



# Automated Extraction of Research Software Installation Instructions from README files

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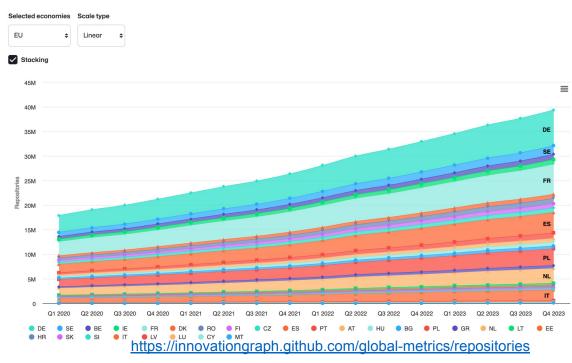


c.utrillaguerrero@tudelft.nl https://carlosug.github.io/



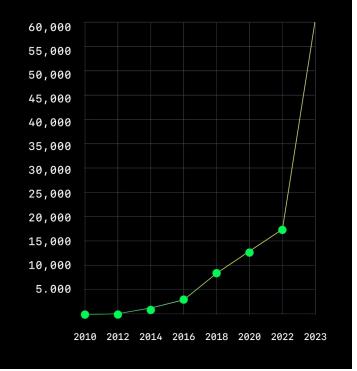
Every software repository comes with a README file (https://docs.github.c om/en/repositories)

#### Count of Repositories Among Economies in the EU @



### The explosive growth of genAl in 2023

# The global growth in generative Al projects on GitHub



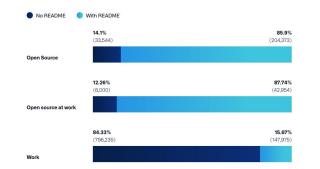
Github is foundational to how software is build today

https://github.blog/2023-11-08-the-state-of-open-source-and-ai/#the-explosive-growth-of-generative-ai-in-2023

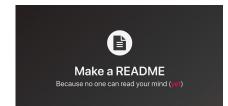


\* source: https://octoverse.github.com/2021/creating-documentation/#readme-or-not

If we wish to investigate further, a clearly written, up-to-date documentation should be available for researchers to run interpretively



https://octoverse.github.com/2021/creating-documentation/#readme-or-not





1974: PDP-10 software had "README.TXT" http://pdp-10.trailing-edge.com/decus\_20tap3\_198111/01/decus/20-007 <u>9/readme.txt.html</u>



README convention to the famous scene in Lewis Carroll's *Alice's Adventures In Wonderland* in which Alice confronts magic munchies labeled "Eat Me" and "Drink Me": <u>https://medium.com/@NSomar/readme-md-history-and-compo</u> <u>nents-a365aff07f10</u>

# Challenge: README is not foolproof, often is difficult to interpret!

- Instructions on how to install, setup, run and test new ideas!
- How to carry out the various individual operations involved in a installation process?

Installation			
Pykan can be installed via PyPI or directly from GitHub.			
Pre-requisites:			F
Python 3.9.7 or higher pip	C		
Installation via github			
python -m venv pykan-env source pykan-env/bin/activate  # On Windows use `pykan-env∖Scripts∖ pip install git+https://github.com/KindXiaoming/pykan.git	⊡ activate`	1	
Installation via PyPI:			
python —m venv pykan—env source pykan—env/bin/activate  # On Windows use `pykan—env pip install pykan	\Scripts\activate	C	
Requirements			After a
<pre># python==3.9.7 matplotlib==3.6.2 numpy==1.24.4</pre>		C	pip :
<pre>scikit_learn==1.1.3 setuptools==65.5.0 sympy==1.11.1</pre>			Option
torch==2.2.2 tqdm==4.66.2			conda conda pip : # or
			pip i

Installation

#### Repo: https://github.com/KindXiaoming/pykan



After activating the virtual environment, you can install specific package requirements as follows:

install –r	requirements.txt

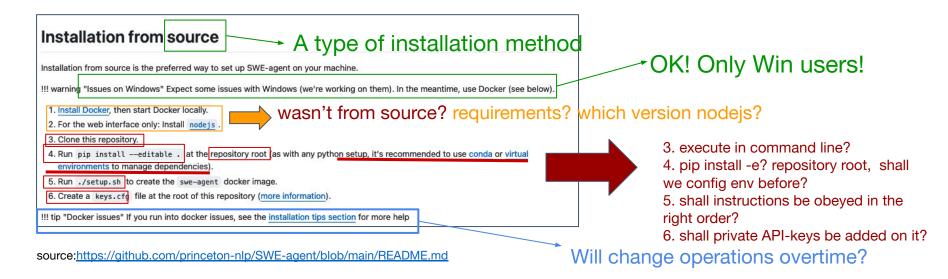
Optional: Conda Environment Setup For those who prefer using Conda:

conda createname pykan-env python=3.9.7			Q
<pre>conda activate pykan-env pip install git+https://github.com/KindXiaoming/pykan.git</pre>	# For GitHub	installation	
# or			
pip install pykan # For PyPI installation			

(D

# Challenge: READMEs may be difficult to interpret!

- Instructions on how to install, setup, run and test new ideas!
- How to carry out the various **individual operations** involved in a software installation process?



#### Challenges: inconsistency, ambiguity, incompleteness, time-dependent

The art of Guesstimate the installation task!!

README file contain essential information written in human language, making automated extraction challenging

### Challenge: README is not foolproof, often is difficult to interpret!

#### - Inconsistency in documentation practice:

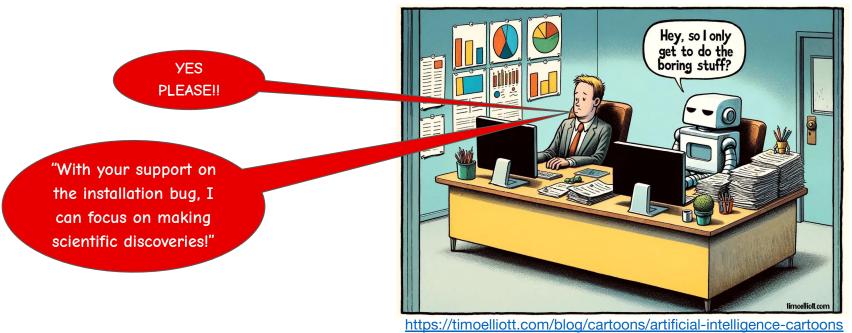
- Diverse installation methods: pip, source, container, binary
- Requirements and dependencies aren't part of installation procedures
- Optional steps to configure environmental variables
- Redundancy and/or incompleteness:
  - Add useless and/or obsolete commands for file location
  - Ambiguity guessing about specific actions in root directory
  - Insufficient instructions for executing a command
  - Time-variant:
    - Often instructions will begin to change/degrade in time or accuracy before it fails
    - The major time sink is removing package conflicts with version and configure environments
    - Methods stop working eventually if not actively maintained
    - Tools and libraries and dependencies changes may cause collapse
    - Bugs are found, new features are needed, new setup requirements arise

Critical information is missing for effective software reuse

Authors tendency to oversimplify the role standards in documentation, making reuse of research software difficult README file contain essential information written in human language, making automated extraction challenging

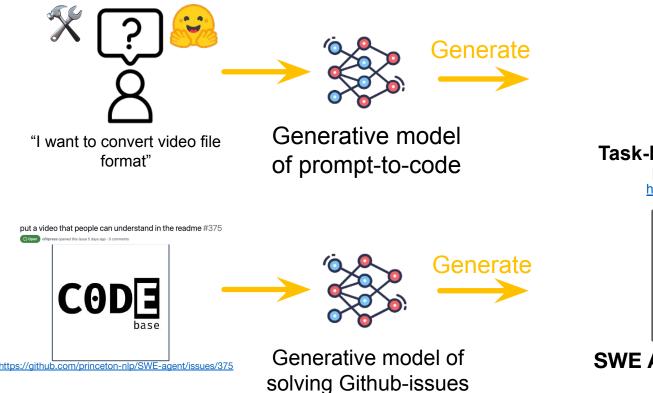
LLMs to turn natural language instructions into a procedure that must executed correctly. We aim to **understand how well LLMs are able to**:

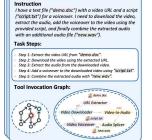
- Detect alternate installation methods (Plans)
- Extract their sequential instructions (Steps)



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### Solving research software installation problems with generative models





### Task-Bench: Task automation

[Yongliang Shen, et al., 2023] https://arxiv.org/pdf/2311.18760

Problem source Wite here		۷
	LODICS, DateTime fields have started throwing an error when being instantiated as inner fields of container fields like List or Tuple. The	
snippet below works in <=3.0.0n	8 and throws the error below in $\approx$ 3.0.0vc9 (and, worryingly, 3.0.0)	
"pythee		
from marshmallow import fields	, Schema	
class MySchema(Schema):		
times - fields.List/fields.Date?	ime()	
s = MySchema()		
Traceback:		
Traceback (most recent call last		
File 'test-mm.py', line B, in one	dulo	
s = MySchema()		
File '/Users/victor/pyerv/versi self fields - self. init, fields)	orn/mamhmallow/lik/python3.6/sibe packages/mamhmallow/schema.py', line 383, in _init	
File '/Users/victor/ pyenv/versi	cen/mashenallow/liky/python3.6/site packages/mashmallow/schema.py/, line 913, is _init_fields	
Local repo path or GitHub URL	https://github.com/swe-agent-demo/manimaliow	
Ren = Stop	Strike	

SWE Autonomous coding agent

[John Yang et al., 2024] https://swe-agent.com/ @princeton-nlp

# Our goal: verify how well LLMs are able to breakdown the installation problem

Input (readme.md)

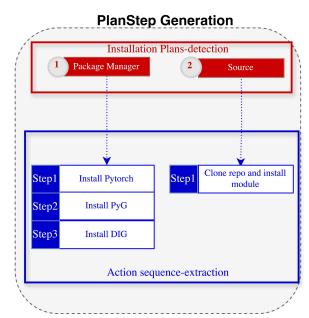






Output (PlanStep.json)

Generative model for extracting Plan and Step



"type\_plan": "Package Manager", "step1": "Install PyTorch", "step2": "Install PyG", "step3": "Install DIG", "technology": "Pip"

"type\_plan": "Source", "step1": "Clone repository and install module", "command": "git clone</br>cd</br>pip install .'

#### correct

#### Installation

#### Install from pip

The key dependencies of DIG: Dive into Graphs are PyTorch (>=1.10.0), PyTorch Geometric (>=2.0.0)

1. Install PyTorch (>=1.10.0)

\$ python -c "import torch; print(torch.\_\_version\_\_)"
>>> 1.10.0

2. Install PyG (>=2.0.0)

\$ python -c "import torch\_geometric; print(torch\_geometric.\_\_version\_\_)"
>>> 2.0.0

3. Install DIG: Dive into Graphs.

pip install dive-into-graphs

#### Install from source

If you want to try the latest features that have not been released yet, you can install dig from source.

git clone https://github.com/divelab/DIG.git
cd DIG
pip install .

# **Prompt101 - Readme2Plan generation**

from groq import Groq

client = Groq()

completion = client.chat.completions.create(model="llama3-70b-8192",

messages=[{

"role": "user",

"PROMPT101": "Given the following README, your task is to identify and list the unique installation methods. These methods are plans containing instructions for installing research software, to be executed in a specific order and under defined conditions: \n1. Binary: Install via download and run precompiled files. For example, GitHub releases.\n2. Container: Install the software and its dependencies via isolated environments. For example, Docker, Podman, or Singularity.\n3. Package Manager: Install via tools and indexed repositories. For example, Conda, Homebrew, or Pip.\n4. Source: Run via command-line, manage and install dependencies, compile source code to a target machine, build, and run. For example, download raw source code, clone repositories, and install dependencies from code repositories.\n\nExclude code commands. Be concise.\n\n### {{README:\n\n##}} ###"},{

"role": "assistant",

"response": "Here are the unique installation methods mentioned in the README:\n\n1. \*\*Binary\*\*: Not explicitly mentioned, but implied through the mention of PyPI installation.\n2. \*\*Container\*\*: Not mentioned.\n3. \*\*Package Manager\*\*: Conda (via Conda Environment Setup)\n4. \*\*Source\*\*: Installation via GitHub (using `pip install git+https://github.com/KindXiaoming/pykan.git`)\n5. \*\*Virtual Environment\*\*: Using `python -m venv` to create a virtual environment, and then installing using `pip`.\n\nNote that the installation methods are not mutually exclusive, and some methods may involve a combination of these approaches."

```
],
temperature=0,
max_tokens=1024,
top_p=1,
stream=False,
stop=None,
```

)

print(completion.choices[0].message)

# P(next word | previous words)

Ziming Lui et al., 2024 Demo from https://kindxiaoming.github.io/p ykan/





```
from groq import Groq
```

```
client = Groq()
completion = client.chat.completions.create(
model="llama3-8b-8192",
messages=[
```

```
"role": "user",
```



"content": "Given the following ### {{README}}, extract the installation instructions for each installation method. These methods are plans containing instructions as steps for installing research software, to be executed in a sequential order, and under defined conditions:\n[DEFINITIONS]\nPerform the following actions. For each README:\n1. Extract the installation instructions for each method .\n2. For each installation method mentioned in the README return a list, where each element of the list is an instruction, in a sequential order. \n3. Write those instructions in sequential order such as: Step1: ..., Step2: .....StepN \n\nExclude code commands in the list. If the README does not contain a sequence of instructions, then simply write \\\"No steps provided\\\". Be concise.\n\n### {{README:}}

#### "role": "assistant",

"content": "Here are the installation instructions for each installation method:\n\n\*\*Binary: No installation instructions provided\*\*\n\n\*\*Container: No installation instructions provided\*\*\n\n\*\*Package Manager:\*\*\n\nStep1: Create a virtual environment\nStep2: Activate the virtual environment\nStep3: Install the package via pip\nStep4: Install specific package requirements\n\n\*Source:\*\*\n\nStep1: Create a virtual environment\nStep2: Activate the virtual environment\nStep3: Install the package via pip\nStep4: Install specific package requirements\n\n\*Source:\*\*\n\nStep1: Create a virtual environment\nStep2: Activate the virtual environment\nStep3: Install the package via pip\nStep4: Install specific package requirements\n\nNote: The README does not provide installation instructions for the Container and Binary methods."

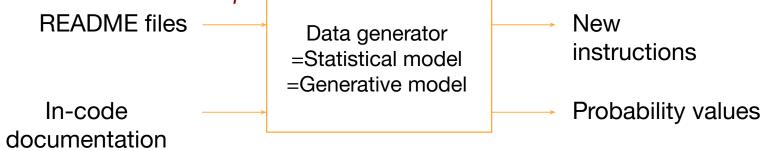
```
],
temperature=0,
max_tokens=1024,
top_p=1,
stream=True,
stop=None,
```

```
)
```

```
for chunk in completion:
P(next wordhuprevious)"", end="")
```

Ziming Lui et al., 2024 Demo from <u>https://kindxiaoming.github.io/p</u> <u>ykan/</u>

- Develop an approach to verify how well they are able to automatically extract instructions and whether these instructions actually match the ones generated by the original authors.
- LLM to autonomously decide on what sequence of steps to execute to install a software
- Assess the ability of LLMs to capture installation instructions, both in terms of *Plans* and *Steps*



Automate the extraction and validation of installation instruction using structured framework:

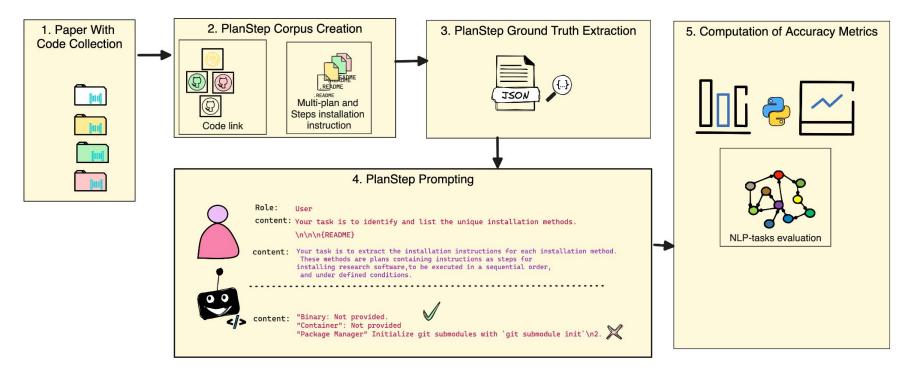


Figure: Overview of the methodology followed to collect research software and design an evaluation framework

## **Corpus and ground truth extraction**

33 open-source research software projects from basic installation procedures to more complex

## For each README, identify:



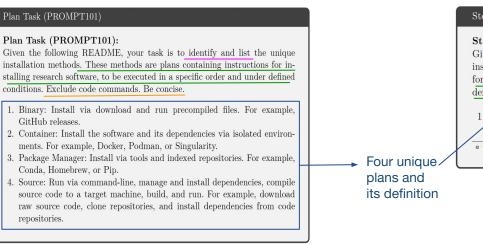
# We defined **Steps** based original's README text

# **Experimental setups**

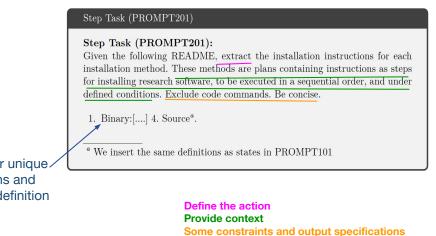
# We prompt (zero-shot) LLMs (Mixtral and LLaMa) to breakdown the installation problem into two-smaller ones



1-**Plan** prompting: this task is about extracting the installation method as Plans described in a README



2-**Step** prompting: This task asks for detecting detailed, sequential steps for each installation plan found in a README



### **Fallibility of LLMs**

#### ASSISTANT

1. \*\*Binary\*\*: Not explicitly mentioned, but implied through the mention of PyPI installation.

2. \*\*Container\*\*: Not mentioned.

3. \*\*Package Manager\*\*: Conda (via Conda Environment Setup)

Here are the unique installation methods mentioned in the README:

4. \*\*Source\*\*: Installation via GitHub (using `pip install git+https://github.com/KindXiaoming/ pykan.git`)

5. \*\*Virtual Environment\*\*: Using `python -m venv` to create a virtual environment, and then installing using 'pip'.

Note that the installation methods are not mutually exclusive, and some methods may involve a combination of these approaches.

ASSISTANT	Here are the installation instructions for each installation method:
	**Binary: No installation instructions provided**
	**Container: No installation instructions provided**
	**Package Manager:**
	Step1: Create a virtual environment
	Step2: Activate the virtual environment
	Step3: Install the package via pip
	Step4: Install specific package requirements
	**Source:**
	Step1: Create a virtual environment
	Step2: Activate the virtual environment
	Step3: Install the package via pip
	Step4: Install specific package requirements
	Note: The README does not provide installation instructions for the Container and Binary methods.

Example from https://kindxiaoming.github.io/pvkan/

#### Installation

Pykan can be installed via PyPI or directly from GitHub.

#### Pre-requisites:

Python 3.9.7 or higher DID

#### Installation via github

python -m venv pykan-env source pykan-env/bin/activate # On Windows use `pykan-env\Scripts\activate` pip install git+https://github.com/KindXiaoming/pykan.git

#### Installation via PyPI

python -m venv pykan-env source pykan-env/bin/activate # On Windows use `pykan-env\Scripts\activate` pip install pykan Requirements # python==3.9.7 matplotlib==3.6.2 numpy==1.24.4 scikit learn==1.1.3 setuptools==65.5.0 sympy==1.11.1 torch==2.2.2 tadm==4.66.2 After activating the virtual environment, you can install specific package requirements as follows:

#### pip install -r requirements.txt Optional: Conda Environment Setup For those who prefer using Conda: conda create ---name pykan-env python=3.9.7

conda activate pykan-env pip install git+https://github.com/KindXiaoming/pykan.git # For GitHub installation # or pip install pykan # For PyPI installation

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0

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Plan: both models achieved around 59% F1-score, but LLAMA significantly outperformed MISTRAL

$\operatorname{LLM}$	Zero-shot		
	Precision	Recall	F1 score
llama-2-7b-chat	0.4615	0.8333	0.5941
Mixtral-8x7b-Instruct-v0.1	0.4068	0.6667	0.5053

MISTRAL

E3 O

0

LLAMA

0 0 1 0 0 0

 $15 \ 4 \ 8 \ 1 \ 0 \ 6$ 

0 1 1 1 0 0

Error Type: E1 E2 E3 O E1 E2

Package Manager 0 0 1 0 1 0

Number of steps agrees with <

Binary

Source

Container

ground truth

		edu.nl/ej7ed
-	LLM	Zero-shot
- re		$R1 \uparrow R2 \uparrow RL$
	llama-2-7b-chat	29.48 18.88 27.75
	Mixtral-8x7b-Instruct-v(	0.1 46.42 37.53 45.27
	Step: LLMs demonstration performance (ROUGE) steps in a plan	when extracting
<ul> <li>Error analys</li> </ul>	s: lack of context	
TT LAMA D MIXTRAL	LLMs detected plans and ste	ps falsely
	Definitions into the n	nodel responses. We

need to keep refining with better prompts!

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incorrect

perfect

under-d

over-d

- Interpreting and rigorously verifying installation instructions remain complex for LLMs
- PlanStep is a simple yet effective validation framework for evaluating LLMs in extracting installation plans and steps
- **Experiments** indicate LLMs struggle with the extraction but show potential
- Future improvements:
  - Enhance PlanStep corpus with level of complexity in the installation plans
  - Incorporate novel prompt methods e.g., few-shot-CoT, LLM4PDDL, CoSm
  - Represent instructions in formalised/machine language e.g., P-PLAN, PDDL





**Delft University of Technology** 



