

TTI Prediction in Urban Road Network Using Computer Vision Techniques

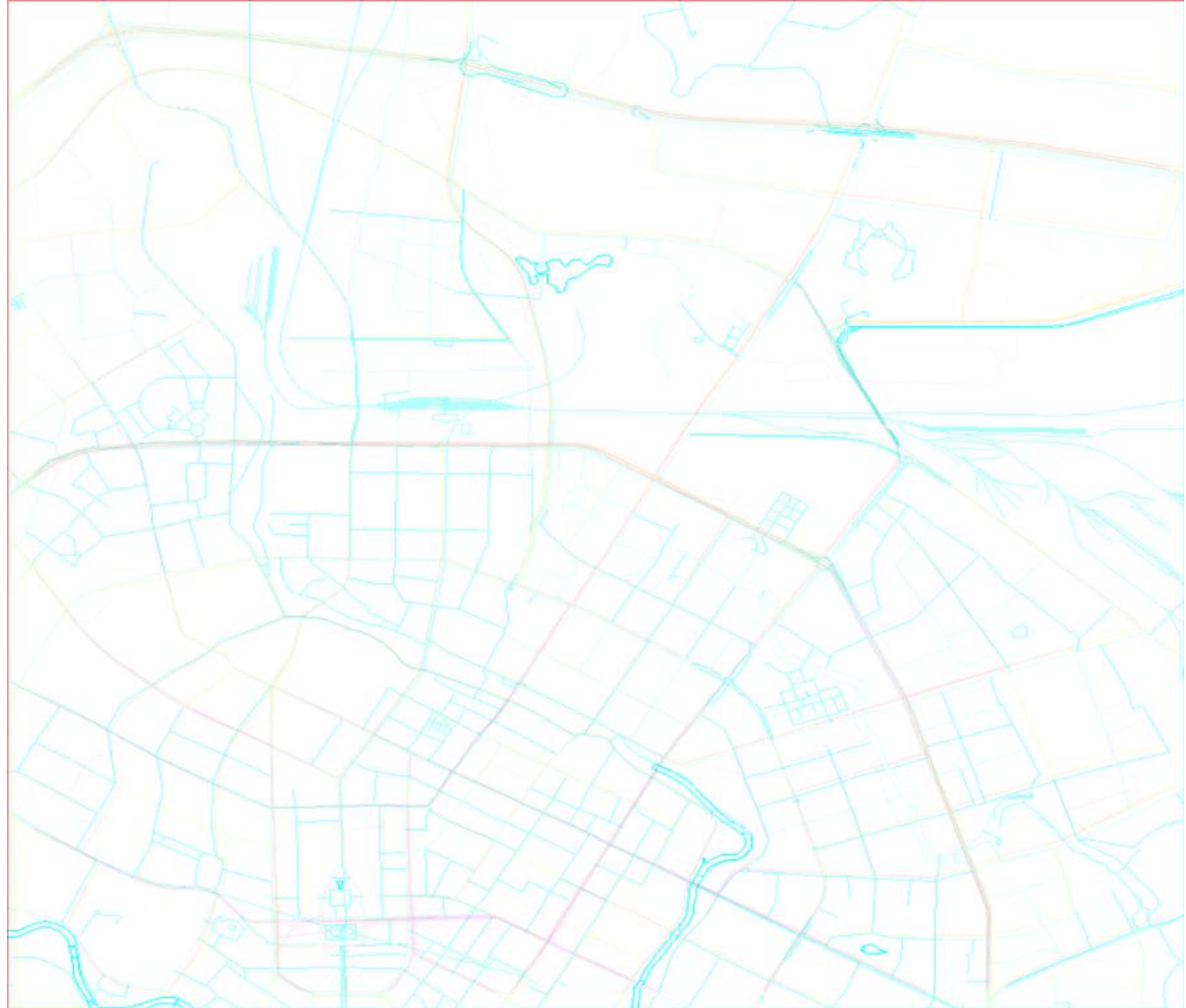
LI Xiahan

Modification

Renew the picture to white background

Renew the output from 1 to 21

Apply K-fold cross validation(now $k=5$)



Training Detail

- Dataset: Training and validation dataset: 20181013-20181017, 5 days. $\text{Len(Training)}:\text{Len(Validation)} = 4:1$. Testing dataset: 20181018, 1 days
- Prediction: Predict 20 randomly selected individual road and 1 area TTI after 10 minutes
- Converge: because of the restriction of GPU usage of Kaggle (9 hours in maximum), none of neural network converge
- Neural Network: CNN, CNN+LSTM(series connection), CNN+LSTM(parallel connection), Historical Average(as baseline)

Deep Learning Result

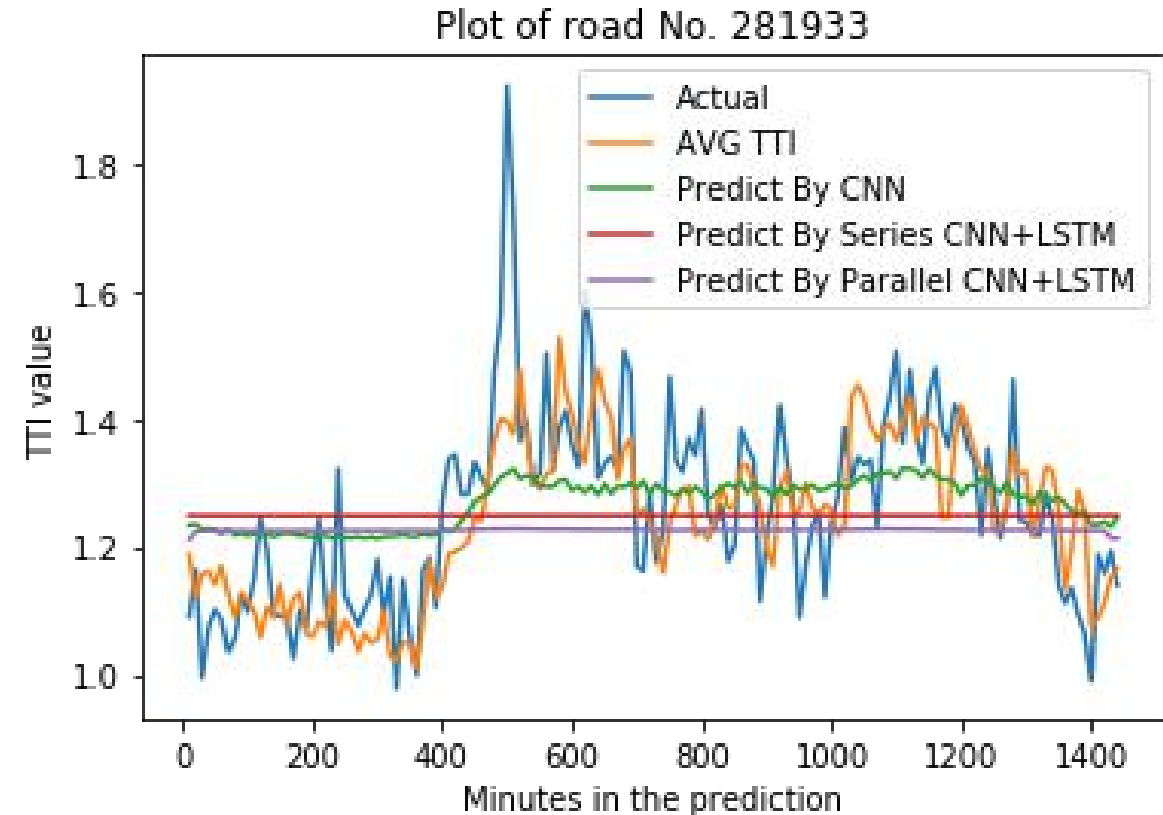
Actual: Actual TTI Value of the road

AVG TTI: Historical Average

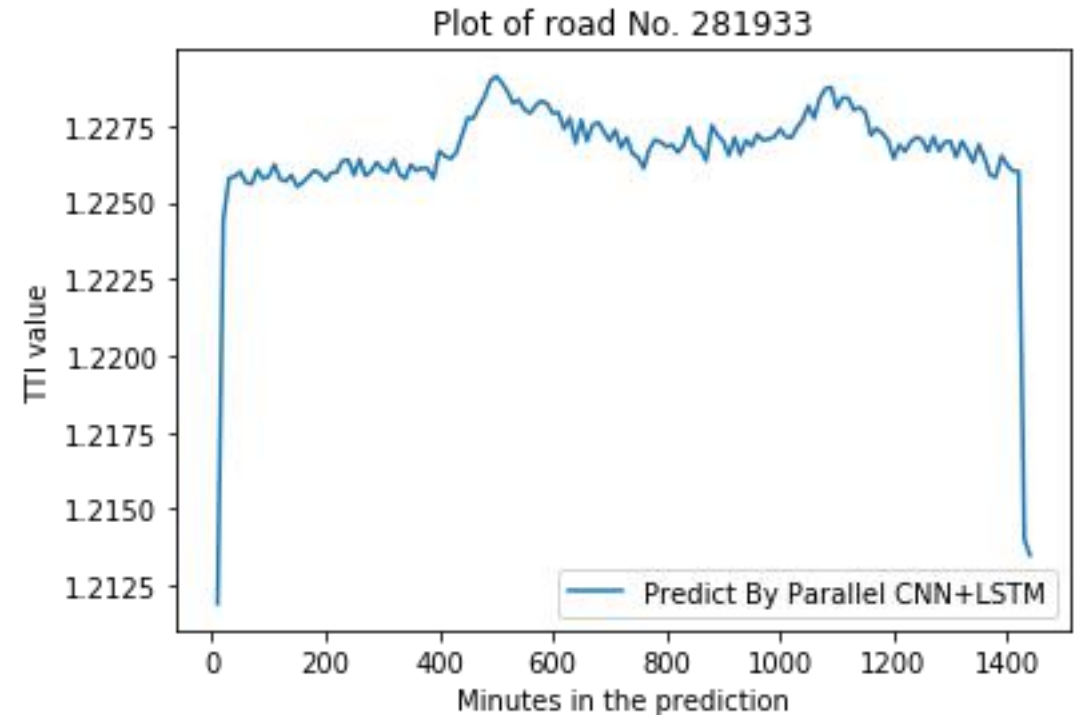
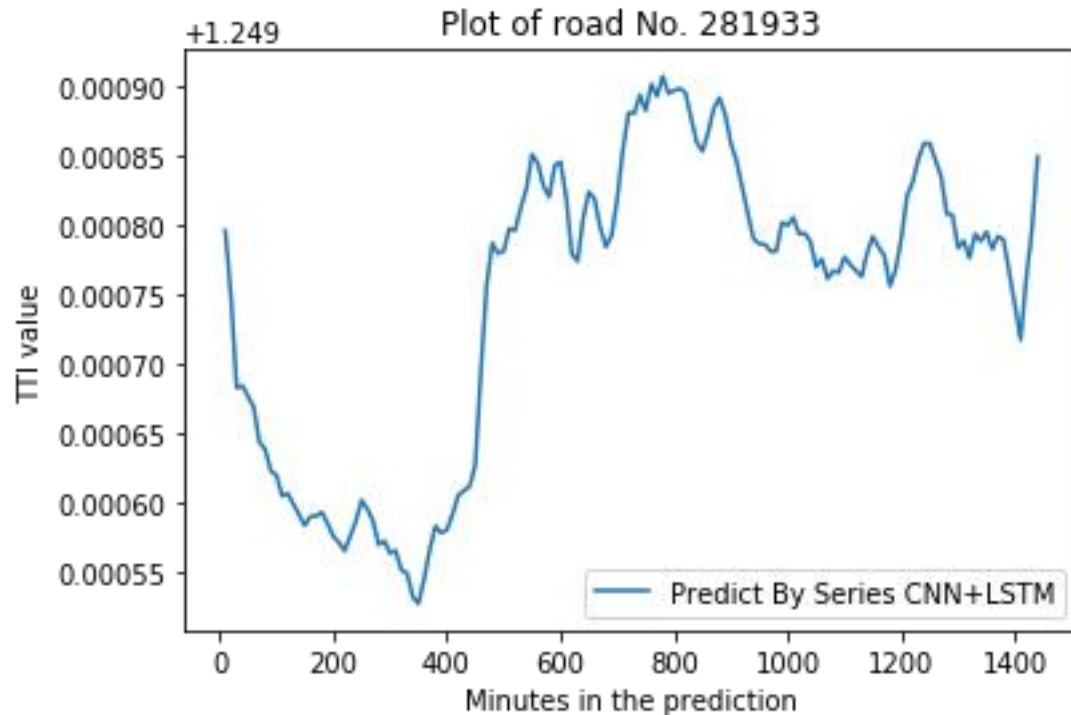
CNN: Resnet34

Series CNN+LSTM: Input of LSTM is the output of Resnet34, similar to the series connection in circuit

Parallel CNN+LSTM: Combine the output of LSTM and output of Resnet34, similar to the parallel connection in circuit



Deep Learning Result



Possible reason: LSTM is good for continuous data, but our data have 10 minutes interval, which is discrete.

Statistical Result

- Goodness of prediction:
CNN > CNN+LSTM(Series) =
CNN+LSTM(Parallel) >
Historical Average

According to MSE Loss

```
In [3]: def Loss(df1, df2):  
        total_loss = 0.0  
        for item in df1.columns.tolist()[1:]:  
            for i in range(144):  
                total_loss += abs(np.power(df1.at[i, item]-df2.at[i, item], 2))  
        print('Total Loss in Average: ', total_loss)
```

```
In [4]: cnndf = pd.read_csv(os.path.join(path, 'CNNresult.csv'))
```

```
In [5]: actualdf = pd.read_csv(os.path.join(path, 'Actual.csv'))
```

```
In [6]: cnnlstmdf = pd.read_csv(os.path.join(path, 'CNN+LSTM_result.csv'))
```

```
In [7]: cnnlstmattdf = pd.read_csv(os.path.join(path, 'CNN+LSTM+Parallel_result.csv'))
```

```
In [8]: avgresultdf = pd.read_csv(os.path.join(path, 'Avg_TTI.csv'))
```

```
In [9]: Loss(cnndf, actualdf) #MSE Loss of results predicted by CNN  
Total Loss in Average: 291.94913895356495
```

```
In [10]: Loss(cnnlstmdf, actualdf) #MSE Loss of results predicted by CNN+LSTM series connection  
Total Loss in Average: 316.96470999038377
```

```
In [11]: Loss(avgresultdf, actualdf) #MSE Loss of results predicted by Historical Average  
Total Loss in Average: 453.12626849645585
```

```
In [12]: Loss(cnnlstmattdf, actualdf) #MSE Loss of results predicted by CNN+LSTM parallel connection  
Total Loss in Average: 316.9975012693749
```

Further Plan

- Begin to write the thesis
- Add exploration data analysis part, we need to statistically explain the data to reader.