Enhanced Spectrum Sensing Techniques for 5G New Radio (NR) and Long-Term Evolution (LTE) Utilizing Unet++ Deep Learning Network

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Abstract—The 5G New Radio (NR) technology emerged in several recent years that is the latest generation in wireless communication technology. The 5G New Radio offers significantly higher the peak data range, high-frequency, and lowlatency comparing to Long-Term Evolution (LTE). Both of them can be distinguished by the frequency range of spectrum extraction. In the recent year, the deep learning network domain introduced various cutting-edge approaches to tackle image processing in several applications such as the medical identify, spectrum sensing in signal processing, and automotive industry that utilize image segmentation techniques. In this paper, we propose the cutting-edge deep learning network base on Unet++ to enhance spectrum sensing for 5G New Radio (NR) and Long-Term Evolution (LTE) that incorporated by Unet++ and attention gate. In detail, we replaced traditional convolution by group convolution to reduce dramatically parameters of own network, around 50 percentage comparing with original Unet++ network, attention gates are applied into each skip connection to focus on the essential segmentation region in the small image. We utilize the spectrum of 5GNR and LTE dataset which were generated by MatLab 5G toolbox to evaluate own network, compare with other DeepLabv3++ and original Unet models. The accuracy of own network reached at XXX% that is higher than DeepLabv3++, Unet, Unet++ by xx%, yy%, zz%. Our implementation and pretrained model are available at: Spectrum sensing base on deep learning Github project

Index Terms—spectrum sensing, 5G New Radio (5G NR), Long-Term Evolution (LTE), signal-to-noise ratio (SNR).

I. INTRODUCTION

The 5G New Radio (NR) is the next generation of cellular network technologies, it provides the high transmission data rage and fast transmission in kinds of different frequencies that include low-bandwidth, middle-bandwidth, and high-bandwidth [?]. In particular, low-bandwidth and middle-bandwidth are popular in many countries, 3400 to 3800 MHz in Europe, 3300 to 4990 MHz in China, 3600 MHz to 4900 MHz in Japan, 3400 MHz to 3700 MHz in Korea, and 3700 MHz to 4200 MHz in United States. The 5G NR offers the long range of frequencies than fourth Long-Term Evolution (LTE), 5G NR offers a broader spectrum range, spanning from below 1GHz up to 52.6GHz, whereas LTE typically operates within the 3.5GHz to 5GHz range.

In contemporary times, the demand for wireless communication network by utilizing the limited spectrum resource increased dramatically in the recent year, it requires a fast recognition for kinds of wireless radio to apply into minimal electronic devices. In the last decade, several solutions had been proposed to discriminate the type of spectrum in wireless communication network. The paper "Intelligent Spectrum Sensing with ConvNet for 5G and LTE Signals Identification" [?] introduced a innovative methodology that utilizing deep learning network which is ConvNet built by incoporating DeepLabv3+ (an efficient encode-decoder architecture for pixel-level classification) and ResNet18 (as a backbone network for feature extraction). As the result, it reached outstanding results with global accuracy 75% and 95% at signalto-noise ratio 40db and 60db respectively [?], comparing to global accuracy 78% and 97% at signal-to-noise ratio 40db and 60db, respectively that using the enhance DeepLabV3+, which was showed by "Accurate Spectrum Sensing with Improved DeepLabV3+ for 5G-LTE Signals Identification" [?].

In the recent year, The deep learning network industry witnessed the development process of sematic segmentation, numerous robust encoder-decoder deep learning network was introduced for sematic segmentation domain that opened opportunities in image processing feild, high precision together with light weight that have ability adapt to minimal electronic devices, contributing to numberous applications related to Biomedical Image Segmentation [?], signal processing [?] [?], and medical Identification. To begin with a light wieght sematic segmentation deep learning network, Unet convolution network for Biomedical image segmentation was presented by Computer Science Department and BIOSS Center for Biological Signaling Studies, University of Freiburg, Germany in 2015 [?]. Unet was built by multiple scale convolution networks including two path encoder and decoder from highscale to small-scale image and small-scale image to highscale image connected to encoder path and decoder path respectively.

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Fig. 1. Example of a figure caption.

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ACKNOWLEDGMENT

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