



DeepAPP: A Deep Reinforcement Learning Framework for Mobile Application Usage Prediction

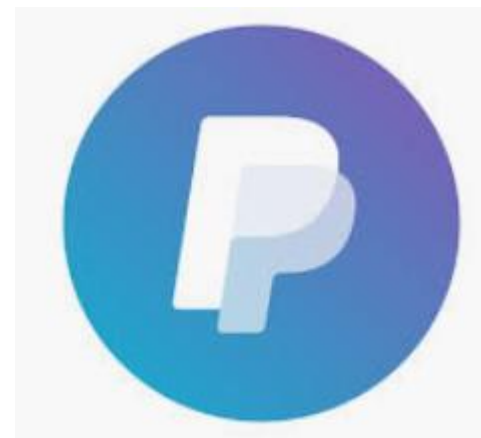
Presentation by Millie

Introduction

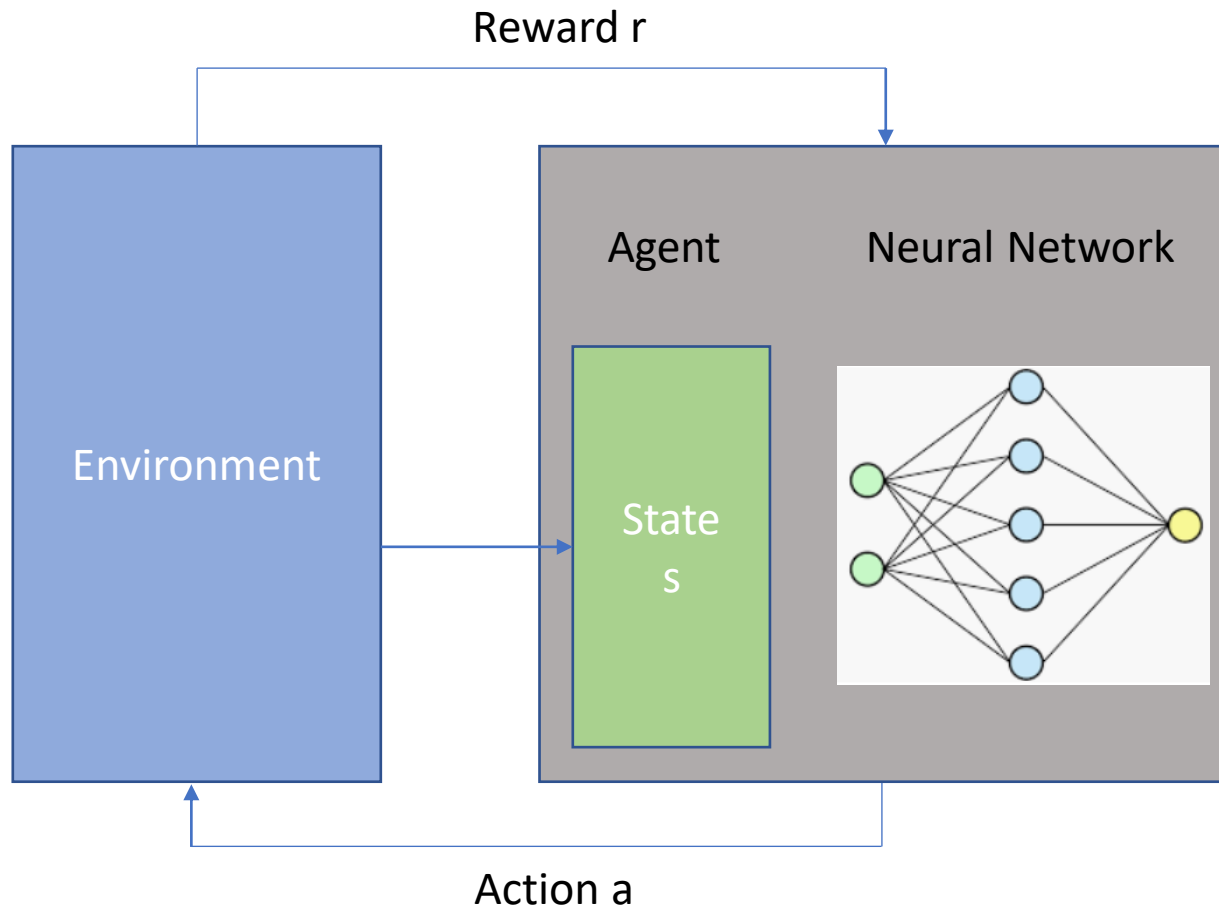
- Predicting the applications (apps) that a mobile user may use in next time slot can provide many benefits: app pre-loading ,content pre-fetching and resource scheduling.
- For instance, by knowing the apps a user may open in next 5 minutes, we can pre-load the apps in memory slightly in advance and improve user experience with minimized launch time.
- Most existing app prediction works can only provide limited prediction accuracy for some reasons.
- We develop a Deep Reinforcement Learning (DRL) framework, named as DeepAPP, to learn a data-driven model-free neural network, which takes the environment context as input and predicts the apps that will be opened next.

MOTIVATION

- Need for app prediction
 - 76.63 % thought it takes a long time from clicking on an application icon to start using the application;
 - 90.77 % are willing to use a software to reduce waiting time of application loading.



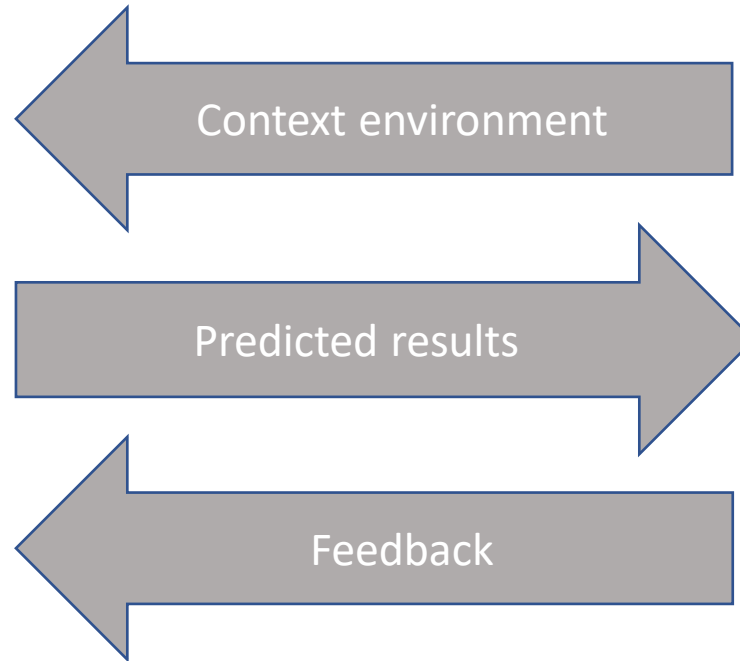
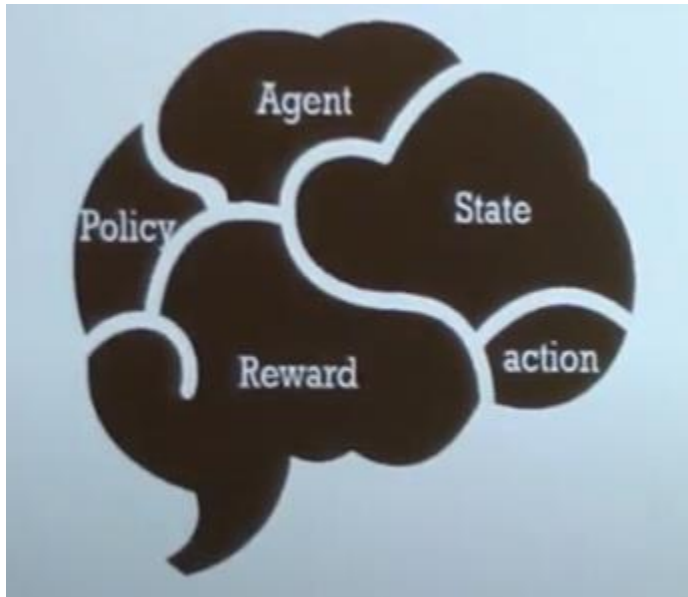
Deep Reinforcement Learning (DRL)



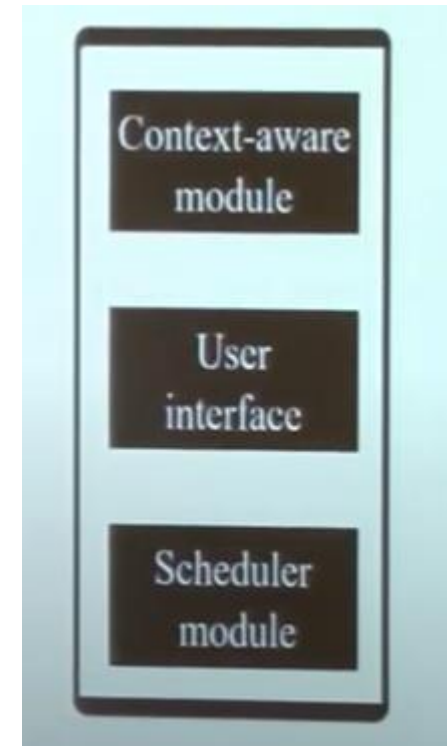
- **State:** current app, context and time
- **Action:** a combination of multiple apps
- **Policy:** a mapping from the state space to the action space

Workflow of DeepAPP

App prediction agent

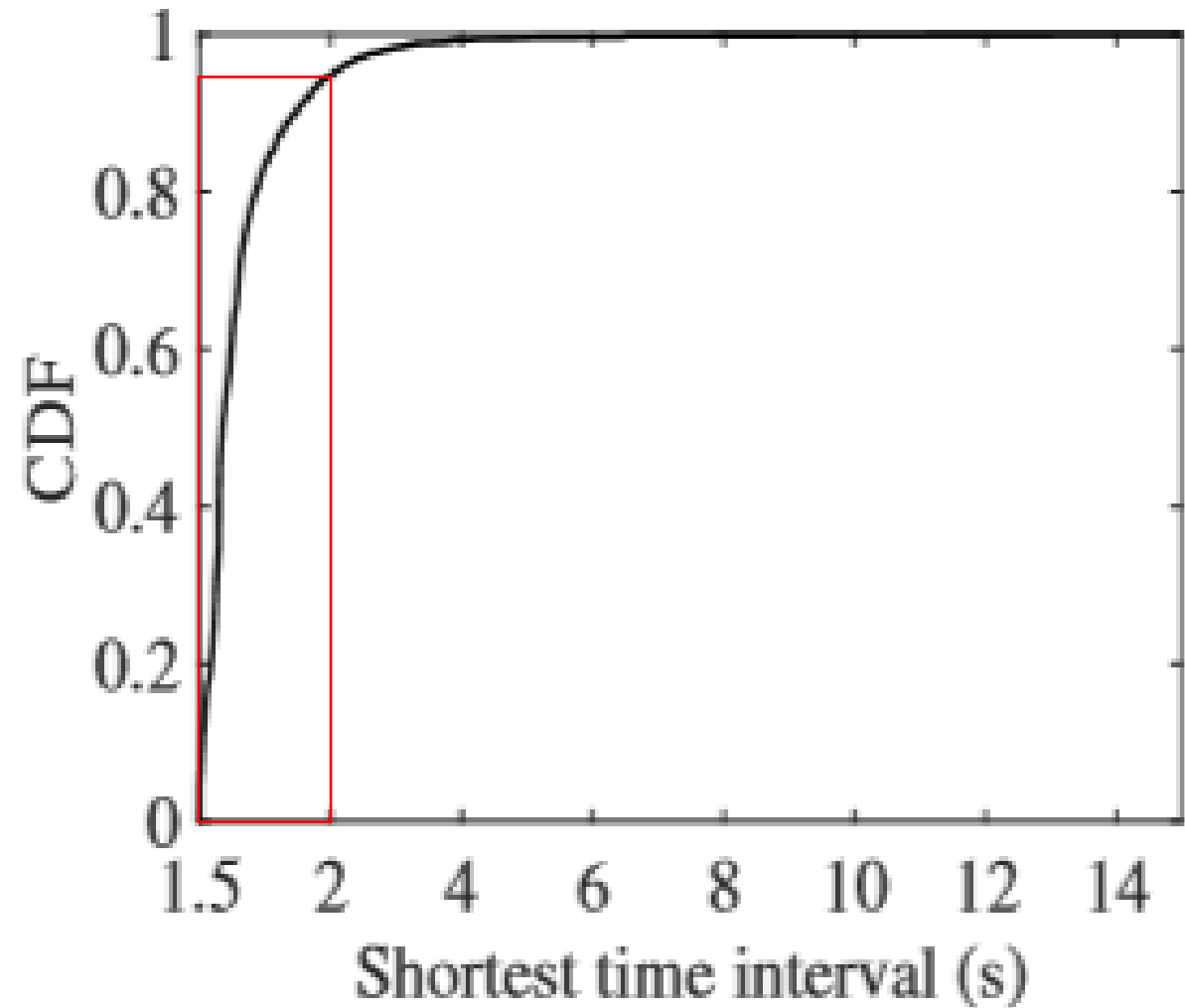


Mobile Phones

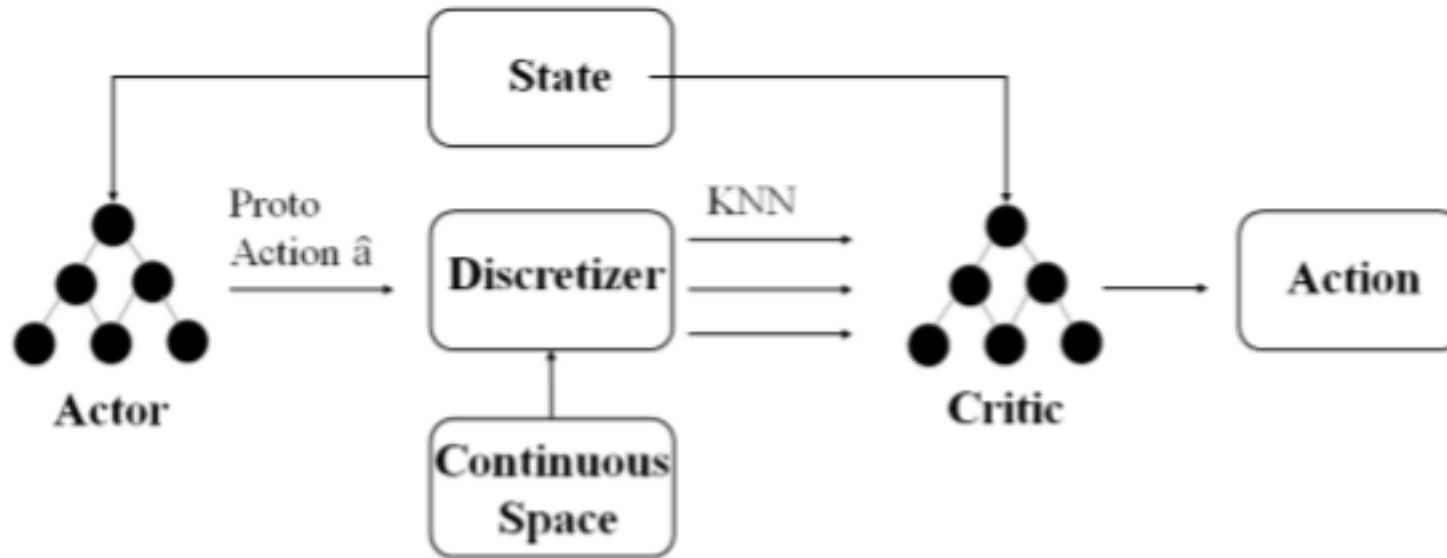


Challenge 1: Real-time prediction

- 443 random users
- 21 days
- 95% of users switched to another app in 2 seconds
- --we need real-time prediction

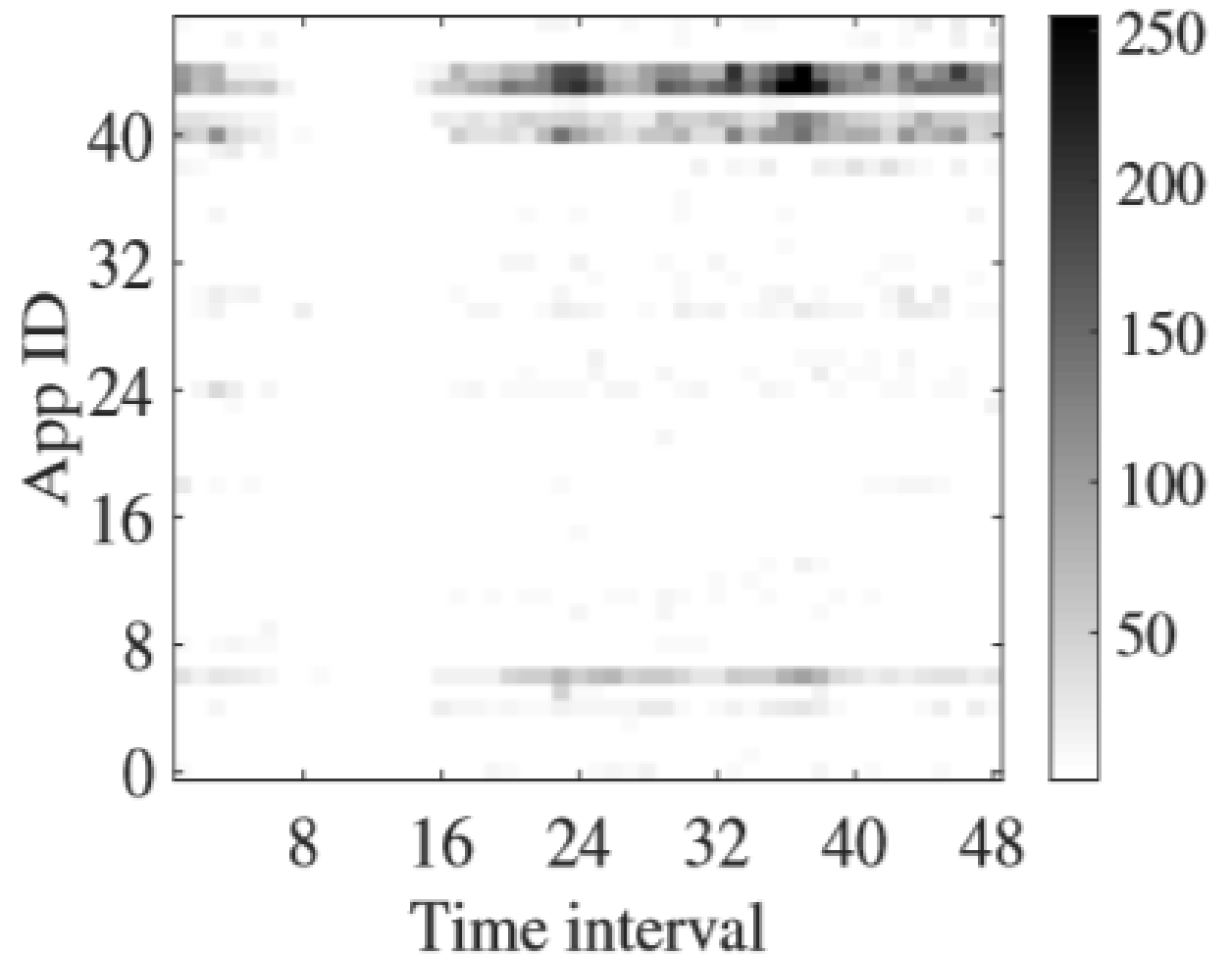


Solution – Fast Prediction

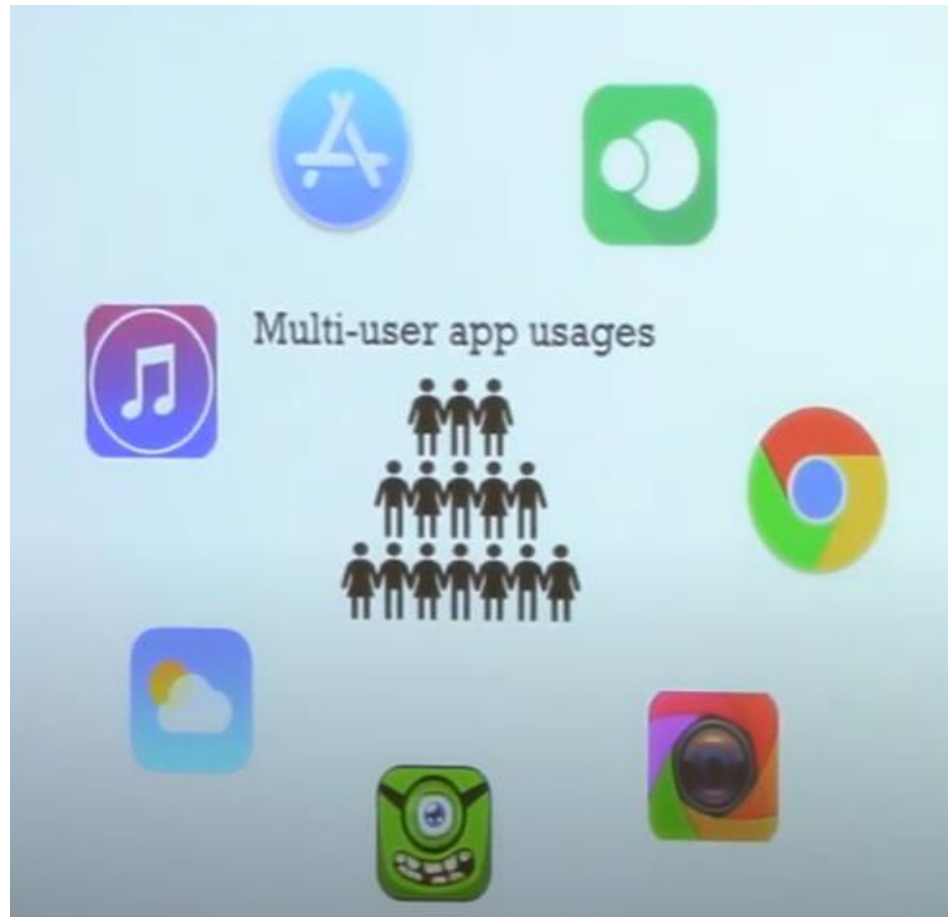


Challenge 2: sparse app usage

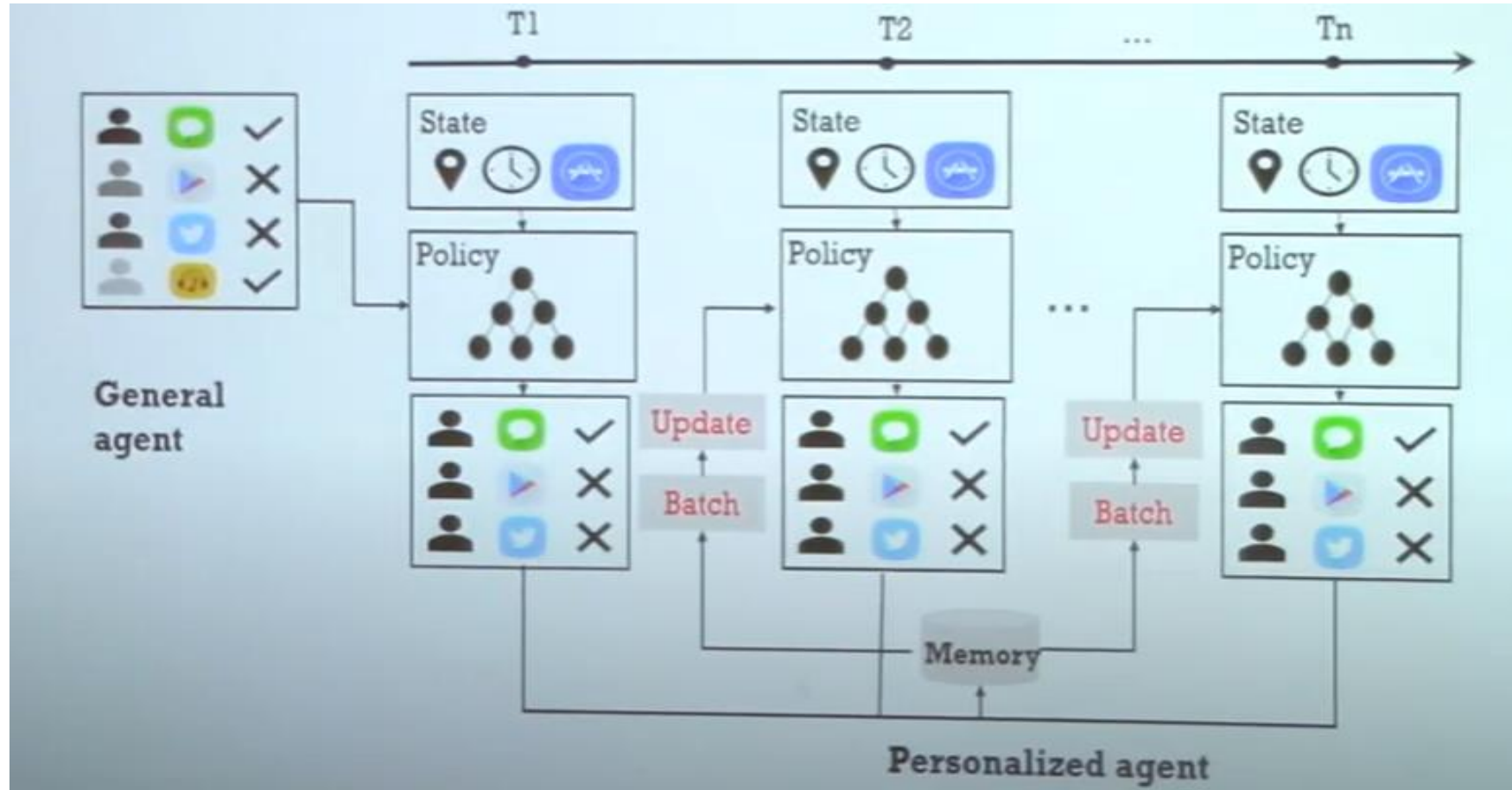
- 1 anonymized user
- 7 days
- No sufficient training data
- app usages are scattered over the time intervals. If we always predict those apps with higher frequency, this sometimes affects the performance



Solution – General & Personalized Agents



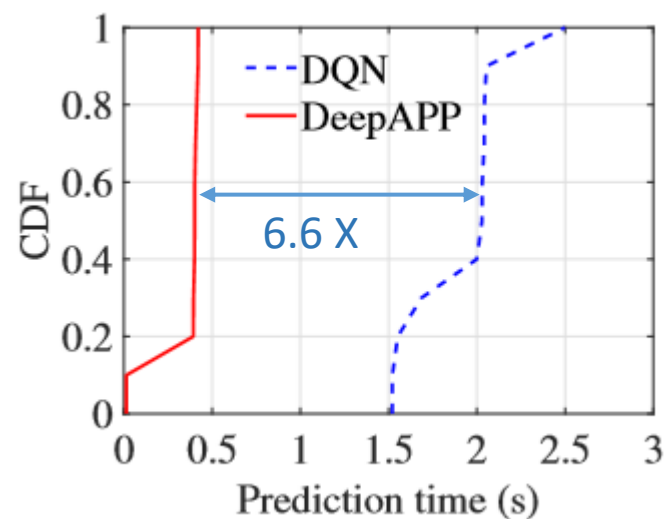
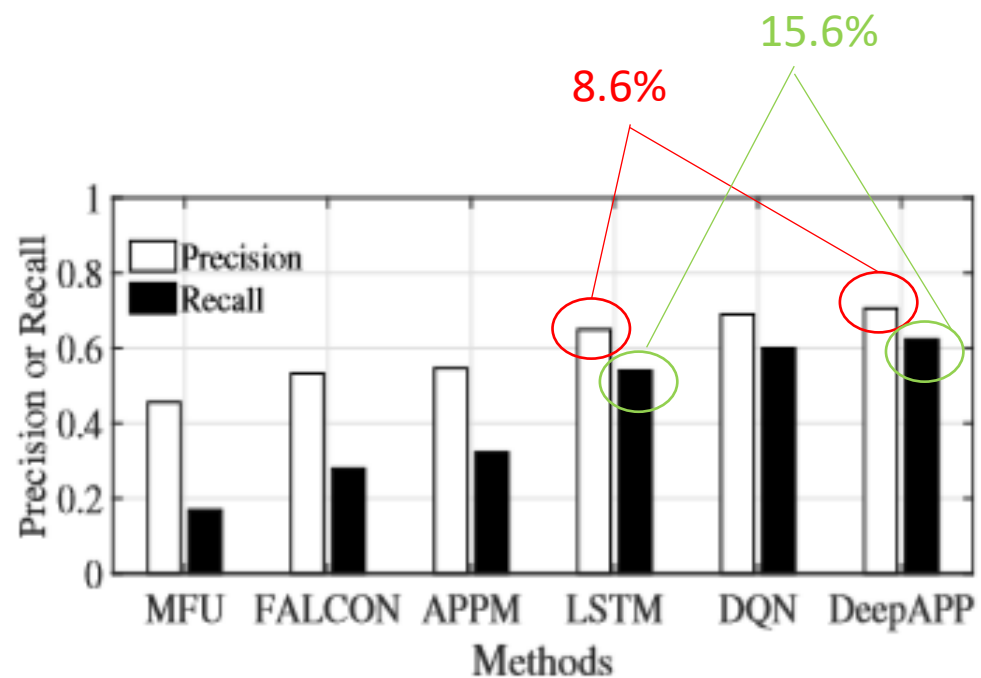
Solution – Personalized agent updating



Data-Driven Evaluation

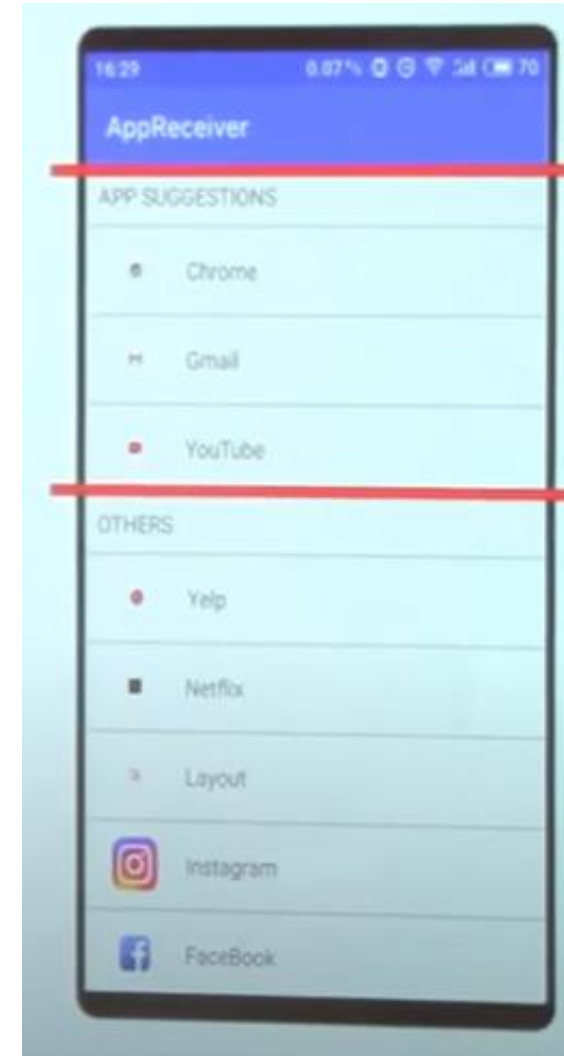
- Dataset:
 - 443 users
 - 3 weeks: 2 for training + 1 for validation
- Prediction accuracy
- Evolution of prediction accuracy over time
- Performance gain of the context-aware state

Evaluation



Field Study

- Participants:
 - 29 (13 females and 16 males)
 - Students, teachers, and employees
 - Aged from 19 to 49
 - Duration: 17 sep.2018 – 10 nov.2018
- Goals:
 - Measuring the in-field accuracy
 - Evaluating the real user experience



Results

- 87.51% of users are satisfied with our DeepApp prediction system
- 71.88% of participants agree that the DeepApp can save their time of launching apps by preloading our predicted apps into the memory.

Discussion

- Deployment cost
- Privacy issues

End

THANK YOU!