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Workshop

At the crossroads of standards and research: AI/ML datasets for future networks

16 July 2024 Geneva, Switzerland

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TeleQnA: A Benchmark Dataset to Assess Large Language Models Telecommunications Knowledge

Antonio De Domenico Huawei Technologies





Antonio De Domenico

About

- Senior Researcher at Huawei Technologies, France
- Active in ITU-T SG 13- Future networks and emerging network technologies
- Leading IEEE ETI GenAl Dataset and Competitions activities
- Co-leading network energy efficiency in NGMN Green Future Network project

Current Research

Integrating AI/ML in 5G and beyond RANs

Contact

antonio.de.domenico@huawei.com





The Race of Language Models

Some key observations:

Doubling time of **LLM compute** requirements: 4-6 months

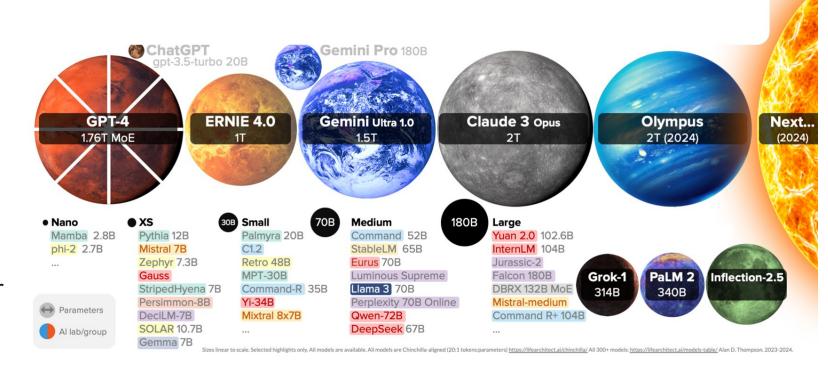
Way beyond Moore's law

Training cost of 10B model~1M\$

Open source models' **performance** lags **private models**' one by ~1 year

Chinchilla scaling laws: 20 text token/parameters

1.4T token for 70B model

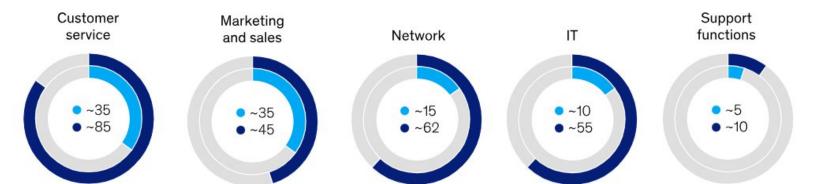




LLMs Use Cases and Expected Value in Telecoms

- Customer service Al chatbots
- Create personalized messages and visual media
- Analyzing specifications and maintenance data
- Streamline the entire software life cycle
- Improve employee productivity

Distribution of impact by business domain¹



Example use cases

Customer-facing chatbots, call-routing performance, agent copilots, bespoke invoice creation Content generation, hyperpersonalization, copilots for store personnel, customer sentiment analysis and synthesis Network inventory mapping, network optimization via customer sentiment analysis, enabling self-healing via customer sentiment analysis on network problems Copilots for software development, synthetic data generation, code migration, IT support chatbots

Share of total impact, %
 Share of surveyed business

Procurement optimization, workplace productivity, internal knowledge management, content generation, HR Q&A

leaders focused on domain. %



The distribution of impact by business domain is based on our experience working with telco companies to deploy gen Al and includes impacts on both capital expenditure and EBITDA.

Forthcoming Impact on the Telecoms Industry

ARTIFICIAL INTELLIGENCE AND DATA SCIENCE FOR COMMUNICATIONS

Large Language Models for Telecom: Forthcoming Impact on the Industry

Ali Maatouk, Nicola Piovesan, Fadhel Ayed, Antonio De Domenico, and Merouane Debbah

The authors delve into the inner workings of large language models, providing insights into their current capabilities and

ABSTRACT

Large language models (LLMs) — Al-driven models that can achieve general-purpose language understanding and generation — have

diverse domains [3], surpassing traditional NLP applications like machine translation and sentiment analysis. In fact, through domain-specific data, they can excel in tasks related to that particular domain. For instance, in medicine, LLMs may

Our goal: use LLMs to pave the way towards Network Automation by bridging the gaps between costumers, researchers, and engineers.

we delve into the inner workings of LLMs, provid-

based virtual tutor and classroom assistant.



ITU-T SG 13: Telecoms Requirements and GenAl Capabilities



SG13-TD763/WP1 STUDY GROUP 13

Original: English

Question(s): 20/13 Geneva, 4-15 March 2023

TD Editors Source: Draft new Technical Report ITU-T TR-GenAI-Telecom Networks: "Requirements Title: and methodology for deploying and assessing Generative AI models in telecom networks" Tel: +33-673462921 Contact: Antonio De Domenico Huawei Technologies Düsseldorf E-mail: antonio.de.domenico@huawei.com **GmbH** Germany Tel: +33-637153889 Nicola Piovesan. Contact: E-mail: nicola.piovesan@huawei.com Huawei Technologies Co. Ltd. China Xiaoqing Xu, Tel: +86-18998490768 Contact: China Telecom E-mail: xuxq@chinatelecom.cn China Yongsheng Liu Tel: +86-18601106253 Contact: China Unicom E-mail: liuys170@chinaunicom.cn China Qiyang Zhao Contact: Tel: +971-509663216 Technology Innovation Institute Email: Qiyang.Zhao@tii.ae UAE



CORRESPONDENCE GROUP ON DATASETS (CGDATASETS)

CGD-O-01

Original: English

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OUTPUT DOCUMENT

Source: Editors

Title: Draft Technical Report "Datasets standardization approaches for datasets applicable

for AI/ML in networks" – deliverable of the Correspondence Group on Datasets

(cgdatasets)

Contact: Vishnu Ram O.V Email: vishnu.n@ieee.org

Independent Expert

Keywords: Artificial Intelligence, datasets, Machine Learning, networks

Abstract: This document is the updated version of the Technical Report on "Datasets

standardization approaches for datasets applicable for AI/ML in networks",

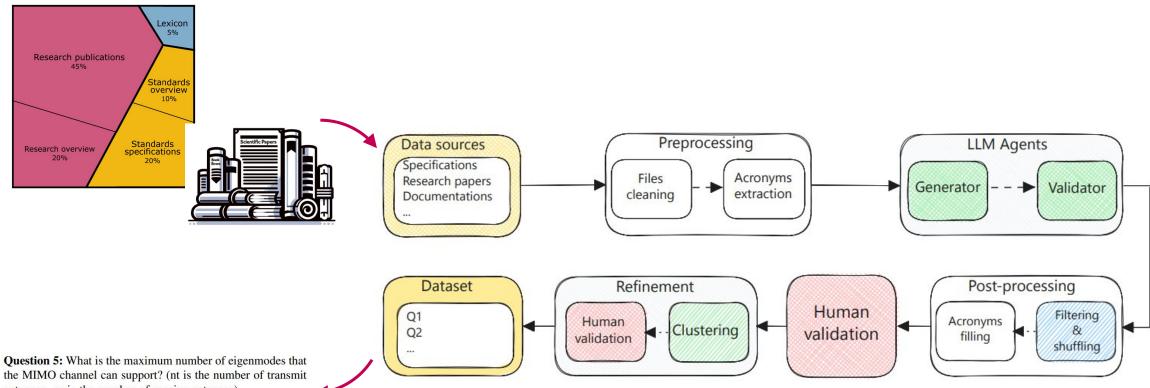
deliverable of the Correspondence Group on Datasets (cgdatasets).

This document is the updated version of the Technical Report on "Datasets standardization approaches for datasets applicable for AI/ML in networks", deliverable of the Correspondence Group on Datasets (cgdatasets) – output of the 12 April 2024 cgdatasets meeting (it includes some post-12 April meeting editorial clean-up).

- ITU-T SG13, TR.GenAl-Telecom, "Requirements and methodology for deploying and assessing Generative Al models in telecom networks" https://www.itu.int/itu-t/workprog/wp_item.aspx?isn=19366
- Correspondence Group for datasets applicable for AI/ML in networks (CG-datasets for AI/ML in networks) https://extranet.itu.int/sites/itu-t/studygroups/2022-2024/sg13/cg-datasets/SitePages/Home.aspx



Assessing the Telecoms Knowledge of LLMs



antennas, nr is the number of receive antennas)

- · Option 1: nt
- Option 2: nr
- Option 3: min(nt, nr)
- Option 4: max(nt, nr)

Answer: Option 3: min(nt, nr)

Explanation: The maximum number of eigenmodes that the

MIMO channel can support is min(nt, nr).

Category: Research publications

Automatic evaluation based on a LLM-generated dataset with human in the loop!!!



Assessing the Telecoms Knowledge of LLMs

Submitted to IEEE Wireless Communications

TeleQnA: A Benchmark Dataset to Assess Large Language Models Telecommunications Knowledge

Ali Maatouk*†, Fadhel Ayed*†, Nicola Piovesan†, Antonio De Domenico†, Merouane Debbah‡, Zhi-Quan Luo§
†Paris Research Center, Huawei Technologies, Boulogne-Billancourt, France

‡Khalifa University of Science and Technology, Abu Dhabi, UAE

§The Chinese University of Hong Kong, Shenzhen, China

Abstract—We introduce TeleQnA¹, the first benchmark dataset designed to evaluate the knowledge of Large Language Models (LLMs) in telecommunications. Comprising 10,000 questions and answers, this dataset draws from diverse sources, including standards and research articles. This paper outlines the automated question generation framework responsible for creating this dataset, along with how human input was integrated at various stages to ensure the quality of the questions. Afterwards, using the provided dataset, an evaluation is conducted to assess the capabilities of LLMs, including GPT-3.5 and GPT-4. The results highlight that these models struggle with complex standards-related questions but exhibit proficiency in addressing general

be observed in other domains, such as medicine and finance, where benchmark datasets like MultiMedQA [1] and FLUE [8] have been introduced to assess the proficiency of LLMs in these fields.

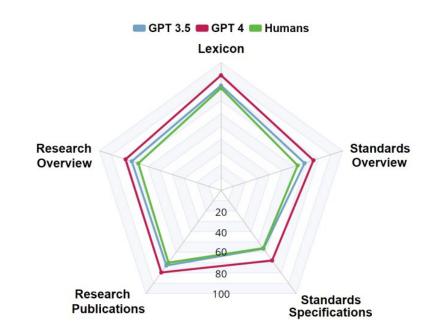
As LLMs find their way into the telecommunications industry, a clear and pressing issue arises—there is a notable absence of a benchmark dataset designed to evaluate these models' proficiency in telecom. Consequently, there is an urgent need for such a dataset, as highlighted in various prior research (e.g., [9]). This paper aims to bridge this gap



The Telecom Knowledge of GPTs

- GPT-4 consistently outperforms GPT-3.5, demonstrating around 7% improvement across all categories
- LLMs exhibit exceptional performance in the lexicon category, which encompasses general telecom knowledge and terminology
- LLMs face challenges when confronted with more intricate questions related to standards, with the highest performing model, GPT-4, achieving a modest 64% accuracy in this domain
- LLMs and active professionals exhibit comparable performance in general telecom knowledge.

	Mistral 7b	Mixtral (MoE)	GPT-3.5	GPT-4	Humans
Lexicon (500)	56.80	83.80	82.20	86.80	80.33
Research overview (2000)	51.60	70.70	68.50	76.25	63.66
Research publications (4500)	49.27	70.20	70.42	77.62	68.33
Standards overview (1000)	46.20	66.73	64.00	74.40	61.66
Standards specifications (2000)	35.60	55.85	56.97	64.78	56.33
Overall accuracy (10000)	47.07	67.74	67.29	74.91	64.86



We need LMs specialized on Telecoms Networks

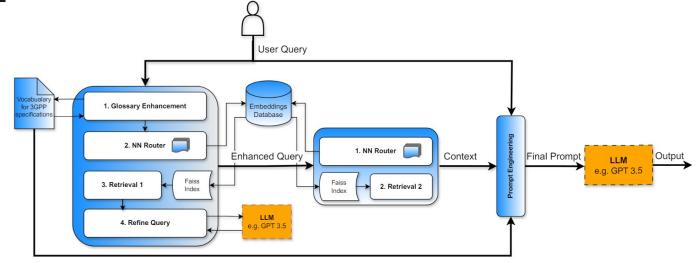
- A. Maatouk, F. Ayed, N. Piovesan, A. De Domenico, M. Debbah, Zhi-Quan Luo, "TeleQnA: A Benchmark Dataset to Assess Large Language Models Telecommunications Knowledge", arXiv preprint arXiv:2310.15051 https://arxiv.org/abs/2310.15051
- https://github.com/netop-team/TeleQnA

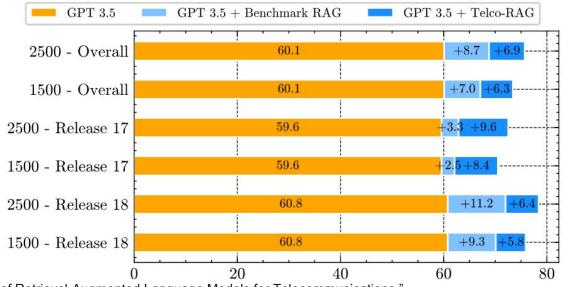


Telco-RAG: A RAG Framework to Handle Queries on Standards

E2E design for improving LLM capabilities on Telcos standard questions

- Hyperparameters Optimization
- Query Augmentation
- Enhancing the RAM Usage
- Prompt Engineering
- Telco-RAG leads to an average improvement of 6.6% and 14.45% compared to GPT 3.5 with and without the Benchmark RAG





AL Bornea, F Ayed, A De Domenico, N Piovesan, A Maatouk, "Telco-RAG: Navigating the Challenges of Retrieval-Augmented Language Models for Telecommunications," arXiv preprint arXiv:2404.15939, https://arxiv.org/pdf/2404.15939



[•] https://github.com/netop-team/Telco-RAG

Telco-RAG: A RAG Framework to Handle Queries on Standards



[•] AL Bornea, F Ayed, A De Domenico, N Piovesan, A Maatouk, "Telco-RAG: Navigating the Challenges of Retrieval-Augmented Language Models for Telecommunications," arXiv preprint arXiv:2404.15939, https://arxiv.org/pdf/2404.15939





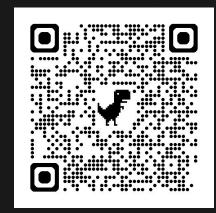
ITU Events

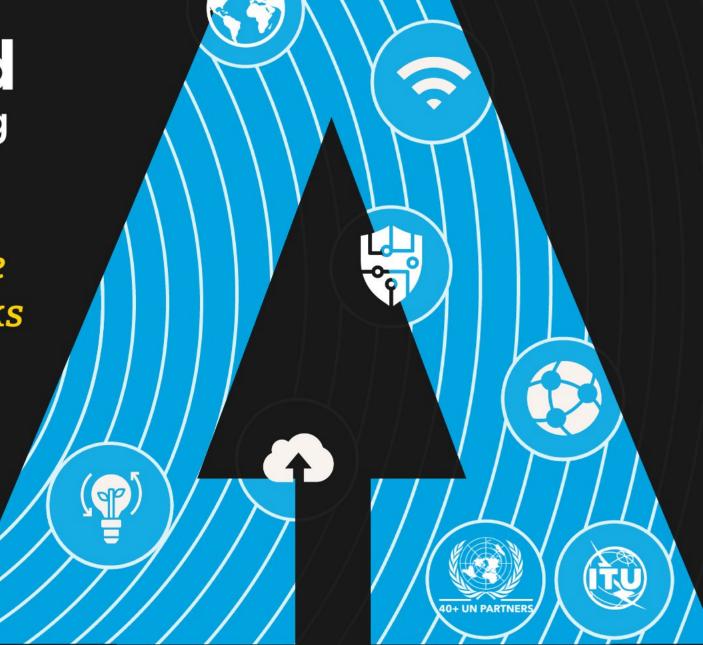


Al for Good

Machine Learning in 5G Challenge

Specializing Large Language Models for Telecom Networks





aiforgood.itu.int

Conclusion

LLMs and GenAl will have a large impact on future networks, both from the requirements and capabilities perspectives

The telco ecosystem needs to identify the most relevant use cases for LLMs in telcos, and the required functionalities/capabilities proper to telcos (beyond standard NLP)

• Specialized telco models: Telecom knowledge, coding, reasoning, calculus, etc

Based on these, the industry can jointly define proper evaluation methodologies:

Tests, datasets, benchmarking metrics, and platforms

This is just the beginning of the journey



Thank you.



antonio.de.domenico@huawei.com

