, limit of detection was found at the level of 1 nM of  $A\beta_{4-16}$  (1 pmol/mL; 1.6 ng/mL).

Finally, to prove the potential of the presented method in the analysis of peptide mixtures, 48 samples containing  $A\beta_{1-16}$ ,  $A\beta_{4-16}$ , and  $A\beta_{5-9}$  were prepared (details in Supplementary Information, Figure S.4). Their choice was dictated by their various influences on the ODs-based chemical tongue response: fluorescence quenching (A $\beta_{1-16}$ ), quenching with red-shift (A $\beta_{4-16}$ ), or fluorescence enhancement  $(A\beta_{5-9})$ . Moreover,  $A\beta_{1-16}$  and  $A\beta_{4-16}$  are the models of the most common Aß forms already detected in biological samples. Detection of the individual A $\beta$  peptide at 100  $\mu$ M in binary and ternary mixtures was performed by QDs-based chemical tongue using partial least squares-discriminant analysis (PLS-DA). Perfect, 100% accuracy was achieved for the two studied peptides (A $\beta_{4-16}$  and A $\beta_{4-16}$ ), while for the third one  $(A\beta_{5,9})$  it was slightly lower (97.9%, Figure S.4). It proves that our method is highly promising for the short-length peptide determination in more complex systems, which will be further explored in our future projects.

# Conclusions

The recognition of small peptides provides a significant challenge for the standard methods dedicated mostly to proteins and long peptides. Therefore, their presence in biological samples could be overlooked or underestimated as they are often easily washed out from chromatographic columns with other low molecular weight molecules, wrongly assigned as the fragments of proteins or longer peptides during analysis of mass spectrometry results, or not recognized by antibodies [15, 31]. In light of the above, the excellent recognition of small and structurally related A $\beta$  peptides presented by our method, employing QDs as receptors, EEM as the detection method, and machine learning to analyze the data, is highly promising for studies on physiologically important small peptides.

Aß peptides are known as important biomarkers for Alzheimer's disease. However, despite the huge variety of their analogs, the ratio of long forms  $A\beta_{1-42}$ :  $A\beta_{1-40}$  is exclusively used in AD diagnostics. The previous works on the chemical tongue towards A<sup>β</sup> peptides were also focused on long forms applying polyelectrolytes and organic dyes [17], dendrimers [19], gold and silver nanoparticles [32, 33] as receptors, but not QDs. On the other hand, sensing by means of fluorescent nanomaterials is mainly focused on interpreting scalar signals (fluorescence intensity at fixed excitation and emission wavelengths or fluorescence shift), while various mechanisms involved in such processes can provide effective and significant enrichment of analytical information. In this work, we showed that combining these two features, which are the application of QDs and proper decoding of their multispectral response (EEM spectrum), leads to high discriminatory power towards recognizing Aß derivatives characterized by high structural similarity. Furthermore, this system is potentially easy to modify, for example, by changing the QD's ligands to provide additional, more specific interactions, lowering the detection limit, and as such be a potentially attractive alternative to analyze clinical samples, which is the aim of our future projects. Moreover, the presented results are important not only from the perspective of the possible development of new detection methods for short-length peptide research but also can suggest that reinterpretation of existing nano-detection systems in terms of enhancing their multidimensional information with further data exploration can be beneficial for improved bioanalytical performance and better understanding of mechanisms at the QD-analyte interface.

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Data availability Data available on request from the authors.

#### Declarations

Conflict of interest The authors declare no competing interests.

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