

Guest Editorial: Special Section on Cognitive Big Data Science Over Intelligent IoT Networking Systems in Industrial Informatics

I. INTRODUCTION

THE NEW frontier research era, convergence of cognitive data science methods, models with reference to the Internet of Things (IoT), and big data systems have brought about various challenges in industrial systems that need to be addressed in the current scenario. Cognitive science will lead to a high level of fluidity to analytics. This special section aims to explore the domain knowledge, reasoning of data science technologies, and cognitive methods with the IoT over the big data systems. Data science techniques have been adopted to improve the IoT in terms of data throughput, optimization, and management, and to have a major impact on the future of IoT networking systems. The main focus is the design of best cognitive embedded data science technologies to process and analyze the large amount of data collected through industrial IoT systems, and help in good decision making. Consequently, the cognitive data science research facilitates a platform to the scientific community to work for the best solution to address the challenges related to cognitive methods and data science model issues, to support IoT solutions toward smart infrastructure, and to meet the requirement of modern world.

Therefore, this special section submission is dedicated to provide a sampling of the wide spectrum of cognitive computing paradigms, making decisions at an industry or organization happening at all the levels of data science applications. We received nearly 80 manuscripts for this special section, of which nine papers have been accepted while seven papers are still under review (as of September 1, 2020). These nine accepted articles have been grouped into two thematic sections as follows:

- 1) cognitive science, and big data;
- 2) IoT networking systems.

Each manuscript has undergone a rigorous peer review process with multiple rounds of review. Section I of this Introduction introduces the accepted article related to cognitive science, and big data. In Section II, the accepted articles related to IoT networking systems are discussed. Section III is acknowledgement of this editorial.

A. Cognitive Science, and Big Data

There are four articles accepted in this thematic section. In the first article “Cognitive Optimal-setting Control of AIoT

Industrial Applications with Deep Reinforcement Learning,” Lai *et al.* proposed a practical expectation-based method for improving the industrial overfitting control of deep reinforcement learning (RL). The proposed expectation-based method can successfully decrease the degree of overfitting in cognitive computing. In their experimental study, the performance of the deep Q network algorithm, advantage learning (AL) algorithm, and the proposed expected AL method were evaluated with the four criteria: the total score, the total step, the average score, and the highest score. Compared with the AL algorithm, the total score of the proposed expected AL method was increased by 6% in the same number of trainings. This shows that the action probability distribution of the proposed expected AL method helps to achieve a better performance than the traditional soft-max strategy for the optimal control of industrial applications.

The second article “A Parallel Military Dog based Algorithm for Clustering Big data in Cognitive Industrial Internet of Things,” by Tripathi *et al.*, presented a novel method for clustering big IoT based datasets, produced from industry. The proposed method finds the optimal centroids by using the ability of trained military dogs to sense suspicious objects by their strong smell sense, and communication ability. The contribution of this article is twofold: 1) a novel meta-heuristic algorithm, inspired from trained military dogs has been introduced, 2) the optimization ability of the proposed algorithm has been tested on 17 standard benchmark functions, and the results are compared with five other state-of-the-art metaheuristics. The proposed MDBO scheme outperformed all the considered algorithms in terms of standard deviation, and fitness value of all the benchmark functions.

The third article “Cognitive Automation for Smart Decision Making in Industrial Internet of Things,” by Rathee *et al.*, introduced an efficient, and novel decision-making process to ensure smooth data transmission, and data sharing among network entities. The proposed model classifies the significant parameters using the simple additive weighting, and analytic hierarchy process method so that sensors can efficiently manage the transfer of data over the Internet. The proposed mechanism was analyzed, and validated rigorously using various sensing, and decision-making parameters against a baseline solution in industrial parameter settings. The simulation results suggested that the proposed mechanism led to 87% efficiency in terms of better detection of the sensor node, decision-making,

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and alteration of transmitted data during analyses of product manufacturing in the IIoT.

The fourth article “Compound-TCP Performance for Industry 4.0 WiFi: A Cognitive Federated Learning Approach,” by Pokhrel and Singh, designed a novel comprehensive analytic model to study the performance of long-lived Compound TCP flows over Industry 4.0 WiFi networks, while considering the correlated impacts of three types of losses at different layers of the protocol stack. The results of this study showed that using cognitive radio, and federated learning techniques in the industrial, multiple APs scenario could substantially improve the performance.

B. IoT Networking Systems

In this section, we have five accepted articles. In the first article, titled “A Directed Edge Weight Prediction Model Using Decision Tree Ensembles in Industrial Internet of Things,” by Qiu *et al.*, the authors proposed a directed edge weight prediction model (DEWP) using decision tree ensembles. It extends the local similarity indices to directed weighted networks, and extracts a series of similarity indices between nodes as features of each edge. These features are used to construct a blended regression model of random forest, gradient boost decision tree, eXtreme gradient boosting, and light gradient boosting machine. The proposed algorithm was evaluated experimentally with the Bitcoin OTC, and Bitcoin Alpha datasets by removing 10% to 90% of edges in the original network. Compared with other classical algorithms, DEWP was shown to achieve higher prediction accuracy, and robustness.

The article “Deep Residual Learning based Enhanced JPEG Compression in the Internet of Things,” by Qiu *et al.*, proposed a novel method to significantly enhance the transformation-based compression standards like JPEG by transmitting much fewer data of a image at the senders end. At the receivers end, this study propose a two-step method by combining the state-of-the-art signal processing based recovery method with a deep residual learning model to recover the original data. Therefore, in the IoT use cases, the sender like edge device can transmit only 60% data of the original JPEG image without any additional computations, but the image quality can still be restored at the receivers end like cloud servers with PSNR over 31 dB. The proposed methods could help to significantly improve the efficiency of DCT based multimedia big data transmission in IoT scenarios.

The article “A Reinforcement Learning-based Network Traffic Prediction Mechanism in Intelligent Internet of Things,” by Nie *et al.*, investigated the problem of end-to-end network traffic prediction in IIoTs for industrial applications. This study has proposed an RL-based network traffic prediction mechanism with lower computational complexity, and a smaller scale training dataset. Aiming at a small training datasets, this study took advantage of RL to predict network traffic, and proposed a Kullback–Leibler divergence-based Monte-Carlo Q-learning algorithm. The proposed RL-based network traffic prediction mechanism was evaluated with real network traffic from a testbed, and the GEANT network. According to the evaluation, the proposed mechanism could effectively predict short-term traffic.

The article “A Novel Class Noise Detection Method for High-dimensional Data In Industrial Informatics,” by Guan *et al.*, integrated the two steps, and proposed a sequential ensemble noise filter (SENF). In the SENF, relevant features are selected, and used to generate a noise score for each instance. Continuously, these noise scores guide feature selection in regression learning. Thus, the SENF falls in the scope of sequential ensemble learning. The authors evaluated the proposed approach with several benchmark datasets with high dimensionality, and considerable label noise. It is shown that the SENF is significantly better than other existing label noise detection methods.

The last article “Edge-Cloud Computing for IoT Data Analytics: Embedding Intelligence in the Edge with Deep Learning,” by Ghosh, and Grolinger, explored merging edge, and cloud computing for machine learning with IoT data with the objective of reducing network traffic, and latencies. Three scenarios were examined: all sensors together consider all the data at once, location-based scenario groups data according to the IoT device locations, and similarity-based scenario groups data according to the similarities of sensors. The evaluation was carried out on the HAR task considering two nonreversible approaches, AE, and PCA, and one nonreversible approach, vector magnitude. The results showed that data, and the corresponding network traffic could be reduced even up to about 80% without significant loss of accuracy if a large sliding window was used in the preprocessing.

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