



# *Machine learning for flying robots in wireless networks*

*Prof. David Gesbert*

*Presented by: Omid Esrafilian*

*EURECOM, Sophia-Antipolis, France*

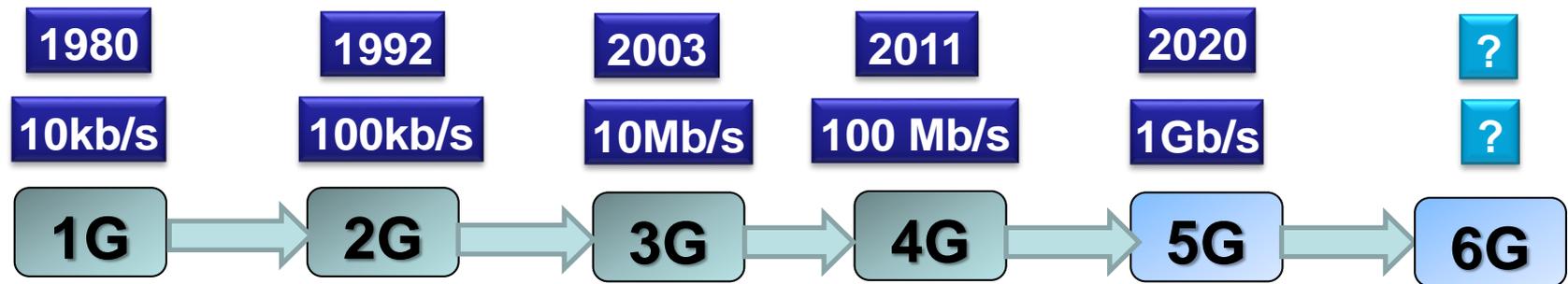
**Nov. 25, 2020 journée scientifique 3IA**

*Collaboration with Rajeev Gangula,*



# Wireless networks

- More speed is always good
- The road from 1G to 6G



Nokia Mobira



# Flying networks: The case for radio-robots



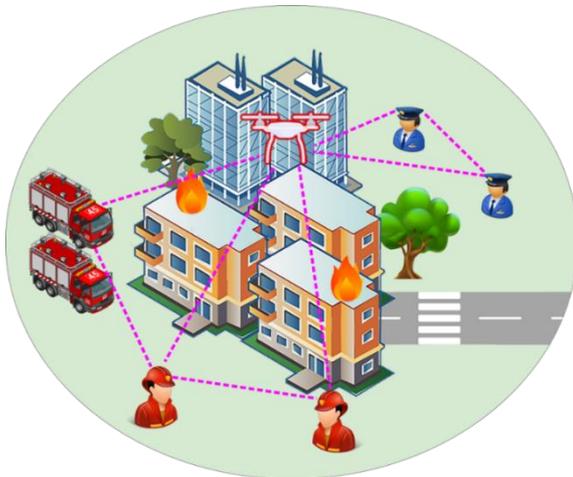
**Hot-spots, sport events, flashcrowds**



**Range extension  
Disaster recovery**



**IoT data harvesting,  
smart city, etc.**



**Peer-to-peer connectivity:  
Autonomous cars, law-enforcement**

# Autonomous Flying Radios

- **Case studies:**
  - Drone-as-a-relay
  - Drone-as-a-base station
- **Key challenges:**
  - Maintaining **good** connectivity and **wide** coverage
- **Solutions based on:**
  - *Active learning*
  - *Deep Reinforcement learning*
  - *Optimization techniques*
- **Real-world *experimentations***
  - *flying radio prototype*
  - *Customized drone*
  - *Open source radio platform (OAI)*



# Intelligent Data Harvesting

- **Worst-user throughput**

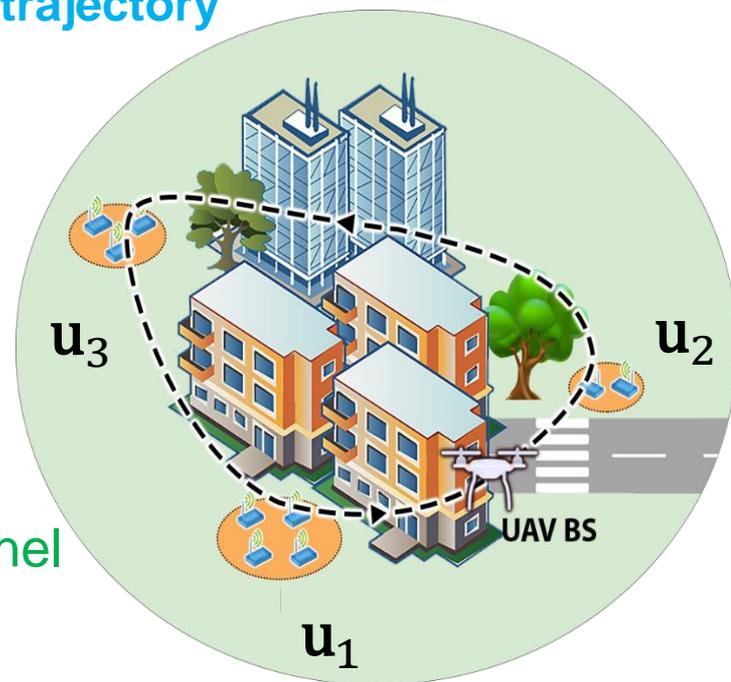
$$\begin{array}{ll} \max_{\mathcal{X}_{UAV}} & \min_k \text{rate}(\mathbf{u}_k, \mathcal{X}_{UAV}) \\ \text{s.t.} & \text{Flight Time} \leq T \\ & \text{UAV starts} = \mathbf{x}_s \\ & \text{UAV ends} = \mathbf{x}_t \end{array}$$

k-th user average throughput over the UAV trajectory

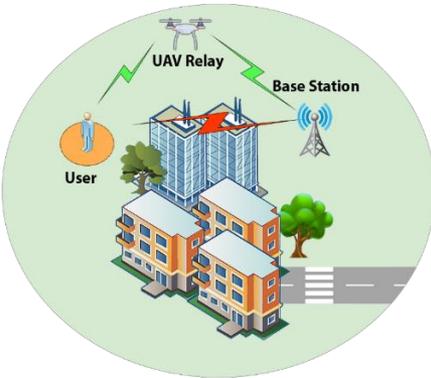
UAV trajectory

- **Need to:**

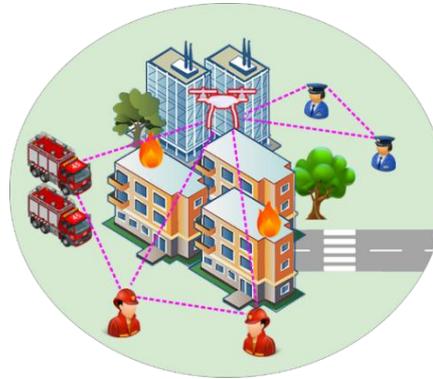
- Estimate  $\text{rate}(\mathbf{u}_k, \mathcal{X}_{UAV}) \rightarrow$  Learn the Channel
- Know user locations  $\rightarrow$  Localize the Users
- Have 3D Map information  $\rightarrow$  Learn the Map
- Generate UAV trajectory  $\rightarrow$  Optimize the Trajectory



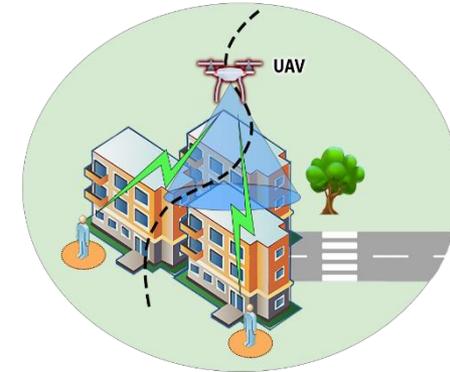
# Real World Experimentations (Online Videos)



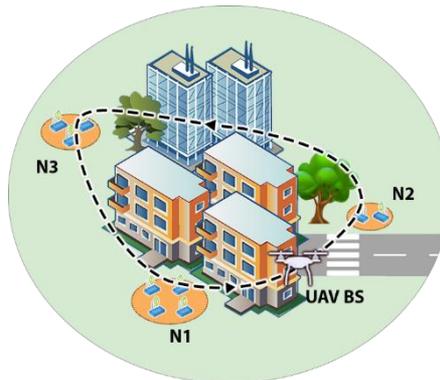
**Autonomous  
Relay Placement  
In LTE networks**



**Autonomous  
UAV Placement  
In mesh network**



**Map Reconstruction  
Using  
Depth and Radio data**



**Intelligent  
Data Harvesting  
for IoT**



**UAV trajectory design  
for  
Mobile Localization**

# UAV Related Publications

---

- O. Esrafilian, R. Gangula, and D. Gesbert. "3D Map-based Trajectory Design in UAV-aided Wireless Localization Systems." IoT Journal, 2020
- O. Esrafilian, R. Gangula, and D. Gesbert. "Autonomous UAV-aided Mesh Wireless Networks." INFOCOM Workshops 2020
- O. Esrafilian, R. Gangula, and D. Gesbert. "3D-map assisted UAV trajectory design under cellular connectivity constraints." ICC 2020
- O. Esrafilian, R. Gangula, and D. Gesbert. "Learning to Communicate in UAV-aided Wireless Networks: Map-based Approaches." IoT Journal, 2018
- Bayerlein, Harald, Rajeev Gangula, and David Gesbert. "Learning to rest: A Q-learning approach to flying base station trajectory design with landing spots." Asilomar 2018.
- Bayerlein, Harald, Paul De Kerret, and David Gesbert. "Trajectory optimization for autonomous flying base station via reinforcement learning." SPAWC 2018
- O. Esrafilian, R. Gangula, and D. Gesbert. "UAV-relay Placement with Unknown User Locations and Channel Parameters", Asilomar, 2018
- R. Gangula, O. Esrafilian, D. Gesbert, C. Roux, F. Kaltenberger, and R. Knopp, "Flying Robots: First Results on an Autonomous UAV-Based LTE Relay using OpenAirInterface", SPAWC, 2018
- O. Esrafilian and David Gesbert. "Simultaneous User Association and Placement in Multi-UAV Enabled Wireless Networks.", WSA, 2018
- O. Esrafilian and David Gesbert. "3D city map reconstruction from UAV-based radio measurements.", GLOBECOM, 2017
- J. Chen, O. Esrafilian, D. Gesbert, and U. Mitra, "Efficient algorithms for air-to-ground channel reconstruction in UAV-aided communications.", GLOBECOM Workshops, 2017
- R. Gangula, P. de Kerret, O. Esrafilian, and D. Gesbert, "Trajectory optimization for mobile access point." Asilomar, 2017

A leading institution at the heart of the digital society



Thank You!

