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Optimizing methanol synthesis from CO₂ using graphene-based heterogeneous photocatalyst under RSM and ANN-driven parametric optimization for achieving better suitability

 Ramesh Kumar,^{†a} Jayato Nayak,^{†b} Somnath Chowdhury,^c Sashikant Nayak,^d Shirsendu Banerjee,^d Bikram Basak,^{ef} Masoom Raza Siddiqui,^g Moonis Ali Khan,^{ig} Rishya Prava Chatterjee,^h Prashant Kumar Singh,ⁱ WooJin Chung,^{*j} Byong-Hun Jeon,^{id} ^{*a} Sankha Chakraborty^{id} ^{*d} and Suraj K. Tripathy^d

Assessment of the performance of linear and nonlinear regression-based methods for estimating *in situ* catalytic CO₂ transformations employing TiO₂/Cu coupled with hydrogen exfoliation graphene (HEG) has been investigated. The yield of methanol was thoroughly optimized and predicted using response surface methodology (RSM) and artificial neural network (ANN) model after rigorous experimentation and comparison. Amongst the different types of HEG loading from 10 to 40 wt%, the 30 wt% in the HEG-TiO₂/Cu assisted photosynthetic catalyst was found to be successful in providing the highest conversion efficiency of methanol from CO₂. The most influencing parameters, HEG dosing and inflow rate of CO₂, were found to affect the conversion rate in the acidic reaction regime (at pH of 3). According to RSM and ANN, the optimum methanol yields were 36.3 mg g⁻¹ of catalyst and 37.3 mg g⁻¹ of catalyst, respectively. Through the comparison of performances using the least squared error analysis, the nonlinear regression-based ANN showed a better determination coefficient (overall $R^2 > 0.985$) than the linear regression-based RSM model (overall $R^2 \sim 0.97$). Even though both models performed well, ANN, consisting of 9 neurons in the input and 1 hidden layer, could predict optimum results closer to RSM in terms of agreement with the experimental outcome.

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^aDepartment of Earth Resources & Environmental Engineering, Hanyang University, 222-Wangsimni-ro, Seongdong-gu, Seoul 04763, Republic of Korea. E-mail: bhjeon@hanyang.ac.kr

^bCentre for Life Science, Mahindra University, Hyderabad, Telangana 500043, India

^cDepartment of Chemical Engineering, NIT Durgapur, M.G. Avenue, 713209, West Bengal, India

^dSchool of Chemical Technology, Kalinga Institute of Industrial Technology, Bhubaneswar, Odisha, India-751024. E-mail: sankha.chakraborty@kiitbiotech.ac.in

^eCentre for Creative Convergence Education, Hanyang University, 222 Wangsimni-ro, Seongdong-gu, Seoul 04763, Republic of Korea

^fPetroleum and Mineral Research Institute, Hanyang University, 222 Wangsimni-ro, Seongdong-gu, Seoul 04763, Republic of Korea

^gChemistry Department, College of Science, King Saud University, Riyadh 11451, Saudi Arabia

^hRCI Office, National Institute of Technology Durgapur, M.G. Road, Durgapur, 713209, West Bengal, India

ⁱDepartment of Biochemistry, University of Lucknow, Lucknow-226007, Uttar Pradesh, India

^jDepartment of Environmental Energy Engineering, Kyonggi University, Suwon 16227, Republic of Korea. E-mail: cine23@kyonggi.ac.kr

[†] Authors have equal contributions.

1. Introduction

Amidst the worldwide growing energy crisis, fixed and dwindling stock of fossil fuels, and extreme pollution, finding acceptable means to produce alternative fuels is a significant breakthrough.^{1,2} According to experts, the exponential growth in atmospheric CO₂ concentration caused by human activity is the most severe threat biotic societies face nowadays. Human population expansion, a modern luxurious lifestyle, and significant industrial development have all increased CO₂ emissions, making this an increasingly serious issue.³ There is no better method for addressing the energy and environmental crises than by utilizing cutting-edge photocatalytic technology to convert ambient CO₂ into useable fuel hydrocarbons (such as methanol or ethanol) under solar excitation.^{4,5} Next-generation biomimetic technologies look promising because they reduce potential pollutants while also converting to low-cost hydrocarbon-based fuels, *viz.*, methanol, by using solar energy and atmospheric CO₂ as raw materials.⁶ The development of appropriate photocatalysts for the effective redox photosynthesis of CO₂ to hydrocarbons under UV/visible light, on the other hand, remains a considerable challenge.^{7,8}

