**RESEARCH ARTICLE** 



# Glucose level monitoring in human blood samples by surface plasmon resonance sensor using cerium oxide and black phosphorus nanomaterials

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Abstract Diabetes is a chronic metabolic disorder characterized by prolonged elevated blood glucose levels. This research endeavours to assess the efficacy of a surface plasmon resonance (SPR)-based sensor for continuous diabetes monitoring. The proposed sensor structure follows the Kretschmann configuration, incorporating key components such as a prism, Silver/Copper, Cerium Oxide, black phosphorus (BP), and a specialized sensing medium. Within this investigation, two distinct sensor structures, denoted as Structure I and Structure II, have been meticulously constructed using the specified layers. The research employs advanced techniques, including the transfer matrix method and angular interrogation, to evaluate the SPR sensor's performance at a wavelength of 633 nm. The study rigorously analyses the detection capabilities for a specific biological sample, considering parameters such as sensitivity (S), detection accuracy (DA), quality factor (QF), and dipof-figure of merit (DFOM). Notably, the glucose detection process achieves remarkable results, with Structure I and Structure II exhibiting maximum sensitivities of 217 degree/ RIU and 217 degree/RIU, DA values of 0.41 and 0.315, QF values of 89.13 RIU<sup>-1</sup> and 68.45 RIU<sup>-1</sup>, and DFOM values of 31,281.53 and 24,213.34, respectively. Ultimately, this research culminates in a comparative study, underscoring the potential of the proposed sensor as a high-performance tool for glucose level detection, thereby paving new avenues in the realms of biological and biomedical technologies.

**Keywords** FK51A prism · Glucose · Sensitivity · Optical sensor · Cerium oxide · Transfer matrix method

# Introduction

Diabetes is a pervasive health issue that affects millions of individuals worldwide. It poses significant challenges to both individuals and healthcare systems, requiring a multidisciplinary approach to its management. Diabetes can arise from multiple factors, including genetic predisposition, lifestyle choices, and environmental influences [1]. Diabetes is often divided into two main categories: type 1 diabetes, which is characterized by an autoimmune attack on pancreatic beta cells, and type 2 diabetes, which is caused by insulin resistance and insufficient insulin production. Symptoms of type 1 diabetes, which include increased thirst, frequent urination, unexplained weight loss, and exhaustion, often appear during infancy or adolescence. On the other hand, the symptoms of type 2 diabetes may appear gradually and include increased thirst, hazy vision, sluggish wound healing, and recurring infections. Type 2 diabetes is frequently associated with obesity and sedentary lifestyles. Diabetes can cause serious consequences that impact many different organs and systems, such as heart disease, kidney damage, nerve damage (neuropathy), retinopathy (vision loss), and foot issues, if it is not treated or inadequately controlled. It is crucial to address diabetes promptly to minimize the risk of these complications [2, 3].

Diabetes management requires a multi-faceted approach involving lifestyle modifications, medication, and regular blood glucose monitoring. In order to avoid and control diabetes, it is important to follow a balanced diet, exercise regularly, manage your weight, and de-stress. [4]. Medications such as insulin and oral hypoglycaemic agents are

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administered based on the specific needs of the individual. Ongoing research focuses on improving the understanding, diagnosis, and treatment of diabetes. The amount of glucose present in a blood sample can be utilized for diagnosing diabetes. Table 1 lists the classifications of diabetes diagnoses.

Monitoring and controlling diabetes as well as the diagnosis of other metabolic illnesses depend on the ability to detect glucose in blood samples. Glucose in blood samples can be detected using various technologies, one of which is surface plasmon resonance. Surface plasmon resonance (SPR) is an optical technique that has revolutionized the field of biophysics and material sciences [5]. By analysing the interaction between light and matter at the nanoscale level, SPR provides valuable insights into the properties and behaviours of materials. One of the primary applications of SPR lies in the field of biochemical sensing. SPR biosensors are used to study biomolecular interactions, helping researchers understand molecular binding events, kinetics, and affinity. With its label-free and real-time monitoring capabilities, SPR has become a powerful tool for studying protein-protein interactions, DNA hybridization, drug discovery, and antibody-antigen interactions [6]. The sensitivity and specificity of SPR make it an invaluable asset for the medical and pharmaceutical industries. In the current theoretical study, the Kretschmann arrangement based on the angular interrogation technique is used [7]. Plasmonic materials like metals are used in the SPR sensor. The two most widely used metals, gold (Au) and silver (Ag), have been utilized to make sensors, although it has been shown that both have weak adherence to prisms [8-13]. To improve adhesion, sensitivity, and other SPR biosensor features, thin coatings of chromium (Cr), Teflon, and indium phosphate have been applied [14]. Copper (Cu) is the most common conductor after silver and is significantly less expensive than gold and silver. Due to its rapid oxidation, Cu has not received much consideration as a plasmonic material. Recently, some researchers [15, 16] suggested that the oxidation problem with metal might be avoided by using appropriate oxide coatings. Particularly among the lanthanum oxides, cerium oxide ( $CeO_2$ ) is recognized as a significant multifunctional substance due to its usefulness in electromagnetic, electrical, photocatalytic, sensing, and other electromagnetic applications [17-19]. CeO<sub>2</sub> has a wide range

Table 1 Classification of diabetes

Category	Glucose levels in the blood after a meal (mM)			
Healthy	< 8.0			
Pre-diabetes	7.80-11.10			
Diabetes	>11.110			

of physical and physical properties, such as semiconductor performance, 3.2 eV band spacing, high oxygen storage capacity, and simple vacant movement due to the ability to transition between  $Ce^{3+}$  and  $Ce^{4+}$  oxidation states [20, 21]. Cerium oxide nanoparticles are ideal for biomolecule immobilization surfaces because of their thermal and chemical durability, low toxicity, and ease of manufacture [21-27]. According to an experimental study, 2-D materials like black phosphorus (BP) and graphene used as BREs can enhance the sensitivity and performance characteristics of SPR sensors. One of the key features of BP is that, as compared to other 2-D materials, it responds incredibly quickly [28]. This enables it to sense the concentrations of analyte in parts per billion. Graphene, WS<sub>2</sub>, and MoS<sub>2</sub> are all outperformed by graphene in terms of adsorption energy. Additionally, BP has a puckered lattice structure, which gives it a surfaceto-volume ratio that is significantly larger than that of other 2D materials [28]. BP may therefore be the best material for molecular binding. Experimental analysis has been done of the BP's electrical and optical characteristics. Cai et al. [29] conducted research indicating that the effective carrier mass, the energy band gap, and the work function exhibits variations in response to changes in the thickness of black phosphorus (BP) material. As the thickness of BP material increases, these parameters change. Notably, black phosphorus has garnered recent recognition as a highly promising medium for various applications owing to its distinctive attributes. These include a direct and customizable band gap, outstanding optical and electrical characteristics, and augmented carrier mobility, as emphasized in [29–31].

The current investigation seeks to optimize the operational characteristics of the surface plasmon resonance (SPR) biosensor for the precise detection of glucose within blood specimens. In this research article, a specialized SPR biosensor configuration, denoted as Prism FK51A/Ag/Cu/ CeO<sub>2</sub>/BP/sensing medium, has been introduced to offer an elevated level of sensitivity. This study encompasses a comprehensive assessment of all pertinent performance metrics, which have been meticulously evaluated and computationally simulated through the utilization of MATLAB 2019 software.

### Device structure and methodology

The fundamental illustration of the proposed multi-layer biosensor employing a Kretschmann configuration is depicted in Fig. 1. The structure comprises six distinct layers, sequentially arranged as follows: FK51A Prism/Metal/CeO<sub>2</sub>/BP/ Sensing media. To optimize the performance characteristics of this biosensor, all layers are meticulously engineered to possess nanometre-scale thicknesses (nm), with a working wavelength of 633 nm. Specifically, the initial layer is Fig. 1 Basic diagram of proposed SPR sensor



Table 2 RI for different glucose concentrations

Glucose concentration	1	Refrac- tive index
		(KIU)
00.0 mM	0.00%	1.3391
07.00 mM	0.13%	1.3481
12.00 mM	0.22%	1.3572
17.00 mM	0.31%	1.3671
22.00 mM	0.40%	1.3765
55.50 mM	1.00%	1.3853
111.0 mM	2.00%	1.3940
166.60 mM	3.00%	1.4014

fashioned from FK51A glass as a prism. To compute the refractive index of this prism, Eq. (1) can be employed, with  $\lambda$  denoting the wavelength in ( $\mu$ m) [32].

$$n_p = \left(1 + \frac{0971247817\lambda^2}{\lambda^2 - 0.00472301995} + \frac{0.21690141\lambda^2}{\lambda^2 - 0.0153575612} + \frac{0.904651666\lambda^2}{\lambda^2 - 168.68133}\right)^{1/2}$$
(1)

A thin layer of CeO<sub>2</sub> with a thickness of  $d_2 = 6$  nm for structure-I and 1 nm for structure-II -II and a thin layer of BP with a thickness of d3 = 0.53 nm have been placed on top of the thin layer of Ag/Cu that coats the prism's base. In a case study, BP is used over the CeO<sub>2</sub> layer to effectively detect efficient glucose in blood samples. Based on the data of people with diabetes disease, as shown in Table 2, we calculated the change in glucose concentration in this study. The RI values at various glucose concentrations were calculated using linear fitting of experimental data from earlier research [33]. The simulation starts with a baseline glucose concentration

Table 3 Values of  $\lambda_p$  and  $\lambda_c$  for Cu and Ag

Metal	Plasma wavelength $(\lambda_p)$	Collision wavelength $(\lambda_c)$	References
Cu	$1.3617 \times 10^{-7}$ mt	$4.0853 \times 10^{-7} \text{ mt}$	[16]
Ag	$1.4541 \times 10^{-7} \text{ mt}$	$1.7614 \times 10^{-7}$ mt	[35]

of 0.00 mM. Humans in good health are considered to have blood glucose levels of 7.00 mM (00.130%), while those with diabetes are considered to have blood glucose levels of 12.00 mM (00.220%) and 17.00 mM (00.310%). Here also include the variation for higher glucose concentrations, namely 22.00 mM (0.40%), 55.50 mM (1%), 111.00 mM (2%), and 166.60 mM (3%), in order to check the stability of the sensors.

The complex refractive index of metal layers has been determined using the Drude-Lorentz model using Eq. 2 [34].

$$n^{2} = \left(1 - \frac{\lambda^{2} \lambda_{c}}{\lambda_{p}^{2} (\lambda_{c} + i\lambda)}\right)$$
(2)

where  $\mathcal{V}$ ,  $\lambda p$ , and  $\lambda c$  represent distinct parameters:  $\mathcal{V}$  signifies the operational wavelength associated with the monochromatic light source, while  $\lambda p$  and  $\lambda c$  signifies the plasma and collision wavelengths, respectively (Table 3).

The material CeO<sub>2</sub> has an optimized thickness of 6 nm for structure I and 1 nm for structure II and a refractive index of 2.2. Black phosphorus (BP) has an optimized thickness of 0.53 nm and a refractive index of 3.50 + i\*0.01. Our structure can be summed up as follows: the first layer is a prism made of FK51A glass to couple the entire incident light, the second layer is a metal (Ag/Cu) layer to produce surface plasmons at the interface, the third layer is CeO<sub>2</sub> to enhance

the plasmonic effects and protect the metal against oxidation, and the fourth is BP to further enhance the sensing performance of the biosensor.

#### Theoretical modelling of the proposed biosensor

The subsequent methodologies are available for the numerical evaluation of optical attributes, encompassing transmittance and reflectance, within the context of a complex multi-layer thin film nanostructure apparatus: (a) Resultant Wave Method (b) Field Element Method(c) Transfer Matrix Method (TMM). The transfer matrix method (TMM) offers significant advantages, including exceptional accuracy, inherent simplicity, and a complete absence of approximation. Consequently, in the present study, the mathematical analysis of the N-layer model is done using the transfer matrix method (TMM) and Fresnel equations. This comprehensive approach facilitates the in-depth characterization of the electromagnetic field at both the initial and last surfaces along the tangential direction, as articulated as follows: [11]

$$\frac{H_1}{P_1} = A_{ij} \left[ \frac{H_{N-1}}{P_{N-1}} \right]$$
(3)

where  $H_1$  and  $H_{N-1}$  represent the tangential components of magnetic fields, while  $P_1$  and PN-1 denote the tangential components of electric fields for the first and *N*th surface. A is denoted as the characteristic's matrix for the amalgamated structure, which is derived through the following mathematical equation:

$$A = \prod_{k=2}^{N} A_k = \begin{vmatrix} A_{11} & A_{12} \\ A_{21} & A_{22} \end{vmatrix}$$
(4)

$$A_{k} = \begin{vmatrix} \cos \beta_{k} & -i \sin \beta_{k} / q_{k} \\ -i \sin \beta_{k} & \cos \beta_{k} \end{vmatrix}$$
(5)

Here  $\beta_k$  and  $q_k$  are

$$q_k = \frac{\left(\epsilon_k - n^2 \sin^2 \theta_1\right)^{1/2}}{\epsilon_k}, \beta_k = \frac{2\pi d_k}{\lambda} = \left(\epsilon_k - n^2 \sin^2 \theta_1\right)^{1/2}$$

where  $\theta_1$  represents the angle of incidence, while  $\lambda$  denotes the wavelength of incident light. Additionally,  $d_k$  signifies the thickness of the kth layer, and  $\epsilon_k$  represents the dielectric constant of the kth layer. The total reflection coefficient of p-polarized light  $(r_p)$  is determined as follows:

$$r_p = \frac{(A_{11} + A_{12}X_N)X_1 - (A_{21} + A_{22}X_N)}{(A_{11} + A_{12}X_N)X_1 + (A_{21} + A_{22}X_N)}$$
(6)

The reflectivity of the given multi-layer configuration is given by

$$R_p = \left| r_p \right|^2 \tag{7}$$

### **Performance parameter**

The evaluation of the performance of the surface plasmon resonance (SPR) sensor encompasses a various pivotal parameter. These parameters encompass the assessment of sensitivity (S), the measurement of the full width at half maximum (FWHM), the determination of detection accuracy (DA), and the calculation of figures of merit (FOM).

### Sensitivity

The angular sensitivity is formally defined as the ratio of the change in the SPR angle ( $\Delta\theta$ res) to the alteration in refractive index ( $\Delta n$ ). This parameter quantifies how variations in the refractive index impact the shift in the surface plasmon resonance (SPR) angle and is given as follows:

$$S = \frac{\Delta \theta_{\rm res}}{\Delta n} \tag{8}$$

#### Full width at half maxima (FWHM)

The full width at half maximum (FWHM) value serves as a critical indicator of the reflectance curve's degree of sharpness. A multitude of parameters, including detection accuracy (DA) and quality factor (QF), rely on the FWHM for their calculation, establishing it as a pivotal component in the analysis. Minimizing the FWHM value is imperative, as it contributes to enhancing the precision of various measurements. FWHM is formally defined as the width of the curve at half of its maximum amplitude and given as follows:

$$FWHM = \theta_1 - \theta_2 \tag{9}$$

#### **Detection accuracy**

It is commonly referred to as the signal-to-noise ratio (SNR). Detection Accuracy exhibits an inverse correlation with the full width at half maximum (FWHM) and is formally characterized as:

$$DA = \frac{1}{FWHM}$$
(10)

# **Quality factor**

The quality factor (Q) is formally expressed as the ratio of Sensitivity to the full width at half maximum (FWHM), and it is denoted as:

$$QF = \frac{S}{FWHM}$$
(11)

# Dip of figure of merit

The dip of the Figure of Merit is formally described as the ratio of Sensitivity to Minimum Reflectance.

$$DFOM = \frac{S}{MinimumRef \, lectance}$$
(12)

# **Results and discussion**

#### Optimization of layers thickness for SPR structure

This section studied the optimal thickness of the Ag/Cu and CeO2 layers, as their performance is influenced by the

Table 4 Different Structures number, name, and configurations

Structure number	Name	Configuration
I	Cu-CeO <sub>2</sub> -BP based SPR	Cu-CeO <sub>2</sub> -BP-sensing medium
II	Ag-CeO <sub>2</sub> -BP based SPR	Cu-CeO <sub>2</sub> -BP-sensing medium

characteristics of the upper dielectric material. The focus of this optimization lies in achieving the lowest possible value for  $R_{\min}$  [10]. A lower  $R_{\min}$  signifies enhanced light energy transfer to the surface plasmon waves (SPW), consequently enhancing surface plasmon resonance (SPR) performance. Our research encompasses two distinct structures, referred to as structure-I and structure-II, with their respective configurations outlined in Table 4 (Fig. 2).

Performance analysis of prism-based structures: optimized Ag/Cu thickness

In conventional surface plasmon resonance (SPR) structures, the primary focus of optimization on the thickness of Ag/ Cu layers and the coupling prism. Figure 3 provides a visual representation of the structural characteristics in a typical SPR configuration (FK51A Prism-Ag/Cu-sensing) with varying metal thicknesses, spanning from 35 to 55 nm with 5 nm increments. These graphical representations demonstrate asymmetry due to alterations in layer thickness and the spatial expansion of surface plasmons (SPs) within the surrounding medium. The minimum reflectance value  $(R_{\min})$ reaches its lowest point at a Cu thickness of 55 nm, registering at 0.0093, while a value of 0.001361 is observed at the Ag thickness, albeit with an increase in subsequent measurements. This reduction in  $R_{\min}$  can be attributed to minimal absorption loss and the extended spatial reach of SPs, influenced by their propagation length (PL) in the parallel direction. In summary, the optimal thickness for Cu and Ag layers in conventional SPR sensors is identified as 55 nm, effectively facilitating the excitation of higher-order SPs. The parameter denoted as 'S,' computed using Eq. (8), yields values of 141.57 degree/RIU and 129.51 degree/RIU.



Fig. 2 Reflectance versus angle for different metal film thickness to obtain optimized metal Ag and Cu thicknesses



Fig. 3 Using angular interrogation, the reflectance curves of a Cu-CeO<sub>2</sub>-BP based structure for various CeO<sub>2</sub> layer thicknesses at various Cu **a** thickness of 40 nm, **b** of 45 nm, **c** of 50 nm, and **d** of 55 nm

# Optimization of Cu, CeO<sub>2</sub> thickness for Cu-CeO<sub>2</sub>-BP structure-I

The detection technique depends on the optimized structure, hence in this section, structure-I is used to optimize the Cu and CeO<sub>2</sub> thicknesses. The structure-I's reflectance curves are shown in Fig. 3 for different Cu thicknesses (Cu: 40 to 55 nm with an interval of 5 nm) and for different CeO<sub>2</sub> layer thicknesses (CeO<sub>2</sub>: 1 to 6 nm with an interval of 1 nm). Fig.3a for Cu of 40 nm, Fig.3b for Cu of 45 nm, Fig. 3c for Cu of 45 nm, Fig. Due to its low absorption loss, the thickness of the BP layer in this section is kept constant at 0.53 nm. The variations in layer thickness that affect the SP's excitations, penetration depth, and penetration length of the sensor, the resonance dip and Rmin of the SPR curves in Fig. 3 are asymmetrical. Table 5 includes the  $R_{min}$  values that were acquired for Fig. 3. Less Rmin is furnished at Cu and CeO<sub>2</sub> thicknesses of 55 nm and 6 nm, respectively. As a result, these optimized thicknesses are used to analyse structure-I for the detection of certain biological samples.

# Optimization of Ag, CeO<sub>2</sub> thickness for Ag- CeO<sub>2</sub>-BP structure-II

Similar reflectance curves for the structure II are shown in Fig.4 in terms of an angle. The Ag and CeO<sub>2</sub> thicknesses in this case are varied (Ag: 40–55 nm with a 5 nm interval, and CeO<sub>2</sub>: 1–6 nm with a 1nm interval). The obtained  $R_{min}$ 

**Table 5** Measurement of  $R_{min}$ values of various Cu and CeO2thickness of structure I

Cu Thickness	$R_{\min}$ values for various CeO <sub>2</sub> thicknesses						
	1 nm	2 nm	3 nm	4 nm	5 nm	6 nm	
Cu = 40  nm	0.2157	0.2184	0.2212	0.2242	0.2273	0.2304	
Cu = 45  nm	0.08641	0.08808	0.08983	0.09165	0.09352	0.0954	
Cu = 50  nm	0.01068	0.01122	0.01179	0.01239	0.013	0.01361	
Cu = 55  nm	0.008921	0.008507	0.008093	0.007687	0.007297	0.006937	

values for Fig. 4 a-d are reported in Table 6, where it is found that the Ag and  $CeO_2$  thicknesses of 50 nm and 1 nm, respectively, have the lowest  $R_{\min}$  values. To explore structure-II for the detection of biological samples, these optimized thicknesses are used. In summary, the thicknesses of Ag are 50 nm and  $CeO_2$  is 1nm.

# Performance analysis of glucose level in blood sample

In the analysis of glucose level detection in blood samples, we have plotted reflectance curves for two distinct structures, as depicted in Fig. 5. Figure 5a represents structure-I,



**Fig. 4** Ag-CeO<sub>2</sub>-BP based structure's reflectance curves using angular interrogation for various CeO<sub>2</sub> layer thicknesses at different Ag Thickness **a** Ag of 40 nm **b** Ag of 45 nm **c** Ag of 50 nm **d** Ag of 55 nm

Table 6Measurement of R<br/>minvalues of various Ag and CeO2thickness of structure-II

Ag Thickness	$R_{min}$ values for various $CeO_2$ thicknesses						
	1 nm	2 nm	3 nm	4 nm	5 nm	6 nm	
Ag = 40  nm	0.0867	0.08642	0.8621	0.08607	0.08598	0.08591	
Ag=45  nm	0.01068	0.01048	0.01031	0.01031	0.01016	0.009885	
Ag = 50  nm	0.008962	0.009212	0.009445	0.009667	0.009885	0.01011	
Ag = 55  nm	0.08087	0.08169	0.08247	0.08323	0.08398	0.08477	

while Fig. 5b pertains to structure-II. These curves exhibit non-symmetrical SPR resonance dips, full width at half maximum (FWHM), and  $R_{\min}$  values due to the excitation of surface plasmons (SPs) at the interface between the prism and the metal layer, coupled with variations in the refractive index (RI) of the sensing medium. The achieved sensitivity for blood glucose detection is remarkable, measuring 217 deg/RIU for both structure-I and structure II. Furthermore, the obtained FWHMs for structure-I and structure-II are 2.42 degrees and 2.3 degrees, respectively. Additionally, we have computed detection accuracy (DA), quality factor (QF), and dip-of-figure of merit (DFOM) using Eqs. 10-12, respectively. For structure-I, the results are DA of 0.41, QF of 89.13  $RIU^{-1}$ , and DFOM of 31,281.53, while for structure-II, we observe DA of 0.315, QF of 68.45  $RIU^{-1}$ , and DFOM of 24,213.34. The comprehensive performance analysis highlights that structure I and II are both effective in detecting glucose levels in the blood, offering impressive sensitivity (S), quality factor (QF), detection accuracy (DA), and dip-of-figure of merit (DFOM).

#### Effect of the number of BP layers

The variations in the number of BP (Black Phosphorus) layers at specific thicknesses, with Cu at 55 nm and Ag at 50 nm, are depicted in Fig. 6a and 6b. These variations in BP layers correspondingly alter the resonance angle. Consequently, there is an observable shift in the dip of the reflectance curve, resulting in an enhancement of the optimized angular sensitivity for the proposed surface plasmon resonance (SPR) sensor. This improvement extends to other performance parameters, including detection angle (DA), quality factor (QF), and detection figure of merit (DFOM). In Fig. 7a and 7b, the sensitivity of a monolayer of BP, with a fixed thickness of 50 nm for Ag and 55 nm for Cu, is detailed. Structure-I exhibits a sensitivity of 209 degrees/ RIU, while structure-II registers 151 degrees/RIU. For structure-I, the angular sensitivity increases from 209 degrees/ RIU to a peak of 217 degrees/RIU with the addition of BP layers, similarly increasing from 151 degrees/RIU to 217 degrees/RIU for structure-II. The optimized angular sensitivity is prominently depicted in Fig. 7a at 209 degrees/RIU for the monolayer but reaches a maximum of 217 degrees/ RIU for structure-I at the bilayer stage, gradually declining



Fig. 5 Reflectance curves using angular interrogation for different RIs of Glucose concentration in blood samples a Cu-CeO<sub>2</sub>-BP b Ag-CeO<sub>2</sub>-BP  $\mathbf{b}$  Ag-CeO<sub>2</sub>-BP b





Fig. 6 Reflectivity curve variation for different numbers of BP layers a Structure-I b Structure-II



Fig. 7 Sensitivity variations with different number of BP layers for the Proposed SPR sensor

thereafter. Figure 7b illustrates that the monolayer's optimized angular sensitivity is 151 degrees/RIU, whereas for structure-II, it attains a maximum of 217 degrees/RIU with seven layers before gradually decreasing. Consequently, the maximum angular sensitivity for both structures I and II are 217 degrees/RIU.

### Comparative study on performance analysis

In this section, we have conducted a comprehensive evaluation of the proposed sensor's performance in comparison to prior research efforts conducted by fellow researchers, as evidenced in Table 7. Our study reveals that the proposed approach, involving both structure-I and structure-II, exhibits enhanced capabilities in terms of sensitivity (S) and detection accuracy (DA) when compared to previously conducted work. Notably, our system achieves superior performance in the vital task of blood glucose level detection, with a sensitivity (S) of 217 degrees/RIU and 0.41 for structure I, and 217 degrees/RIU and 0.43 for structure II. Furthermore, our research marks a significant milestone by shedding light on the impressive performance of quality factor (QF) and detection figure of merit (DFOM) in the context of specific biological sample detection, a dimension not explored in previous studies. This heightened performance is quantified with a quality factor (QF) of 89.13 RIU<sup>-1</sup> and the detection figure of merit (DFOM) of 31,281.53 for structure-I, while structure-II achieves the quality factor (QF) of 75.65 RIU<sup>-1</sup>

•			0	-	
Reference	Structure	Detection of glucose level in a blood sample			
		S (deg/RIU)	DA	QF (RIU <sup>-1</sup> )	DFOM
Nurgroho et al. [31]	Prism (BK7)-Cr-Au-Sensing Medium	116.69	_	_	-
Proposed work	Prism (FK51A)-Cu-CeO2-BP-Sensing Medium	217	0.41	89.13	31,281.53
Proposed work	Prism (FK51A)-Ag-CeO2-BP-Sensing Medium	217	0.315	68.45	24,213.34

 Table 7
 The performance of the proposed work and existing work comparison on the detection of glucose in blood samples

and a detection figure of merit (DFOM) of 19,415.30. These results underscore the remarkable advancements made in our research, showcasing the potential for significantly improved detection processes in the realm of biological samples.

# Conclusions

This study presents a novel numerical modelling approach for a surface plasmon resonance (SPR) sensor designed specifically for precise glucose level measurement. The sensor utilizes a unique "Ag/Cu-CeO<sub>2</sub>-BP" structure in conjunction with an FK51A prism, employing two distinct structural configurations known as structure-I and structure-II, both incorporating the specified materials. The assessment of the sensor's performance revolves around critical parameters, including "sensitivity (S)," "detection accuracy (DA)," "quality factor (QF)," and the innovative inclusion of "dipof-figure of merit (DFOM)". Collectively, these metrics provide a comprehensive evaluation of the sensor's efficacy in detecting biological samples.

Notably, both structure-I and structure-II exhibit exceptional Sensitivity, registering 217 deg/RIU, indicative of their capability to discern even subtle changes in refractive index units (RIU). In terms of detection accuracy (DA), structure-I achieves a commendable 0.41, while structure-II closely follows with a value of 0.315, confirming their reliability in accurately measuring glucose levels. Moreover, the quality factor (QF) analysis underscores the efficiency of these structures, with structure-I achieving a high QF of 89.13 RIU<sup>-1</sup> and structure-II demonstrating a respectable QF of 68.45 RIU<sup>-1</sup>. The study introduces the novel concept of dip-of-figure of merit (DFOM), further enriching the sensor's performance assessment. Structure-I exhibits a DFOM of 31281.53, while structure-II showcases a DFOM of 24213.34, highlighting their superior capabilities.

Furthermore, a comprehensive comparative analysis reveals significant enhancements in sensitivity (S) and detection accuracy (DA) when compared to prior research, solidifying the innovative contributions of this study. The inclusion of quality factor (QF) and dip-of-figure of merit (DFOM) as evaluation criteria represents a pioneering advancement in SPR sensor technology. Consequently, this research introduces a cutting-edge numerical modelling approach for an SPR sensor featuring the "Ag/Cu-CeO<sub>2</sub>-BP" structure, tailored for precise glucose level measurement. With outstanding Sensitivity, Detection Accuracy, Quality Factor, and the pioneering inclusion of Dip-of-Figure of Merit, this sensor presents a promising and highperformance solution for the precise detection of biological materials. Its potential applications extend to the fields of biomedical and biological research, offering an innovative platform for advanced diagnostics and analyses in these critical domains.

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#### Declarations

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#### References

- American Diabetes Association, Classification and diagnosis of diabetes. Diabetes Care 38, S8–S16 (2015). https://doi.org/10. 2337/dc15-S005
- J. Aakko, T. Uomilehto, J. Aana, L. Indström, J. Ohan, G.E. Riksson, I.T.V. Alle, E.H. Ämäläinen, L.-P. Arikka, S. Irkka K Einänen -K Iukaanniemi, M. Auri, L. Aakso, A. Nne, L. Ouheranta, M. Erja, R. Astas, V. Irpi, S. Alminen, M. Atti, A. Bstract, Prevention of type 2 diabetes mellitus by changes in lifestyle among subjects with impaired glucose tolerance. N. Engl. J. Med., 344(3): 1343-1350 (2001)
- R. Varma, N.M. Bressler, Q.V. Doan, M. Gleeson, M. Danese, J.K. Bower, E. Selvin, C. Dolan, J. Fine, S. Colman, A. Turpcu, Prevalence of and risk factors for diabetic macular edema in the United States. JAMA Ophthalmol. 132(11), 1334–1340 (2014). https://doi.org/10.1001/jamaophthalmol.2014.2854
- P. Anastas, N. Eghbali, Green chemistry: principles and practice. Chem. Soc. Rev. 39(1), 301–312 (2010). https://doi.org/ 10.1039/b918763b

- J. Homola, Surface plasmon resonance sensors for detection of chemical and biological species. Chem. Rev. 108(2), 462–493 (2008). https://doi.org/10.1021/cr068107d
- J. Homola, M. Piliarik, Surface plasmon resonance (SPR) sensors (Springer Berlin Heidelberg, 2006), pp.45–67. https://doi. org/10.1007/5346\_014
- A.P. Vinogradov, A.V. Dorofeenko, A.A. Pukhov, A.A. Lisyansky, Exciting surface plasmon polaritons in the Kretschmann configuration by a light beam. Phys. Rev. B (2018). https://doi. org/10.1103/PhysRevB.97.235407
- S. Pal, A. Verma, Y.K. Prajapati, J.P. Saini, Sensitive detection using heterostructure of black phosphorus, transition metal di-chalcogenides, and MXene in SPR sensor. Appl. Phys. A Mater. Sci. Process. (2020). https://doi.org/10.1007/s00339-020-03998-1
- R. Jha, A.K. Sharma, Design of a silicon-based plasmonic biosensor chip for human blood-group identification. Sens. Actuators B Chem. 145(1), 200–204 (2010). https://doi.org/10.1016/j.snb. 2009.11.060
- S. Pandey, S. Singh, S. Agarwal, A.K. Sharma, P. Lohia, D.K. Dwivedi, Simulation study to improve the sensitivity of surface plasmon resonance sensor by using ferric oxide, nickel and antimonene nanomaterials. Optik 267, 169757 (2022). https://doi.org/ 10.1016/j.ijleo.2022.169757
- V. Yesudasu, H.S. Pradhan, R.J. Pandya, Recent progress in surface plasmon resonance-based sensors: a comprehensive review. Heliyon (2021). https://doi.org/10.1016/j.heliyon.2021.e06321
- X. Dai, Y. Liang, Y. Zhao, S. Gan, Y. Jia, Y. Xiang, Sensitivity enhancement of a surface plasmon resonance with tin selenide (SnSe) allotropes. Sensors (Switzerland) (2019). https://doi.org/ 10.3390/s19010173
- V.E. Bochenkov, M. Frederiksen, D.S. Sutherland, Enhanced refractive index sensitivity of elevated short-range ordered nanohole arrays in optically thin plasmonic Au films. Opt. Express 21(12), 14763 (2013). https://doi.org/10.1364/oe.21.014763
- X.C. Yuan, B.H. Ong, Y.G. Tan, D.W. Zhang, R. Irawan, S.C. Tjin, Sensitivity-stability-optimized surface plasmon resonance sensing with double metal layers. J. Opt. A Pure Appl. Opt. 8(11), 959–963 (2006). https://doi.org/10.1088/1464-4258/8/11/005
- S. Singh, S.K. Mishra, B.D. Gupta, Sensitivity enhancement of a surface plasmon resonance-based fiber optic refractive index sensor utilizing an additional layer of oxides. Sens. Actuators A 193, 136–140 (2013). https://doi.org/10.1016/j.sna.2013.01.012
- J.N. Nur, M.H.H. Hasib, F. Asrafy, K.N. Shushama, R. Inum, M.M. Rana, Improvement of the performance parameters of the surface plasmon resonance biosensor using Al<sub>2</sub>O<sub>3</sub> and WS<sub>2</sub>. Opt. Quant. Electron. (2019). https://doi.org/10.1007/ s11082-019-1886-9
- M.G. Daher, S.A. Taya, I. Colak, S.K. Patel, M.M. Olaimat, O. Ramahi, Surface plasmon resonance biosensor based on graphene layer for the detection of waterborne bacteria. J. Biophotonics (2022). https://doi.org/10.1002/jbio.202200001
- G. Seong, M. Dejhosseini, T. Adschiri, A kinetic study of catalytic hydrothermal reactions of acetaldehyde with cubic CeO<sub>2</sub> nanoparticles. Appl. Catal. A General 550, 284–296 (2017). https://doi. org/10.1016/j.apcata.2017.11.023
- T.K. Mishra, A. Kumar, S.K. Sinha, B. Gupta, Wear behavior and XRD analysis of reinforced copper matrix composite reinforced with cerium oxide (CeO<sub>2</sub>). Bhupendra Gupta Mater. Today Proc. 5(14), 27786–27794 (2018)
- S. Singh, P.K. Singh, A. Umar, P. Lohia, H. Albargi, L. Castañeda, D.K. Dwivedi, 2D nanomaterial-based surface plasmon resonance sensors for biosensing applications. Micromachines 11(8), 779 (2020). https://doi.org/10.3390/mi11080779
- S. Sebastiammal, A. Mariappan, K. Neyvasagam, A.L. Fathima, Annona muricata inspired synthesis of CeO<sub>2</sub> nanoparticles and

their antimicrobial activity. Mater. Today Proc. **9**, 627–632 (2018). https://doi.org/10.1016/j.matpr.2018.10.385

- K. Fugane, T. Mori, D.R. Ou, P. Yan, F. Ye, H. Yoshikawa, J. Drennan, Improvement of cathode performance on Pt-CeOx by optimization of electrochemical pre-treatment condition for PEFC application. Langmuir 28(48), 16692–16700 (2012). https://doi.org/10.1021/la302912
- H.R. Pouretedal, Z. Tofangsazi, M.H. Keshavarz, Photocatalytic activity of mixture of ZrO<sub>2</sub>/SnO<sub>2</sub>, ZrO<sub>2</sub>/CeO<sub>2</sub> and SnO<sub>2</sub>/CeO<sub>2</sub> nanoparticles. J. Alloys Compd. **513**, 359–364 (2012). https:// doi.org/10.1016/j.jallcom.2011.10.049
- 24. Y. Wang, B. Li, C. Zhang, L. Cui, S. Kang, X. Li, L. Zhou, Ordered mesoporous CeO<sub>2</sub>-TiO<sub>2</sub> composites: Highly efficient photocatalysts for the reduction of CO<sub>2</sub> with H<sub>2</sub>O under simulated solar irradiation. Appl. Catal. B **130–131**, 277–284 (2013). https:// doi.org/10.1016/j.apcatb.2012.11.01
- K. Hamidian, A. Najafidoust, A. Miri, M. Sarani, Photocatalytic performance on degradation of Acid Orange 7 dye using biosynthesized un-doped and Co doped CeO<sub>2</sub> nanoparticles. Mater. Res. Bull. (2021). https://doi.org/10.1016/j.materresbull.2021.111206
- M. Sun, Z. Li, H. Li, Z. Wu, W. Shen, Y.Q. Fu, Mesoporous Zrdoped CeO<sub>2</sub> nanostructures as superior supercapacitor electrode with significantly enhanced specific capacity and excellent cycling stability. Electrochim. Acta (2020). https://doi.org/10.1016/j.elect acta.2019.135366
- M. Wang, M. Shen, X. Jin, J. Tian, Y. Shao, L. Zhang, Y. Li, J. Shi, Exploring the enhancement effects of hetero-metal doping in CeO<sub>2</sub> on CO<sub>2</sub> photocatalytic reduction performance. Chem. Eng. J. (2022). https://doi.org/10.1016/j.cej.2021.130987
- N. Mao, J. Tang, L. Xie, J. Wu, B. Han, J. Lin, S. Deng, W. Ji, H. Xu, K. Liu, L. Tong, J. Zhang, Optical anisotropy of black phosphorus in the visible regime. J. Am. Chem. Soc. 138(1), 300–305 (2016). https://doi.org/10.1021/jacs.5b10685
- S. Srivastava, S. Singh, A.C. Mishra, P. Lohia, D.K. Dwivedi, Numerical study of titanium dioxide and mxene nanomaterialbased surface plasmon resonance biosensor for virus sarscov-2 detection. Plasmonics (2023). https://doi.org/10.1007/ s11468-023-01874-1
- M. Pandaram, S. Santhanakumar, R. Veeran, R.K. Balasundaram, R. Jha, Z. Jaroszewicz, Platinum layers sandwiched between black phosphorous and graphene for enhanced SPR sensor performance. Plasmonics 17(1), 213–222 (2022). https://doi.org/10. 1007/s11468-021-01507-5
- B. Karki, A. Uniyal, T. Sharma, A. Pal, V. Srivastava, Indium phosphide and black phosphorus employed surface plasmon resonance sensor for formalin detection: numerical analysis. Opt. Eng. (2022). https://doi.org/10.1117/1.oe.61.1.017101
- L. Wu, J. Guo, Q. Wang, S. Lu, X. Dai, Y. Xiang, D. Fan, Sensitivity enhancement by using few-layer black phosphorus-graphene/ TMDCs heterostructure in surface plasmon resonance biochemical sensor. Sens. Actuators B Chem. 249, 542–548 (2017). https:// doi.org/10.1016/j.snb.2017.04.110
- Y. Jia, Z. Li, H. Wang, M. Saeed, H. Cai, Sensitivity enhancement of a surface plasmon resonance sensor with platinum diselenide. Sensors (Switzerland) (2020). https://doi.org/10.3390/s20010131
- H.S. Nugroho, L. Hasanah, C. Wulandari, R.E. Pawinanto, M.H. Haron, A.R.M. Zain, D.D. Berhanuddin, B. Mulyanti, P. Singh, P. Susthitha Menon, Silicon on insulator-based microring resonator and Au nanofilm Krestchmann-based surface plasmon resonance glucose sensors for lab-on-a-chip applications. Int. J. Nanotechnol. 17(1), 29–41 (2020). https://doi.org/10.1504/IJNT.2020.109348
- S. Singh, A.K. Sharma, P. Lohia, D.K. Dwivedi, Ferric oxide and heterostructure BlueP/MoSe2 nanostructure based SPR sensor using magnetic material nickel for sensitivity enhancements. Micro Nanostructures 163, 107126 (2022). https://doi.org/10. 1016/j.spmi.2021.107126

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