# **Enabling 5G/6G Wireless Communications for Supporting Maritime Applications**

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## Outline of the presentation

- Personal introduction
- Maritime communication networks
- Research areas
- Conclusions
- Vision for future development

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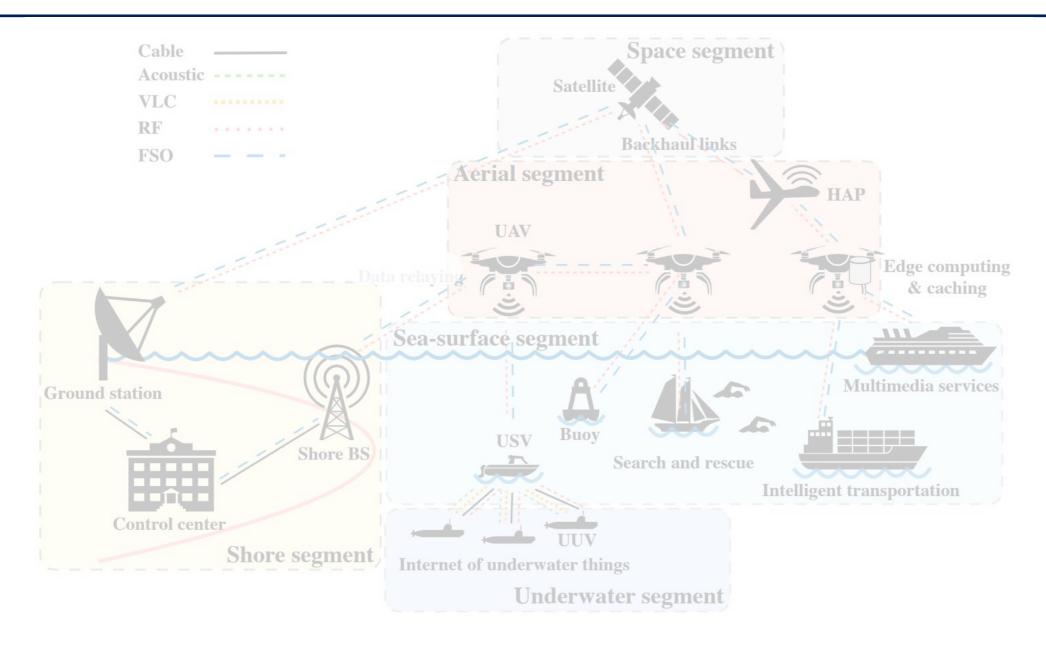
## **Background**

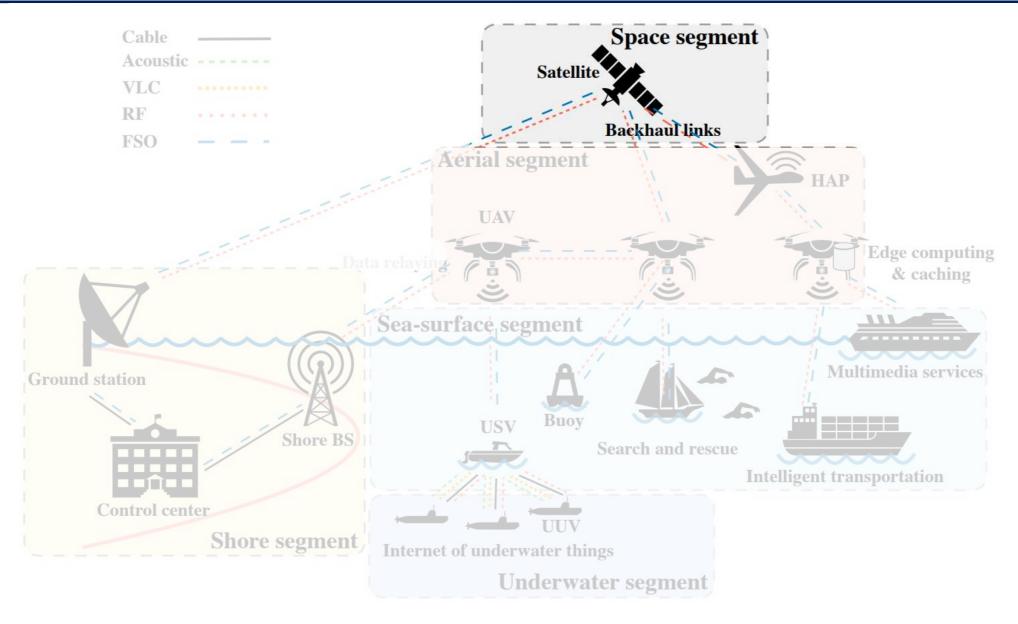
<ul> <li>Diploma "Electrical Engineering and Computer Technology," University of Patras</li> </ul>	2009
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<ul> <li>Ph.D "Spectral Efficient Cooperative Relaying with Interference Mitigation in Heterogeneous Wireless Networks," University of the Aegean</li> </ul>	2014
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<ul> <li>Post-doctoral researcher, Dept. of Information and Communication Systems Engineering, University of the Aegean</li> </ul>	2014-2020
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## Outline of the presentation

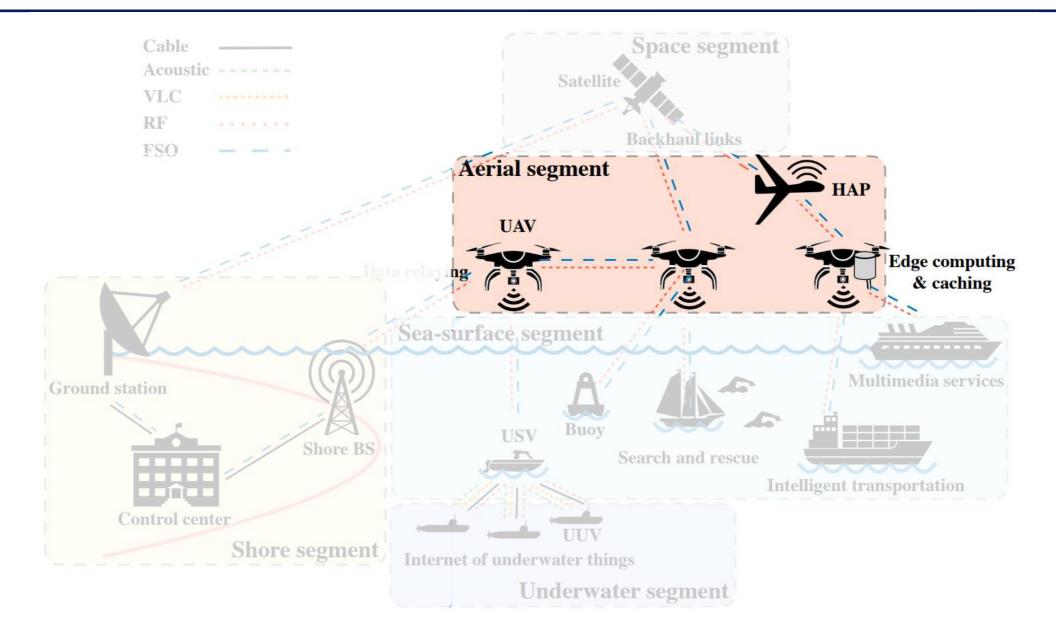
- Personal introduction
- Maritime communication networks Architecture
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- Communication technologies
- Performance targets

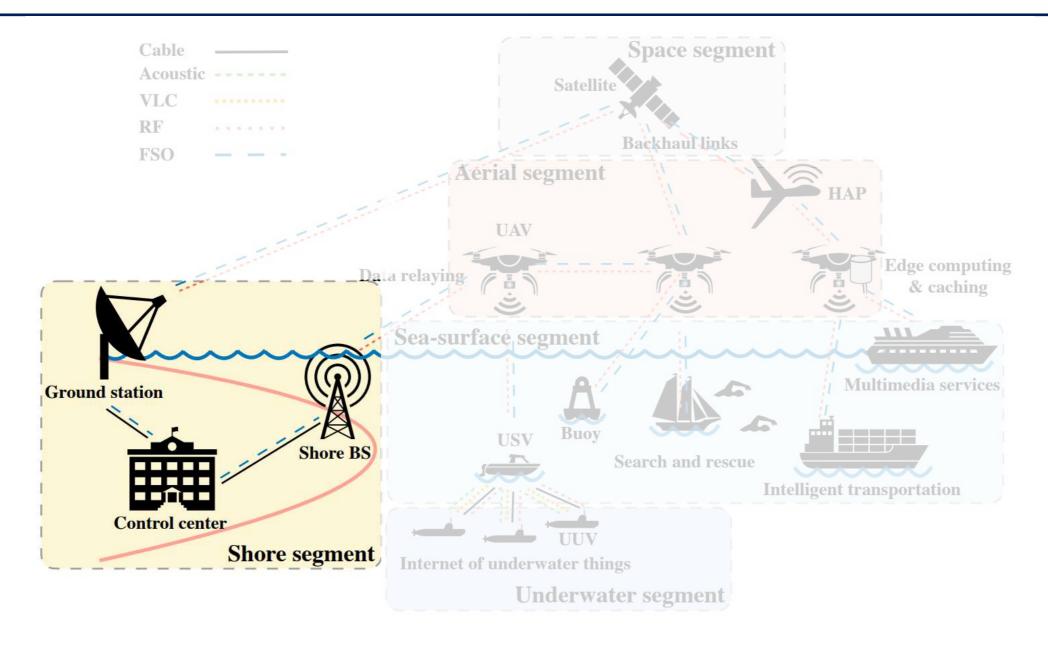




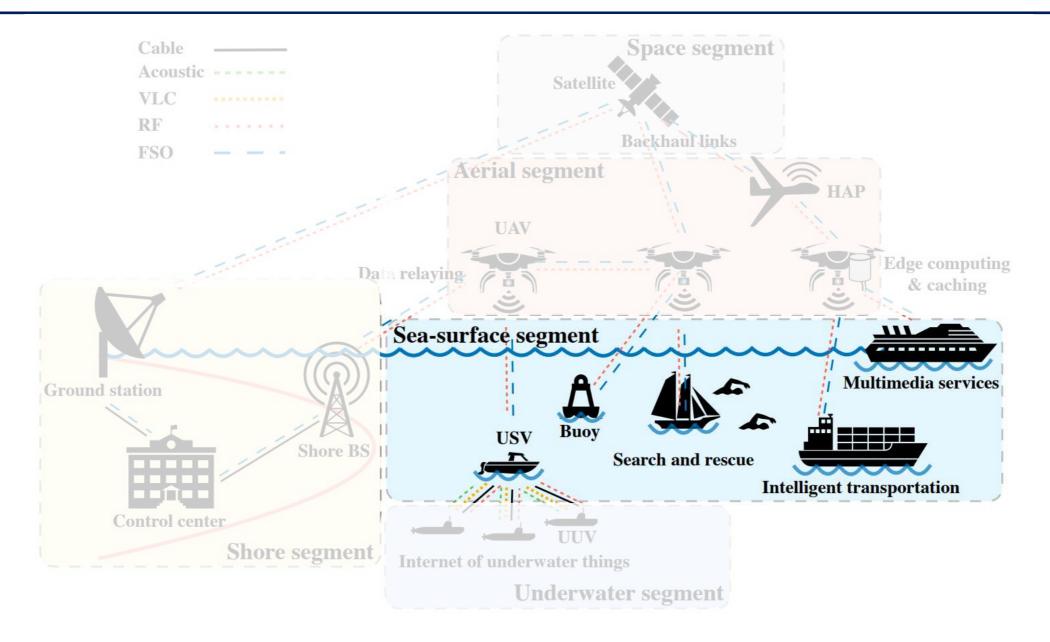
- Various satellite systems, e.g. geostationary earth orbit (GEO)-based INMARSAT and low-earth orbit (LEO) constellations, such as Starlink
- Back-up when shore BSs and aerial nodes fail to provide coverage to maritime nodes
- Backhauling/fronthauling to enable data availability across the maritime communication network (MCN)



- Different aerial node types, including unmanned aerial vehicles (UAVs) and high-altitude platforms (HAPs)
- Dynamic provision of radio-resources to remote areas, low-latency compared to satellite links, reliable multi-hop transmissions and diverse wireless paths

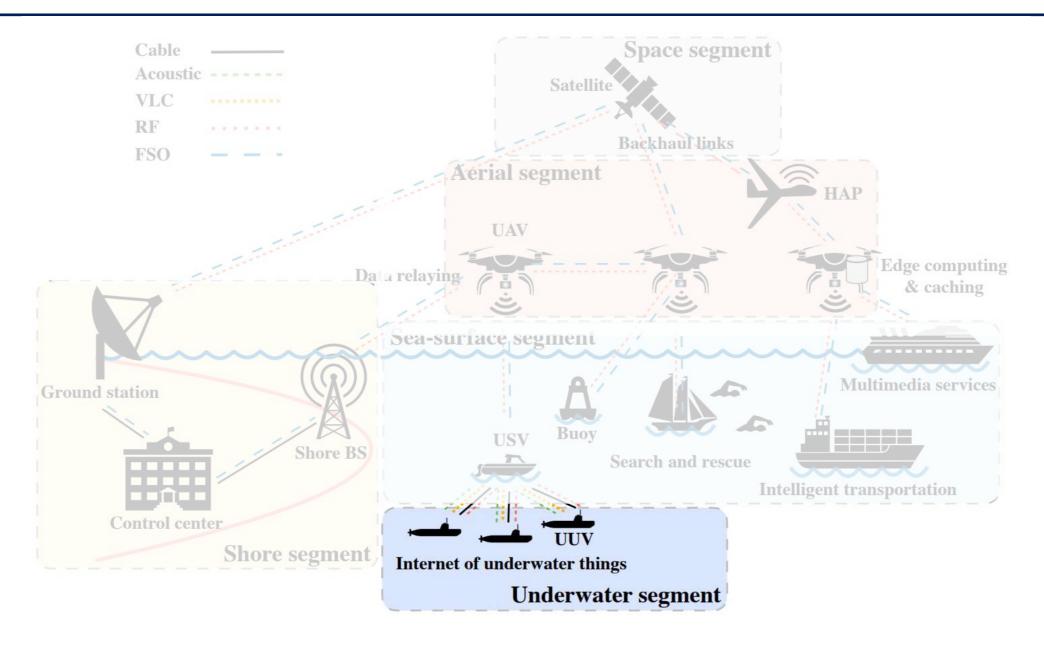


- Shore BSs provide coverage to nearby maritime nodes and UAVs, employing cellular standards
- Connectivity with the space segment allows data transmission within the broader MCN



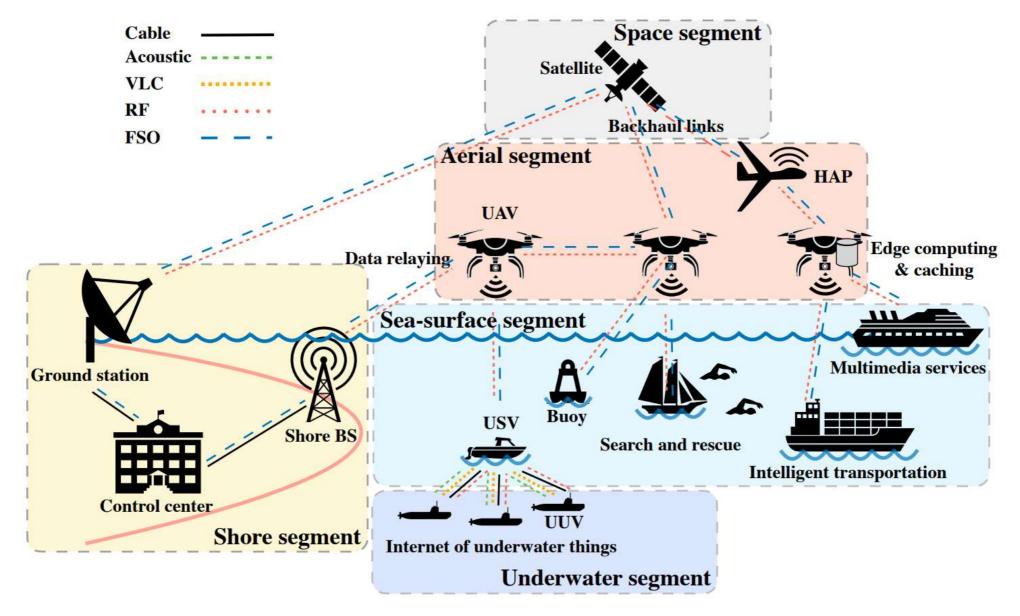
- Unmanned surface vehicles (USVs), buoys and ships support intelligent transportation, environmental observation, underwater data relaying and search and rescue etc
- Novel paradigms include extended coverage giant cells, in the form of seaborne floating towers, being semisubmersible steel reinforced concrete platforms [Guan et al., 2021]

[Guan et al., 2021] S. Guan, J. Wang, C. Jiang, R. Duan, Y. Ren and T. Q. S. Quek, "MagicNet: The Maritime Giant Cellular Network," IEEE Commun. Mag., March 2021.



- Sensors and unmanned underwater vehicles (UUVs) for marine data acquisition and transmission to UUVs, ships or UAVs
- Electromagnetic waves experience high attenuation in seawater and long-distance transmission relies on acoustic signals

## **Communication technologies**



- Radio frequency (RF) communications (VHF, cellular, Wi-Fi standards)
- Free space optical (FSO) for large bandwidth and high data rate under line-of-sight (LoS)
- Visible-light communications (VLC) using light-emitting diodes (LEDs) to facilitate underwater communications
- Acoustic communications offer long-range underwater transmission but are characterized by small channel capacity and high propagation delay

#### **Performance targets**

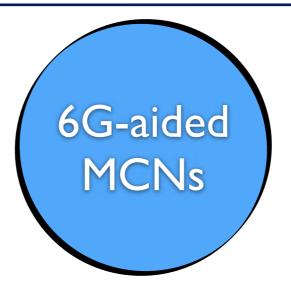
- Energy efficiency/network lifetime maximization
- Low-latency communication
- Spectral efficiency
- Satellite/aerial-aided coverage improvement
- Low-complexity and distributed network operation

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- Motivation
- Power minimization
- Delay minimization
- Capacity improvement
- Coverage improvement
- Complexity reduction

#### **Motivation**



Energy- constrained IoT devices and unmanned vehicles need low-power operation

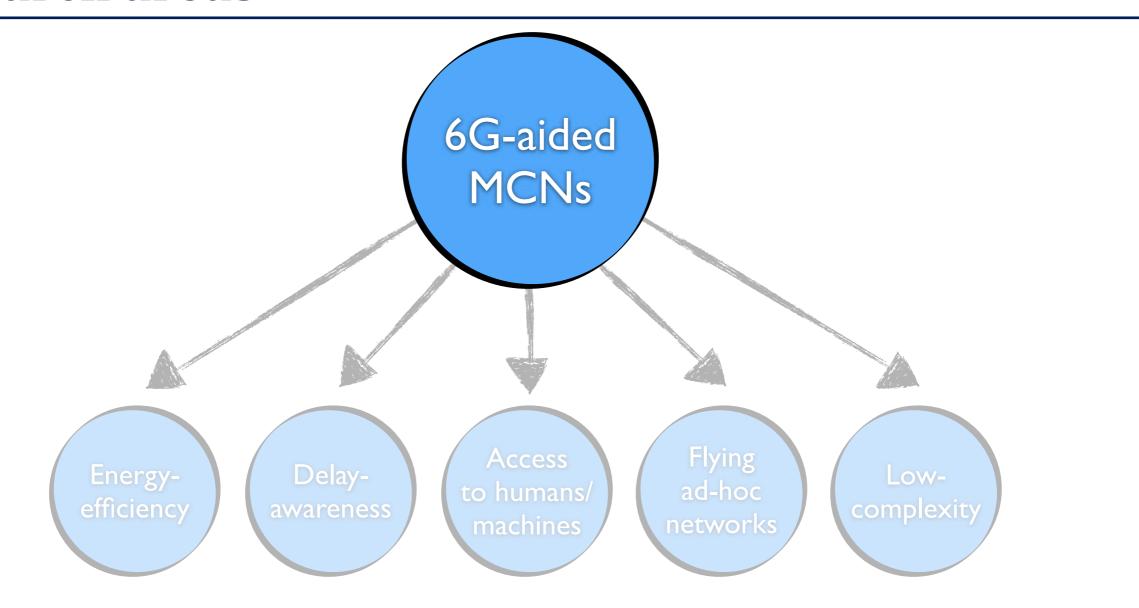
Low-latency maritime applications (UAVs/USVs/UUVs coordination, intelligent transportation etc.)

Mass connectivity must be guaranteed to coexisting users and IoT devices

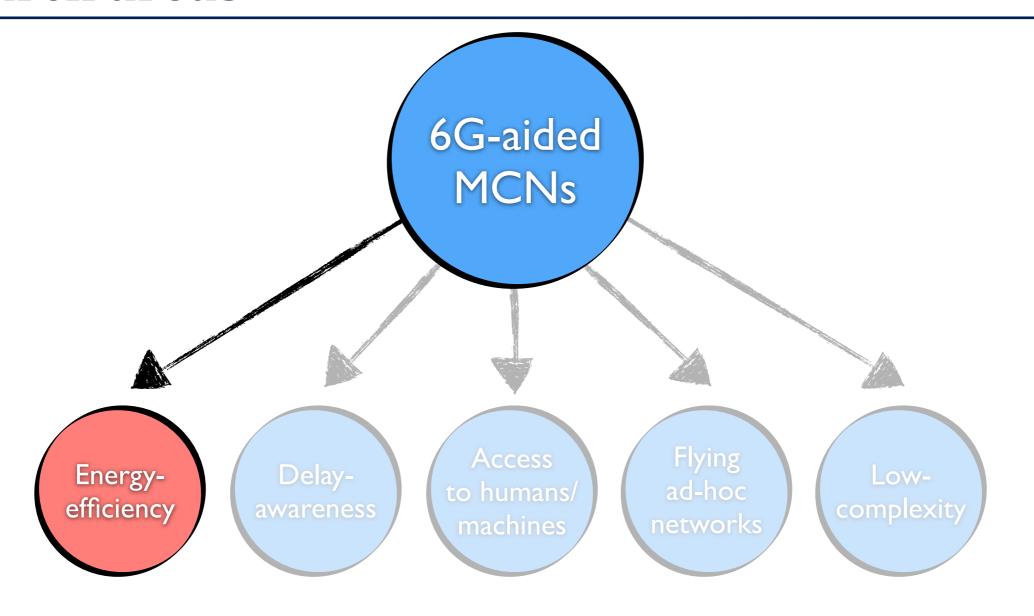
Deployment of aerial nodes is vital for improved coverage and access

Low-complexity network coordination is needed due to the massive number of users and IoT devices

#### Research areas



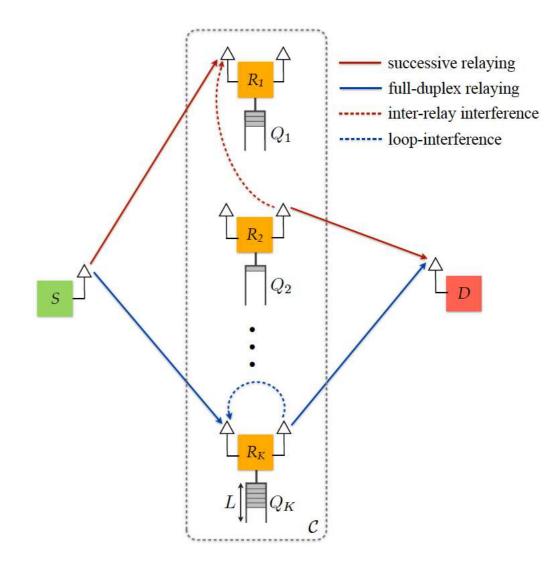
#### Research areas



CSI exploitation for power adaptation

#### Power minimization (1/2)

- <u>Problem</u>: When CSI is available and fixed rate is required, fixed transmit power is inefficient
- <u>Solution</u>: Hybrid algorithms integrating HD/ successive/FD modes with power adaptation
  - Selection of the relay/relay-pair requiring the minimum power for a pre-defined rate [Nomikos et al., 2015]
  - With multi-antenna relays, FD transmissions with power adaptation for LI mitigation are possible [Nomikos et al., 2016]
  - When statistical CSI is available, power adaptation is performed for the duration of a frame [Nomikos et al. 2018]



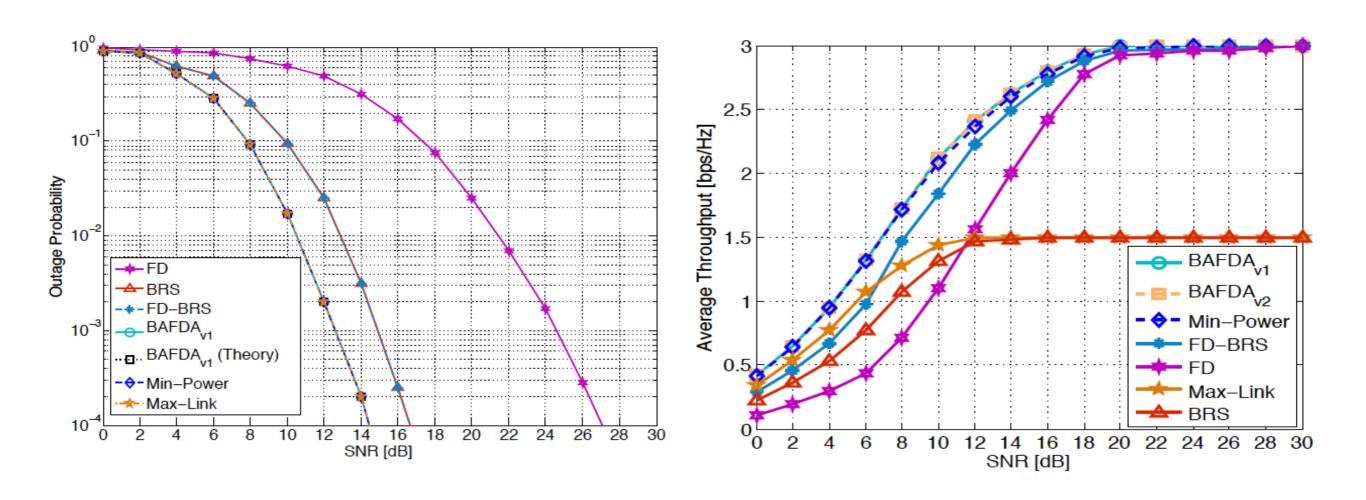
[Nomikos et al., 2015] N. Nomikos, T. Charalambous, I. Krikidis, D. N. Skoutas, D. Vouyioukas and M. Johansson, "A buffer-aided successive opportunistic relay selection scheme with power adaptation and inter-relay interference cancellation for cooperative diversity systems," IEEE Trans. on Commun., May 2015.

[Nomikos et al., 2016] N. Nomikos, T. Charalambous, I. Krikidis, D. N. Skoutas, D. Vouyioukas, M. Johansson and C. Skianis, "A survey on buffer-aided relay selection," IEEE Commun. Surv. & Tut., Secondquarter 2016.

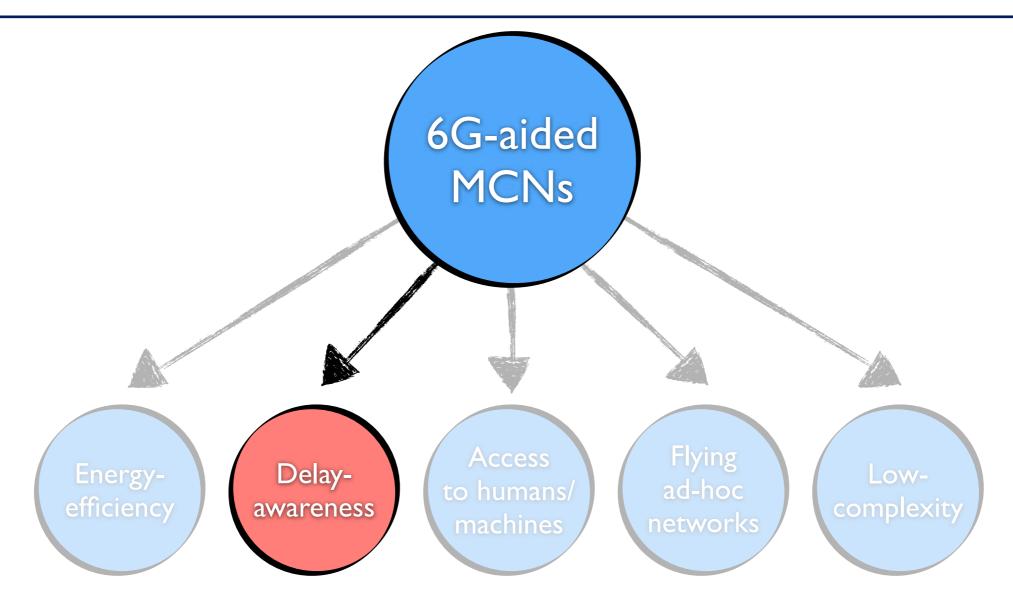
[Nomikos et al., 2018] N. Nomikos, T. Charalambous, D. Vouyioukas, R. Wichman and G. K. Karagiannidis, "Power adaptation in buffer-aided full-duplex relay networks with statistical CSI," IEEE Trans. on Veh. Tech., Aug. 2018.

## Power minimization (2/2)

- Using instantaneous CSI, the proposed algorithms (min-pow, BAFDA) provide:
  - Reduced outages, by relying on the robust max-link
  - Improved throughput, due to FD and successive transmissions



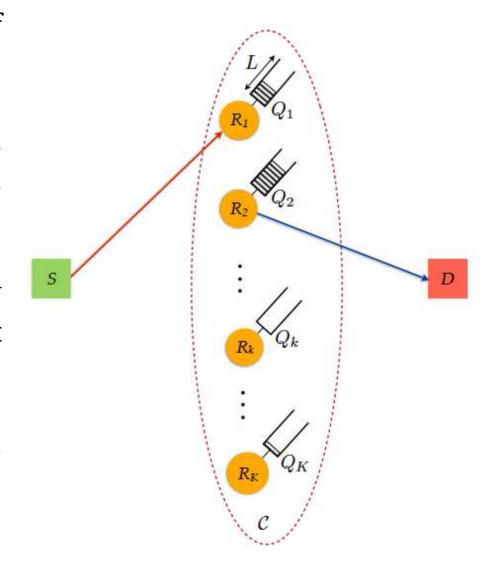
#### Research areas



Prioritize relay-destination links and exploit buffer status to avoid buffer starvation

## Delay minimization (1/2)

- <u>Problem</u>: Buffers provide increased degrees of freedom for relay selection but may introduce delay
- <u>Solution</u>: Modified versions of hybrid relay selection (HRS) and max-link [Poulimeneas et al., 2016, Nomikos et al., 2018]
  - Selection chooses among the feasible source-relay (relay-destination) links the ones with the smallest (largest) data queue
  - The relay-destination link is prioritized and buffers are kept non-empty

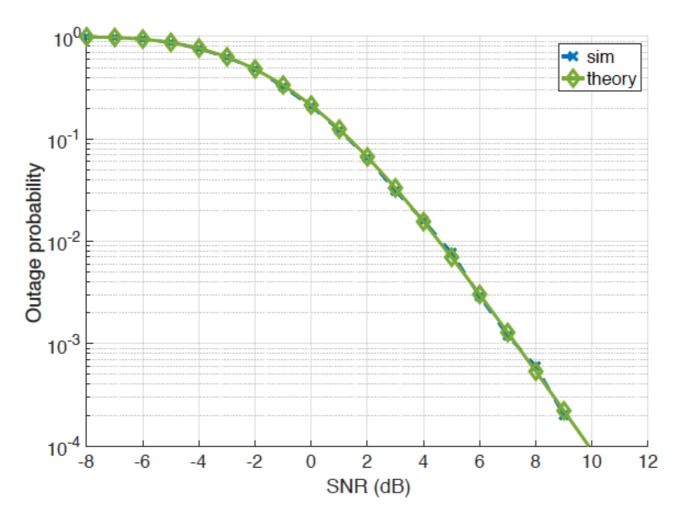


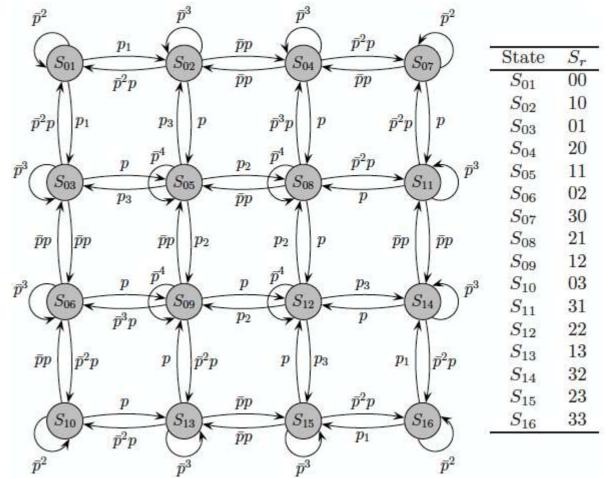
[Poulimeneas et al., 2016 (1)] D. Poulimeneas, T. Charalambous, N. Nomikos, I. Krikidis, D. Vouyioukas and M. Johansson, "A delay-aware hybrid relay selection policy," Int. Conf. on Telecommun. (ICT), Thessaloniki, Greece, May 2016 (Best-paper finalist).

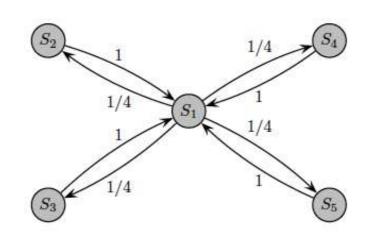
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## Delay minimization (2/2)

- Theoretical analysis showed that diversity can be maintained
- Asymptotic delay performance depends only on the number of relays
- The outage performance is improved, as buffer starvation is avoided

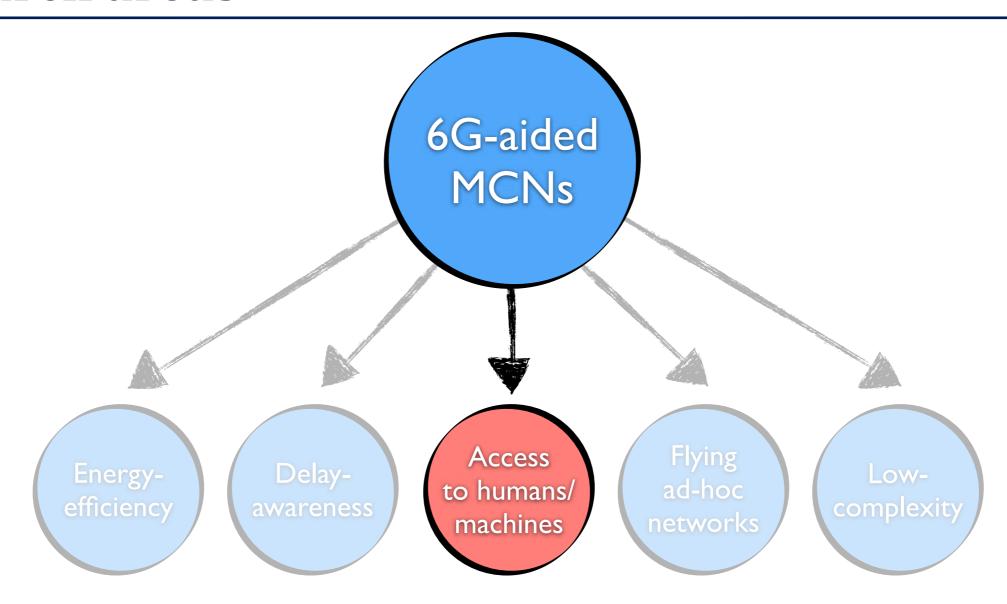






State	$S_r$
$S_1$	2222
$S_2$	1222
$S_3$	2122
$S_4$	2212
$S_5$	2221

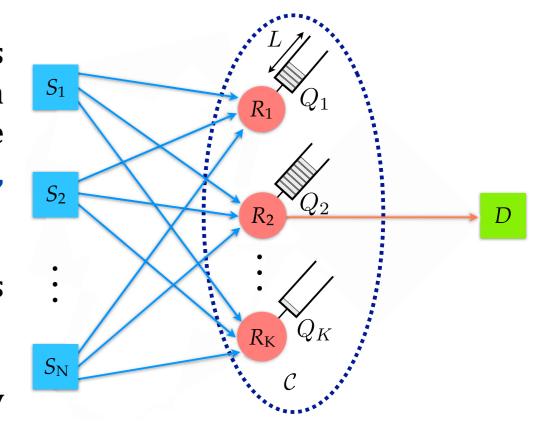
#### Research areas



Non-orthogonal multiple access (NOMA), considering the CSI and rate requirements of users and IoT devices

## Capacity improvement (1/4)

- <u>Problem</u>: In the uplink, orthogonal access cannot satisfy mass connectivity and CSI acquisition by IoT devices results in high energy and complexity costs
- <u>Solution</u>: Dynamic decoding ordering at the relays allows the simultaneous reception of signals from users and IoT devices through successive interference cancellation (SIC) [Nomikos et al., 2019(1), Nomikos et al., 2019 (2)]
  - Flex-NOMA exploits CSI at the receiver and selects the relay with the largest buffer size
  - Users and machines do not need CSI, as they broadcast to the relays with fixed power

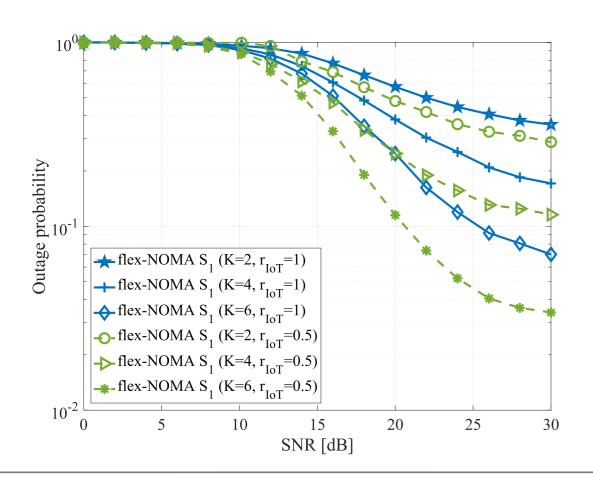


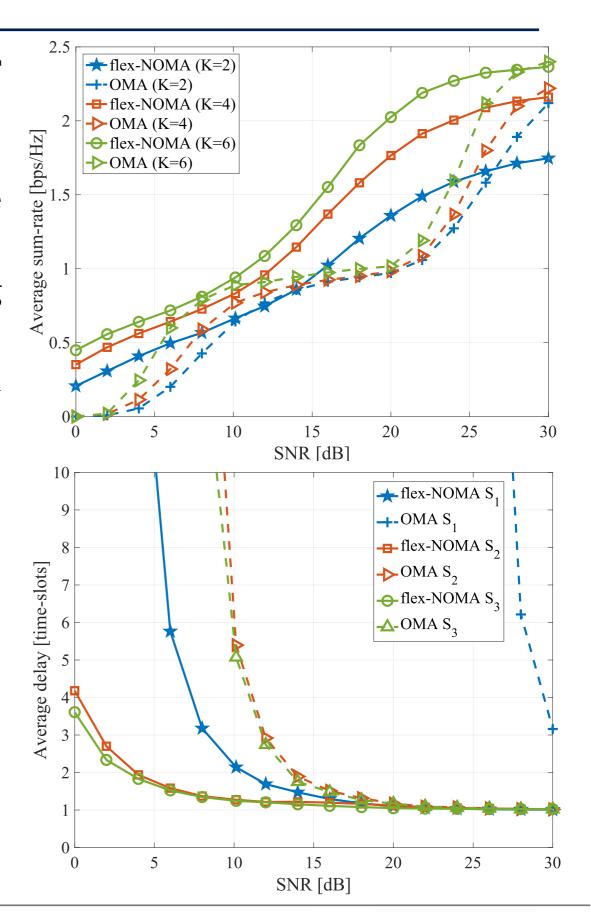
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[Nomikos et al., 2019] N. Nomikos, E. T. Michailidis, P. Trakadas, D. Vouyioukas, T. Zahariadis, and I. Krikidis, "Flex-NOMA: Exploiting buffer-aided relay selection for massive connectivity in the 5G uplink," IEEE Access, July 2019.

## Capacity improvement (2/4)

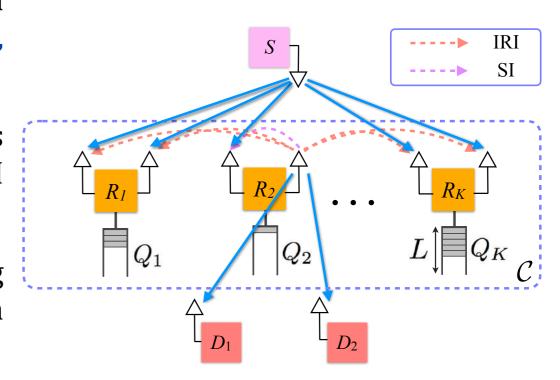
- Scenarios where a user coexists with two IoT devices and different rate requirements ( $r_{\rm H2H}$  = 3 bps/Hz,  $r_{\rm IoT}$  = 1 or 0.5 bps/Hz)
- Flex-NOMA offers improved outage performance to H2H communications, compared to OMA
- Higher average sum-rate is provided for varying SNR
- Lower delay is achieved by avoiding orthogonal resource allocation





## Capacity improvement (3/4)

- <u>Problem</u>: The mass connectivity potential of NOMA decreases when HD relays are employed
- <u>Solution</u>: Integrating NOMA with buffer-aided FD relays for hybrid FD/successive/HD operation [Nomikos et al., 2019, Nomikos et al., 2020, Nomikos et al., 2021]
  - BA hybrid NOMA (BAHyNOMA) algorithm uses broadcasting in the first hop, avoiding CSI acquisition at the transmitter
  - Relays store packets, seamlessly switching among FD/HD operation when FD transmission is not possible
  - NOMA transmissions are performed in the second hop, considering the CSI and rate requirements of users and machines



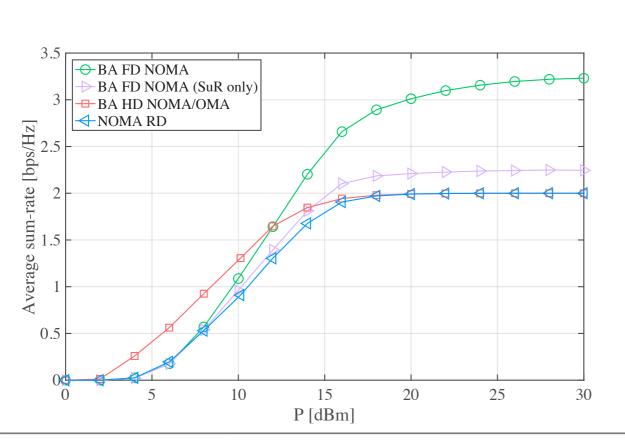
[Nomikos et al., 2019] N. Nomikos, P. Trakadas, A. Hatziefremidis, and S. Voliotis, "Full-Duplex NOMA Transmission with Single-Antenna Buffer-Aided Relays," Electronics, Dec. 2019.

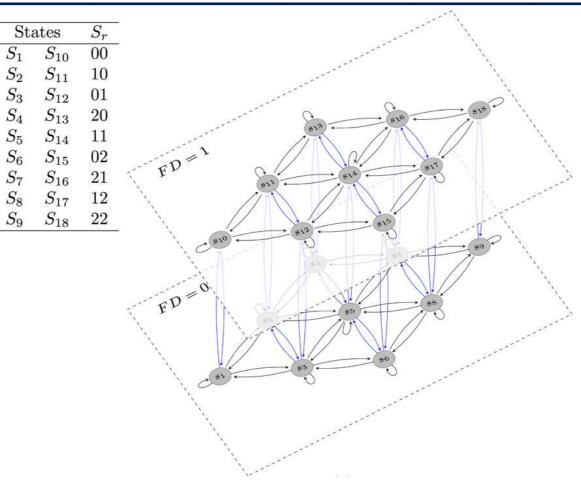
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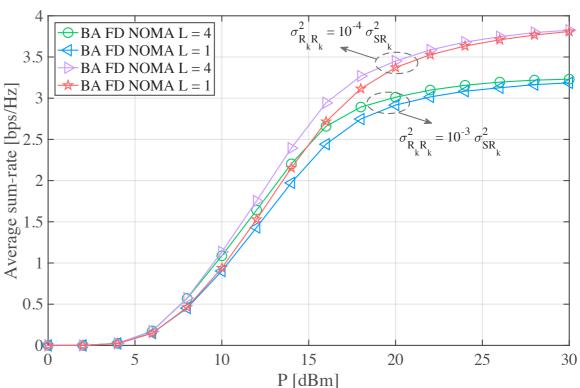
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## Capacity improvement (4/4)

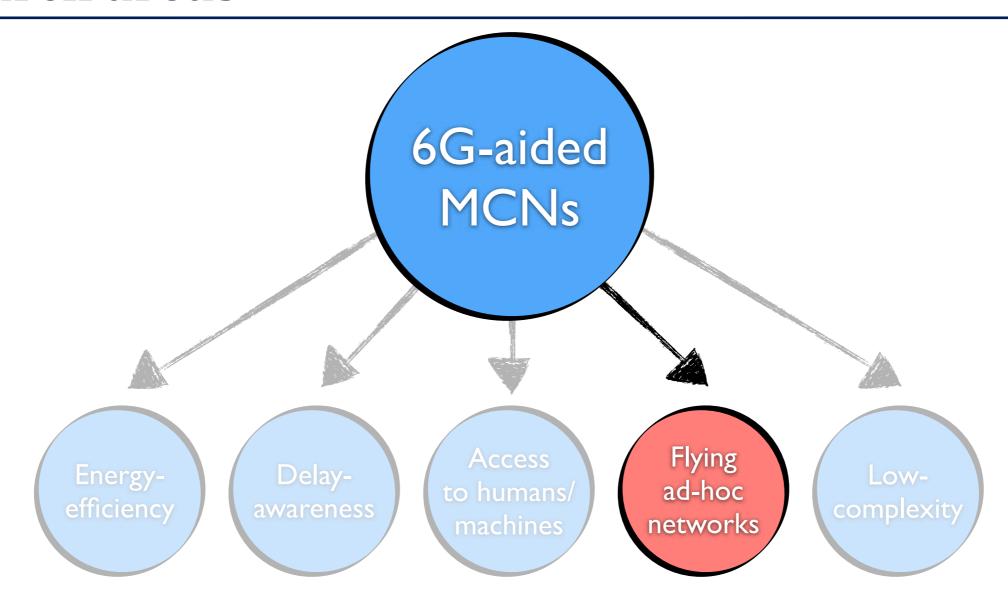
- A two-user scenario where the first user is closer to the relays and the other at the network edge is investigated
- Sum-rate performance surpasses that of HD NOMA/OMA and OMA due to FD transmissions
- In cases with reduced LI, the FD performance gain increases







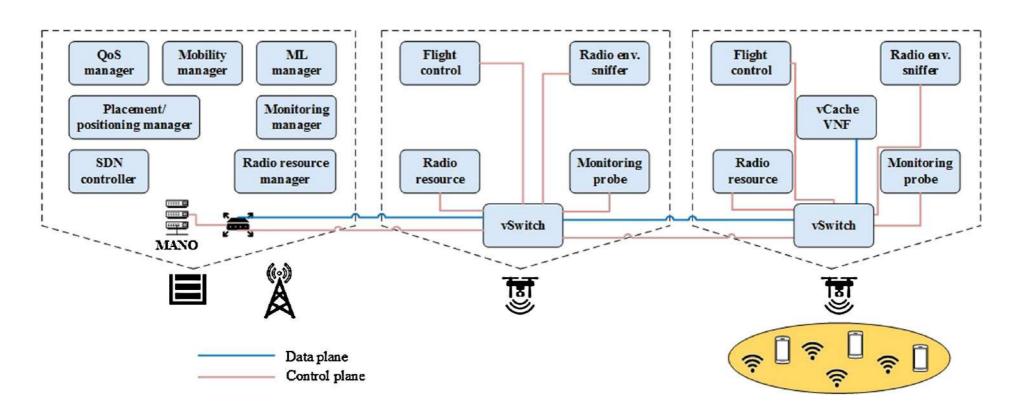
#### Research areas



Optimization of aerial nodes' position for improved coverage of users and IoT devices

## Coverage improvement (1/2)

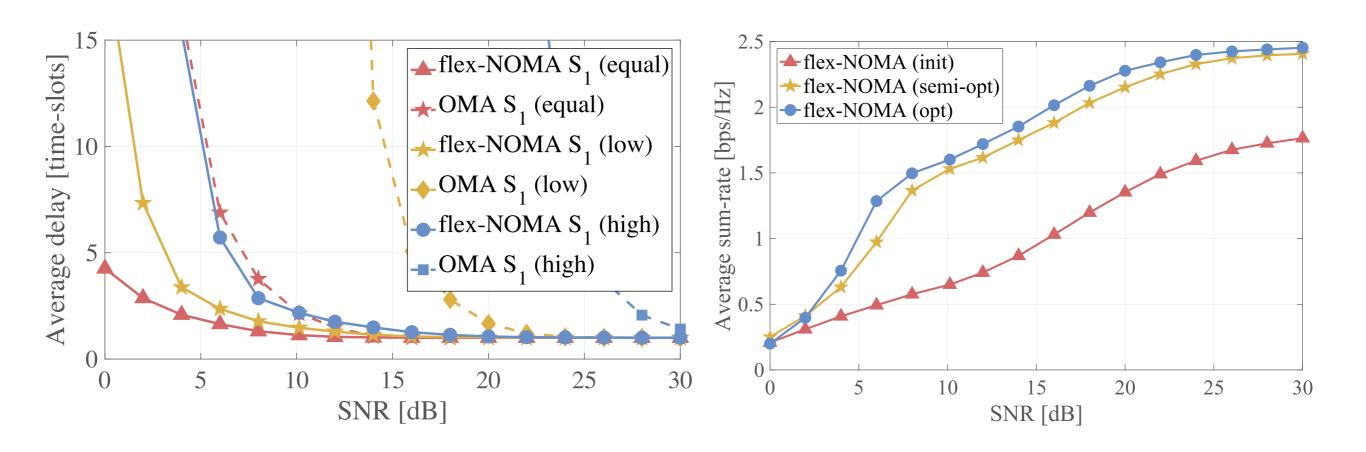
- <u>Problem</u>: Low channel asymmetry reduces the performance of NOMA when connecting coexisting users and IoT devices
- <u>Solution</u>: A flexible moving radio access network (RAN), consisting of aerial nodes which can increase channel asymmetry by repositioning [Nomikos et al., 2020]
  - The proposed RAN includes network softwarization and orchestration characteristics to dynamically deploy aerial nodes and resources
  - Radio access uses NOMA, exploiting channel / rate asymmetry of users and IoT devices



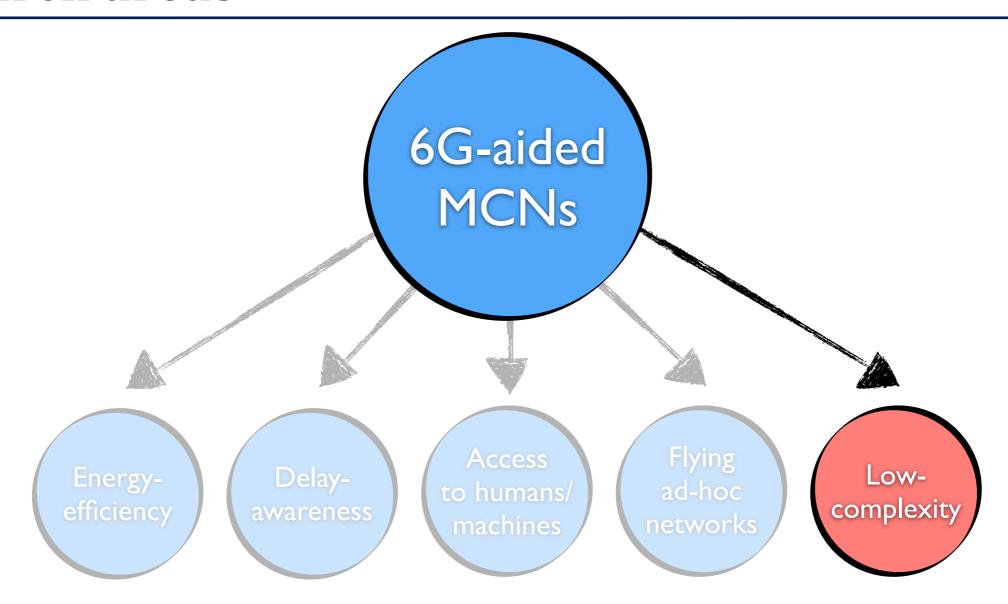
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## Coverage improvement (2/2)

- Scenarios where a user coexists with two IoT devices with different rate requirements
  - NOMA reduces the delay over OMA independently of the rate asymmetry
- Different cases of optimized flying RA nodes positioning for increased channel asymmetry and improved NOMA (K = 2)
  - When aerial nodes reposition for higher channel asymmetry sum-rate increases



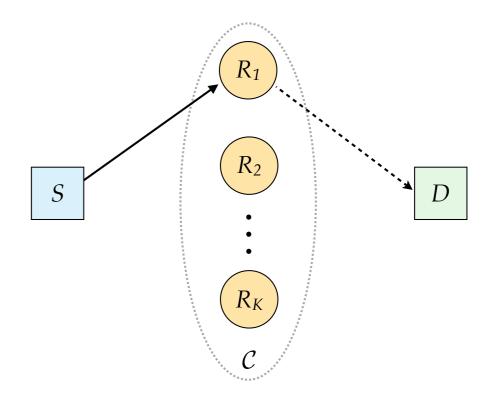
#### Research areas

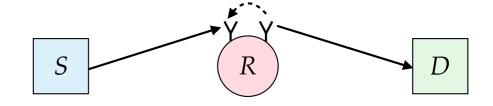


Avoid excessive network coordination overheads to support the massive number of users and IoT devices

## Complexity reduction (1/2)

- Problem: Relay selection and power control mechanisms incur increased network coordination overheads
- <u>Solution</u>: The adoption of reinforcement learning through multi-armed bandits (MAB) eliminates the need for CSI, using one-bit ACK/NACK feedback [Nomikos et al., 2020, Nomikos et al., 2021]
  - The use of upper confidence bound (UCB) algorithms guarantees that average regret grows logarithmically over the time horizon
  - Distributed network operation is achieved by integrating synchronized timers at the relays into the MAB framework





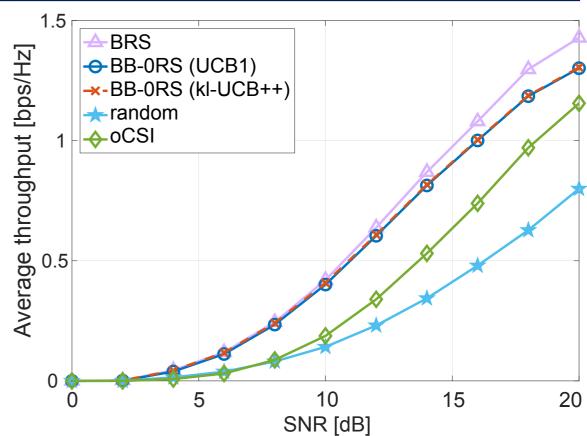
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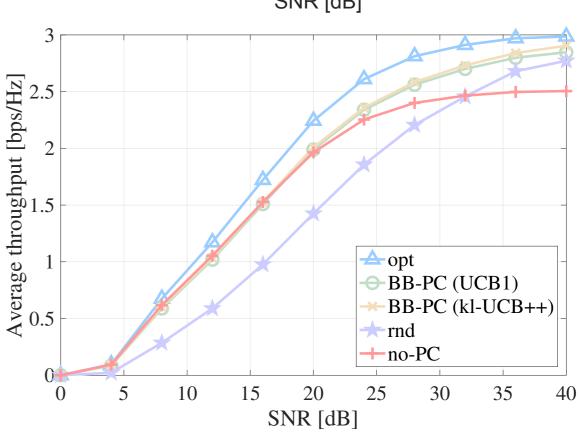
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## Complexity reduction (2/2)

- Bandit-based opportunistic relay selection (BB-ORS) has a small performance gap compared to optimal relay selection with full CSI knowledge
- BB-ORS offers significantly higher average throughput over random relay selection and relay selection with outdated CSI (oCSI)

- A small performance gap is observed compared to optimal power control with full CSI knowledge
- In FD relay networks, bandit-based power control (BB-PC) outperforms the cases without power control (no-PC) and random power level selection





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#### **Conclusions**

- Distributed and low-complexity opportunistic relaying algorithms were proposed, for hardware- and energy-constrained maritime IoT devices and vessels
- Hybrid HD/FD/successive relaying reduces outages, power expenditure and delays and increases throughput
- NOMA showed tremendous mass connectivity potential for users and IoT devices
- Various CSI cases were examined for users and IoT devices with different capabilities
- Reinforcement learning was integrated in multi-hop networks with promising results

...but still many 6G techniques and maritime topologies to take into consideration!

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#### Vision for future development

- Coexisting users and IoT devices stresses backhaul/fronthaul of ground and maritime networks, needing radical offloading paradigms, e.g. reinforcement learning-aided caching [Nomikos et al., 2022 (1)]
- There is increased potential for integrating machine learning algorithms in maritime communication networks, e.g. multi-armed bandits for trajectory design
- Maritime networks and the Internet of Underwater Things, comprising vessels, platforms, users and machines require novel grant-free non-orthogonal multiple access and the use of intelligent reflecting surfaces to maximize the capacity
- Aerial networks will coexist with shore base stations and satellites, necessitating dynamic backhauling/fronthauling in maritime settings [Nomikos et al., 2022 (2)]

[Nomikos et al., 2022 (1)] N. Nomikos, S. Zoupanos, T. Charalambous, and I. Krikidis "A survey on reinforcement learning-aided caching in mobile edge network," IEEE Access, January 2022.

[Nomikos et al., 2022 (2)] N. Nomikos, P. K. Gkonis, P. S. Bithas, and P. Trakadas "A survey on UAV-aided maritime communications: Deployment considerations, applications, and future challenges," arXiv, September 2022.

## Thank you!

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## Questions?