

Fluid: Towards Transparent Science Communication

intelligible openness

“Open” should mean **accessible, intelligible** and **contextualised**, not just available for download

Today, outputs are disconnected from the pipelines used to create them

Notebooks help, but push the burden onto authors

AI can help reconstruct things after the fact, but how can we rely on this?

Can we help **authors** tell stories able to reveal their own supporting evidence?



For:

- >Data journalism
- Publishing
- Distillation

disconnect between “**data**” and “**discourse**”



a **software infrastructure** problem!

Can we help **readers** engage, critique and reach their own conclusions?



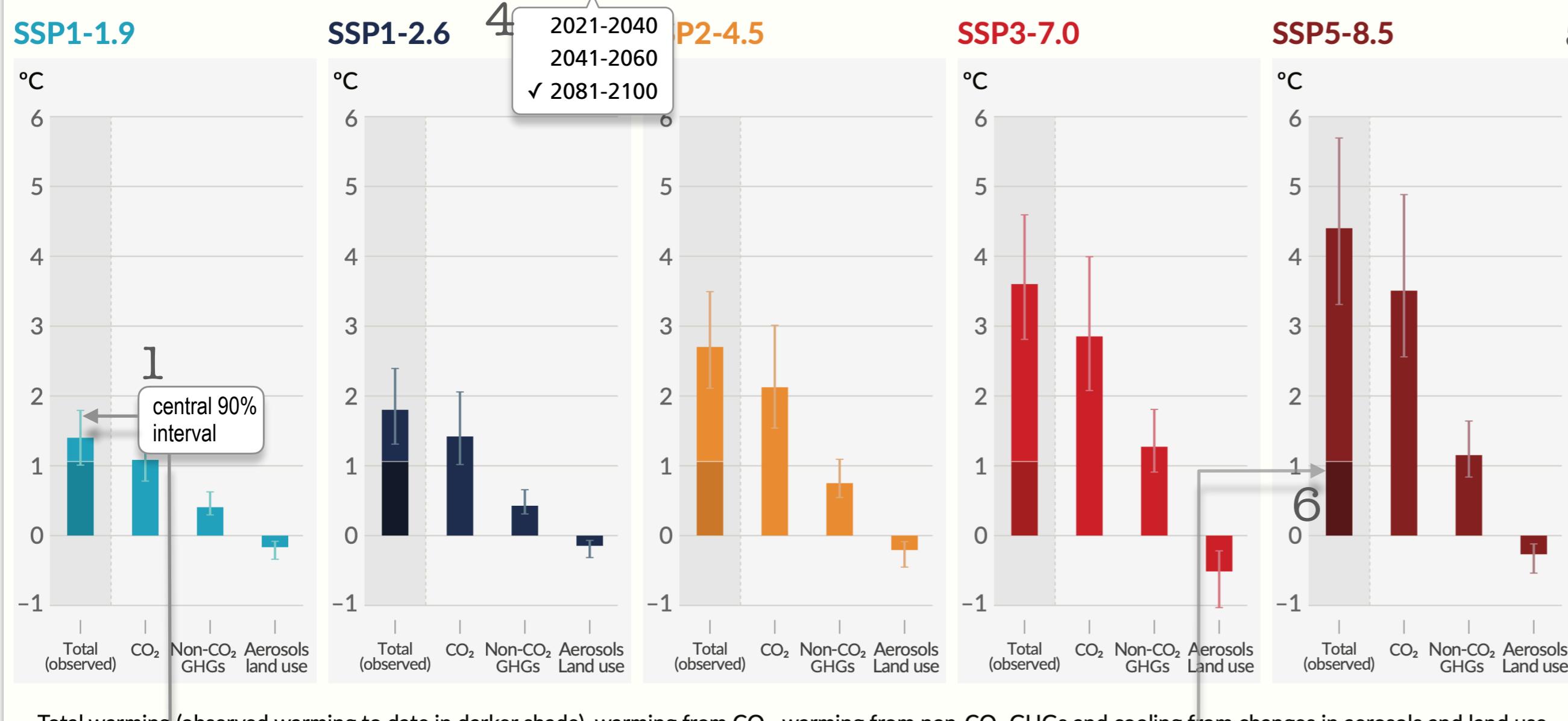
For:

- Sense making
- Policy decisions
- Peer review

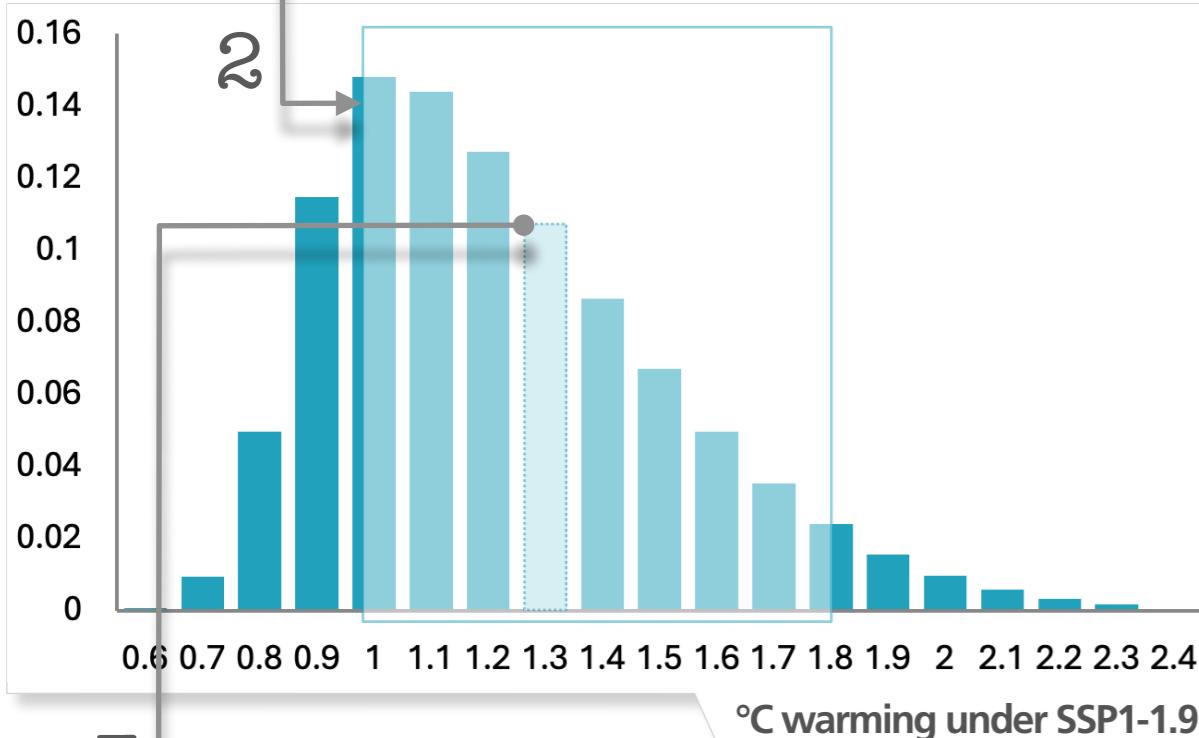
implemented / work-in-progress / future work

(b) Contribution to global surface temperature increase from different emissions, with a dominant role of CO₂ emissions

Change in global surface temperature in 2081–2100 relative to 1850–1900 (°C)



Total warming (observed warming to date in darker shade), warming from CO₂, warming from non-CO₂ GHGs and cooling from changes in aerosols and land use



Panel (b). Bars and whiskers represent median values and the very likely range, respectively. Within each scenario bar plot, the bars represent: total global warming (°C); warming contributions (°C) from changes in CO₂ and from non-CO₂ greenhouse gases (comprising well-mixed greenhouse gases and ozone); and net cooling from other anthropogenic drivers (aerosols and land use). The best estimate for observed warming in 2010–2019 relative to 1850–1900 is indicated in the darker column in the ‘total’ bar.

8 has probability 1.0 of exceeding

in at least one of {2021-2040, 2041-2060, 2081-2100}

Run	°C warming	Time period	Scenario
12	1.39	2018-2100	SSP1-1.9
28	1.40	2018-2100	SSP1-1.9
29	1.36	2018-2100	SSP1-1.9
44	1.31	2018-2100	SSP1-1.9
52	1.37	2018-2100	SSP1-1.9
56	1.37	2018-2100	SSP1-1.9
58	1.40	2018-2100	
76	1.32	2018-2100	
81	1.36	2018-2100	SSP1-1.9
89	1.33	2018-2100	SSP1-1.9

SSP1-1.9 ensemble runs (10 of 1380)

IPCC confidence levels	
virtually certain	≤ 99%
extremely likely	≤ 95%
very likely	≤ 90%
likely	≤ 66%
more likely than not	< 50%
about as likely as not	≤ 33%
unlikely	≤ 0%
very unlikely	≤ 0%
extremely unlikely	≤ 0%
exceptionally unlikely	≤ 0%

B.1.2 Global warming of 2°C, relative to 1850–1900, would be exceeded in the 21st century under the high and very high GHG emissions scenarios (SSP3-7.0 and SSP5-8.5). Global warming of 2°C would extremely likely be exceeded in the intermediate GHG emissions scenario (SSP2-4.5). Under the very low and low GHG emissions scenarios, global warming of 2°C is extremely unlikely to be exceeded (SSP1-1.9) or unlikely to be exceeded (SSP1-2.6).

technical approach

A transparent programming language

called Fluid provides fine-grained provenance tracking via a dynamic dependence graph.

Graph supports queries and serves as a **ground truth** for AI-generated natural language explanations.

A **web-based publishing front-end** enriches the final artifact with explorable provenance information, via additional interactions.

AI assistants will help **authors** create supporting natural language grounded in data, and help **readers** by translating query results into natural language.



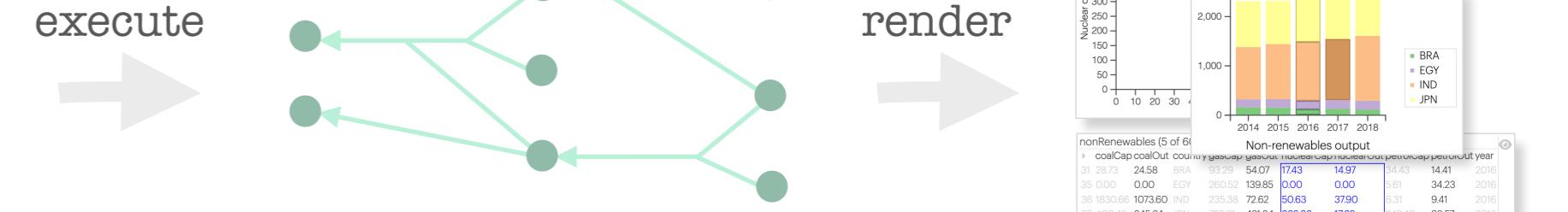
AI **authoring** assistant to help underwrite fragments of natural language with code

```
-- 2015
[1] year: 2015, type: "total", emissions: 64.82956487,
[2] year: 2015, type: "Aerosol", emissions: 8.11253861,
[3] year: 2015, type: "NonCO2", emissions: 18.37955661,
[4] year: 2015, type: "Landuse", emissions: 8.11253861,
[5] year: 2015, type: "GHG", emissions: 38.13667251,
[6] year: 2015, type: "Aerosol", emissions: 8.11253861,
[7] year: 2015, type: "NonCO2", emissions: 18.37955661,
[8] year: 2015, type: "Landuse", emissions: 8.11253861,
[9] year: 2015, type: "GHG", emissions: 38.13667251,
[10] year: 2015, type: "Aerosol", emissions: 8.11253861,
[11] year: 2015, type: "NonCO2", emissions: 18.37955661,
[12] year: 2015, type: "Landuse", emissions: 8.11253861,
[13] year: 2015, type: "GHG", emissions: 38.13667251,
[14] def extend_da(a):
[15]     da = a
[16]     for n in range(1, window):
[17]         da = da.append(n, a, length(a) - n, a),
[18]     return da
[19] def movingavg(da, window):
[20]     da = extend_da(da)
[21]     da = da[window - 1:-1]
[22]     da = da.groupby(da.index // window).mean()
[23]     da = da[window:]
[24]     return da
[25] def movingavg_xy(da, x, y, window):
[26]     da = extend_da(da)
[27]     da = da[window - 1:-1]
[28]     da = da.groupby(da.index // window).mean()
[29]     da = da[window:]
[30]     da = da[[x, y]]
[31]     da = da.rename(columns={x: f'{x}_{window}', y: f'{y}_{window}'})
[32]     return da
[33] def movingavg_xy_xy(da, x1, y1, x2, y2, window):
[34]     da = extend_da(da)
[35]     da = da[window - 1:-1]
[36]     da = da.groupby(da.index // window).mean()
[37]     da = da[window:]
[38]     da = da[[x1, y1, x2, y2]]
[39]     da = da.rename(columns={x1: f'{x1}_{window}', y1: f'{y1}_{window}', x2: f'{x2}_{window}', y2: f'{y2}_{window}'})
[40]     return da
[41] 
```

Raw inputs

- declarative visualisation and analysis code
- data sources
- expository text

execute

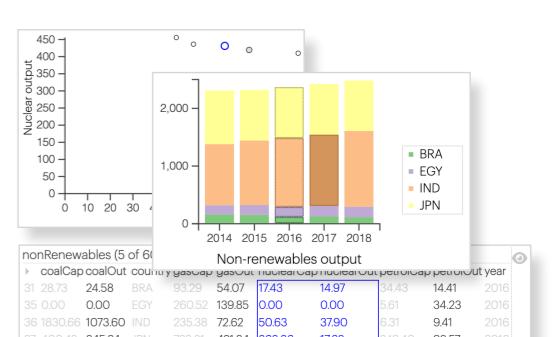


Dynamic dependence graph

- fragments of data as vertices
- computation steps as hyperedges
- cognacy queries reveal relationships between vertices



AI **reading** assistant to assign natural language to provenance query results



Interactive output

- web interface
- provenance queries
- why and how queries
- multiverses and facets