# Reproducible research and scientific publication

Konrad Hinsen<sup>1</sup> Nicolas P. Rougier<sup>2</sup>

<sup>1</sup>Centre de Biophysique Moléculaire, Orléans, France

<sup>2</sup>Laboratoire Bordelais de Recherche en Informatique, Bordeaux, France

February 14, 2017

# The two faces of scientific publications

#### Dissemination

Scientists publish their findings to allow their peers to

- verify them
- build on them

for as long as they are relevant to scientific progress ( $\approx$  **decades**)

Reproducible research requires **publishing software and data** in addition to the traditional narrative.

#### **Evaluation**

Publications are the basis for establishing a scientist's

- reputation (content)
- productivity (number)
- importance (impact)

Journals therefore define incentives for research.

For reproducible research to become the norm, it must have a place in these incentives.

## The two faces of software

#### Human

## what the software does

- models, methods
- concepts
- informal language
- fuzziness, ambiguity
- focus on the essential

We analyzed the data using version 2.1 of the InsightDiscoverer software [42].

## Computer

## bit-level operations

- algorithm
- representations
- formal language
- extreme precision
- every bit matters

InsightDiscoverer 2.1 compiled with gcc 5.1.3 (compilation options: ...) using libdata 1.0.2 compiled with gcc 4.4.6 running under Linux kernel 2.6.32 on an Intel Xeon CPU series X5675 using 3 cores ...

### The world of atoms vs. the world of bits

	Atoms	Bits
quantities	value $\pm$ error	value
comparison	tolerance	exact equality
judgement	good bad	true / false
design	robustness	N/A

#### **Common fallacies:**

Software A is similar to software B.

No definition of similarity for software.

- Good results for input A imply good results for similar input B.
  Thousands of counterexamples, e.g. here, here, and here.
- Floating-point arithmetic is imprecise.

IEEE-754 defines exact manipulations of precise bit patterns. The **interpretation** of bit patterns as real numbers is imprecise.

4 / 6

# Publishing reproducible computer-aided research

## Dissemination/Human

- Notebooks (Jupyter, ...)
- Workflows
- Software Heritage

## Evaluation/Human

- Software journals (JORS, JOSS, SoftwareX)
- Software citation, transitive credit
- Reproducible research journals (IPOL, ReScience)

# Dissemination/Computer

- Containers (Docker, ...)
- Reproducible builds, Guix / Nix
- Servers (IPOL, Code Ocean)
- ActivePapers

## Evaluation/Computer

ActivePapers

# Integration of everything

• binder, Everpub, Popper

# Looking over the fence

## Reproducibility in experimental sciences:

- Political Science Replication Initiative
- Estimating the Reproducibility of Psychological Science

### Automatic partial validation of publications:

• statcheck: automatic validation of statistical analyses in a paper