

STAR: A Concise Deep Learning Framework for Citywide Human Mobility Prediction

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Preliminary

- ▶ **Definition**¹: Human mobility is defined as the total number of humans passing through an area during a certain period.
- ▶ **Problem**²: Given the historical observations $\{X_t | t = 0, \dots, n - 1\}$ to predict X_n in the future.



(a)

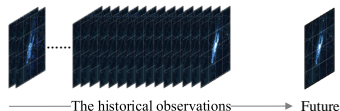


(b)



(c)

(a)



(b)

¹Zhidan Liu et al. In: *IEEE Network* (2018).

²Junbo Zhang, Yu Zheng, and Dekang Qi. In: *AAAI*. 2017.

Motivation

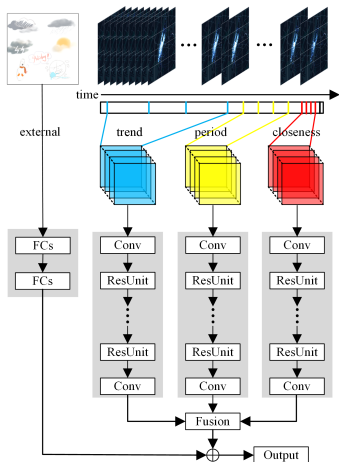


Figure: ST-ResNet

New idea

- Fusion themselves in convolution operation:

$$T_{i,j,k}^l = \sum_c \sum_m \sum_n T_{c,j+m,k+n}^{l-1} K_{i,c,m,n} \quad (1)$$

New discovery

- Temporal shifting pattern^a
e.g., The peak hours on weekdays are usually in the afternoon, but could vary from 5:00pm to 6:00pm

^aHuaxiu Yao et al. In: AAAI. 2019.

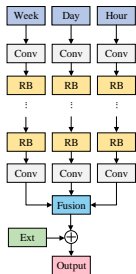
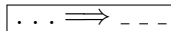
Methodology

Narrow the network (for efficiency)

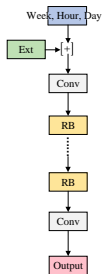
- ▶ retaining one of the networks in ST-ResNet

Increase the input information (for accuracy)

- ▶ increasing the **closeness dependents** in each period



(a) ST-ResNet



(b) STAR

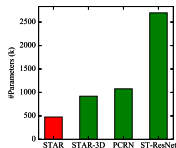
```
Q ← ∅  
for i ∈ [1, lc] do  
  Q ← Xt-i  
for i ∈ [1, lp] do  
  for r ∈ [0, lr] do  
    Q ← Xt-i × p - r  
for i ∈ [1, lq] do  
  for r ∈ [0, lr] do  
    Q ← Xt-i × q - r  
return Q
```

Algorithm 1: Select Keyframes

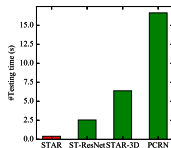
Experiment

Dataset: TaxiBJ³

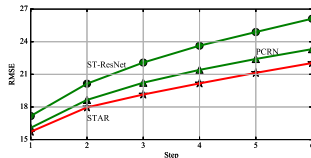
Evaluating: RMSE



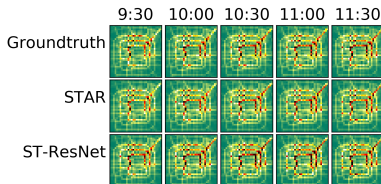
(c) #parameter



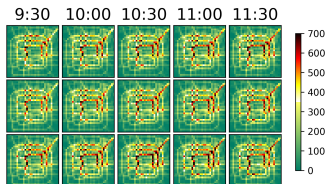
(d) #time



(e) mult-step



(f) inflow



(g) outflow

Thank You