

# We don't need any more open-source models!

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Aalto University

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# Introduction: a typical modelling project

*Open-source tools (can) increase the efficiency of modelling, scenario development, analysis, and writing*

Time allocated for scenario development and analysis

Coding a toy problem

More coding

Collecting data

Collecting more data

Calibrating a baseline

More calibrating

Developing scenarios

Working on scenarios

Analysis & writing

Quality of code review, documentation, etc. over project duration

# Problems with open-source scientific software

*There are many concerns that open-source projects deliver sub-par quality compared to closed-source tools*

List of drawbacks:

- ...?
- ...?
- ...?

⇒ It's just a question of committed resources...

⇒ Overall, the downsides & risks are (pretty much) the same as a close-source (commercial or academic) project

# Actual issues of open-source scientific software

*If the quality of open-source projects depends on resources, how do we make sure that projects get adequate support?*

A few ideas on how to improve collaboration:

- ⇒ Make open-source required by funding agencies
- ⇒ Change the expectation in the community
- ⇒ Look around for existing projects rather than start from scratch...

## Challenges

- ⇒ In particular for early-career researchers, how to get recognition for contributions to other projects?
- ⇒ Open-source doesn't mean high-quality scientific software

# Rationale for best-practice scientific programming

*Following best-practice principles in your work will give you more time to do better research*

Modelling and scientific analysis is usually a “constant prototyping” exercise

- ⇒ “Just adding one more feature” often breaks existing functionality
- ⇒ Dependencies (open-source packages) change over time
- ⇒ Models and tools are too complex to immediately notice changed behaviour

Who has not yet experienced the panic & stress  
from a model not solving shortly before a deadline...?

Following best-practice principles...

- ⇒ Guards against models and tools failing to work (as expected)
- ⇒ Helps you to understand *your own thinking* a few months later

# A one-slide guide to open & FAIR research

*Even accomplished researchers aren't always up to speed...*



DOI:  
[10.22022/ene/04-2020.16404](https://doi.org/10.22022/ene/04-2020.16404)

More about the FAIR principles:  
[www.go-fair.org/fair-principles/](http://www.go-fair.org/fair-principles/)

Please cite as: Daniel Huppmann et al., 2020  
Five best-practice steps to make your research open & FAIR v1.0  
doi: [10.22022/ene/04-2020.16404](https://doi.org/10.22022/ene/04-2020.16404) | url: [openENTRANCE.eu](https://openENTRANCE.eu)

## Five best-practice steps to make your research open & FAIR<sub>v1.0</sub>



You may think that putting your work\* on a website already makes it free & open. But that's not quite true – follow these steps to implement best practice of **#openscience!**

\* data sets, text, tables, figures & illustrations, source code, scientific software, ... even #Horizon2020 deliverables

### 1. Open

If you want your *work to be read, used & shared by others*, be explicit about it: For text, data, figures, ... – use the [CC-BY license](https://creativecommons.org/licenses/by/4.0/) | For code, visit [choosealicense.com](https://choosealicense.com)

### 2. Findable

To make it easy for others to find and cite your work, get a [digital object identifier \(DOI\)](https://www.doi.org/) and add a *recommended citation*

### 3. Accessible

Depositing your work in an institutional repository or a service like [zenodo](https://zenodo.org/) ensures that your work is still *available even after the end of the project*

### 4. Interoperable

Using established community standards, data formats and software packages lets others *quickly understand and use your work*

### 5. Reusable

To make it easy for others to *build on your work*, make sure to assign a version number and relevant (machine-readable) metadata



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# A Special Report on Global Warming of 1.5°C

## Analyzing impacts of climate change in the context of the SDGs

The IPCC *Special Report on Global Warming of 1.5°C* (SR15) was published in the fall of 2018.

### The New York Times

#### **Major Climate Report Describes a Strong Risk of Crisis as Early as 2040**

[...] To prevent 2.7 degrees of warming, the report said, greenhouse pollution must be reduced by 45 percent from 2010 levels by 2030, and 100 percent by 2050. It also found that, by 2050, use of coal as an electricity source would have to drop from nearly 40 percent today to between 1 and 7 percent. Renewable energy such as wind and solar, which make up about 20 percent of the electricity mix today, would have to increase to as much as 67 percent. [...]

[www.nytimes.com/2018/10/07/climate/ipcc-climate-report-2040.html](http://www.nytimes.com/2018/10/07/climate/ipcc-climate-report-2040.html)



Harry Taylor, 6, played with the bones of dead livestock in Australia, which has faced severe drought.

Brook Mitchell/Getty Images

Where do these numbers come from?



[www.ipcc.ch/sr15](http://www.ipcc.ch/sr15)

# An example of open & FAIR science

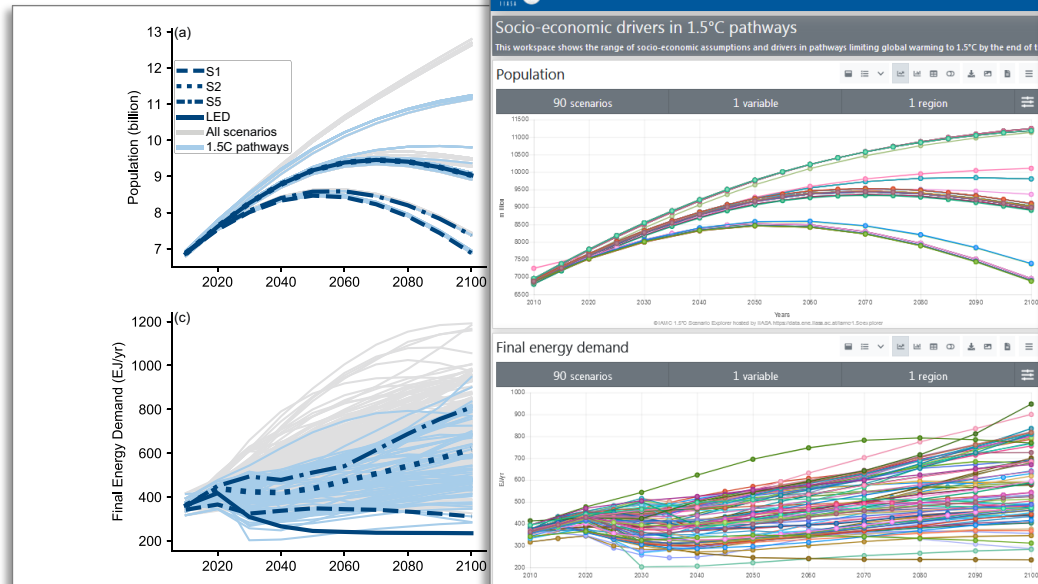
## The IPCC SR15 as a case study of open & FAIR scenario analysis

Interactive online scenario explorer at [data.ene.iiasa.ac.at/iamc-1.5c-explorer](https://data.ene.iiasa.ac.at/iamc-1.5c-explorer)

Range of assumptions of socio-economic drivers (Figure 2.4)

Notebook `sr15_2.3.1_range_of_assumptions`

The SR15 SPM and chapters are still undergoing copy-edits and revisions as part of the tricklebacks from the approval plenary. The assessment, statistics tables and figures shown here is therefore still subject to change.



```
In [10]: fig, ax = plt.subplots(2, 2, figsize=(8, 6))

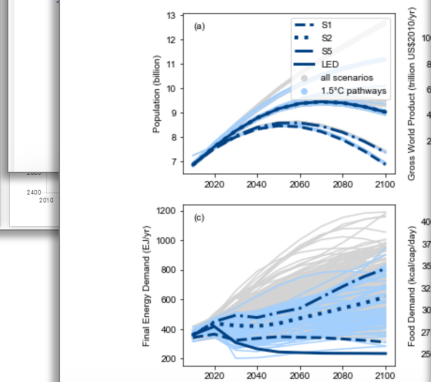
pop = df.filter(variable='Population')
pop.convert_unit({'million': ['billion']})
line_plot_with_markers(ax[0][0], pop,

gdp = df.filter(variable='GDP|PPP')
gdp.convert_unit({'billion US$2010/yr': ['billion US$2010/yr']})
line_plot_with_markers(ax[0][1], gdp,

final = df.filter(variable='Final Energy Demand')
line_plot_with_markers(ax[1][0], final,

food = df.filter(variable='Food Demand')
line_plot_with_markers(ax[1][1], food,

ax[0][0].legend(loc=1)
fig.tight_layout()
```



The screenshot shows the GitHub repository page for 'iiasa/ipcc\_sr15\_scenario\_analysis'. It displays the repository name, commit history, and file structure. The commit history shows recent updates by 'danielhupmann' and 'ncc'. The file structure includes folders for 'static', 'assessment', 'bibliography', 'data', 'further\_analysis', 'ncc', and files for '.gitignore', 'AUTHORS.md', 'LICENSE', 'NOTICE', and 'README.md'.

Figure 2.4 | Range of assumptions about socio-economic drivers and assessment. 1.5°C-consistent pathways are blue, other pathways grey. Trajectories for the illustrative 1.5°C-consistent archetypes used in this Chapter (LED, S1, S2, S5; referred to as P1, P2, P3, and P4 in the Summary for Policymakers.) are highlighted. S1 is a sustainability oriented scenario, S2 is a middle-of-the-road scenario, and S5 is a fossil-fuel intensive and high energy demand scenario. LED is a scenario with particularly low energy demand. Population assumptions in S2 and LED are identical. Panels show (a) world population, (b) gross world product in purchasing power parity values, (c) final energy demand, and (d) food demand.

Figure 2.4 as printed in the SR15 ([www.ipcc.ch/sr15](http://www.ipcc.ch/sr15))

Rendered notebooks to generate figures and tables at [data.ene.iiasa.ac.at/sr15\\_scenario\\_analysis](https://data.ene.iiasa.ac.at/sr15_scenario_analysis)

```
$ git clone git@github.com:iiasa/ipcc_sr15_scenario_analysis.git
```



# A toolbox for scenario analysis & visualization

*The pyam package enables streamlined processing of results as well as versatile exploration, analysis and visualization tools*

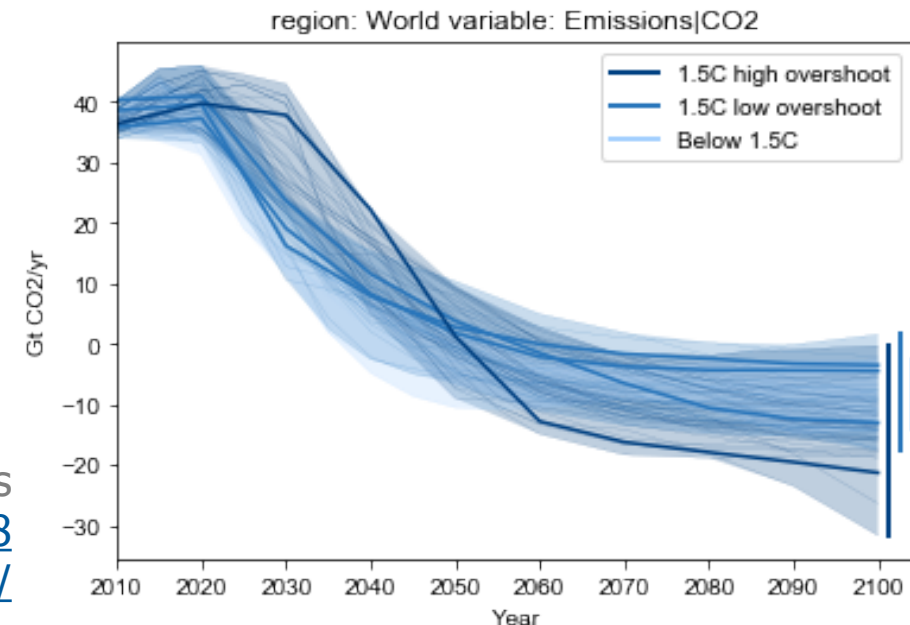
## Requirement 1:

- ⇒ Standardized, scripted, version-controlled, unit-tested workflow to efficiently get from raw model *output* to processed *results*  
e.g., aggregate over sectors & regions using context-specific methods (sum, weighted average, min/max)
- ⇒ Validation and consistency checking

## Requirement 2:

- ⇒ Exploration and analysis of results in a *reproducible & transparent* manner

Carbon dioxide emissions across 1.5°C pathways  
SPM 3a, IPCC SR15 | doi: [10.22022/SR15/08-2018.15428](https://doi.org/10.22022/SR15/08-2018.15428)  
url: [https://data.ene.iiasa.ac.at/sr15\\_scenario\\_analysis/](https://data.ene.iiasa.ac.at/sr15_scenario_analysis/)



# pyam: a Python package for scenario analysis

*To facilitate the validation and assessment of scenario results, we developed a dedicated open-source package*

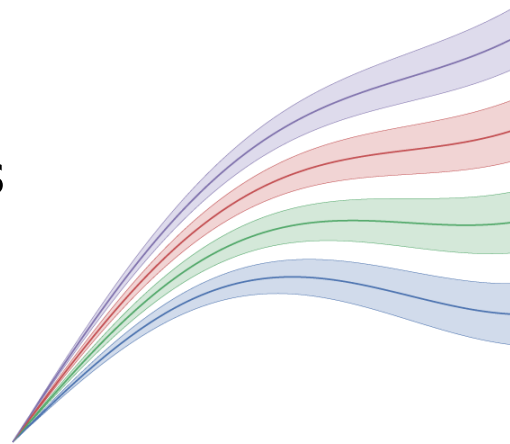


Aim: develop a package for scenario analysis & visualization

following best practice of collaborative scientific software development

Features:

- ⇒ Analysis & validation
- ⇒ Categorization & indicators
- ⇒ Visualization features
- ⇒ Statistics package



***pyam*: analysis and visualization of integrated assessment scenarios**

License Apache 2.0    pytest passing    docs passing    codecov 95%

DOI 10.5281/zenodo.1470400    JOSS 10.21105/joss.01095

Repository hosted on



Community supported by



Documentation hosted by



[pyam-iamc.readthedocs.io](https://pyam-iamc.readthedocs.io)

More information:

Documentation: [pyam-iamc.readthedocs.io](https://pyam-iamc.readthedocs.io)

Scientific reference: M. Gidden and D. Huppmann (2019).

*Journal of Open Source Software* 4(33):1095.

doi: [10.21105/joss.01095](https://doi.org/10.21105/joss.01095)



#pyam\_iamc

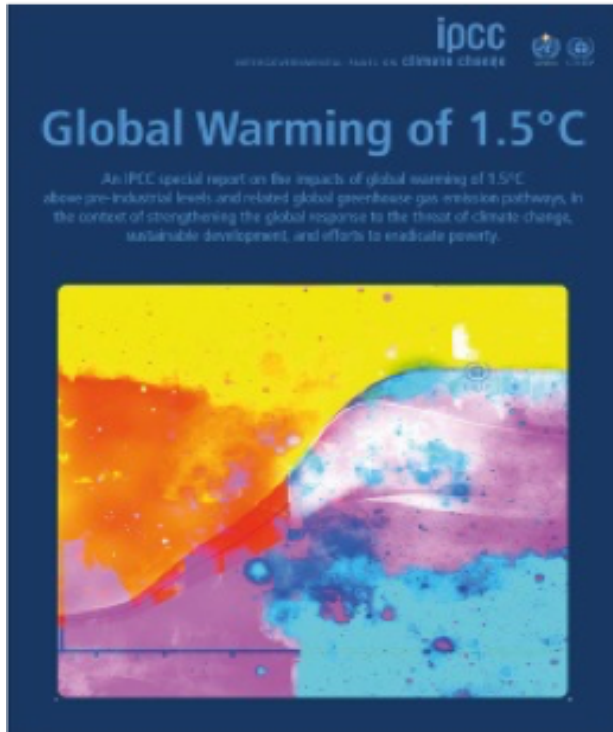
# pyam: supporting the IPCC SR15 assessment

*Many figures & tables in the SR15 were created with pyam*

*Check out the open-source notebooks – transparent & reproducible!*

The IPCC *Special Report on  
Global Warming of 1.5°C*

Range of assumptions about socio-economic drivers  
and projections for energy and food demand



[www.ipcc.ch/sr15](http://www.ipcc.ch/sr15)

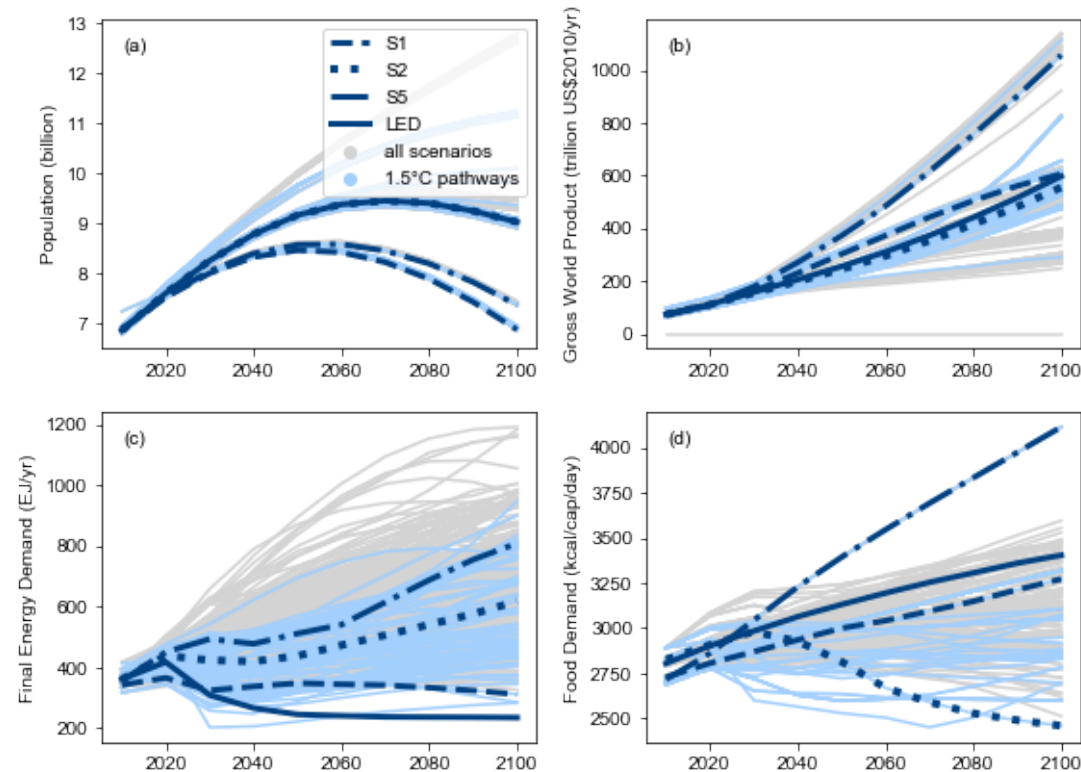


Figure 2.4, page 111, SR15



More information on  
open tools & resources  
supporting the IPCC SR15

# The key components for model integration

*In the openENTRANCE project, we aim to develop an ecosystem of models & tools for decarbonization pathways*

Model integration requires a common nomenclature

i.e., naming conventions, definitions, list of regions

⇒ We started a collaborative process on GitHub to facilitate an open discussion and a clear history of changes.

⇒ Implemented as yaml-format dictionary files to balance (human) readability vs. machine processability



`Final Energy:`

`description:` Total final energy consumption by all end-use sectors and all fuels, excluding transmission/distribution losses

`unit:` EJ/yr

More info [github.com/openENTRANCE/nomenclature](https://github.com/openENTRANCE/nomenclature)

# My view on the road ahead for energy modelling

## *Open science has to go beyond open source...*

In an IIASA nexus blog post published a few weeks ago...



⇒ I discuss how open-source scientific software and FAIR data can bring us a step closer to a community of open science

<https://blog.iiasa.ac.at/>

More information on my lectures at TU Wien (VU 370.062)



<https://data.ene.iiasa.ac.at/teaching> (including recording of some lectures)

My plea to the audience of this seminar

⇒ Contribute to other work rather than develop new models!

⇒ Follow best-practice of scientific software dev & FAIR principles!

*Thank you very much for your attention!*

Curious about the pyam package?

- Read the docs on [pyam-iamc.readthedocs.io](http://pyam-iamc.readthedocs.io)

Want to learn more about the IPCC SR15 scenario ensemble & assessment?

- Read our commentary in Nature Climate Change at <https://rdcu.be/9i8a>

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<http://www.iiasa.ac.at/staff/huppmann>

# The IAMC template for timeseries data

## *A community standard for compiling scenario results*

Over the past decade, the integrated-assessment community (IAMC) developed a tabular data format for model inter-comparison projects



- ⇒ High-profile use case: IPCC Reports (AR5, SR15)
- ⇒ Used by ~50 research teams globally



	A	B	C	D	E	F	G	H	I	
1	<b>Model</b>	<b>Scenario</b>	<b>Region</b>	<b>Variable</b>	<b>Unit</b>	<b>2005</b>	<b>2010</b>	<b>2015</b>	<b>2020</b>	
2	MESSAGE	CD-LINKS 400	World	Primary Energy	EJ/y	454.5	479.6	...	...	

It's not a great standard...

- ⇒ No direct metadata, no sub-annual time resolution (yet), scalability issues, ...
- ⇒ But it's easy to work with for non-experts, across platforms,  
and there is plenty of existing infrastructure to work with this format

# The “variable” column

*The IAMC data format uses the “variable” column to implement a semi-hierarchical structure*

The “variable” column can be used to implement a hierarchical tree

⇒ Aggregate:           Primary Energy

⇒ Subcategory:       Primary Energy|Coal

⇒ Further detail:    Primary Energy|Coal|w/CCS

⇒ The pyam package offers many tools to work with such hierarchical trees

```
df.filter(variable='Primary Energy*', level=1)
```

```
df.aggregate(variable='Primary Energy')
```

Read the docs for more information:

⇒ <https://pyam-iamc.readthedocs.io/en/stable/data.html>



# Good practice for scenarios ensemble analysis

*As part of the effort supporting the IPCC SR15 assessment, we wrote a list of “do’s and don’ts” for model/scenario comparison*

## A user’s guide to the analysis and interpretation of (unstructured) scenario ensembles

- Don’t interpret the scenario ensemble as a statistical sample or as likelihood/agreement.
- Don’t focus only on the medians, but consider the full range over the scenario set.
- Don’t cherry-pick individual scenarios to make general conclusions.
- Don’t over-interpret scenario results and don’t venture too far from the original question.
- Don’t conclude that the absence of a particular scenario (necessarily) means that this scenario is not feasible or possible.

Based on Box 1, Huppmann et al., Nature Climate Change 8:1027-1030 (2018).  
doi: [10.1038/s41558-018-0317-4](https://doi.org/10.1038/s41558-018-0317-4) | open-access version: <https://rdcu.be/9i8a>