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Active Connectivity Fundamentals for TSCH Networks of Mobile Robots

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Abstract—Time Slotted Channel Hopping (TSCH) is a medium access protocol defined in the IEEE 802.15.4 standard which have been proven to be one of the most reliable options when it comes to industrial applications. TSCH has been designed to be utilized in static network topologies. Thus, if an application scenario requires a mobile network topology, TSCH does not perform reliably. In this paper we introduce active connectivity for mobile application scenarios, such as mobile robots. This is a feature that enables the option to regulate physical characteristics such as the speed of a node as it moves, in order to keep being connected to the TSCH network. We model the active connectivity approach through a basic example where two nodes are moving towards the same direction to infer the main principles of the introduced approach. We evaluate the active connectivity feature through simulations and quantify trade-off between connectivity and application-layer performance.

Index Terms—TSCH, Mobility, Dependable IoT, Reliability.

I. INTRODUCTION

Time Slotted Channel hopping (TSCH) [1] is a Medium Access Control (MAC) protocol which became very popular in Industrial Internet of Things (IoT) [2] since it can provide robustness and reliability towards the network performance. The TSCH protocol is based on a channel hopping function that mitigates the impact of interference and multipath fading that diminish the communication in IoT networks. All the nodes in TSCH networks share a common time source to enable synchronization among the nodes. Provided that the nodes are synchronized, a schedule is calculated including a predefined channel offset and time offset which declares the communication details within the TSCH network.

TSCH is a flexible protocol which can be tailored towards the requirements of each application. A very popular customization approach is modifying the TSCH schedule. Since the traffic demands, network topology and routing might vary a lot depending on the application, the TSCH schedule is a crucial part which can be adjusted based on the application demands. Therefore, there is an extended scientific literature around TSCH scheduling schemes, which includes three main categories: centralized [3], distributed [4] and autonomous [5].

As TSCH networks emerged, they started being utilized in different kinds of dependable applications with mobile nodes, that each one has various set of requirements with different challenges every time. For example, wearable sensors [6] for health, are mobile devices which could benefit from a reliable mobile TSCH. In [7], the node mobility is distinguished

between macro and micro mobility: macro is the mobility between different network domains and micro is the mobility within the current network domain. In this paper we focus on micro mobility and more specifically mobility within the TSCH network. In our previous work [8] we demonstrated that the current state of the art in TSCH schedules cannot support mobility. Thus, TSCH performance is far from reliable when mobile communication is required. There are several factors to be considered in a mobile scenario like the traffic volume, the mobility model, the power budget, and the operating environment.

Mobile robotics is another application that could benefit from reliable TSCH-based robot-to-robot communication, such as Unmanned Aerial Vehicles (UAV) [9], autonomous vehicles [10] and many more. Indeed, similar to wireless sensor networks, mobile robots are cyber-physical systems that depend on traditional (*e.g.*, [11]) and nontraditional sensors (*e.g.*, [12]) to perceive the environment and act to maximise their application objectives. This synergy is recently investigated as part of the Internet of Robotic Things [13], [14].

Unlike wearable sensors, whereby the device has no control on the mobility of the user, mobile robots routinely adjust their mobility to maximize their objectives, *e.g.*, planning based on energy consumption estimates [15], [16]. When reliable communication is vital, a mobile robot can make similar adjustments for maintaining reliable connectivity based on link quality estimates. In this spirit, we introduce the concept of Active Connectivity (AC). Namely, a node can regulate its physical characteristics (*i.e.*, speed, route, topology) to remain within coverage of its neighbours and therefore keep being connected to the TSCH network. While this approach can increase the reliability and robustness of the TSCH network, it may have negative impact on other objectives, such as the time the robot needs to cover a certain distance to complete a task and consequently to the overall cost. Thus, we investigate the trade-off between the reliable connectivity and application performance in terms of distance covered. In order to acquire a fundamental insight into the performance of AC we opted for studying a basic scenario, whereby two mobile nodes move towards the same direction. For the scope of the evaluation, we used the Cooja simulator [17], a cross layer network simulator which includes different levels from physical to application layer.

This paper is organized as follows. A brief technical descrip-

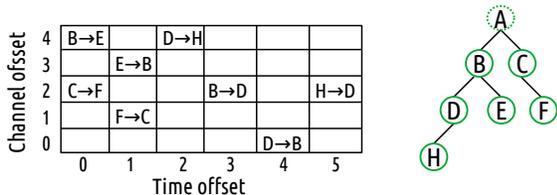


Fig. 1. TSCH slotframe on the left and routing topology on the right.

tion of TSCH is mentioned in Section II. Section III presents the state of the art and how it is related with the current work. Section IV illustrates the AC operating principles. The experimental scenario, the evaluation details the obtained results, and a discussion are presented in Section V. Finally, Section VI concludes the paper and discusses future work.

II. TSCH PRIMER

This Section provides a brief overview with the technical aspects of TSCH protocol which is part of the IEEE 802.15.4 standard [18] and an amendment in IEEE 802.15.4e-2015 [19].

TSCH operates at the link layer and two of its main features is the frequency hopping and the synchronization of the nodes. The nodes of the TSCH network are following a duty cycle which is dictated by the schedule. They have the option to sleep for reserving power, transmit or receive a packet. In order to avoid collisions, it is not allowed to multiple transmissions at the same time and channel. The schedule is organized into a two-dimensional table called the slotframe. Figure 1 illustrates a slotframe with a topology. The time offset is represented on the x-axis and the channel offset at the y-axis. Every cell, which is called timeslot, represents a specific time and channel offset and most of the times has a duration of 10 ms which is enough to send an IEEE 802.15.4 packet and receive an ACK. In Figure 1 there are 6 timeslots and 5 channel offsets. The number of the timeslots is defining the length of the slotframe and has an impact on several trade-offs affecting the network performance.

The TSCH coordinator constructs the TSCH network, it defines the network ID, slotframe size and the Frequency Hopping Sequence (FHS). The coordinator is also responsible to initialize the Absolute Slot Number (ASN) to 0 which is increased with a new timeslot. To join the TSCH network a node has to receive an EB (Enhanced Beacon) packet, which is broadcast from the already joined nodes. EB contains essential information like the time source which is necessary to synchronize with the other nodes. Equation 1 is computing a channel for a given cell, CO stands for Channel Offset. There is a priority mechanism in case there is more than one transmission cell at the same time.

$$Channel = FHS(ASN + CO) \bmod ||FHS|| \quad (1)$$

During the evaluation part we used the MSF schedule to keep this part simple as well. The MSF is defined in the RFC 9033 [4] as a scheduling mechanism for TSCH implemented

at the top of 6top protocol. MSF include three types of cells: minimal, autonomous, negotiated. Minimal cells are used for EB packets and routing purposes; autonomous are used for unicast communication and a negotiated cell is used when a node has just joined the TSCH network and intends to let the other nodes about its presence.

III. RELATED WORK

Utilizing TSCH under mobile scenarios is a research topic which is not covered adequately by the research literature. This section illustrates the existing research endeavours but also a few instances presenting how RPL (Routing Protocol for Low-Power and Lossy Networks) performs in mobile scenarios as well. RPL is used in several TSCH approaches as the default routing protocol and information obtained from RPL are used to construct the TSCH schedule at some case. Therefore, it is interesting to understand how it performs on mobile scenarios and what may be its impact on TSCH.

Al-Nidawi et al [20], evaluated the Low Latency Deterministic Network (LLDN) and TSCH protocols under mobility scenarios. The authors identify numerous issues that affect the network performance and quantify their impact on the energy consumption and the network coverage. The main issues mentioned are the long channel offset which increases the scanning process, mobile nodes cannot identify coordinators due to beaconing on multiple frequencies and the absence of a flexible timeslot scheme which will enable a smoother function when a node is added or deleted. After gaining an insight into the challenges of TSCH in mobile scenarios Al-Nidawi et al. [21] propose Mobile TSCH to decrease the delay that arises during the TSCH joining procedure. In order to achieve this they encapsulate EB packets into ACK packets which are transmitted on a fixed channel. The proposed approach decreases the Radio Duty Cycle (RDC) by an average of 30% and increases the connectivity by 25%. An evaluation of TSCH in mobile scenarios which considers both mobile and stationary nodes, presents that TSCH can achieve adequate connectivity with the premise that there are adequate amount of nodes either stationary or mobile to enable a proper coverage [22]. It is introduced though an overhead due to the increased number of messages used to maintain synchronization which has an impact on the energy consumption and the latency of the network. A novel TSCH schedule called Instant [23], is utilized in indoor localization and data collection services in application scenarios designed for remote healthcare in residential environments. Instant includes both stationary and mobile nodes and the new feature offered in this schedule is that the mobile nodes are able to know information about reservations of subsequent unicast cell block of the stationary nodes in advance through a simple probe-ACK transaction. Therefore, if they want to transmit a large amount of data, they select a stationary node based on this information to select an available node and avoid delay and energy overhead. In a previous work we investigated how popular TSCH schedules perform on heterogeneous mobility patterns [8]. More specifically, we examined through simulations how MSF [4],

Orchestra [5] and Alice [24] schedules perform on mobility patterns representing an autonomous agricultural vehicles application scenario and a smart warehouse where a synergy between machinery, autonomous robots/vehicles and workers communicate to complete various tasks. We illustrate that neither of the schedules is providing a reliable performance because a number of nodes are suffering from coverage issues, or the schedule cannot handle the mobility and most of the times is outdated.

An extended survey on a significant amount of mobility models and their impact on RPL protocol is presented in [25]. The authors provide a comprehensive taxonomy, a classification of the mobility models and they conduct a comparison based on their main specification. Moreover, they evaluate RPL used in several mobility models using Cooja simulator to quantify metrics such as power consumption, reliability, latency and control overhead. An interesting observation is that the RPL's trickle timer, which is used to control traffic overhead by dividing the time into intervals, has an impact on the performance. Barceló et al. propose an extension of the 6TiSCH routing in [26], considering scenarios where static and mobile nodes co-exist. The routing between static nodes is carried out by the regular 6TiSCH but the routing among mobile nodes and static nodes is performed by a novel approach which is utilizing the end-to-end reliability estimations with a blacklisting function based on the position of the node. They evaluate their approach through simulations and the results show that the reliability between the mobile and static nodes is increased even when there are occurring high positioning errors compared to previous routing approaches. Another approach to improve mobile scenarios which use RPL is presented in [27]. The authors follow a Software Defined Network (SDN) technique where a central controller has a holistic view of the network, can predict the handovers, and update the routing tables. In addition, the central controller is not limited in terms of resources like the regular IoT nodes. Thus, it can execute computationally intensive algorithms such as particle and Kalman filter. The authors evaluate their approach through Cooja simulations, and the results suggest that the proposed approach can achieve higher reliability compared with the baseline RPL but also with the current state of the art mRPL.

IV. ACTIVE CONNECTIVITY

The AC approach entails several challenges depending on the application requirements. This section is establishing the foundations of enabling AC in TSCH networks with mobile nodes. The main principle is that if a link between two mobile nodes is weak and is about to die then the nodes have the ability to regulate physical characteristics like their speed, their topology or their route to keep this link alive. In this paper we focus only on the speed due to limited space but still this is very general principal that generates a set of technical concerns that have to be addressed.

The first consideration to be taken is to decide which of the two nodes is going to regulate its speed. The routing

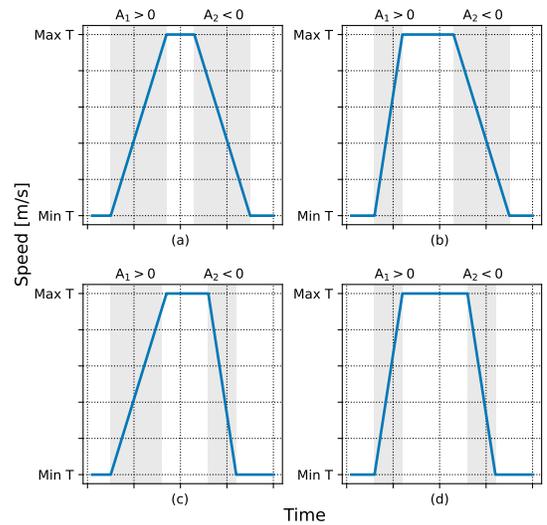


Fig. 2. Representation of potential speed profiles. Example of a moderate acceleration and deceleration adaptation (a), within the gray intervals the acceleration A_1 and deceleration A_2 represent the speed change, which is activated based on the Minimum and Maximum RSSI Thresholds. In (b) it is denoted the steep acceleration moderate deceleration, in (c) the moderate acceleration steep deceleration and in (d) the steep acceleration steep deceleration technique.

in TSCH networks is organized with a tree topology most of the times and we decided that it will be convenient that the child node will be the one which will regulate its speed because it will probably affect less nodes in the network. In that sense if the child node has its own children, then these nodes have to regulate their speed as well in the same rate to remain within the connectivity range. Another consideration was to select the metric which would indicate that a link is about to die. The IoT devices are using low-cost radios which are prone to noise and interference [28], [29]. There are metrics like Radio Signal Strength Indicator (RSSI) which is the captured power level after a packet reception. The RSSI measurement unit is decibels per milliwatt (dBm). A similar metric is the Link Quality Indicator (LQI) which describes the quality of the received packet, but it is less depended by the environment activity compared with RSSI. Both of them have significant spatial or temporal dependencies especially during a mobile scenario. This makes it challenging to find a balance between a representing quantity of samples and be coherent with the limited amount of resources offered by IoT devices. To this end we decided to determine a weak link based on the Exponentially Weighted Moving Average (EWMA) of RSSI values, which is described in Equation 2.

$$EWMA_{RSSI_i} = \alpha * RSSI_i + (1 - \alpha) * EWMA_{i-1} \quad (2)$$

EWMA does not consume a lot of resources and at the same time it is able to represent a series of RSSI values. The selection of the alpha parameter, which is defining the weight of the current RSSI value and the weight of the previous RSSI values, is examined in the evaluation part in Section V along with different RSSI thresholds used to notify the prospect of

a weak link. The rate that the speed is going to be regulated was also one of the considerations we had to take. Apparently the acceleration or the deceleration can affect the performance of the AC operation. Especially when a node is at the very limits of the connectivity range it is important to regulate its speed faster. We illustrate some potential speed profiles we in Figure 2. Namely, a moderate approach both for acceleration and deceleration illustrated in Figure 2a, an approach which includes a steep acceleration and a moderate deceleration in Figure 2b, another one where the acceleration is moderate and the deceleration steep in Figure 2c and one where both acceleration and deceleration are steep in Figure 2d. In this paper we focus only at the speed profile illustrated in 2a for practical reasons.

The metrics to evaluate the performance of AC have to be considered as well. Networking metrics like throughput is able to represent the network performance of the TSCH network but we also use the downtime which we define as the time a node spends not being connected to the TSCH network after the first time it gets connected. The AC will have an impact on the distance a node will cover. Therefore, we consider the moving distance as a metric towards the application layer, because if a node covers a shorter distance due to AC purposes, it might increase the operating cost since the node would require more time to operate. For instance, if the node is an autonomous vehicle, it would require more fuel in that case. Finally we introduce a metric which is reflecting on a bias tradeoff between reliability and application performance, to illustrate how an application can tailor its AC performance based on the defined requirements.

V. EVALUATION

This section describes all the technical details during the evaluation part, the obtained results, and a discussion upon them. In order to evaluate the AC we used the Cooja simulator [17] and we defined a simplistic topology with two nodes depicted in Figure 3. The mobility model we use is also very simple, node A in Figure 3 is the root node, and it is moving to the same direction with node B with a distance of 130 m. They are moving in a straight line form until they reach the end of the grid and then they return back. They repeat this pattern for 30 minutes of simulation time. Node A is moving with 1 m/s and node B with 3 m/s. The maximum speed a node can go is up to 3 m/s and the minimum 0 m/s. We define these regulations for safety reasons (a mobile node can be a vehicle, a robot, a UAV and cannot move too fast) but also to consider the covered distance as a meaningful metric to evaluate the AC impact on the application layer. All the simulations were repeated with 20 different random seeds to avoid statistical bias. The configuration parameters of the simulation are listed in Table I.

We evaluate two versions of AC mechanism. In the first one we assume that a node knows the position of the rest of the nodes in the network, thus when AC notifies it about a weak link it knows if it has to accelerate or decelerate. We do this assumption due to the fact that several application scenarios

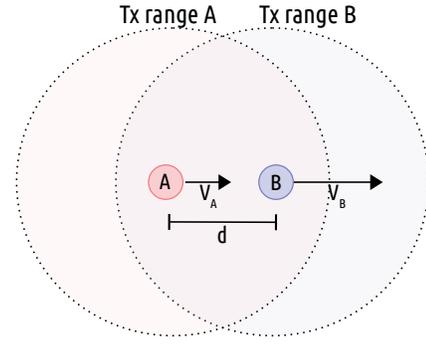


Fig. 3. The rudimentary mobility pattern Node A and Node B follow to model the design principles of the Active Connectivity mechanism. $3V_A = V_B$

such as autonomous agricultural vehicles most probably have GPS and can aggregate their position through the TSCH network but also in the spirit of abstracting complexities. We refer to this version as AC. In the other version a node does not know the positions of the other nodes and the mechanism does a random guess to decide if it has to accelerate or decelerate when it receives a notification about a weak link. This decision is evaluated during the operation and if the EWMA level drops down to threshold after this decision has been taken, the mechanism changes its decision and does the opposite action. Algorithm 1 presents the operation of the mechanism and we refer to this mechanism as AC Random (ACR). Considering that both AC and ACR have the same topology depicted in Figure 3, but this could change if node B decrease a lot its speed and node A overtake it and it depends on the configuration parameters that node B increase its speed in time to continue being in range with node A. We also run a version with the AC mechanism deactivated to have it as a benchmark comparison.

Algorithm 1: Active Connectivity Random

```

Input: RSSI
Output:  $RSSI_{ewma}$ , Accelerate or Decelerate
//Initialization
 $RSSI_{ewma}() \leftarrow RSSI_i$ 
if  $RSSI_{ewma}() < RSSI_{minT}$  then
    |  $random\_decision()$ 
    |  $RSSI_{ewma\_current} \leftarrow RSSI_{ewma}()$ 
end
if  $RSSI_{ewma\_current} - RSSI_{ewma}() \leq 3$  then
    |  $change\_decision()$ 
end

```

Figures 4 and 5 illustrate the first set of results which is the achieved throughput. Thus, Figure 4 presents the throughput for three different alpha values used in EWMA and six different RSSI threshold values which will activate the AC mechanism. Notice that the RSSI threshold values are mentioned in couples as the minimum will activate the AC mechanism when the link is weak and the maximum when

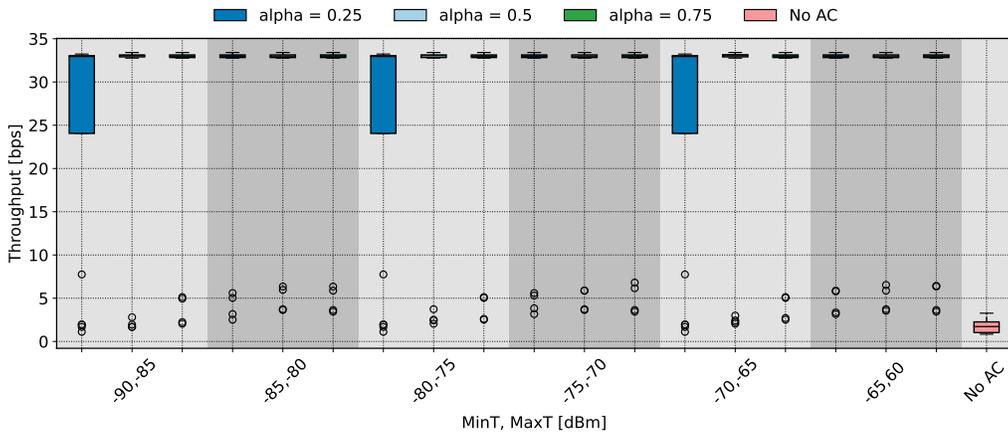


Fig. 4. Throughput using AC for different alpha values and RSSI thresholds. The colours representing the alpha values are not visible because the throughput performance is homogeneous close to its maximum value for most of the cases.

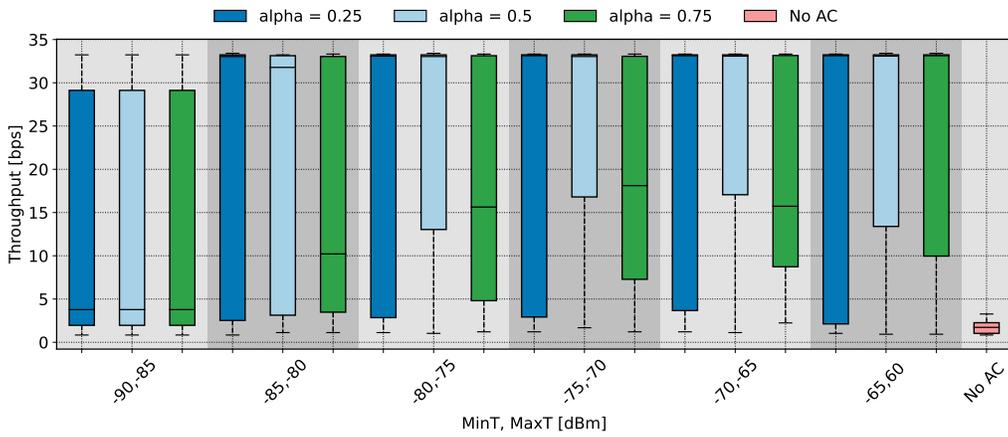


Fig. 5. Throughput using ACR for different alpha values and RSSI thresholds.

TABLE I
CONFIGURATION PARAMETERS USED DURING THE SIMULATION

Parameter	Value
Grid size	2000 x 2000 m
Transmission range	450 m
Radio model	Logistic Loss
Mobility model	Mobile Ad Hoc Network
Mobility speed	0 to 3 m/s
Traffic rate	1 packet/5 sec
Number of nodes	2
Slotframe length	3
Slot duration	10 ms
TSCH schedule	Minimal Scheduling Function
Transceiver	CC2420
Frequency spectrum	2.4 GHz
Simulation duration	30 min

the link is in a better status and regulate its speed towards its initial speed. All the following Figures present the results on this manner.

AC achieved approximately 33 bps for most of the cases which is the maximum it can be achieved in this simulation.

However, when the alpha value was 0.25 there are few cases when the throughput was lower close to 25 bps. We speculate that this due to the manner EWMA functions, namely with a lower alpha value the weight of the last RSSI value is lower in the EWMA calculation. Hence, AC requires more time to respond to a weak link case.

Figure 5 shows the throughput for the ACR case which is lower for some cases, for instance when the minimum and maximum thresholds were -90 and -85 dBm. An explanation is that the high values in the thresholds notify ACR about a weak link too late and if the random decision is mistaken there is no time to change the decision before the node goes out of range. When the alpha is 0.75, ACR performance drops. The explanation in this case is that alpha value increases a lot the weight of the last RSSI value making ACR too aggressive which in combination with the random guesses increases the mistaken decisions. In general, even though ACR performs worse than the AC version which is expected but if we compare the ACR with the version without AC features there is a significant improvement.

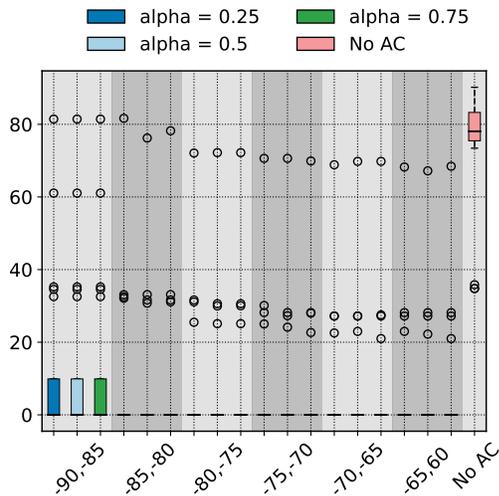


Fig. 6. Downtime using AC for different alpha values and RSSI thresholds.

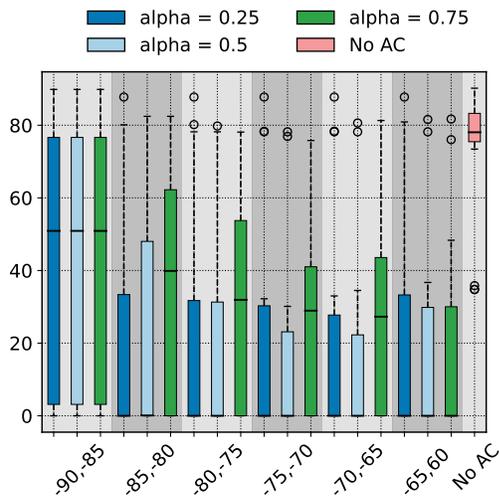


Fig. 7. Downtime using ACR for different alpha values and RSSI thresholds.

In Figures 6 and 7 we see the downtime of AC and ACR represented with boxplots. The mean downtime for AC was approximately 10%. Apparently, the trends are the same with the throughput since they are obtained from the same simulations. For the ACR case we see higher percentages of downtime, the alpha that performs the best is 0.5. If we compare the version without AC features with the worst performance of ACR when thresholds were -90 and -85 dBm, the downtime is reduced by 30% approximately.

The distance covered by node B is represented in Figures 8 and 9 for the case of AC and ACR respectively. The bars represent the mean distance and the errorbars the standard deviation. We decided to use this performance metric as well since it can have an impact on the overall cost. The distance node B covers without AC features is around 11 km/h and when AC is activated in Figure 8 the distance drops to 4 km/h

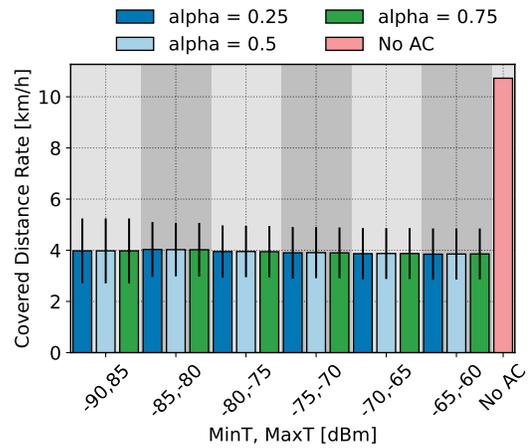


Fig. 8. Distance using AC for different alpha values and RSSI thresholds.

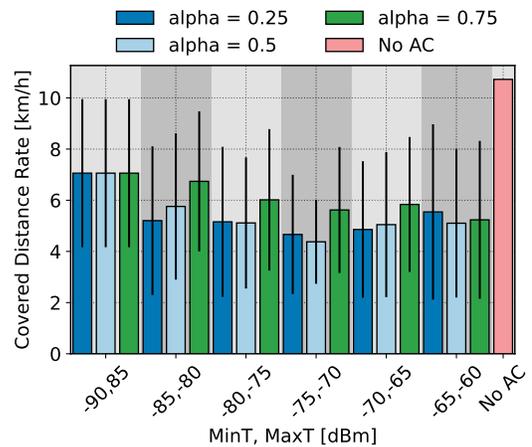


Fig. 9. Distance using ACR for different alpha values and RSSI thresholds.

since it has to reduce its speed to be within the communication range of node A. This is an overhead that some applications might not be able to afford. Respectively, some applications might be able to afford a lower throughput in exchange with more covered distance. This is achieved by ACR in Figure 9 where the mean covered distance is 7 km/h when the threshold values were -95 , -85 . This happened because node B spent more time disconnected from the TSCH network of course as it is indicated from Figure 7. The trade-off described from the results is that the throughput is disproportionate with the downtime and the covered distance.

In the spirit of quantifying these trade-offs, we defined Equation 3, which is able to depict the performance based on a predefined bias. β is the parameter which defines the bias between the covered distance and the throughput, D stands for the distance the node travel at the regading scenario, D_{max} is the distance the node travels without AC features, T is the achieved throughput for the regarding scenario and T_{max} the maximum threshold it can be achieved in the simulation if the downtime is 0%. We decided to illustrate results concerning

ACR mechanism since they are more disparate.

$$P = \beta \frac{D}{D_{max}} + (1 - \beta) \frac{T}{T_{max}} \quad (3)$$

The main trend we see in Figure 10 is that when there is a lower weight towards the distance or in other words, when β is lower, the performance increases when the thresholds are higher. The higher thresholds make the ACR more aggressive to change the node speed which results on better throughput. Apparently this stands for the other hand as well. When β is larger the performance increases for lower thresholds, meaning that there is higher reward on moving faster and lower reward on having higher throughput. This is achieved when the thresholds are lower and the ACR is more conservative on changing the node speed. This results from Figure 10 can be used as a design guideline to help selecting the configuration parameters on a specific scenario that has to fulfil specific application requirements. Furthermore the configuration parameters can be changed dynamically based on the performance. For instance, if an application is focusing more on the reliability but throughout the execution of the scenario the application requirements (*e.g.* distance) are exceed in a high degree and affect the energy resources, it can change the configuration parameters to focus more on the application requirements instead and conserve more energy.

VI. CONCLUSION

We introduced AC approach for TSCH networks including mobile nodes. AC can regulate the speed of the nodes to increase the reliability by keeping the nodes associated within the TSCH network by notifying them when they are going out of coverage. Utilizing Cooja simulator and generating a simplistic scenario we manage to quantify the performance of two versions of AC. One where a node knows the position of the other nodes and therefore knows if it should accelerate or decelerate its speed to stay within range and another one where the node does not know and have to guess using a random function. The results show that the reliability can be increased but there is an impact on the distance and consequently on the application performance. We describe this trade-off and discuss that depending on the application requirements it can be crucial or not. Furthermore we model this trade-off based on a bias and we evaluate the performance towards reliability or the application requirements. As future work we plan to evaluate AC with more complex topologies and real experiments including smart car kits and real IoT nodes. Moreover, the case of ACR would be investigated if it can be implemented with Reinforcement Learning methods [30] to replace the random guessing.

VII. ACKNOWLEDGEMENTS

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REFERENCES

- [1] S. Duquenooy, A. Elsts, B. A. Nahas, and G. Oikonomou, "TSCH and 6TiSCH for Contiki: Challenges, Design and Evaluation," in *2017 13th International Conference on Distributed Computing in Sensor Systems (DCOSS)*, pp. 11–18, 2017.
- [2] E. Sisinni, A. Saifullah, S. Han, U. Jennehag, and M. Gidlund, "Industrial Internet of Things: Challenges, Opportunities, and Directions," *IEEE Transactions on Industrial Informatics*, vol. 14, no. 11, 2018.
- [3] D. Chen, M. Nixon, and A. Mok, *WirelessHART(TM): Real-Time Mesh Network for Industrial Automation*. Springer, 2010.
- [4] T. Chang, M. Vučinić, X. Vilajosana, S. Duquenooy, and D. Dujovne, "6TiSCH Minimal Scheduling Function (MSF)," RFC 9033, 05 2021.
- [5] S. Duquenooy, B. Al Nahas, O. Landsiedel, and T. Watteyne, "Orchestra: Robust Mesh Networks Through Autonomously Scheduled TSCH," in *Proceedings of the 13th ACM Conference on Embedded Networked Sensor Systems, SenSys '15*, (New York, NY, USA), p. 337–350, Association for Computing Machinery, 2015.
- [6] A. Elsts, X. Fafoutis, G. Oikonomou, R. Piechocki, and I. Craddock, "TSCH Networks for Health IoT: Design, Evaluation, and Trials in the Wild," *ACM Trans. Internet Things*, vol. 1, Apr. 2020.
- [7] Z. Shelby and C. Bormann, *6LoWPAN: The Wireless Embedded Internet*. Wiley, 2009.
- [8] C. Orfanidis, A. Elsts, P. Pop, and X. Fafoutis, "TSCH Evaluation Under Heterogeneous Mobile Scenarios," *IoT*, vol. 2, no. 4, pp. 656–668, 2021.
- [9] C. Wang, J. Wang, J. Wang, and X. Zhang, "Deep-Reinforcement-Learning-Based Autonomous UAV Navigation With Sparse Rewards," *IEEE Internet of Things Journal*, vol. 7, no. 7, pp. 6180–6190, 2020.
- [10] B. V. Philip, T. Alpcan, J. Jin, and M. Palaniswami, "Distributed Real-Time IoT for Autonomous Vehicles," *IEEE Transactions on Industrial Informatics*, vol. 15, no. 2, pp. 1131–1140, 2019.
- [11] M. Jayasuriya, R. Ranasinghe, and G. Dissanayake, "Active perception for outdoor localisation with an omnidirectional camera," in *2020 IEEE/RSJ International Conference on Intelligent Robots and Systems (IROS)*, pp. 4567–4574, IEEE, 2020.
- [12] L. Marchegiani and P. Newman, "Learning to listen to your ego-motion: Metric motion estimation from auditory signals," in *Annual Conference Towards Autonomous Robotic Systems*, pp. 247–259, Springer, 2018.
- [13] P. Simoens, M. Dragone, and A. Saffiotti, "The internet of robotic things: A review of concept, added value and applications," *International Journal of Advanced Robotic Systems*, vol. 15, no. 1, 2018.
- [14] A. Kamilaris and N. Botteghi, "The penetration of internet of things in robotics: Towards a web of robotic things," *Journal of ambient intelligence and smart environments*, no. Preprint, pp. 1–22, 2020.
- [15] O. Bartlett, C. Gurau, L. Marchegiani, and I. Posner, "Enabling intelligent energy management for robots using publicly available maps," in *2016 IEEE/RSJ International Conference on Intelligent Robots and Systems (IROS)*, pp. 2224–2229, 2016.
- [16] P. Ondruška, C. Gurău, L. Marchegiani, C. H. Tong, and I. Posner, "Scheduled perception for energy-efficient path following," in *2015 IEEE International Conference on Robotics and Automation (ICRA)*, pp. 4799–4806, 2015.
- [17] F. Osterlind, A. Dunkels, J. Eriksson, N. Finne, and T. Voigt, "Cross-Level Sensor Network Simulation with COOJA," in *Proceedings. 2006 31st IEEE Conference on Local Computer Networks*, pp. 641–648, 2006.
- [18] "IEEE Standard for Low-Rate Wireless Networks," *IEEE Std 802.15.4-2015 (Revision of IEEE Std 802.15.4-2011)*, pp. 1–709, 2016.
- [19] "IEEE Standard for Local and metropolitan area networks—Part 15.4: Low-Rate Wireless Personal Area Networks (LR-WPANs)," *IEEE Std 802.15.4-2011 (Revision of IEEE Std 802.15.4-2006)*, pp. 1–314, 2011.
- [20] Y. Al-Nidawi, H. Yahya, and A. H. Kemp, "Impact of mobility on the IoT MAC infrastructure: IEEE 802.15.4e TSCH and LLDN platform," in *2015 IEEE 2nd World Forum on Internet of Things (WF-IoT)*, 2015.
- [21] Y. Al-Nidawi and A. H. Kemp, "Mobility Aware Framework for Timeslotted Channel Hopping IEEE 802.15.4e Sensor Networks," *IEEE Sensors Journal*, vol. 15, no. 12, pp. 7112–7125, 2015.
- [22] S. Raza, T. V. D. Lee, G. Exarchakos, and M. Güneş, "A Reliability Analysis of TSCH Protocol in a Mobile Scenario," in *2019 16th IEEE Annual Consumer Communications Networking Conference (CCNC)*, pp. 1–6, 2019.
- [23] A. Elsts, J. Pope, X. Fafoutis, R. Piechocki, and G. Oikonomou, "Instant: A TSCH Schedule for Data Collection from Mobile Nodes," in *Proceedings of the 2019 International Conference on Embedded*

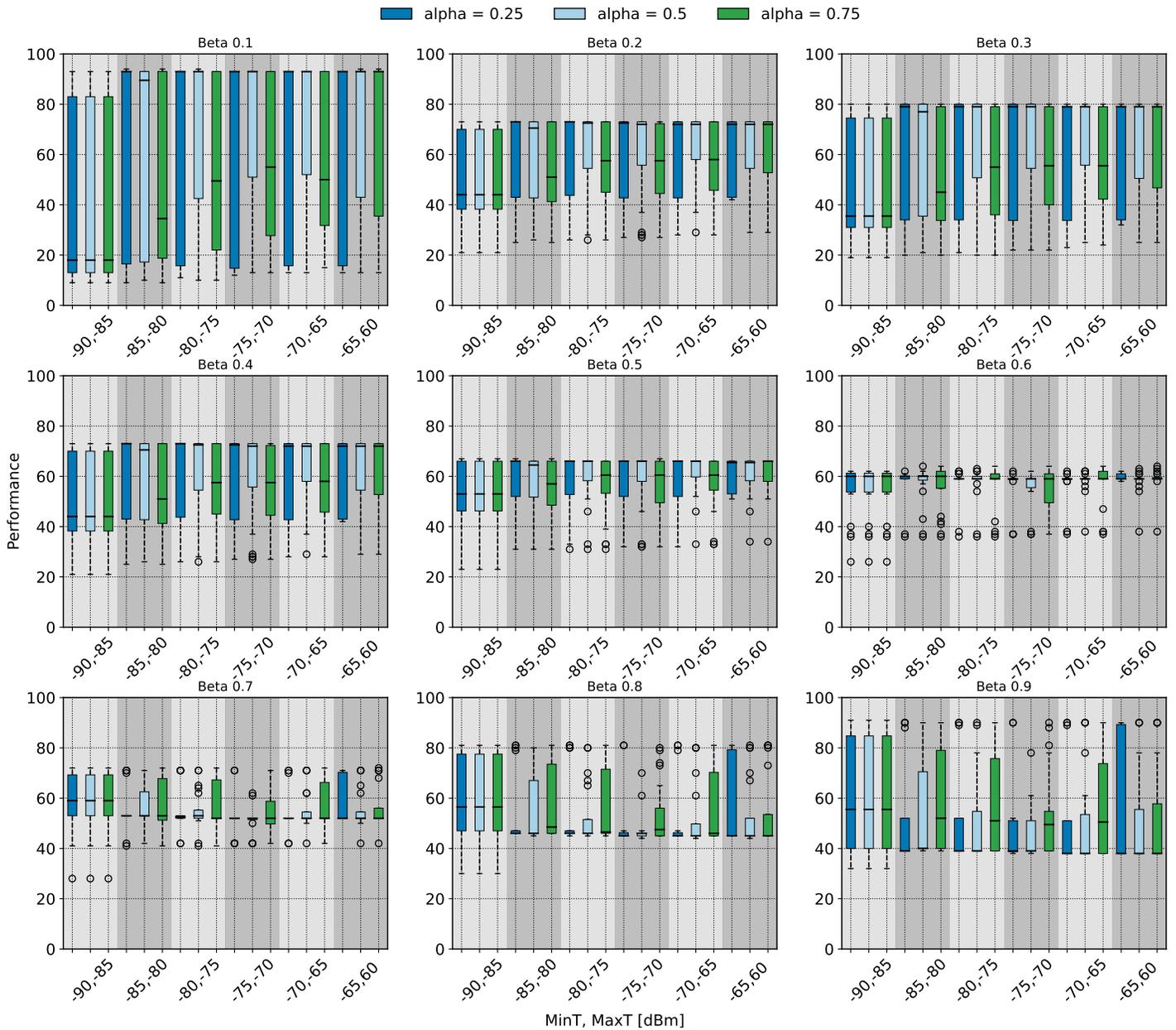


Fig. 10. Performance of the ACR based on a bias tradeoff between reliability and distance. The Beta value on the top of the figures represents the bias which is proportionate with distance disproportionate with reliability.

Wireless Systems and Networks, EWSN '19, (USA), p. 35–46, Junction Publishing, 2019.

[24] S. Kim, H.-S. Kim, and C. Kim, “ALICE: Autonomous Link-Based Cell Scheduling for TSCH,” in *Proceedings of the 18th International Conference on Information Processing in Sensor Networks*, IPSN '19, (New York, NY, USA), Association for Computing Machinery, 2019.

[25] B. Safaei, A. Mohammadsalehi, K. T. Khoosani, S. Zarbaf, A. M. H. Monazzah, F. Samie, L. Bauer, J. Henkel, and A. Ejlali, “Impacts of Mobility Models on RPL-Based Mobile IoT Infrastructures: An Evaluative Comparison and Survey,” *IEEE Access*, vol. 8, pp. 167779–167829, 2020.

[26] M. Barcelo, A. Correa, X. Vilajosana, J. L. Vicario, and A. Morell, “Novel Routing Approach for the TSCH Mode of IEEE 802.15.4e in Wireless Sensor Networks with Mobile Nodes,” in *2014 IEEE 80th Vehicular Technology Conference (VTC2014-Fall)*, pp. 1–5, 2014.

[27] I. Rabet, S. P. Selvaraju, M. H. Adeli, H. Fotouhi, A. Balador, M. Vahabi, M. Alves, and M. Björkman, “Pushing IoT Mobility Management to the Edge: Granting RPL Accurate Localization and Routing,” in *2021 IEEE 7th World Forum on Internet of Things (WF-IoT)*, pp. 338–343, 2021.

[28] R. C. Shah and L. Nachman, “Interference Detection and Mitigation in IEEE 802.15.4 Networks,” in *Proceedings of the 7th International Conference on Information Processing in Sensor Networks*, IPSN '08, (USA), p. 553–554, IEEE Computer Society, 2008.

[29] C. Orfanidis, L. M. Feeney, M. Jacobsson, and P. Gunningberg, “Investigating interference between lora and ieee 802.15.4g networks,” in *2017 IEEE 13th International Conference on Wireless and Mobile Computing, Networking and Communications (WiMob)*, pp. 1–8, 2017.

[30] J. Kober, J. A. Bagnell, and J. Peters, “Reinforcement learning in robotics: A survey,” *The International Journal of Robotics Research*, vol. 32, no. 11, pp. 1238–1274, 2013.