FLUID

Data visualisation for the 21st century

or

"Choose your own data-viz adventure"

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Plan for rest of session

Fluid is a functional programming language for building transparent, self-explanatory research outputs

- Project overview
- Demos & UX discussion
- Creating content with Fluid
- authoring experience today
- where we want to take it
- language overview
- Behind the scenes: dynamic dependence graphs
- Future directions
- Call for Collaboration!

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Project overview

Initial funding from The Alan Turing Institute Now collaboration between UoB and ICCS









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https://f.luid.org

https://github.com/explorable-viz/fluid

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fluid · user experience · querying and questioning

Demo: renewables

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Demo: renewables

Ideas introduced

- Surfacing fine-grained I/O relationships
 - different parts of the output use different parts of the input!
- The more output we express interest in, the more data becomes relevant
- Transient/persistent selections allow **relative** queries

Discussion points

- You could program these "transparency queries" yourself but not scalable or robust to change
 - to be **ubiquitous** needs to be **automatic** (more on this later)

Demo: renewables

```
let series type country = [
   { x: row.year, y: row.output }
   | year \leftarrow [2013..2018], row \leftarrow renewables,
   row.year = year, row.energyType = type, row.country = country
] in LineChart {
   caption: "Output of USA relative to China",
   plots: [
      LinePlot { name: type, data: plot }
      | type ← ["Bio", "Hydro", "Solar", "Wind"],
      let plot = zipWith (fun p1 p2 \rightarrow { x: p1.x, y: p1.y / p2.y })
                          (series type "USA") (series type "China")
```

fluid · user experience · querying and questioning

Demo: renewables-linked

Demo: renewables-linked

Ideas introduced

- Surfacing relationships between outputs that arise from common data dependencies
 - comprehension aid for understanding how different views are related
- "Brushing and linking", but transparent: shared data explains why two selections are related
 - relative queries can reveal how data usage "overlaps"
- Additional dimension of selection: primary vs. secondary

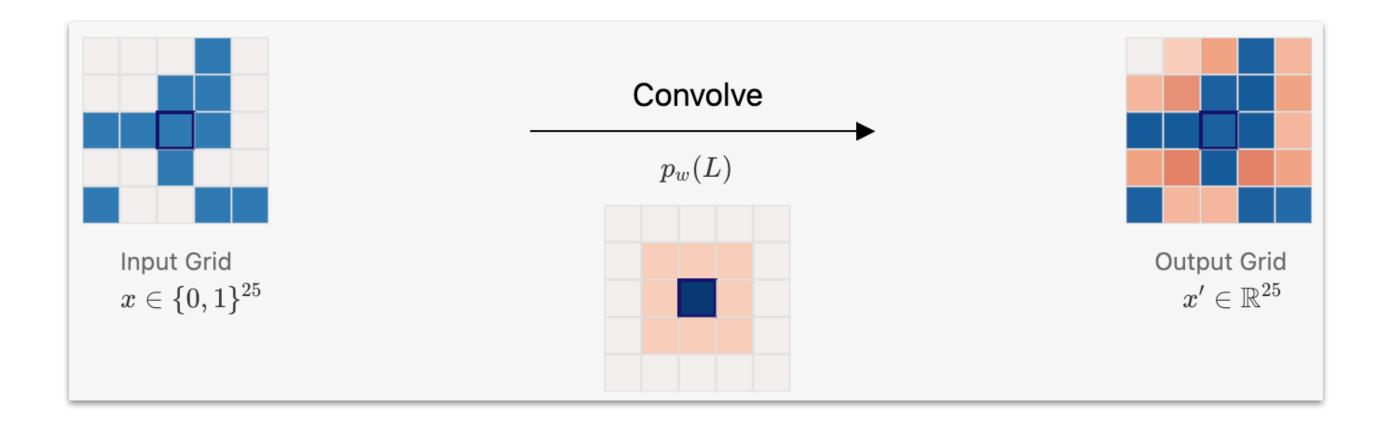
Discussion points

- Visualising selections: non-trivial and visualisation-dependent
 - cognitive considerations like change blindness/inattentional blindness
- Just knowing **what** is related isn't enough need to know **how**

Future directions

■ "Intensional" queries — how was this calculated?

Demo: convolution



Demo: convolution

Ideas introduced

- Views of computations can be used to explain and illustrate
 - infrastructure for "explorable explanations" (Bret Victor)
- Interacting with inputs to see what outputs they contribute to
- Inputs can be related in virtue of contributing to a common output

Discussion points

- distill.pub example was a hand-crafted animation
- Fluid demo is a transparent algorithm
 - generic infrastructure that can be reused for other algorithms
 - infrastructural improvements shared by everything downstream

Demo: convolution

```
let zero n = const n;
    wrap n = ((n - 1) \mod n_{max}) + 1;
    extend n = min (max n 1);
let convolve image kernel method =
    let ((m, n), (i, j)) = (dims image, dims kernel);
        (half_i, half_j) = (i `quot` 2, j `quot` 2);
        area = i * j
    in [ let weightedSum = sum [
           image!(x, y) * kernel!(i' + 1, j' + 1)
           |(i', j') \leftarrow range(0, 0)(i - 1, j - 1),
             let x = method (m' + i' - half_i) m,
             let y = method(n' + j' - half_j) n,
             x \geqslant 1, x \leqslant m, y \geqslant 1, y \leqslant n
         ] in weightedSum `quot` area
          | (m', n') in (m, n) □;
```

fluid · user experience · explaining and educating

Demo: convolution-wrapped

Ideas introduced

- Comprehension as active process of hypothesis formulation and testing
- Interact with different algorithms to understand how they behave

Discussion points

■ Implementation details start to matter in new ways!

Future directions

- "Unpack" computation to examine intermediate results (e.g. interim 3x3 arrays)
- Converge the medium in which we do science with medium in which we communicate science

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Creating a Fluid visualisation

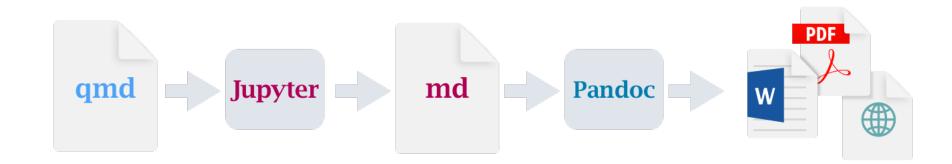
So far project has focused mainly on **end-user experience** Developer tools are sorely lacking..

Current workflow ()

- Create index.html with div to contain Fluid visualisation
- Write Fluid source code (.fld) for visualisation
- Write small PureScript program to load visualisation

What's missing

- Command-line publishing tool (Node.js)
- Fluid kernel for Jupyter will enable authoring
 via Markdown and Quarto



Want to leverage as much existing open source infrastructure as possible Four interns will be helping with some of this over the summer!

Language overview

Current design

- Purely functional (no side-effects)
- Untyped
- Records, lists, dictionaries, 2D arrays
- Graphics library based on d3.js

Implemented in **PureScript** (Haskell clone for the web)

What's missing

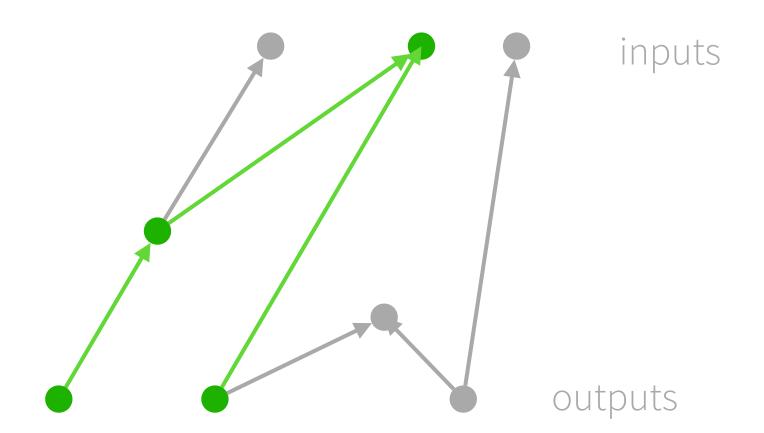
- Modules and imports
- I/O load from file, db or URL
- User-defined datatypes
- Type system (with units of measure?)

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How does it work?

Key infrastructure

- Fluid interpreter builds a directed acyclic graph of data dependencies as program runs
- Treat relationship between inputs and outputs as "metadata" that can be queried
- Related inputs and related outputs are relations of cognacy (common ancestry) in the graph



Further reading

- Conjugate Operators for Transparent, Explorable Research Outputs. Bond, David, Nguyen, Orchard & Perera, 2024
- Linked Visualisations via Galois Dependencies. Perera, Nguyen, Petricek & Wang, 2022
- Provenance for Interactive Visualizations. Psallidas & Wu, 2018

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Future directions

How to enable a smooth transition from content consumption to content creation?



Readers:

- Don't care how it works
- Want responsive, self-explanatory, intuitive UI
- Should be able to transition from passive reading to active engagement
- UI affordances (opportunities for interaction) should present themselves

We wear different hats at different times.

Authors:

- Proficient in technology
- Invested in specific workflows and skills
- Benefits of new technology need to be obvious
- Barriers to entry need to be low

What are the prospects of doing something like Fluid for R or Python?

Weaving new stories from existing ones

Example of previous continuum that we would like to enable:



- Reviewer explores claims, data sources and computational methods in situ
- Frames queries by interacting with outputs and perhaps making other choices
- Queries/views are persistent and versioned and can be shared with authors or other readers
- Interactions are reproducible and can be replayed (cf. <u>Histogram</u>)
- Interesting observations are new knowledge and contribute to the overall science
- Authors' original narrative was just one of many possible narratives

Not a new idea, but definitely an idea whose time has come

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How can we help you tell a story with your data?

We are looking for a VESRI project that we can use to showcase **our infrastructure** and **your research** in the form of an online article with figures transparently linked to data

Timeframe: Aug-Dec 2024

Call for Case Studies

Do you have:

- an existing open access publication with figures we could reimplement in Fluid to add value?
- a question about prior work that you didn't get a chance to ask and would like to revisit?
- a new idea or question we could help you present in an interesting way?

Your project may be a good fit if:

- not too data-intensive or algorithmically complex!
- has obvious visual elements
- will benefit from being presented in a transparent, explorable way (potentially to a lay audience)

thank you!

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Cross-VESRI Slack github.com/explorable-viz

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