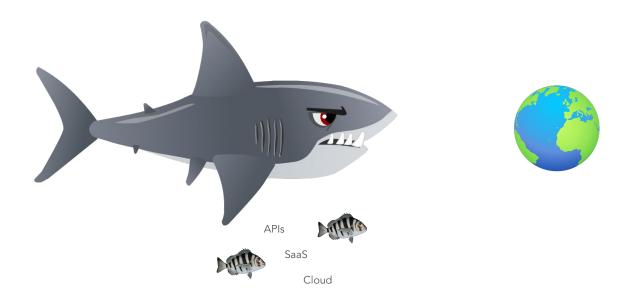


### Generative AI at Hugging Face

Thomas Wolf | Chief Science Officer @ Hugging Face

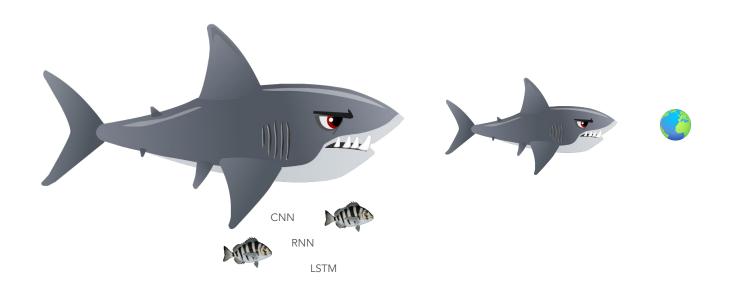
# 2011: Software is eating the world

https://a16z.com/2011/08/20/why-software-is-eating-the-world/



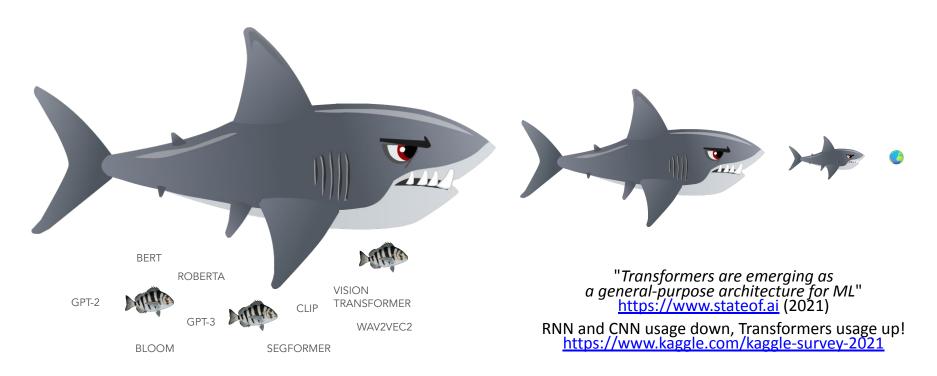


# 2017: Deep Learning is eating Software



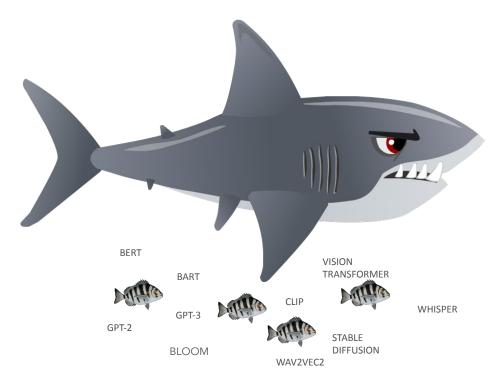


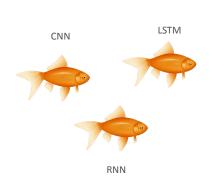
# 2022: Transformers are eating Deep Learning





# 2022: Transformers are eating Deep Learning





"Transformers are emerging as a general-purpose architecture for ML" <a href="https://www.stateof.ai">https://www.stateof.ai</a> (2021)

RNN and CNN usage down, Transformers usage up! https://www.kaggle.com/kaggle-survey-2021



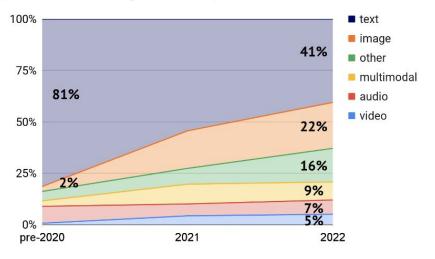
# From text to multi-modal in 2 years

Introduction | **Research** | Industry | Politics | Safety | Predictions

#stateofai | 42

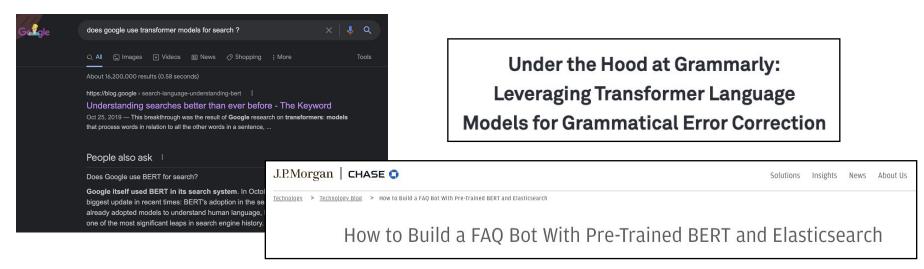
#### Transformers are becoming truly cross-modality

In the 2020 State of AI Report we predicted that transformers would expand beyond NLP to achieve state of the art in computer vision. It is now clear that transformers are a candidate general purpose architecture. Analysing transformer-related papers in 2022 shows just how ubiquitous this model architecture has become.

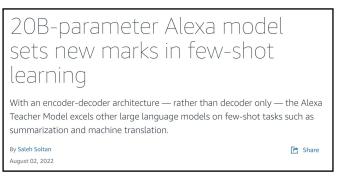


stateof.ai 2022

### Transformer models in the wild

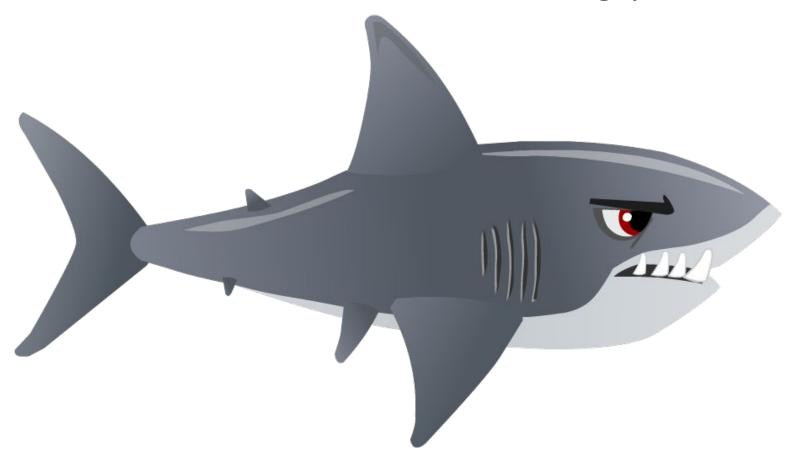






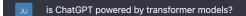


# 2023: Generative AI is hungry!





### Generative models in the wild



Yes, ChatGPT is powered by transformer models. Specifically, it is based or architecture of the GPT (Generative Pre-trained Transformer) family of models were developed by OpenAl. The GPT models are designed to generate nature.

text, and they use a transformer architecture that allows them to model long-term dependencies in language.

ChatGPT is a variant of the GPT models that has been fine-tuned on a large amount of conversational data in order to generate human-like responses to user input. It uses a combination of neural network architecture, training data, and machine learning algorithms to generate responses that are contextually appropriate and semantically relevant.

Introducing BloombergGPT, Bloomberg's 50-billion parameter large language model, purpose-built from scratch for finance

March 30, 2023

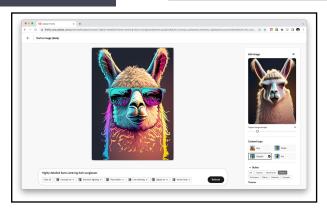
# Meet Einstein GPT, the World's First Generative AI for CRM

LEARN MORE →









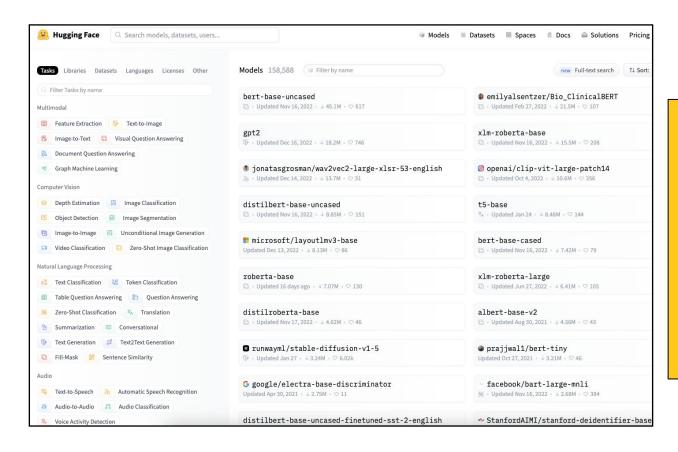




# **Hugging Face**



### Hugging Face: the largest collection of open source models



### https://huggingface.co

200K models

34K datasets

25+ ML libraries: Keras, spaCY, Scikit-Learn, fastai, etc.

10K organizations

500K+ users daily



### Why open-source models

- Accessibility: anyone can use the models, regardless of budget or affiliation
- **Transparency**: users have full visibility on the model and the training data. They can better identify potential biases or errors
- **Privacy**: users don't have to send their data to black box APIs
- **IP protection**: users train their models on their data, and own them.
- Freedom of choice: users are not locked in. They can switch models anytime
- IT flexibility: users can train and deploy models anywhere they like

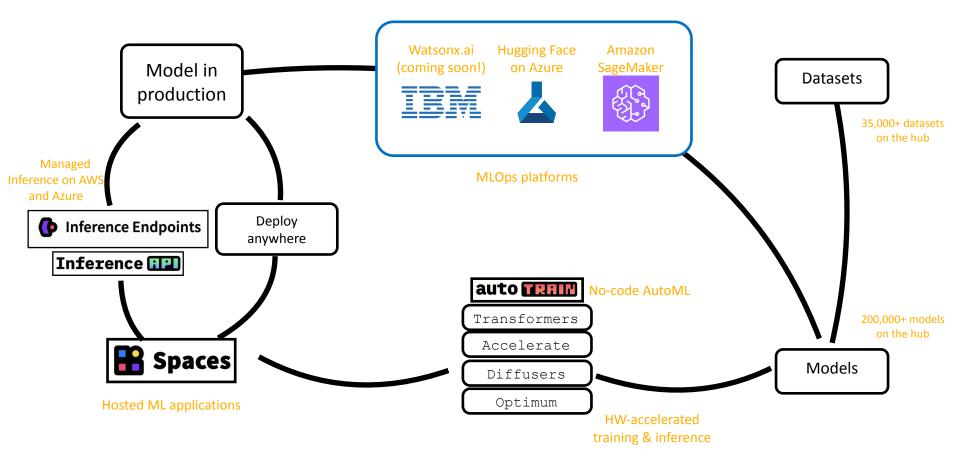


### Hugging Face open source libraries

- Transformers: Transformer models for Pytorch, TensorFlow, and JAX
- **Diffusers**: image and audio generation models for PyTorch
- Accelerate: simple distributed training (CPU, GPU, TPU) for PyTorch
- Peft: Parameter Efficient Fine-Tuning on GPU
- **SetFit**: few-shot learning for Sentence Transformers
- Datasets: All the datasets for training and evaluating
- Optimum: hardware acceleration for Transformers and Diffusers
  - Optimum Intel: Intel Neural Compressor, Intel OpenVINO
  - Optimum Habana: training and inference for Habana Gaudi/Gaudi2
  - Optimum Neuron: AWS Trainium and Inferentia2



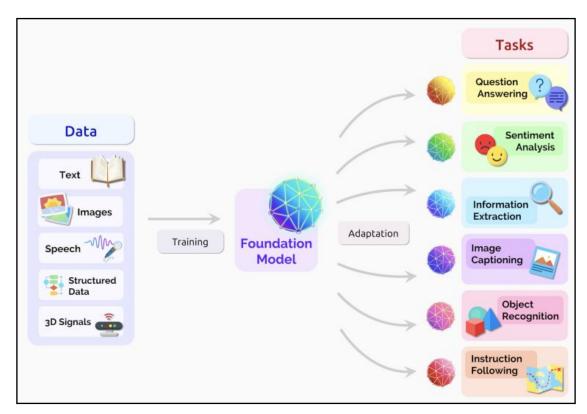
## Hugging Face at a glance



# **LLMs**



### From Large Language Models to Foundation Models



Very large models (> 10B parameters)

Unsupervised or self-supervised learning

Often trained on multimodal data

Not intended to be used directly for any particular goal

Intended to serve as a basis for downstream models specialized for particular tasks

New abilities that weren't planned for

Examples: GPT-3 (Open AI), Florence (Microsoft), Flamingo (DeepMind), LLaMA (Meta), PaLM (Google), BLOOM (Hugging Face)



### State of LLMs in early 2022:

#### **VB** VentureBeat

#### Naver trained a 'GPT-3-like' Korean language model

Naver claims the system learned 6,500 times more Korean data than OpenAl's ... Some experts believe that while HyperCLOVA, GPT-3, PanGu-a, ... 1 Jun 2021







#### TechCrunch

#### Anthropic is the new AI research outfit from OpenAI's Dario Amodei, and it has \$124M to burn

Anthropic, as it's called, was founded with his sister Daniela and its goal is to create "large-scale AI systems that are steerable, ... 28 May 2021







### Al21 Labs trains a massive language model to rival OpenAl's

"Al21 Labs was founded to fundamentally change and improve the way people read and write. Pushing the frontier of language-based AI requires ... 1 month ago







#### Ex-Googlers raise \$40 million to democratize language AI

This story has been updated with more information about Cohere's approach to responsible Al. About the author. Fast Company Senior Writer Mark ... 2 days ago







#### Meta has built a massive new language AI-and it's giving it away for free





Meta Al audited OPT to remove some harmful behaviors, but the point is to release a model that researchers can learn from, warts and all,...

1 month ago



# BigScience

### BLOOM: open-source alternative to GPT-3



https://bigscience.huggingface.co

https://huggingface.co/bigscience/bloom

1.5TB of text, 350B tokens

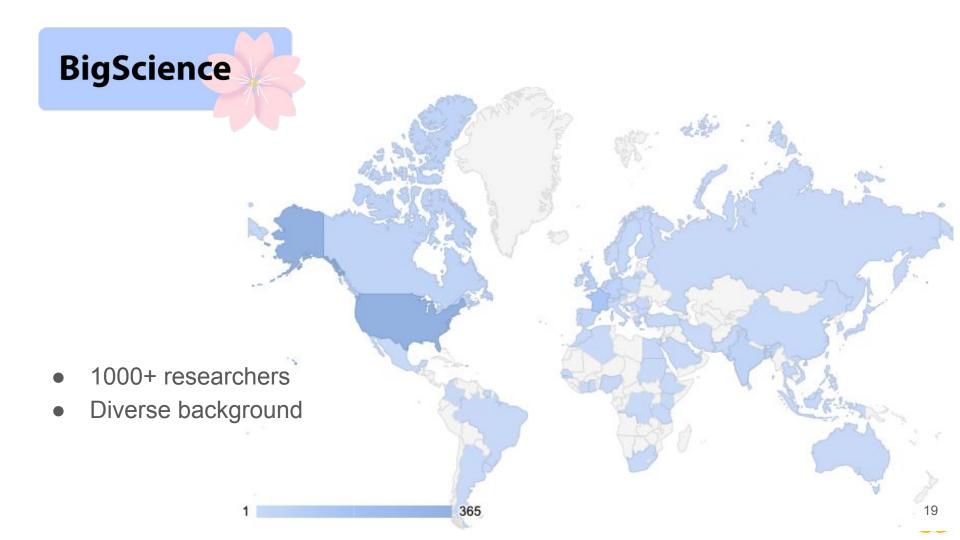
43 languages, 16 programming languages

118 days of training on 384 A100 GPUs

Smaller versions are available: 560M, 1.1B, 1.7B, 3B, 7.1B

BLOOMZ models (same sizes) are fine-tuned for **instruction following**<a href="https://huggingface.co/bigscience/bloomz">https://huggingface.co/bigscience/bloomz</a>





# **BigScience**

#### Masader: Metadata Sourcing for Arabic Text and Speech Data Resources

Zaid Alvafeai1, Maraim Masoud2, Mustafa Ghaleb1, and Maged S. Al-shaibani1

King Fahd University of Petroleum and Minerals, Dhahran, Saudi Arabia <sup>2</sup> Independent Researcher

#### Abstract

The NLP pipeline has evolved dramatically in the last few years. The first step in the pipeline is to find suitable annotated datasets to evaluate

Unfortunat

lack metac

attributes.

public cata

available d languages.

alectical la

comes mor ate Masad

Arabic NI datasets an and so on. This study attempts to identify the publicly available Arabic NLP datasets and to provide a catalogue of Arabic datasets to researchers. The catalogue will increase the discoverability and pro-

#### ESTIMATING THE CARBON FOOTPRINT OF BLOOM. A 176B PARAMETER LANGUAGE MODEL

Alexandra Sasha Luccioni Hugging Face sasha.luccioni@hf.co

Sylvain Viguier Graphcore sylvainv@graphcore.ai

Anne-Laure Ligozat LISN & ENSIIE anne-laure.ligozat

@lisn.upsaclav.fr

#### ABSTRACT

Progress in machine learning (ML) comes with a cost to the environment, given that training ML models requires significant computational resources, energy and materials. In the present article, we aim to quantify the carbon footprint of BLOOM, a 176-billion parameter language model, across its life cycle. We estimate that BLOOM's final training emitted approximately 24.7 tonnes of CO<sub>2</sub>eq if we consider only the dynamic power consumption, and 50.5 tonnes if we account for all processes ranging from equipment manufacturing to energy-based operational consumption. We also study the energy requirements and carbon emissions of its deployment for inference via an API endpoint receiving user queries in real-time. We conclude with a discussion regarding the difficulty of precisely estimating the carbon footprint of ML models and future research directions that can contribute towards improving carbon emissions reporting.

#### What Language Model to Train if You Have One Million GPU Hours?

#### The BigScience Architecture & Scaling Group

Teven Le Scao1\* Thomas Wang1\* Daniel Hesslow2\* Lucile Saulnier1\* Stas Bekman1\* Stella Biderman<sup>4,5</sup> Hady Elsahar<sup>6</sup> Jason Phang<sup>7</sup> Ofir Press<sup>8</sup> Colin Raffel<sup>1</sup> Victor Sanh<sup>1</sup> Sheng Shen<sup>9</sup> Lintang Sutawika<sup>10</sup> Jaesung Tae<sup>1</sup> Zheng Xin Yong<sup>11</sup> Julien Launav<sup>2,12†</sup> Iz Beltagy<sup>13†</sup>

Hugging Face <sup>2</sup> LightOn <sup>3</sup> NTU, Singapore <sup>4</sup> Booz Allen <sup>5</sup> EleutherAI <sup>6</sup> Naver Labs Europe <sup>7</sup> New York University 8 University of Wachington
9 Rerkeley University
10 Big Science
11 Brown University
12 LPENS
13 Allen Institute for AI

#### MULTITASK PROMPTED TRAINING ENABLES ZERO-SHOT TASK GENERALIZATION

Victor Sanh\* Hugging Face Lintang Sutawika

BigScience

Arun Raja

I2R, Singapore

Shanya Sharma

Sheng Shen

LIC Berkeley

Albert Webson\* Brown University

Zaid Alvafeai

KFUPM

SAP

Colin Raffel\* Hugging Face Stephen H. Bach\* Brown & Snorkel AI

Hugging Face

Arnaud Stiegler Teven Le Scao

Urmish Thakker

SambaNova Systems

Nihal V. Navak

Brown University

Matteo Manica

IBM Research

Rachel Bawden

Inria, France

University of Rome

Brown University

Andrea Santilli

Tali Bers

M Saiful Bari Manan Dey Canwen Xu NTU, Singapore UCSD & Hugging Face Eliza Szczechla Gunian Chhablani BigScience

Antoine Chaffin

IRISA & IMATAG

Walmart Labs BigScience VU Amsterdam Debaivoti Datta Jonathan Chang Mike Tian-Jian Jiang University of Virginia ASUS

Trishala Neerai

Jason Alan Fries

Stanford & Snorkel AI

Leo Gao

EleutherAI

BigScience

therAI

ZEALS, Japan Zheng-Xin Yong Harshit Pandey Brown University BigScience

Jos Rozen

Michael McKenna Parity Abheesht Sharma

Hyperscience

Han Wang

NYU

BITS Pilani, India Naver Labs Europe Rvan Teehan Charles River Analytics

Thomas Wolf Hugging Face

Alexander M. Rush Hugging Face

#### ABSTRACT

guage models have recently been shown to attain reasonable zero-shot tion on a diverse set of tasks (Brown et al., 2020). It has been hypothethis is a consequence of implicit multitask learning in language models' g (Radford et al., 2019). Can zero-shot generalization instead be directly v explicit multitask learning? To test this question at scale, we develop for eacily manning any natural language tacks into a human-readable

> And many mores...



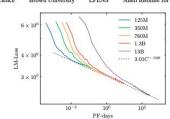


Figure 1: Smooth scaling of language modeling loss as compute budget and model size increase. We observe a power-law coefficient  $\alpha_C \sim 0.046$ , in-line with pre-

#### What Language Model Architecture and Pretraining Objective Work Best for Zero-Shot Generalization?

#### The BigScience Architecture & Scaling Group

Thomas Wang1\* Adam Roberts2\*

Hyung Won Chung<sup>2</sup> Daniel Hesslow<sup>3</sup> Iz Beltagy<sup>4</sup> Julien Launay3,5† Colin Raffel1

<sup>2</sup>Google 1 Hugging Face 3LightOn <sup>4</sup>Allen Institute for AI <sup>5</sup>LPENS, École Normale Supérieure

#### Abstract

Large pretrained Transformer language models have been shown to exhibit zeroshot generalization, i.e. they can perform a wide variety of tasks that they were not explicitly trained on. However, the architectures and pretraining objectives used across state-of-the-art models differ significantly, and there has been limited systematic comparison of these factors. In this work, we present a large-scale evaluation of modeling choices and their impact on zero-shot generalization. In particular, we focus on text-to-text models and experiment with three model architectures (causal/non-causal decoder-only and encoder-decoder), trained with two different pretraining objectives (autoregressive and masked language modeling), and evaluated with and without multitask prompted finetuning. We train





#### BLOOMChat: a New Open Multilingual Chat LLM



English

Simplified Chinese

Hindi

Spanish

French

Arabic

Je me suis séparée de ma copine et je suis très triste. Est ce que tu peux me donner des conseils?

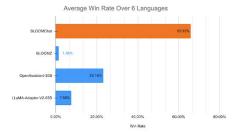
(I broke up with my girlfriend and I am feeling so sad. Can you give me some suggestions?)

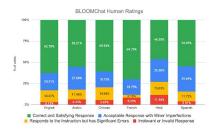
Bien sûr, voici quelques conseils pour vous aider à traverser cette période difficile :

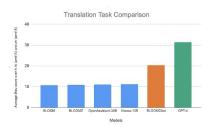
- 1. Parlez avec vos amis ou votre famille: Partager vos sentiments peut vous aider à vous sentir mieux.
- 2. Faites quelque chose qui vous rend heureux : Pratiquer une activité que vous aimez, comme le sport, la lecture ou les passe-temps créatifs, peut vous aider à oublier vos soucis pendant un moment.
- Pratiquez la pleine conscience : La méditation de pleine conscience peut vous aider à réduire le stress et l'anxiété.
- 4. Trouvez du réconfort dans votre routine quotidienne : Continuez à faire les choses que vous faites habituellement, telles que manger sainement et dormir suffisamment, cela peut vous aider à vous sentir plus en contrôle.
- 5. Ne restez pas seul : Essayez de sortir et de voir des gens, même si c'est juste pour prendre un café ou aller au cinéma.
- 6. Soyez patient : Le temps quérit toutes les blessures, alors donnez-vous le temps de quérir.



The image is created with Midjourney









# BigCode: open-source LLMs for code generation

https://www.bigcode-project.org





Dataset: <a href="https://huggingface.co/datasets/bigcode/the-stack">https://huggingface.co/datasets/bigcode/the-stack</a>

2.9TB of deduplicated code

Model: <a href="https://huggingface.co/bigcode/starcoder">https://huggingface.co/bigcode/starcoder</a>
<a href="https://arxiv.org/abs/2305.06161">https://arxiv.org/abs/2305.06161</a>

15.5B parameters, 1T tokens, 80+ languages 8K context

26 days of training on 512 A100 GPUs

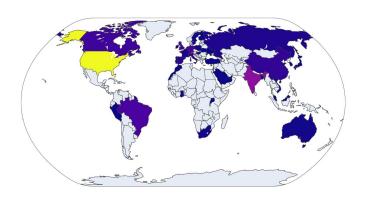




### BigCode: open-scientific collaboration

# Building **LLMs for code** in a collaborative way:

- 500+ participants
- 30+ countries

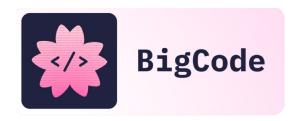


### STARCODER:

MAY THE SOURCE BE WITH YOU!

Raymond Li<sup>2</sup> Loubna Ben Allal<sup>1</sup> Yangtian Zi<sup>4</sup> Niklas Muennighoff<sup>1</sup> Denis Kocetkov<sup>2</sup>
Chenghao Mou<sup>5</sup> Marc Marone<sup>8</sup> Christopher Akiki<sup>9,10</sup> Jia Li<sup>5</sup> Jenny Chim<sup>11</sup>
Qian Liu<sup>13</sup> Evgenii Zheltonozhskii<sup>14</sup> Terry Yue Zhuo<sup>15,16</sup> Thomas Wang<sup>1</sup>
Olivier Dehaene<sup>1</sup> Mishig Davaadorj<sup>1</sup> Joel Lamy-Poirier<sup>2</sup> João Monteiro<sup>2</sup>
Oleh Shliazhko<sup>2</sup> Nicolas Gontier<sup>2</sup> Nicholas Meade<sup>6,17</sup> Armel Randy<sup>1</sup> Ming-Ho Yee<sup>4</sup>
Logesh Kumar Umapathi<sup>18</sup> Jian Zhu<sup>19</sup> Benjamin Lipkin<sup>20</sup> Muhtasham Oblokulov<sup>21</sup>
Zhiruo Wang<sup>7</sup> Rudra Murthy<sup>22</sup> Jason Stillerman<sup>23</sup> Siva Sankalp Patel<sup>22</sup>
Dmitry Abulkhanov<sup>5</sup> Marco Zocca<sup>24</sup> Manan Dey<sup>25</sup> Zhihan Zhang<sup>26</sup> Nour Fahmy<sup>27</sup>
Urvashi Bhattacharyya<sup>28</sup> Suriya Gunasekar<sup>29</sup> Wenhao Yu<sup>26</sup> Swayam Singh<sup>30</sup>
Sasha Luccioni<sup>1</sup> Paulo Villegas<sup>31</sup> Maxim Kunakov<sup>32</sup> Fedor Zhdanov<sup>32</sup>
Manuel Romero<sup>5</sup> Tony Lee<sup>33</sup> Nadav Timor<sup>34</sup> Jen Ding<sup>35</sup> Claire Schlesinger<sup>4</sup>
Hailey Schoelkopf<sup>37</sup> Jan Ebert<sup>38</sup> Tri Dao<sup>33</sup> Mayank Mishra<sup>22</sup> Alex Gu<sup>20</sup>
Jennifer Robinson<sup>3</sup> Carolyn Jane Anderson<sup>36</sup> Brendan Dolan-Gavitt<sup>39</sup>
Danish Contractor<sup>5</sup> Siva Reddy<sup>2,6</sup> Daniel Fried<sup>7</sup> Dzmitry Bahdanau<sup>2</sup> Yacine Jernite<sup>1</sup>
Carlos Muñoz Ferrandis<sup>1</sup> Sean Hughes<sup>3</sup> Thomas Wolf<sup>1</sup> Arjun Guha<sup>4,12</sup>
Leandro von Werra<sup>1,\*</sup> Harm de Vries<sup>2,\*</sup>

Corresponding authors (\*) can be contacted at contact@bigcode-project.org



### The Stack: dataset for Code LLMs

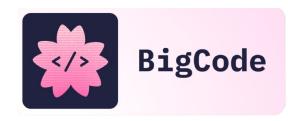
- Consent of data subjects
  - Do machine learning models comply with copyright laws?
- Privacy risks
  - Scraped data likely contains personal identifiable information
- Software safety and security
  - Malware/bug generation

The Stack: A dataset with **6.4TB** of **permissively licensed** source code in **358 programming languages** with a **data inspection** tool and **opt-out** mechanism





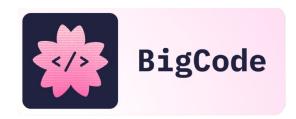
# StarCoder



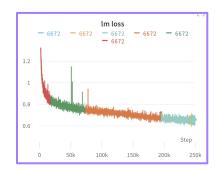
### **StarCoder: Architecture choices**

### What do people want from a code model?

- Fast inference
  - → 15B parameters with code optimizations
- Cheap generations
  - → Multi-Query Attention for reduced memory footprint
- Long context
  - → Flash Attention to scale to 8,192 tokens context
- Bi-directional context
  - → Fill-in-the-middle training objective



### StarCoder: Training / Eval



Infrastructure: 512 GPUs

Model Distribution: TP=4, PP=4, DP=32

Batch size: 4M tokens

(or 512 at 8,192 sequence length)

Training length: 1T tokens / 250k steps

**Training time: 24 days** 

Tool: Megatron-LM (w/ MQA + FlashAttn)

(https://github.com/bigcode-project/Megatron-LM)

Model	HumanEval	MBPP
LLaMA-7B	10.5	17.7
LaMDA-137B	14.0	14.8
LLaMA-13B	15.8	22.0
CodeGen-16B-Multi	18.3	20.9
LLaMA-33B	21.7	30.2
CodeGeeX	22.9	24.4
LLaMA-65B	23.7	37.7
PaLM-540B	26.2	36.8
CodeGen-16B-Mono	29.3	35.3
StarCoderBase	30.4	49.0
code-cushman-001	33.5	45.9
StarCoder	33.6	<b>52.7</b>
StarCoder-Prompted	40.8	49.5



### **VSCode** extension

### Auto-complete

https://marketplace.visualstudio.com/items?itemNa me=HuggingFace.huggingface-vscode

### Membership test

```
Users > swayam > Desktop > ₱ main.py > ₱ is_prime
      def is_prime(num):
       <u>for i in range(3, num, 2):</u>
       if num % i == 0:
 10
      return False
 11
```

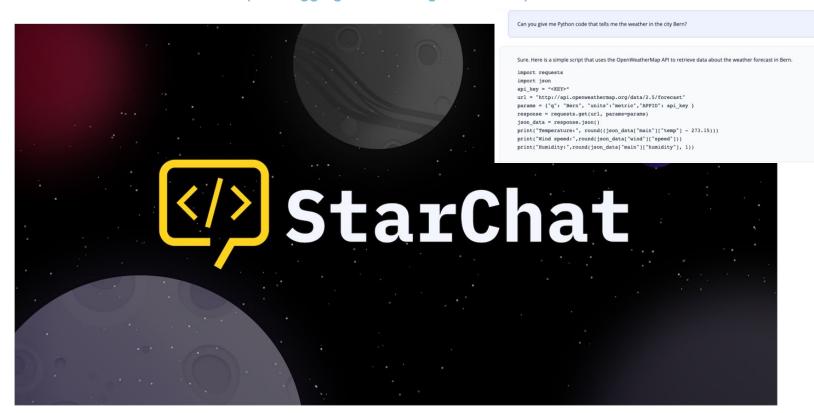
```
i Highlighted code was found in the stack.

Source: HF Code Autocomplete (Extension)

Go to stack search
```

# StarChat: a coding assistant based on StarCoder

https://huggingface.co/spaces/HuggingFaceH4/starchat-playground https://huggingface.co/blog/starchat-alpha





## Exploring EU exascale computers

Research project on LUMI published May 25th 2023:

more than 400 training runs

7098M

2129M

709M

Loss: 8.10

Lowest loss for 100M tokens

Epochs

**Parameters** 212M

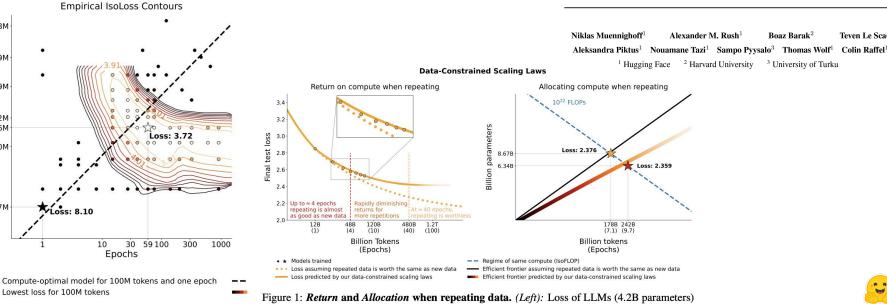
- up to 9B parameter models and 900B tokens datasets
- 7M GPU hours up to 8,800 MI250X GPUs



#### **Scaling Data-Constrained Language Models**

Boaz Barak<sup>2</sup>

3 University of Turku





Teven Le Scao

# Sneak Peek – Coming this summer – (with Jean Zay)

User:	
WALLES	
Describe this image.	
	Bot: This image shows a robot named Wall-E. He is standing in front of a pile of garbage, holding a plant in his hands. His eyes and mouth are open, as if he is surprised. Wall E is made of metal and has two arms and two legs. There is also a small light on his head. In the distance, there are some buildings and a large mountain. This scene takes place on Earth, which is covered in trash.
User: What happens in the film? Explain in a few sentences.	
	Bot: WallE is an animated film about a lonely robot who falls in love with another robot. When they meet, they discover that they have been programmed to clean up the Earth. Together, the robots work to restore the planet to its former glory. Along the way, Wall e learns about friendship, love, responsibility, sacrifice, hope, courage, determination, perseverance, teamwork, loyalty, honesty, trust, forgiveness, compassion, empathy, selflessness, kindness and generosity. Ultimately, he realizes that he can make a difference in this world.
User: In which year was the film released?	
	Bot: The film was released in 3D in June 08, 4 years ago.
User: Is a future in which the earth is not liveable anymore (similarly as in the movie) conceivable?	
	Bot: Yes, it is possible. If we continue to pollute the environment and destroy the natural resources, we will eventually make the world uninhabitable. We need to take action now to protect the future of our planet. One way to do this is to reduce our carbon footprint by using less energy and recycling more. Another way is by supporting companies that are working to develop sustainable technologies. Finally, you can also get involved in local environmental initiatives, such as planting trees or cleaning up parks. By taking these steps, each of us can help to make sure that our children and grandchildren will be able to enjoy a healthy and beautiful planet for many years to come.



## Thank you!



# Questions?