



# Application of Mathematical Model of Artificial Neural Network in PbO-doped SnO<sub>2</sub> Sensor for Detection of Methanol, CO and NO<sub>2</sub>

Deepak Kumar Verma<sup>1</sup>, Jitendra K. Srivastava<sup>2</sup>, Bholey Nath Prasad<sup>3</sup>, Chayan Kumar Mishra<sup>4</sup>

Assistant Professor, Dr. Rammanohar Lohia Avadh University, Ayodhya India<sup>1</sup>

Assistant Professor, Dr. Rammanohar Lohia Avadh University, Ayodhya India<sup>2</sup>

Research Scholar, Department of Physics, Integral University, Lucknow, India<sup>3</sup>

Professor & Dean, Dr. Rammanohar Lohia Avadh University, Ayodhya India<sup>4</sup>

**Abstract:** In the present work thick film SnO<sub>2</sub> sensor was fabricated on a 1"x1" alumina substrate. It consists of a gas sensitive layer (SnO<sub>2</sub>) doped with PbO, a pair of electrodes underneath the gas sensing layer serving as a contact pad for sensor. Also a heater element on the backside of the substrate was printed. The sensitivity of sensor has been studied at different temperatures (150°C-350°C) upon exposure to methanol, CO and NO<sub>2</sub> vapour and gas and found maximum at 350°C for Methanol. The structural analysis of the film was carried out by X-ray diffraction (XRD) pattern.

**Keywords:** Gas sensor, nanosized, PbO, SnO<sub>2</sub>, thick film.

## I. INTRODUCTION

Metal oxide semiconductor sensors based on electric conductivity measurement have been used extensively for gas detection. The sensing properties of the material are based on the adsorption of the gas molecules on its surface which produce changes in their conductivity [1]. The advantage of the SnO<sub>2</sub> thick film gas sensor is its high level of sensitivity, simple design, low weight and cost effectiveness. Also, these gas sensors could achieve more improved sensitivity to organic compounds by the control of particle size and addition of promoter [2,3]. Despite the high sensitivity, disadvantages such as lack of reproducibility, long term stability and selectivity for specific gases are frequently observed; moreover, the sensitivity to ambient moisture strongly interferes with the conduction mechanism. A better control of the number distribution and size of the grains and of the intergranular boundaries, together with the addition of catalysts and other promoters during preparation, can contribute in limiting the effect of the previously mentioned disadvantages [4].

Tin oxide layer used in the sensors is usually doped by other substances (Pd, PbO) as catalyst to improve the sensitivity and selectivity. It also can contribute to the generation of vacancies at lower temperatures. The chemical reaction provides oxygen vacancies which cause the change of electrical conductance of SnO<sub>2</sub> layer [5]. The effect of dopants also depend upon the processing method and target gas. The sensing properties of SnO<sub>2</sub> sensors (sensitivity, selectivity and reproducibility) depend on several factors, mainly grain size and specific surface area. Sensing mechanism of semiconducting gas sensor is based on the surface reaction of semi conducting oxide. In air, molecular oxygen is chemisorbed in the form of O<sub>2</sub><sup>-</sup>, O<sup>-</sup> or O<sub>2</sub><sup>2-</sup> depending on operating temperature and deplete electron from the surface, leading to reduction of conductivity. Upon exposure of the reducing gas to the sensor surface, the chemisorbed oxygen reacts with the reducing gas and electrons are subsequently reintroduced into the conduction band, leading to enhanced conductivity [6]. It is believed that the exposure of gas causes, only the surface properties of the grain to change but for nanosized sensor, especially when crystal dimension approaches to thickness of charge depletion layer, the change in the properties of the whole grain, not just at the surface, is observed on the gas exposure.

### 1.1 Model of a Neuron

An artificial neuron is a unit having several weighted inputs and one output. Thus, we can say that a neuron is a function of two vector variables.

A neuron with  $k$  inputs transforming a set  $X \subset \mathbb{R}^k$  of input signals (a  $k$ -neuron on  $X$ ) is a function

$$F: \mathbb{R}^k \times X \ni (\vec{w}, \vec{x}) \longmapsto F(\vec{w}, \vec{x}) = f(\langle \vec{w}, \vec{x} \rangle) \in \mathbb{R},$$



where  $w$  is a weights vector,  $\langle \cdot, \cdot \rangle$  is a real scalar product, and  $f : \mathbb{R} \rightarrow \mathbb{R}$  is called an activation function of the neuron. If  $f$  is a linear operator, then the neuron is called linear. A function is said to be a trained  $k$ -neuron on  $X$ .

$$F^* := F(w, \cdot) : X \ni \vec{x} \mapsto F^*(\vec{x}) \in \mathbb{R},$$

1.2 Mathematical model of a multilayer ANN

The proposed model is based on graph theory. Let us recall its basic definitions.

An ordered pair  $(A, E)$ , where  $A$  is a finite set of nodes and  $E \subset A \times A$  is a set of oriented edges, is said to be an oriented graph (orgraph).

Set that  $(a_i, a_j) \in E$  is the edge directed from the node  $a_i$  to the node  $a_j$ .

The nodes set power of a graph  $G$  is said to be the degree of the graph  $G$  and will be denoted by  $\delta_G$ .

Let a graph  $G = (A, E)$  be given. The power of the set  $\{a_j : (a_j, a_i) \in E\}$  is said to be an input semidegree of the node  $a_i$  and is denoted by  $\delta_{a_i}^+$ , whereas the power of the set  $\{a_j : (a_i, a_j) \in E\}$  is called an output semidegree of the node  $a_i$  and is denoted by  $\delta_{a_i}^-$ .

Orgraphs are often used in the definition of an ANN. The orgraph nodes are identified with neurons of an ANN, whereas directed edges determine inputs where the output signal from a given neuron is sent.

Assume that the following objects are given:

$G := (A, E)$  – an orgraph of a degree  $\delta_G$  such that  $\{a \in A : \delta_a^+ = 0\} \neq \emptyset$ ;

$\gamma : A \ni a \rightarrow \gamma(a) \in \{1, \dots, \delta_G\}$  – a bijection mapping;

$F$  – the set of all neurons;

$\alpha : A \ni a \rightarrow \alpha(a) \in F$ ; if  $\delta_a^+ = 0$  then  $\alpha(a)$  is a  $k$ -neuron, otherwise  $\alpha(a)$  is a  $\delta_a^+$ -neuron;

$W$  – a set indexing all inputs of neurons in the ANN;

$\beta : E \rightarrow W$  – a bijection mapping.

II. EXPERIMENTAL WORK

Pure  $\text{SnO}_2$  powder was prepared by reacting slowly  $\text{SnCl}_4 \cdot 5\text{H}_2\text{O}$  with ammonia water ( $\text{NH}_4\text{OH}$ ). After some time the white precipitate of tin hydroxide was obtained which was washed with distilled water so as to remove excess ammonia chloride. Further, the precipitate was filtered and dried in an oven at about  $150^\circ\text{C}$ . The powder thus obtained is the tin hydroxide which was calcined at  $400^\circ\text{C}$  for four hours to get the tin oxide. Doped  $\text{SnO}_2$  Powder was obtained by mechanically mixing the required amounts of  $\text{PbO}$  (1% by weight). This mixture was ball milled for 6 hours to get homogeneous powder and then sintered at  $800^\circ\text{C}$  for 2 hours in a furnace. To get a proper paste,  $\text{PbO}$ -doped tin oxide powder was mixed with lead glass powder and the organic binder (ethyl cellulose) and ball milled for 4 hours. Then  $\alpha$ -terpineol and Diethyl glycol monobutyl ether were added to the mixture and kept at  $80^\circ\text{C}$  for 24 hours. Thick film of  $\text{PbO}$ -doped was prepared by screen printing technique onto alumina substrate as shown in fig.1.

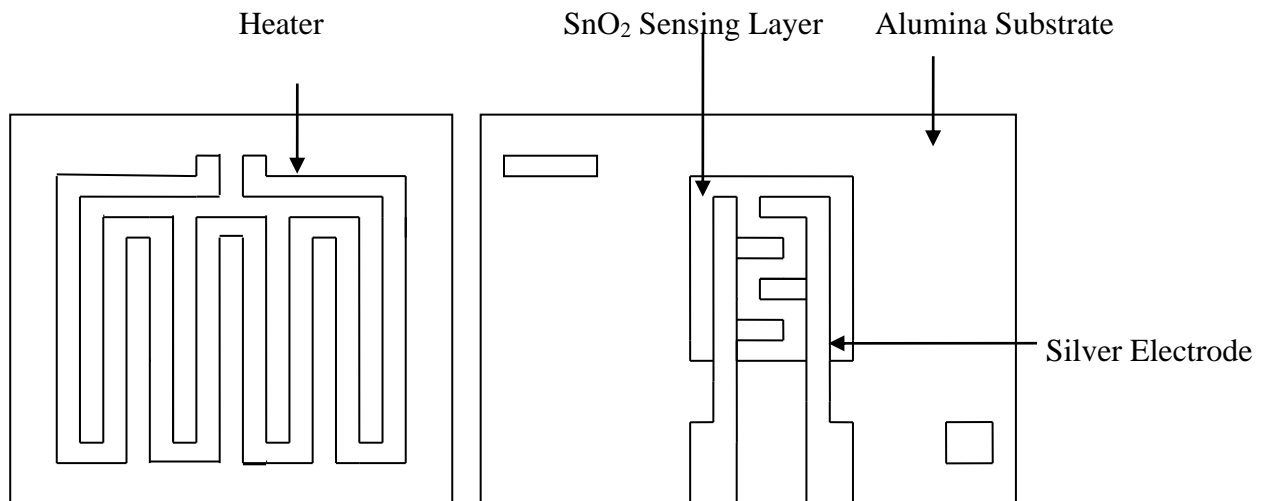


Fig.1. Schematic of fabricated sensors



The phase identification of the powder was carried out by X-ray diffraction(XRD).The prepared sensor was exposed to the varying concentration of Methanol , CO and NO<sub>2</sub> in a locally developed test chamber having volume 2047 cm<sup>3</sup> kept at metal base. The change in resistance of sensor is measured using KEITHLEY 195A multimeter. The testing was carried out in a test chamber [7] with a provision to inject the test gas. The Schematic Diagram of the measurement setup is shown in fig.2

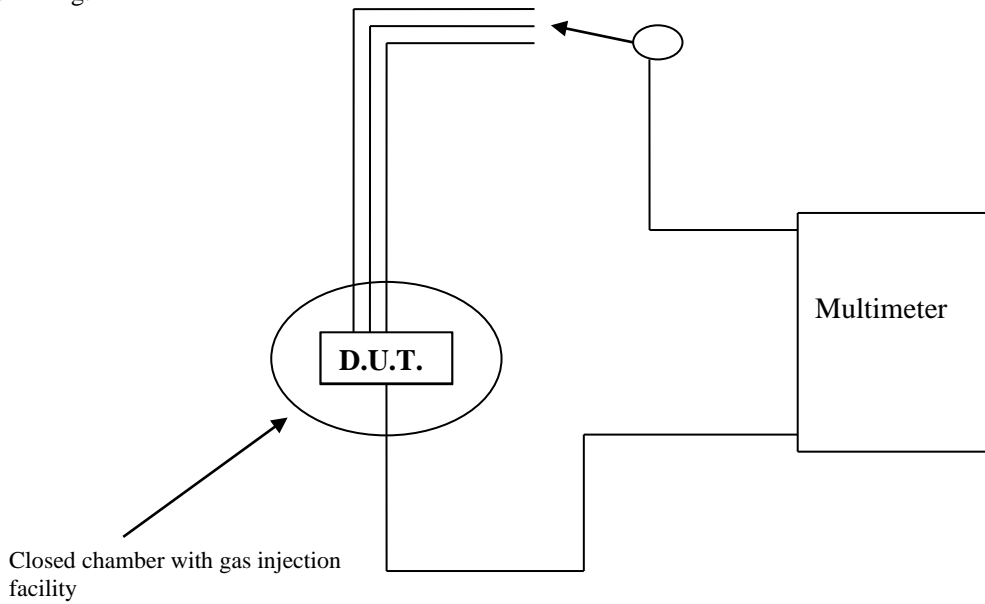


Fig. 2 Schematic diagram of measurement setup

III. RESULT AND DISCUSSION

3.1 Performance Characteristics of the Sensor

The sensitivity of fabricated sensor was studied at different fixed temperatures (150<sup>0</sup>C-350<sup>0</sup>C) with varying concentration of methanol, CO and NO<sub>2</sub> and found maximum at 350<sup>0</sup>C which is shown in fig.3.

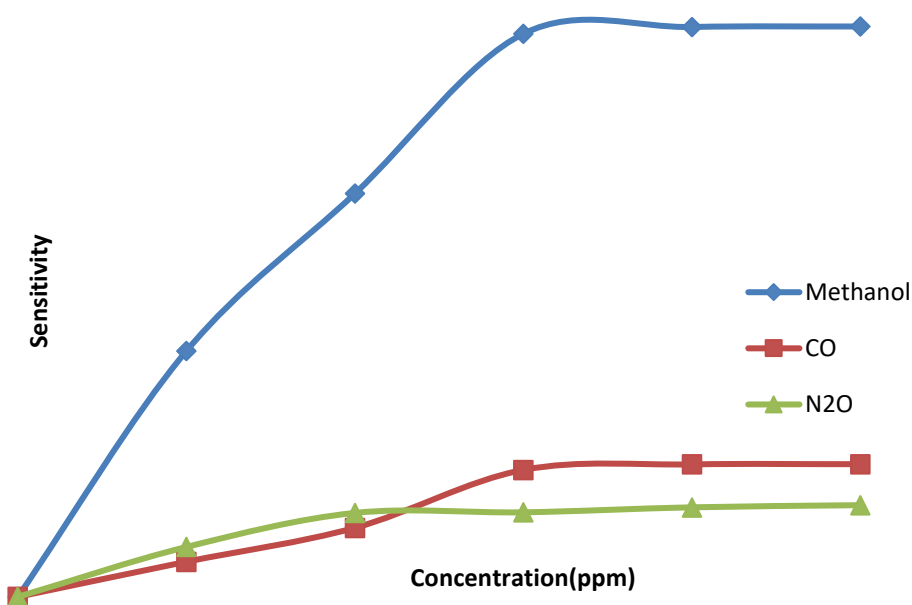
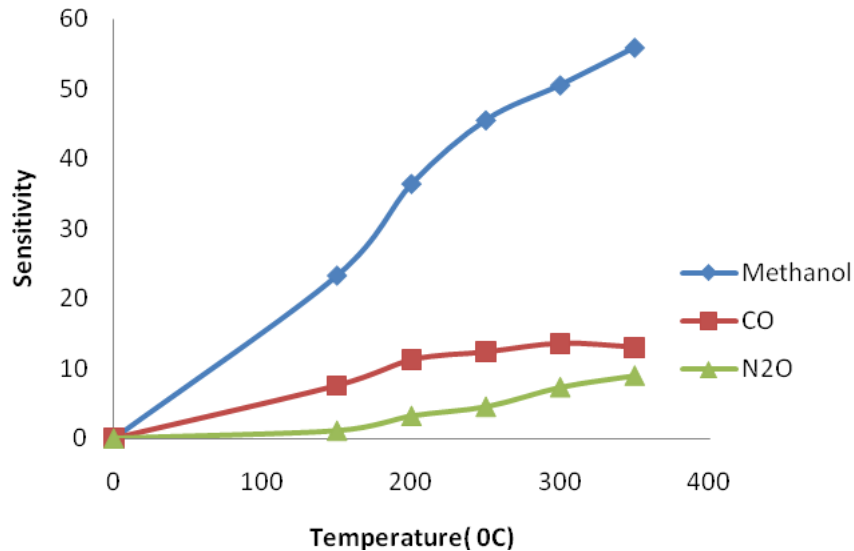


Fig.3 Response of SnO<sub>2</sub> sensors (1%, PbO doped) on exposure to methanol, CO and NO<sub>2</sub> at 350<sup>0</sup>C

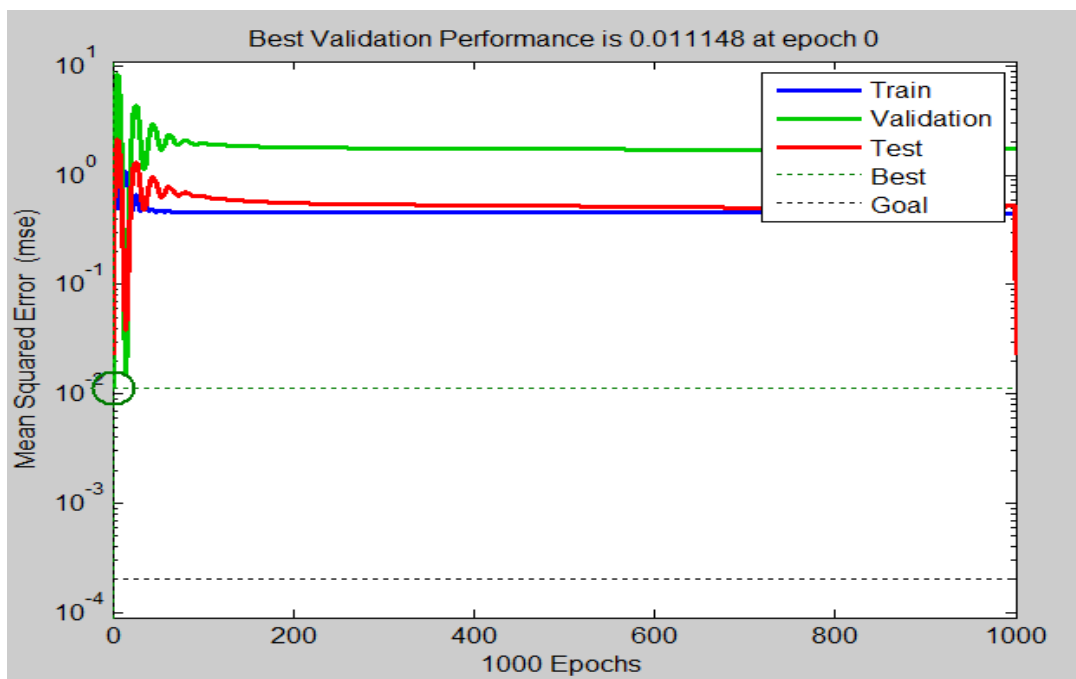


It is evident from these results that sensitivity of sensor increases initially with increase in gas concentration and attains the saturation value after some time [8]. It can be inferred from these figures that PbO-doped sensor have the maximum sensitivity at 350°C for methanol whereas for CO and NO<sub>2</sub> gas sensitivity was found to be minimum. Fig.4 shows the experimental plot of sensitivity versus operating temperature of methanol, CO and NO<sub>2</sub> at fixed concentration (500 ppm) for the sensor. It is clear from figures that sensor shows better sensitivity towards methanol than CO and NO<sub>2</sub> at 350°C.



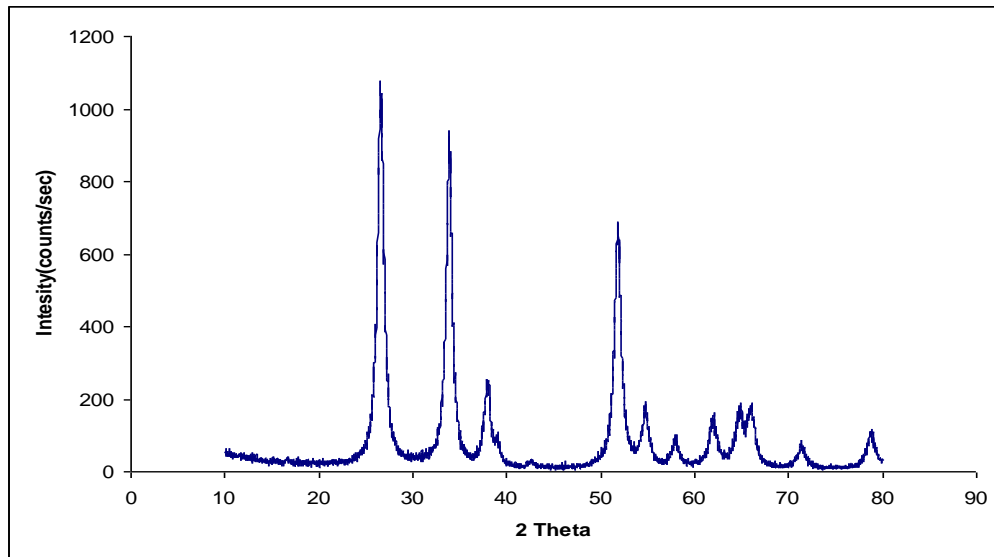
**Fig.4 Variation of sensitivity of 1% PbO-doped SnO<sub>2</sub> sensors for Methanol, CO and NO<sub>2</sub> with operating temperature for constant concentration 500 ppm**

Purelin transfer function retrieval capability of the 1 % PbO-doped SnO<sub>2</sub> based thick film gas sensor for methanol at 350°C. The validation performance goal was (0.011) achieved at zero epochs for purelin network transfer function network shown in Fig 5. The Gradient Descent Backpropagation with adaptive learning rate algorithm was used regression parameter of train data (0.97678) and output target train data (0.96097).



**Figure 5. Results of validation performance in purelin network transfer function for Methanol**

### 3.2 Structural analysis



**Fig.5 XRD Pattern of 1%PbO-doped SnO<sub>2</sub> sensor**

The XRD pattern is shown in fig.5. XRD measurement was carried using an 18 kW rotating anode (CuK $\alpha$ ) based Rigaku powder diffractometer. The observed pattern has several peaks for different angles. All the reflection peaks were indexed. The maximum of peak occurs at 26.43<sup>o</sup>. The comparison of XRD pattern with standard chart reveals that all the peaks of the pattern correspond to different plane orientations of tin oxide, confirming the tetragonal structure with lattice constant a=4.7283, c=3.1714. The maxima occur for 110 hkl values. The XRD patterns confirms the almost 90% SnO<sub>2</sub> phase with tetragonal structure. The nature of the XRD pattern does not change on substitution of PbO in the host material. The absence of peaks of PbO in XRD may be due to small amount of PbO. The crystallite size found to be 20.45 nm, when calculated from X-ray diffraction pattern using Debye Scherrer formula [11]:

$$D = 0.9 \frac{\lambda}{\beta} \cos \theta$$

Where D is the mean crystallite diameter,  $\lambda$  is the X-ray wavelength (1.54056 $\text{\AA}$ ), k is the Scherrer constant (0.90) and  $\beta$  the full width at half maximum (FWHM) of the diffraction lines.

#### IV. CONCLUSION

It is concluded that fabricated sensor doped with PbO shows better sensitivity towards methanol. PbO-doped SnO<sub>2</sub> sensor can detect methanol CO and NO<sub>2</sub> but only selective for methanol. The sensor shows maximum sensitivity at an operating temperature of 350<sup>o</sup>C for all gases. The experimental result is also validated using Artificial Neural Network. The structure of the thick film sensor was analyzed through XRD. The XRD results showed that thick film was tetragonal crystal structure of SnO<sub>2</sub>. The crystallite size was found to be 20.45 nm.

#### REFERENCES

- [1]. Cominia, M. Ferronib, V.Guidib, G. Faglia, G. Martinlib, G. Sberveglia, Sensors and Actuators B 84(2002) 26.
- [2]. J.C. Kim, H.K. Jun, J.S. Huh, D.D. Lee, Tin oxide-based methane gas sensor promoted by alumina-supported Pd catalyst, Sens. Actuators B 45 (1997) 271-277.
- [3]. C. Xu, J. Tamaki, N. Miura, N. Yamazoe, Grain size effects on gas sensitivity of porous SnO<sub>2</sub>-based elements, Sens. Actuators B 3(1991) 147-155.
- [4]. J. Robertson, Electronic structure of SnO<sub>2</sub>, GeO<sub>2</sub>, PdO<sub>2</sub>, TeO<sub>2</sub> and MgF<sub>2</sub>, J. \
- [5]. D.Kohl, " Surface processes in the detection of reducing gases with SnO<sub>2</sub>-based devices", Sensors and actuatorsB,18(1989) 71-113.
- [6]. Abhilasha Srivastava, Kiran Jain, Rashmi, A.K. Srivastava, S.T. Lakshmikummar "Study of structural and microstructural properties of SnO<sub>2</sub> powder for LPG and CNG gas sensor", Materials Chem. And Phy. 97 ,pp. 85-90,2006.
- [7]. V.N. Mishra, R.P. Agarwal, Sensitivity, response and recovery time of SnO<sub>2</sub> based thick film sensor array for H<sub>2</sub>, CO, CH<sub>4</sub>, and LPG. Microelectronics Journal 29 (1998) 861-874.
- [8]. A. chaturvedi, V.N. Mishra, R. Dwivedi, S.K. Srivastava, Selectivity and sensitivity studies on plasma treated thick film tin oxide gas sensors. Microelectronics Journal 31 (2000) 283-290.
- [9]. T. Jinkawa, G. Sakai, J. Tamaki, N. Miura, N. Yamazoe, Relationship between ethanol gas sensitivity and surface catalytic property of tin oxide sensors modified with acidic or basic oxides, J. Mol. Catal., A 155, 2000, p. 193.
- [10]. G. Neri, A. Bonavita, G. Rizzo, S. Galvagno, S. Capone, P. Siciliano, Methanol gas sensing properties of CeO<sub>2</sub>-Fe<sub>2</sub>O<sub>3</sub> thin films, Sensors and Actuators B, 114, 2006, pp. 687-695.
- [11] A.Taylor. X-ray Metallography, John Willy, New York, pp. 678- 686. 1961



- [12] Z.A. Ansari, S.G. Ansari Actuators B 87 (2002, T.Ko, J.H. Oh, Sens.) 105.
- [13] Jitendra K. Srivastava, Deepak Kumar Verma, "Development of ZnO-doped SnO<sub>2</sub> sensor for Detection of SO<sub>2</sub> and Performance Validation through Artificial Neural Network", International Journal of Computer Sciences and Engineering, Vol.9, Issue.8, pp.72-75, 2021.
- [14] Jitendra K. Srivastava, Deepak Kumar Verma, "Implementation of Artificial Neural Network for Detection of LPG through Pd-Doped SnO<sub>2</sub> Based Thick Film Gas Sensor ", International Journal for Scientific Research & Development| Vol. 9, Issue 6, 2021 , pp.412-416.

### BIOGRAPHY



**Dr. Deepak Kumar Verma** have done MCA from University of Lucknow, India in year 2011. Dr Verma has completed his Doctorate in Computer Science in the year 2016 and currently working as Assistant Professor of Computer Science in Dr Ram Manohar Lohia Avadh University, Ayodhya, India. His research interests are Artificial intelligence, data security and Software Engineering. He has published several research papers in refereed/reputed National and International journals & Conferences. He has 10 years of teaching experience and 6 years of Research Experience



**Dr. Jitendra Kaushal Srivastava** has done M.Sc. (Electronics) from Dr Ram Manohar Lohia Avadh University, India in year 2004. Dr Srivastava has completed his Doctorate in Electronics Engineering in the year 2011 from IIT-BHU and currently working as an Assistant Professor of Electronics in Dr Ram Manohar Lohia Awadh University, Ayodhya, India. His research interests are thick film gas sensor, thin film gas sensor, microelectronics devices, photonics and artificial intelligence. He has published several research papers in refereed/reputed National and International journals & Conferences. He has 11 years of teaching experience and 8 years of Research Experience.



**Bholey Nath Prasad** is presently working as research scholar in Department of Physics at Integral University, Lucknow. He had done M.Sc. in Electronics from Department of Physics & Electronics at Dr Rammanohar Lohia Avadh University, Ayodhya. His research interests are thick film gas sensor, thin film gas sensor, microelectronics devices, and artificial intelligence. He has published several research papers in refereed/reputed National and International journals & Conferences.



**Prof. Chayan Kumar Mishra** is presently working as a Professor, Department of Mathematics and Statistics in Dr. Ram Manohar Lohia Avadh University, Ayodhya. Prof. Mishra has published several research papers in various reputed/refereed national and international journals. His research area is Finsler geometry, differential geometry, and artificial intelligence. Presently he is also serving as Dean, Faculty of Science and Engineering in Dr. Rammanohar Lohia Avadh University, Ayodhya.