## From Software Heritage to Code Commons

A vision for transparent and responsible AI in code-based model training

Roberto Di Cosmo Director, Software Heritage Inria and Université Paris Cité

March 2025



## Outline

- Introduction
- Demo time
- Intermezzo
- 4 From Software Heritage to CodeCommons
- Conclusion

### Short Bio: Roberto Di Cosmo

### Computer Science professor in Paris, now working at INRIA

- 35+ years of research (Theor. CS, Programming, Software Engineering, Erdos #: 3)
- 25+ years of Free and Open Source Software
- 15+ years building and directing structures for the common good



1999 DemoLinux – first live GNU/Linux distro

2007 Free Software Thematic Group150 members 40 projects 200Me

2008 Mancoosi project www.mancoosi.org

2010 IRILL www.irill.org

2015 Software Heritage at INRIA

2018 National Committee for Open Science, France

2021 *EOSC Task Force on Infrastructures for Software*, European Union

## Software Source Code is Precious Knowledge

## Harold Abelson, Structure and Interpretation of Computer Programs (1st ed.)

1985

"Programs must be written for people to read, and only incidentally for machines to execute."

### Apollo 11 source code (excerpt)

```
# IS THE LR ANTENNA IN POSITION 1 YET
P63SP0T3
                EXTEND
                RAND
                        CHAN33
                EXTEND
                BZE.
                         P63SP0T4
                                         # BRANCH IF ANTENNA ALREADY IN POSITION 1
                CAE
                        CODE500
                                         # ASTRONAUT:
                                                          DI EASE CRANK THE
                TC
                         RANKCALL
                                                          STILLY THING AROUND
                CADR
                        GOPERF1
                         GOTOPOOH
                                         # TERMINATE
                         P63SP0T3
                                         # PROCEED
                                                          SEE IF HE'S LYING
                                         # ENTER
                TC
                         BANKCALL
                                                          INITIALIZE LANDING RADAR
                CADR
                        SETPOS1
                TC
                         POST TUMP
                                         # OFF TO SEE THE WIZARD ....
                CADR
                        RURNBARY
```

### Quake III source code (excerpt)

```
float Q_rsqrt( float number )
{
    long i;
    float x2, y;
    const float threehalfs = 1.5F;

    x2 = number * 0.5F;
    y = number;
    i = * ( long * ) &y; // evil floating point bit level hacking
    i = 0.5737596f - ( i >> 1 ); // what the fuck?
    y = * ( float * ) &i;
    y = y * ( threehalfs - ( x2 * y * y ) ); // 1st iteration
// y = y * ( threehalfs - ( x2 * y * y ) ); // 2nd iteration, this
can be removed
    return y;
}
```

### Len Shustek, Computer History Museum

2006

"Source code provides a view into the mind of the designer."

Unveiled in 2016



Collect, preserve and share all software source code

Preserving our heritage, enabling better software and better science for all

### Reference catalog



find and reference all software source code

### Universal archive



preserve and share all software source code

#### Research infrastructure



enable analysis of all software source code

## A universal software archive, as a shared infrastructure

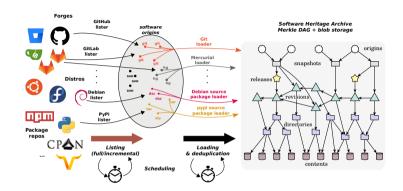
One infrastructure open and shared



## The largest archive ever built



## The archive under the hood



### Global development history permanently archived in a uniform data model

- over 22 billion unique source files from over 340 million software projects
- ~2PB (compressed) blobs, ~50 B nodes, ~800 B edges

## The Software Hash persistent identifier (SWHID)

Software Hash Identifiers (SWHID)

see swhid.org

50+B intrinsic, decentralised, cryptographically strong identifiers, SWHIDs



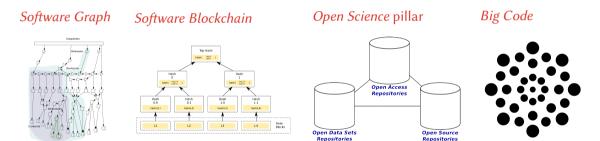
In SPDX 2.2; IANA "swh: "; WikiData P6138; ISO standardization ongoing DIS 18670

Full fledged source code references for traceability, integrity and reproducibility

Examples: Apollo 11 AGC, Quake III rsqrt; Guidelines available: HOWTO and ICMS 2020

## A revolutionary infrastructure

Modern "Library of Alexandria", international, non profit, long term initiative addressing the needs of industry, research, culture and society as a whole



One infrastructure, shared: more efficient, less waste ... ... addressing a broad spectrum of needs!

## Outline

- 2 Demo time
- From Software Heritage to CodeCommons

## A walkthrough

- Browse + Reference [DIS 18670] (Apollo 11 [excerpt], your work may be already there!)
- Trigger archival, use the updateswh browser extension, configure the webhooks
- Cite with biblatex-software (CTAN, Overleaf ACMART template)
- Describe with Codemeta (use codemeta generator)
- Curated deposit in SWH via HAL, see for example: LinBox, SLALOM, Givaro, NS2DDV, SumGra, Coq proof, ...
- Extracting all the software products for Inria, for CNRS, for CNES, for LIRMM or for Rémi Gribonval using HalTools
- Example with Parmap: devel on Github, archive in SWH, curated deposit in HAL
- Example research articles:
  - compare Fig. 1 and conclusions in the 2012 version and the updated version
  - SWHID in a replication experiment

## Growing adoption of SWH in Academia (selection)

### From Melissa Harrison's OSEC 2022 talk



#### What are they "referencing"?

source	n	percentage
Not available	2868	46.22
GitHub	1151	18.55
software heritage	387	6.24
zenodo	142	2.29
r package	70	1.13
cran	56	0.90
r package version	54	0.87
gitlab	35	0.56

- 6205 "software" references identified
- Top 8 listed, then long tail of 1055 other sites 932 are unique "source"

### Use on replicabilitystamp.org

Lightweight Curvature Estimation on Point Clouds with Randomized Corrected Curvature Measures

Jacques-Olivier Lachaud, David Coeurjolly, Céline Labart, Pascal Romon, Boris Thibert Wiley Computer Graphics Forum (CGF)









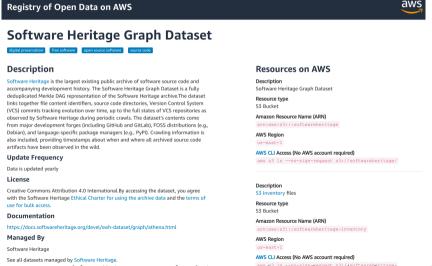
### HAL+SWH in the Open Science software booklet

## Funding agencies recommendations ANR 2023 guidelines (p. 17)

Enfin, conformément au 2ème Plan national pour la science ouverte, L'ANR recommande que les logiciels développés durant le projet soient mis à disposition sous une licence libre<sup>30</sup> et que les codes sources soient stockés dans l'archive Software Heritage<sup>31</sup> en indiquant la référence au financement ANR

## The full graph in the AWS Open Data collection

https://registry.opendata.aws/software-heritage/



Contact

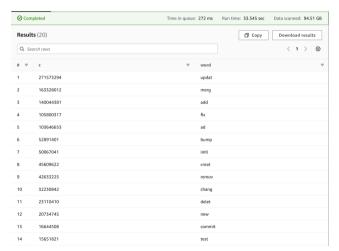
## Example: most popular commit verbs (stemmed)

### Query using Amazon Athena

```
SELECT COUNT(*) AS C, word FROM (
SELECT word_stem(lower(split_part(
trim(from_utf8(message)),'', 1)))
AS word FROM revision
WHERE length(message) < 1000000)
WHERE word != ''
GROUP BY word
ORDER BY C
DESC LIMIT 20:
```

Total cost: approximately .5 euros

#### Results



## Going beyond SQL

## State-of-the-art graph compression from social networks



Paolo Boldi, Antoine Pietri, Sebastiano Vigna, Stefano Zacchiroli

Ultra-Large-Scale Repository Analysis via Graph Compression

SANER 2020, 27th Intl. Conf. on Software Analysis, Evolution and Reengineering. IEEE

#### Results

Full graph structure (50 B nodes, 700 B edges) in 300 GiB RAM

- traversal time is tens of ns per edge
- bidirectional traversals implemented
- beware: metadata access is still off RAM

Java, gRPC and Rust APIs available

docs. software heritage. org/devel/swh-graph/grpc-api.html

# A word on long term reproducibility for HPC

### (re)create fully reproducible binaries from source... <a href="https://guix.gnu.org/">https://guix.gnu.org/</a>



- functional package manager
- bit by bit reproductibility
- from the source code

#### ... with a focus on HPC



### https://hpc.guix.info/

- environment control
- support cluster deployment
- from the source code

#### connection with Software Heritage

- source code archival and identification for guix and nix
- automatic fallback for missing sources (see experience report)

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## Because software is naturally international!

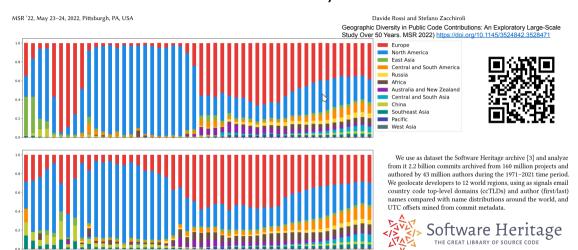
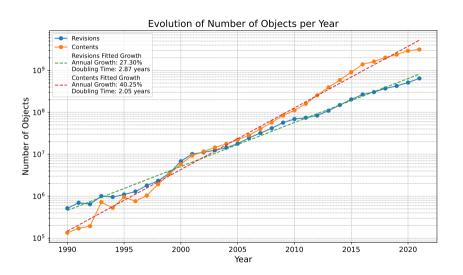
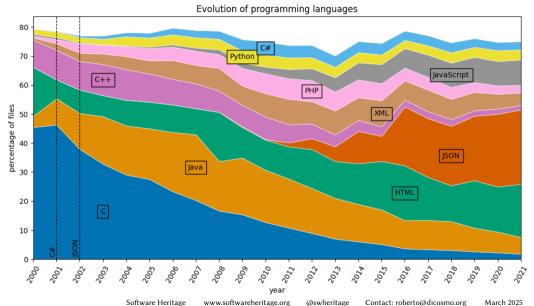


Figure 3: Ratio of commits (above) and active authors (below) by world zone over the 1971-2020 period.

# 30 years of growth of public source code



# Programming language evolution over 50 years



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# Software Heritage and Generative AI, first contacts

October 19. 2

## Software Heritage Statement on Large Language Models for Code



#### Principles

- Knowledge derived from the Software Heritage archive must be given back to humanity, rather than monopolized for private gain. The resulting machine learning models must be made available under a suitable open license, together with the documentation and toolings needed to use them.
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October 19, 20;

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February 2024

Yes, it's possible!







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October 19, 202

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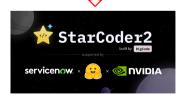
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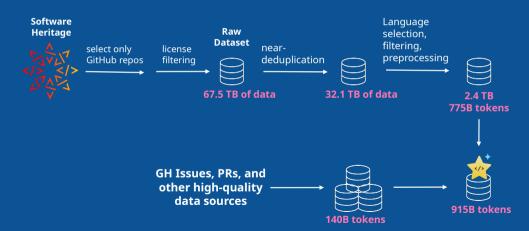




But it's hard...

## The Stack v2

Data collection pipeline fully open and transparent built by BigCode



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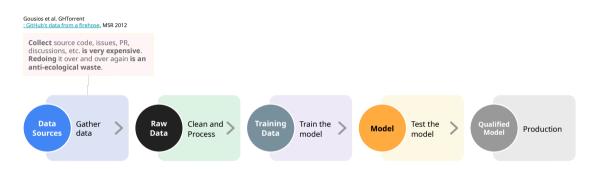
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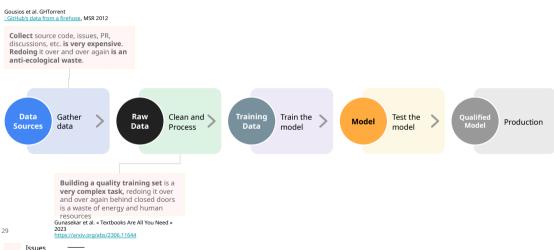
We need a coordinated effort to ensure fully open models will succeed!

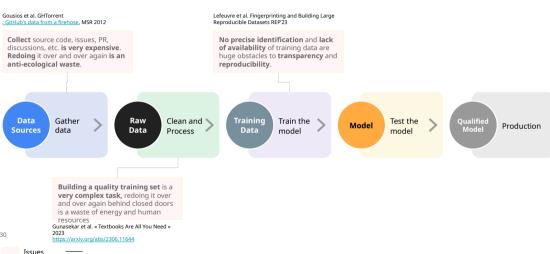


Issues

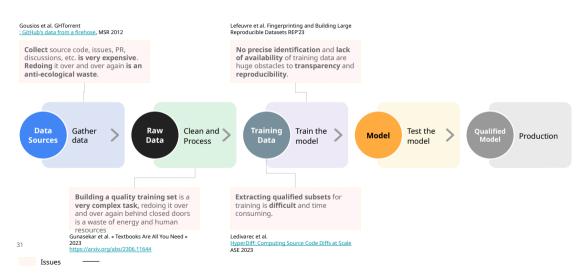


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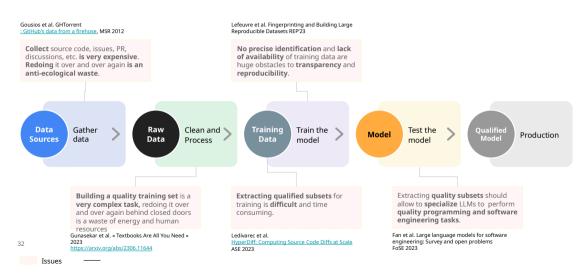




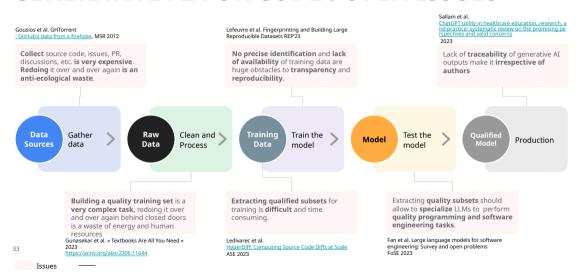
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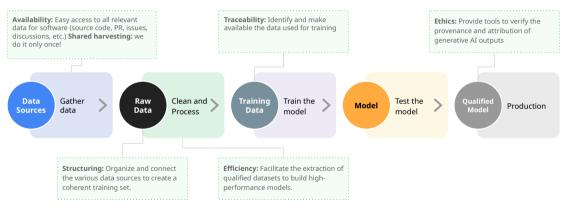
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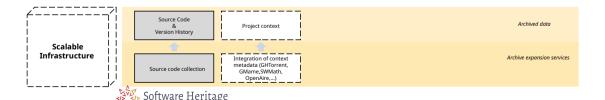
#### A STEP FORWARD: CodeCommons

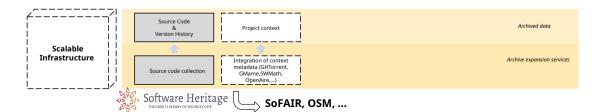


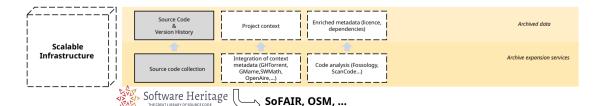
Solutions

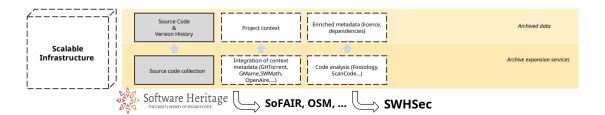


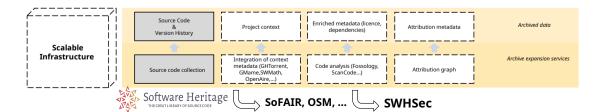


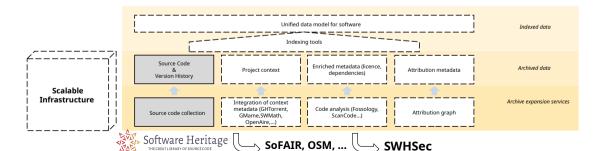


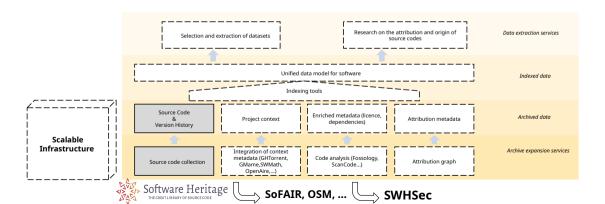


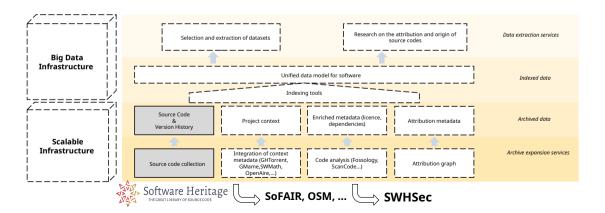


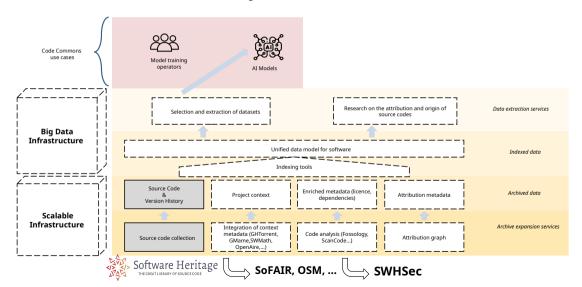


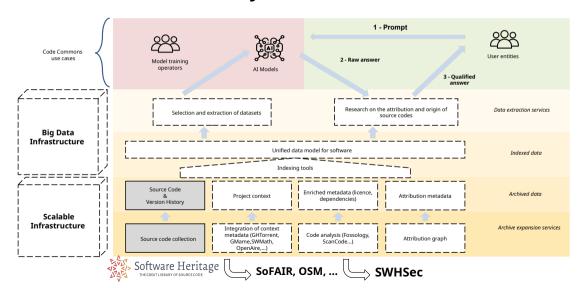










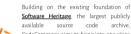


ORARAMNIS A		ΤΗΕ ΔΥΤΌΡΟ
Team	Entity / Referent	Expertise
ed partners Software Heritage		
DiverSE		Universal Archive of Software Source Code
	ĺnría_	Software engineering, code, programming, languages, Software variability management Large-scale software evolution Generative AI for software development
Almanac	_	Automatic linguistic modeling and analysis and computational humanities
CEDAR	cea	Analysis and processing of complex, large-scale data
vare vation Lab	YWEAG	Automatic language processing Generative AI
DILS	by Modus Create	Engineering, Software and Systems
AboutCode		Machine learning, Modeling, Natural language processing Distributed computing
ontracting (budget < 200k€)		
Sant'Anna	Philippe Ombredanne	The global benchmark for license detection
nded partners		
Emeritus Inria DI PICA	Patrick Valduriez	Cutting-edge expertise in big data management
ALMA MATER STUDIORUM UNIVERSITÀ DI BOLOGNA	Paolo Ferragina	Data compression and text algorithms (ACM Paris Kanellakis award 2022)
UNIVERSITA DEGLI STUDI DI TORINO	Marco Danelutto	Massively parallel HPC programming expertise

# CodeCommons

Open, responsible, and transparent AI: Our shared goal

CodeCommons is an ambitious project to create the world's most comprehensive digital commons for code



available source code archive, CodeCommons aims to bring into one place all the critical and qualified information needed to create smaller, better datasets for the next generation of Al tools. At its core, the project prioritizes transparency and traceability, enabling model builders and users to respect creators' rights while promoting sovereign and sustainable AI.



#### Learn more





#### Meet the teams





#### Outline

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- **6** Conclusion

#### Come in, we're open!

## https://softwareheritage.org

#### Software Heritage is

- vendor neutral, open source
- worldwide, long term

#### Software Heritage enables

- archival, reference, integrity
- traceability, global knowledge base

Contact: roberto@dicosmo.org

#### Call to action

- support a shared open infrastructure to support your use cases
- develop new applications, tackle new scientific challenges
- positions open for CodeCommons

#### Join us



#### Annual report 2024



@swheritage

