# Seminar: Distributed Computer Systems SS23

On the Reliability of LTE Random Access: Performance Bounds for Machine-to-Machine Burst Resolution Time

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Abstract—Cellular networks are becoming increasingly important. Currently, the predominant technology for setting up mobile networks is 4G LTE which is used extensively to server a large number of users. That is why performance of LTE Networks is of high importance. For setting up connections, the RACH Procedure is the bottleneck, reducing the number of devices that can connect at the same time and increasing the time, until a burst arrival of devices is resolved. In the Paper "On the Reliability of LTE Random Access: Performance Bounds for Machine-to-Machine Burst Resolution Time" [1] the authors analyse the performance limits of the RACH Procedure and the impact of different access barring policies. In this Seminar work the necessary background is presented and the findings are summarised. The theoretical analysis is further validated via large scale simulations run in CPython using Numpy.

#### I. Introduction

Cellular Networks serve a high number of users over large areas. The most used technology for mobile communication networks is 4G Long Term Evolution (LTE), while the usage of 5G NR networks is steadily increasing. In Germany 97.1% of the surface is at least served by one LTE Provider [2]. These systems also supply a large number of devices thereby holding a challenge from a performance standpoint. In Germany over 74.5 Million active SIM cards were served by roughly 85,000 LTE Base Stations [2]. In addition to that over 58.3 Million Machine to Machine(M2M) SIM Cards were operating without active users [2].

One common occurrence in LTE systems is the arrival of many user equipments (UEs) in a short period of time which can be characterised as burst arrival. One scenario of a burst arrival are power outages. Base Stations are usually not supplied with emergency power leading the base station to shut down during power outages. On power restoration and reboot, most devices in the cell will try to reconnect in a short time leading to a burst arrival. Another scenario of burst arrivals are emergency situations, during which many users will either seek help, information or just call a relative. More burst arrival scenarios are described in [3]. All these actions will lead to a burst arrival because many devices will be switching from idle mode to a connected state. Also, sensor networks can cause burst arrivals simply by reporting data at the same time.

To all burst arrivals of devices, the Random Access Channel(RACH) Procedure is the main bottleneck increasing the burst resolution time exponentially as the number of

devices approaches the cell capacity. However, in emergency situations large delays are unacceptable for some users. In industrial M2M networks devices even need guarantees for reaching a connected state. For that reason the authors of [1] analyse the performance of LTE Networks under burst arrivals. The authors use recursive methods as well as probabilistic methods to derive methods, which can compute the probability for burst resolution by a given time.

The standardised mechanism to deal with burst arrivals in LTE is the usage of Access Class Barring Policies. These Policies reduce the number of admitted UEs thereby avoiding congestion.

In [1] the authors present such Policies and analyse their impact on the burst resolution probability. The necessary background for this analysis is presented in this seminar work and the results of [1] are summarised. Further large scale simulations are implemented and compared to the findings of [1]

## II. LTE SYSTEM BACKGROUND

This section provides the necessary background to understand the LTE startup procedure, abstract from the physical layer and to analyse the Access Barring Policies

#### A. LTE Startup procedure

LTE end-to-end systems are structured into 2 parts, the Evolved UMTS Terrestrial Radio Access Network (E-UTRAN) and the Evolved Packet Core (EPC). The E-UTRAN consists of all base stations (eNodeB), their respective cells and user equipment (UE). UEs are in many cases mobile phones. However, they can also be sensor networks, cars or other smart devices, which either do not have a wired connection to a service provider or have a roaming behaviour. The EPC has the responsibility to authenticate the user sim cards, fetch the subscriber data and provides control functionality as well as a gateway to the internet. The structure of LTE networks is shown in figure 1.

An UE will first connect to an eNodeB, which provides a connection to the EPC and the internet. After the connection with the eNodeB is fully established, the UE will be in the Radio Resource Control (RRC) Connected State, which allows it to send data via the eNodeB. This connection is only in the E-UTRAN. Typically, the UE will follow up

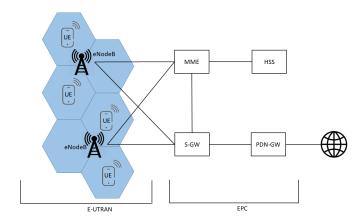


Fig. 1. Example structure of an LTE network. The Network is partitioned into E-UTRAN and EPC

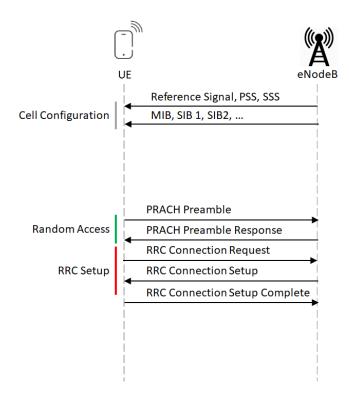


Fig. 2. Over the Air messages during the LTE Startup Phase. After Cell configuration 5 Messages have to be exchanged.

with an attachment procedure with the EPC and some other procedures, which in turn will allow the UE to access the internet. Nevertheless, the Startup Procedure until the RRC Connected State will be the first bottleneck, which the UE will encounter.

The Startup Procedure is depicted in figure 2. After turning on, the UE will first search for the Reference Signal, the Primary Synchronisation Signal(PSS) and the Secondary Synchronisation Signal(SSS). Evaluating these signals will

allow the UE to compensate frequency offsets and synchronise with the eNodeB . After synchronisation the UE will be able to receive the Master Information Block (MIB) and the System Information Blocks (SIBs), of which SIB1 and SIB2 are the most important for this work. MIB and SIB1 will contain important cell parameters, such as the coding scheme, the current Frame Number and the scheduling of further SIBs.

Acquiring this information enables the UE to receive SIB2, which announces the beginning of Random Access Channel (RACH) contention phases and the expected receiving signal power. If the UE wants to connect to the eNodeB, it has to wait for the beginning of a RACH contention phase. During a RACH contention phase the UE will select one RACH preamble out of a given Number of Preambles M and send it to the eNodeB on the RACH. The eNodeB will respond with RACH Response, which contains a grant for each selected Preamble. This grant assigns the UE some resources in the network. The UE can use these resources to send an RRC Connection Request to the eNodeB on a different frequency at a scheduled timeslot. The RRC Connection Request will contain the required parameters to sign up the UE at the eNodeB. The eNodeB will respond with an RRC Connection Setup message, assigning an identifier for the UE and providing information about the channels, which the UE is now allowed to use. The UE will confirm this message with an RRC Connection Setup Complete message and enter the RRC Connected State.

## B. LTE Physical Layer and collisions

LTE uses Orthogonal Frequency Division Multiplexing(OFDM) [4]. This means that LTE signals consist of multiple sub-carriers, which are orthogonal placed into the frequency spectrum. The sub-carriers are therefore independent of each other and can send symbols without interference of other sub-carriers.

In LTE time is divided into Frames with a duration of 10ms. LTE Frames are further divided into sub-frames with a duration of 1ms each containing 2 Symbols, sometimes also called slots. These Symbols are then modulated onto sub-carrier using Amplitude Modulation. The Time division scheme of LTE is depicted in Figure 3.

Physical Resource Blocks (PRB) are then defined as symbols mapped to each sub-carrier. Usually PRBs contain multiple sub-carriers. PRBs can be visualised in a Resource Grid and are the smallest unit of assignable resources in LTE Networks as shown in figure 4. The eNodeB will give grants to the UE, which allow the UE to use specific PRBs to contact the eNodeB. In the same way, the eNodeB will reserve some PRBs for Messages send by the eNodeB. Usually each transmission is 1 sub frame long but this does not mean that only 2 Symbols can be sent. 1 option to transmit large messages is obviously to partition the message into multiple smaller messages. As an alternative, multiple sub-carriers



Fig. 3. Time Division in LTE Systems [4]. Time is divided into frames, sub frames and slots

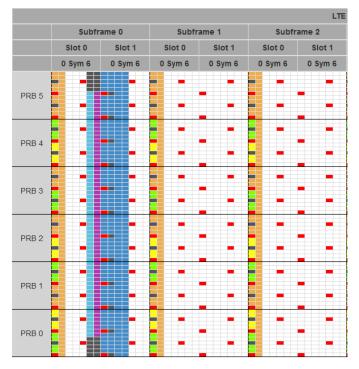


Fig. 4. An example assignment of a Resource Grid [5]. Coloured PRBs are assigned for some task

can be used together to send multiple symbols at the same time. Finally different modulation and coding schemes can be applied to compress more data into these 2 symbols.

The Physical Random Access Channel (PRACH) Configuration is broadcast by the eNodeB and therefore is equal for all UE implying each UE participating in the contention phase will use the PRB. The expected receiving signal power is also broadcast and timing requirements are very strict. If multiple UEs send the same message to the UE, the messages will overshadow each other and the eNodeB can decode the message successfully. On the other hand if different messages are send in the same PRB, the messages will therefore collide most likely destroying the messages. In rare cases the eNodeB might be able to decode one of the different messages, e.g. when one UE uses more sending power than broadcast. However, because UEs are typically

mobile and run on battery power, they usually want to save as much power as possible and will not use a higher signalling power. RACH Preambles are an exception to this rule because they are by design not destructible. This implies that multiple UEs can send different RACH Preambles to the eNodeB in the same PRB, which will not interfere with each other. In this case, multiple UEs will be assigned the same grant for the RRC Connection Request. Again this will lead to multiple UEs sending a Connection Request Message in the same PRBs. Because the Connection Request Message contains UE specific parameters, these messages will be different from each other. RRC Connection Request Messages will interfere with each other in contrast to RACH Preambles, so there will be a collision destroying all RRC Connection Requests.

In summary if multiple UEs choose the same Preamble, the RACH Procedure will not complete because the RRC Connection Request Messages will collide destructively.

# C. Access Barring Policies

A Network Operator will try to avoid that multiple UEs select the same RACH Preamble, because this leads to collision and wasted resources, as described in section II-B and [3]. Additionally, because the UEs did not finish the RACH Procedure successfully, they will participate in the next RACH contention phase, effectively using even more resources. This can lead to a very long connection time or even deadlocks, if the number of UEs trying to connect N is much larger than the Number of Preambles: M

The most straightforward solution to this problem is to increase the number of Preambles M. Because Preambles are designed to be non-destructive between each other, there is a natural limit of 64 Preambles

$$M \le 64$$

which can not be exceeded. Also in reality the number of Preambles is further limited by the quality of the physical channel and the already present traffic reducing the number of grants. As a result the network operator is usually not able to allow more PRACH Preambles.

Access Barring Policies provide a different solution to the deadlock Problem [3]. In SIB2 the eNodeB can specify an Access Barring Policy(ACB). This ACB specifies a probability p that a UE can participate in the RACH Procedure. If probability p < 1 is set, the UE will a run random throw on a binomial distribution with weight p, whether it is admitted to this specific PRACH contention window. In case to many UEs try to use the RACH Procedure at the same time, the eNodeB can therefore lower p reducing the number of admitted UEs and lowering the required time, until all UEs are connected. The expected number of admitted UEs then be:

$$E[N] = Np \tag{1}$$

SIB2 even allows setting the access probability differently for different UE classes. This enables the eNodeB to give preference to emergency services or put sensor networks at a disadvantage.

The most basic Access Barring Policy is obviously just setting

$$p = 1 \tag{2}$$

This implies that Access Barring is essentially not used.

An improvement over that is to use the static access barring policy. The intuition of this policy is to just set

$$p = x , x < 1 \tag{3}$$

and leave it for the entire run. Static access barring policy can therefore reduce the number of admitted UEs by a factor x. On the downside static access barring policy is insensitive to the number of UEs trying to connect which might lead to p not being optimal. In general p has to be lowered if many UEs are active and increased if only a few UEs are active. So if many UEs are active, a static p will probably be too high and if few UEs are active p will be too low. In fact there is always an optimal solution for setting p. The authors of [6] showed that the optimal access barring policy is to set

$$p_i = \min\left\{1, \frac{M}{B(i)}\right\} \tag{4}$$

where  $p_i$  is the access probability and B(i) is the access probability in contention window i. Optimal Access Barring policy assumes, that the backlog B(i) is known to the eNodeB. However, in reality the eNodeB does not know the backlog and has only access to statistics about past contention windows and channel quality. That is why the authors of [7] propose dynamic access barring policy, which is based on the past number of idle preambles and the number of successful completed PRACH Procedures. The dynamic access barring policy is shown in Algorithm 1.

# Algorithm 1 Dynamic Access Barring with estimation [7]

- 1: Initialize  $v_0 = M$  and  $p_0 = 1/M$
- 2: if the number of idle preambles is r then
- 3:  $\Delta v = 0.582 \cdot M 1.582 \cdot r$
- 4:  $v_{t-1} = v_{t-1} + \Delta v$
- 5:  $a_t = \max(0, \Delta v)$
- 6:  $v_t = v_{t-1} + a_i s_i$
- 7: end if
- 8:  $v_t = \max(M, v_t)$  and  $p_t = \min\left(1, \frac{M}{v_t}\right)$

# III. ANALYSIS

This sections present the results of the Paper [1].

#### A. Assumptions

Because the frequency of PRACH contention windows is depending on the eNodeB, cell conditions and already active users, time is partitioned into discrete time steps t. At  $t_0$  the burst arrival occurs.  $t_1..t_n$  are then the PRACH contention windows following  $t_0$ . This abstracts from the variable frequency of PRACH contention windows. An LTE System can then be characterised as the tuple

$$sc = (M, N, a_i, acb)$$

where

M is the number of Preambles

N is the number of UEs arriving at  $t_0$ 

 $a_i$  is the number of UEs arriving at  $t_i$ 

acb is the used ACB Policy

Additionally, the required Quality of Service can be defined as a tuple

$$qos = (b^{\epsilon}, t, \epsilon)$$

with  $b^{\epsilon}$  being the required backlog at time t with a probability  $1-\epsilon$ . So  $\epsilon$  is the probability of violating the QoS requirement For many simulations or analysis results some of these parameters will be fixed and the missing parameters are calculated such that the QoS Requirement can be satisfied by the system.

For the analysis presented, it is further assumed that all steps of the PRACH procedure occur before the next PRACH contention windows. That implies that every UE knows whether its last PRACH procedure was a success. Successful connected UEs will therefore not try to connect again. Further this implies, that it is sufficient to evaluate the number of times each preamble has been chosen to get the number of successful PRACH Procedures. However, not connected UEs will all try the PRACH Procedure (depending on ACB) in the next PRACH contention window. For dynamic access barring policies, which change the admission probability p regularly, it is additionally assumed, that p can be reconfigured between each time step

With the above assumptions the RACH Procedure is essentially modelled as an M-channel slotted ALOHA protocol where each Preamble is mapped to a channel. This enables the usage of performance analysis on M-channel slotted ALOHA instead.

#### B. Recursive Analysis

The success of a given Preamble m in timeslot i is defined as

$$s_{i,m} = \begin{cases} 1 & \text{if chosen by 1 UE} \\ 0 & \text{otherwise} \end{cases}$$
 (5)

Using this notation the number of successful connected UEs  $s_i$  in timeslot i can be defined as

$$s_i = \sum_{m=0}^{M} s_{i,m} \tag{6}$$

The backlog at time slot i can then be recursively defined as

$$B(i) = B(i-1) + a_i - s_i (7)$$

The intuition of this formula is that the Backlog at time i depends on the backlog at time i-1. Then some UEs may arrive additionally and some UEs might connect successful. In case ACB is used one can compute the expected number of admitted UEs b' with

$$b' = (B(i-1) + a_i) \cdot p \tag{8}$$

Again the intuition is simply to compute the expected value for all UEs participating having success with probability p, which is defined by the ACB

#### C. Probabilistic Analysis

Assuming a system with backlog b' the probability distribution for  $s_i$  can be described as [1]:

$$P[s_i = k, b'_i = x] = {x \choose k} {M \choose k} \frac{k!}{M^x}$$

$$\times \sum_{j=1}^{\min(m-k, x-k)} (-1)^j {M-k \choose j} {x-k \choose j} j! (M-k-j)^{x-k-j}$$

(10)

With that, the service can be described as Moment Generating Function (MGF) as follows [1]:

$$\overline{M}_{S}(\theta) = \left(\sum_{k=0}^{M} \sum_{x=0}^{N} \frac{M^{x} e^{-m}}{x!} P[s_{i} = k, b'_{i} = x] e^{-\theta k}\right)$$
(11)

This MGF describes the probability distribution of the service. Usually MGF describe probability distributions. However, because the service of the system can be described as a probability function MGFs are applicable. One can use this to compute the burst resolution violation probability as follows:

$$\epsilon(b^{\epsilon}, t) = \inf_{\theta} \left\{ e^{-b^{\epsilon}\theta} \cdot \left( e^{\theta N} \overline{M}_{S}(\theta)^{t} + \overline{M}_{S}(\theta) \frac{1 - \overline{M}_{S}(\theta)^{t-1}}{1 - \overline{M}_{S}(\theta)} \right) \right\}$$
(12)

This formula enables a fast computation of the burst resolution violation probability compared to the recursive formula in III-B. However, this formula is only accurate for  $b^{\epsilon} >> M$  and becomes very conservative when  $b^{\epsilon} \to M$  as claimed int [1]. For that reason this formula can not be used directly. The usage of the formula is restricted to  $B(i) \geq cM$  with the following formula [1]:

$$P[t_1 + t_2 \ge t] = P[t_1 \ge t - x]P[t_2 = x]$$
 (13)

$$<\epsilon(cM, t-x)P[t_2=x]$$
 (14)

The intuition of this formula is, that time is partitioned into 0 to  $t_1$  and  $t_2$ . The backlog is also partioned into N to cM and cM to 0 where c > 1 is a new variable, which is set before calculation. This allows to compute the backlog probability to reach Backlog cM with formula 24 which is fast. Then only the backlog probability to reduce the remaining backlog cM has to be computed using the recursive formula in III-B. Because the backlog has been significantly reduced to  $cM \ll N$ , this will be fast in comparison to calculating the whole error probability recursively. It is further shown in [1], that the proposed solution get results close to real world examples by running simulations in OMNeT++, which is a framework for simulating large communication networks. OMNeT++ does also simulate physical properties therefore not relying on assumptions about the physical layer. However, the authors do not explain, whether reaction times and schedules are simulated or if the assumptions from III-A are used.

#### D. Discussion

Most of the assumptions in III-A make sense in respect to real world system. One might criticise, that in many cases the UE will not have finished the RACH Procedure before the next RACH contention window begins. The maximum response time for RACH is between 3ms and 12ms as is specified in SIB2 [4]. In practice, the response time will be more towards the upper end of that spectrum because decoding, reacting, and creating the response takes some time. In previous experiments using an NUC11 [8], an Intel® Core<sup>TM</sup> i7-1165G7 Processor, SRSRAN [9] and USRP B210 [10] I measured a minimum achievable reaction time of 7ms. This lower bound for reaction time has also been measured by [11]. This leads me to believe that reaction times will rather be in the range of 7ms to 12ms than lower. This also implies that the RACH Procedure will not be finished in most cases, because almost all RACH contention window schedules have a lower periodicity [4]. However, this will only defer the burst resolution by a few frames, because this simply means, that UEs with a successful RACH procedure might leave one or 2 contention windows later.

The analysis framework presented enables fast computation because it does not rely on recursive formulas with a large recursion depth. However, the parameter c still has to be tuned for the given scenario to find suitable approximations.

# IV. SIMULATION

For this seminar I implemented a simulation on the recursive backlog formula in section III-B. To improve the performance the formula was implemented as an iterator instead of a recursive Function. Using an iterator removes unnecessary function calls and minimises the memory profile therefore allowing large scale simulations in a parallel execution. The behaviour of the iterator is shown in algorithm 2.

Generating large samples is done using Numpy in order to use the performance of the underlying C++ framework

## Algorithm 2 Simulation Loop

- 1: Initialize N and  $p_0 = 1/M$
- 2: while  $B > b^{\epsilon}$  or  $t_c < t$  do
- 3:  $t_c + = 1$
- 4: draw B samples from a binomial distribution to get nr. admitted UEs a
- 5: draw a random integer samples from a uniform distribution [0..M]
- 6: count the number of occurrences of each preamble
- 7:  $s_i$  = number of preambles chosen exactly once
- 8:  $B-=s_i$
- 9: update p for dynamic ACB policies
- 10: end while
- 11: if  $B > b^{\epsilon}$  then
- 12: return success
- 13: **else**
- 14: return failure
- 15: **end if**

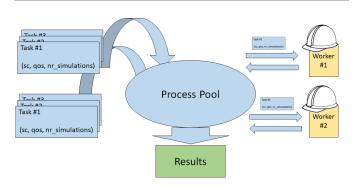


Fig. 5. scheme of the simulation setup. A process pool is used to distribute task to workers.

as much as possible. Simulations over ranges of parameters are implemented using a process worker pool. The scheme of the simulation setup is depicted in figure 5. Each task is characterised by a tuple

$$(sc, qos, nr\_simulations)$$

and submitted to the worker pools. sc and qos are implemented similar to their definition in III-A. From there multiple workers can take executed task and run it independently. This requires each task to be completely independent of each other. By design simulations should not interfere with each other. However, extra care has to be taken, that no shared objects are used which would slow down calculation and would invalidate simulation results. A process pool worker is used instead of a thread pool worker to avoid the Global Interpreter Lock (GIL). GIL is a mechanism, that restricts the usage of the python interpreter to one thread at the time. From a programming standpoint, GIL can be seen as a kind of mutex, essentially halting all other threads until the current thread is finished. The purpose of GIL is to guarantee consistency of python objects and prevent side effects or non-deterministic

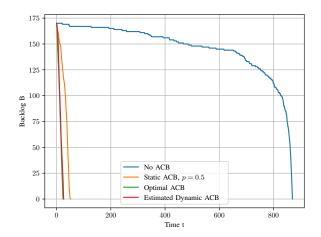


Fig. 6. Backlog over Time as line chart for different ACB, M=20, N=170. When using ACB the resolution time is exponentially large. Optimal and estimated ACB perform similar

behaviour, which might occur because of parallel execution. Since the simulations tasks are independent of each other, GIL is not needed and should be prevented. Spawning of multiple processes costs extra resources. For that reason, each Task consists of a given number of simulations. This avoids spawning a new Process for every simulation instance, which would again slow execution down.

The typical use case for thread pools is usually IO limited tasks, justifying their existence for different types of large scale operations.

## V. SIMULATION RESULTS

Figure 6 shows the typical course of the Backlog over Time for the ACB Policies described in II-C. We observe that the given System is at its limit when using no ACB, which has exponentially increased the burst resolution time. This can be solved using ACB. The estimated dynamic ACB Policy is also very close to the optimal solution. However, we will later see, that the estimated dynamic ACB Policy still has a performance overall.

Next we can analyse the violation probability  $\epsilon$  for different allowed backlogs  $b^{\epsilon}$  as depicted in figure 7 Again we observe exponential behaviour as the system reaches the maximum QoS it can deliver. The vertical line at backlog = 5 implies that for  $b^{\epsilon} \geq 5$  the violation probability was always 0:  $\epsilon = 0$  This simulation results supports the findings in [1]. However, the authors forget to explicitly state that t=15 which made finding this configuration difficult.

Figure 8 then shows the maximum number of UEs a cell with 10 Preambles can support, for different violation

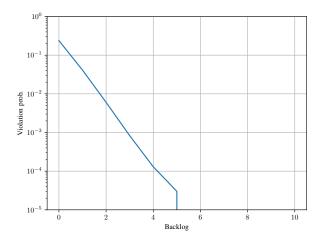


Fig. 7. violation Probability vs. max. allowed backlog as line chart.  $b^\epsilon$ ,  $M=30,\ N=100,\ t=15$ , static ACB  $p=0.5,\ 100000$  Samples. Allowing more backlog reduces the violation probability exponentially.

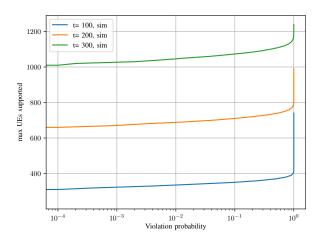


Fig. 8. maximum number of supported UEs vs total burst resolution violation probability as line chart for M=10

probabilities. We can observe exponential behaviour here as well implying that with higher number of UEs the violation probability for a given QoS will increase exponentially. This simulation uses the optimal ACB policy therefore the results are only theoretical.

Finally one can compare the optimal ACB policy against the estimated dynamic ACB policy. The simulation results are shown in 9 plotting the violation probability against vs the burst resolution time. We can infer, that the estimated dynamic ACB Policy generally needs more time to guarantee the same violation probability as the optimal ACB Policy. For m=20 this delay was about 25 time steps.

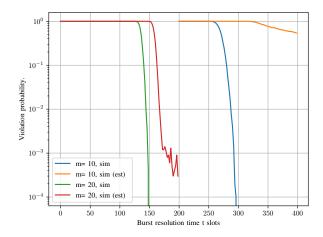


Fig. 9. Full burst resolution violation probability vs Burst resolution time , N=1000

## VI. RELATED WORK

Several studies have been conducted to analyse the performance of the Random Access Channel (RACH) procedure in Long-Term Evolution (LTE) networks. This section provides an overview of the key papers that have explored the performance bounds and characteristics of the RACH procedure.

In [12] Leyva-Meyorga et al. analyse the performance of the RACH Procdure in LTE networks. To do this, they use probabilistic analysis which is not based on Network Calculus but instead directly models the probabilities of choosing the same preamble multiple times. This obviously has the disadvantage of increased performance requirements for large search spaces.

The  $3^{rd}$  Generation Partnership Project, which is responsible for development of LTE standards, has also conducted its own simulations to measure the performance of the RACH procedure. Their findings are shown in [3].

Finally, for the development of 5G NR Jayashree Thota et al. compare the performance of the RACH procedure in 5G to the performance in 4G [13]. Their simulations suggest, that the shorter RACH procedure in 5G and other improvements can reduce the average access delay by up to 90%.

## VII. CONCLUSION

In this work, I presented the necessary background to understand the LTE Startup Procedure and analyse the RACH Procedure. For Burst Arrivals of large number, I showed how one can compute the backlog over time and how this can be implemented in a simulation. Further I summarised the results of [1]. The simulations done in this work support the findings of the paper in every aspect. For one case, the missing parameters were calculated. Future work can further improve the analysis method into finding a framework, which allows for even tighter computation of performance bounds. Additional work is also necessary to find good Values for c, which is essential for the analysis of the violation probability of QoS

Requirements. Finally, there exist more techniques than ACB, which can improve burst resolution time. These additional techniques still need to be added into the analysis framework to give complete insights into the possible performance bounds for the RACH Procedure.

## VIII. USAGE OF CHATGPT FOR THIS WORK

The impact of ChatGPT on this work is very limited. For the implementation I used ChatGPT to answer syntax specific questions as well as for the generation of minimal examples to improve the understanding of certain concepts. Usually this work is done using search-engines like "Google", official documentations and forums like "StackOverflow". ChatGPT proved as a good replacement for these technologies and provided answers, which were always correct. In some cases, the answer provided by ChatGPT was not precise enough but this could be sorted out by stating follow-up questions. ChatGPT also provided good solutions in English as well as in German. Some example prompts were:

- "How can multithreading with worker pools be done in python?"
- "What is the difference between a process pool and a thread pool executor?"
- "What does global interpreter lock in python mean?"

It was further attempted to generate the related work section VI with ChatGPT. However, this did not succeed as ChatGPT as no access to real scientific papers. In Fact extra care has to be taken, because in some instances, ChatGPT can be tricked into giving false references to papers, which do not even exist. An example prompt to show this is:

- 1) which papers analyse the performance of the RACH Procedure in LTE?
- based on these papers write a related work section for a scientific report on the performance bounds of the RACH procedure

Apart from that, ChatGPT was not used.

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#### ABBREVIATIONS AND ACRONYMS

ABBREVIATIONS AND ACRONING	
ACB	Access Barring
eNodeB	evolved NodeB (Base station)
EPC	evolved packet core
E-UTRAN	evolved UMTS Terrestrial Radio Access
GIL	Global Interpreter Lock
LTE	Long Term Evolution
M2M	Machine to Machine
MGF	Moment Generating Function
MIB	Master Information Block
PRACH	Physical Random Access Channel
PRB	Physical Resource Block
PSS	Primary Synchronisation Signal
RRC	Radio Resource Control
SIB	System Information Block
SSS	Secondary Synchronisation Signal
UE	User Equipment