#### Explanation in Science

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## **Common Questions**

- what is a scientific explanation?
- what is explained?
- what does the explaining?

## **Diverse Answers**

- deductive-nomological (D-N) (Hempel and Oppenheim 1948; Hempel 1965)
- statistical relevance (Salmon 1971)
- unification (Friedman 1974; Kitcher 1989)
- pragmatic (van Fraassen 1980)
- causal-mechanical (Salmon 1984; Dowe 2000)
- intervention (Woodward 2003)
- mechanistic (Machamer, Darden, and Craver 2000; Bechtel and Abrahamsen 2005)
- asymptotic (Batterman 2002)
- model-based (Bokulich 2009)

#### Science Dataset

- ▶ 781 articles from one year of the journal Science
- large set of small case studies, randomly sampled
  - Sample A: 25 "explain" sentences
  - Sample B: 100 sentences
  - Sample C: 25 abstracts

I use Sample A to build my account and the others to test it

## **Previous Work**

- "Explain" in scientific discourse, Synthese 190(8):1383–1405, 2013.
- explanation is a goal of scientific practise
- explanation is important for understanding scientific practise
- explanation is general, across sciences

- justifies, at least in part, the diversity of philosophical accounts
- is there a unity to scientific explanation?

## Current Work

#### ▶ a general philosophical account of scientific explanation

No clear theoretical predictions for a star with parameters similar to those for HIP 13044 exist, hence it is possible that some high-order oscillations can explain the 1.4- or 3.5-day signal.

Setiawan, J., R.J. Klement, T. Henning, H.W. Rix, B. Rochau, J. Rodmann, and T. Schulze-Hartung. 2010. A giant planet around a metal-poor star of extragalactic origin. *Science* 330(6011):1642.

High-order oscillations *of luminance* in the theoretical predictions for *the stellar dynamics* of stars with parameters similar to HIP 13044 CAN POSSIBLY EXPLAIN the length of the signals *in the luminance* of HIP 13044.

#### Case A10: Normal Form

can possibly explainThe high-orderthe lengthof oscillationsof the signalsof luminancein the luminancein the theoryof HIP 13044of stellar dynamicswhich is a starin models of starswith parameters similarwith parameters similarto HIP 13044.to HIP 13044

# Case A10: Patterns

| phrase | can possibly explain    |                         |
|--------|-------------------------|-------------------------|
| top    | The high-order          | the length              |
| core   | of oscillations         | of the measurements     |
|        | of luminance            | of the oscillations     |
|        | in the theory           | of luminance            |
|        | of stellar dynamics     | of HIP 13044            |
|        | in models               |                         |
| base   | of stars                | which is a star         |
|        | with parameters similar | with parameters similar |
|        | to HIP 13044            | to HIP 13044.           |

## Case A10: Base

|        | with parameters simi-<br>lar to HIP 13044 | with parameters simi-<br>lar to HIP 13044. |
|--------|---|--|
| base   | of stars                                  | which is a star                            |
|        | in models                                 |  |
|        | of stellar dynamics                       | of HIP 13044                               |
|        | in the theory                             | of luminance                               |
|        | of luminance                              | of the oscillations                        |
| core   | of oscillations                           | of the measurements                        |
| top    | The high-order                            | the length                                 |
| phrase | can possib                                | oly explain                                |

# Case A10: Qualities

| phrase | can possibly explain    |                         |
|--------|-------------------------|-------------------------|
| top    | The high-order          | the length              |
| core   | of oscillations         | of the measurements     |
|        | of luminance            | of the oscillations     |
|        | in the theory           | of luminance            |
|        | of stellar dynamics     | of HIP 13044            |
|        | in models               |                         |
| base   | of stars                | which is a star         |
|        | with parameters similar | with parameters similar |
|        | to HIP 13044            | to HIP 13044.           |

## Case A10: Core

| phrase | can possibly explain                |  |
|--------|-------------------------------------|--|
| top    | The high-order                      | the length                                 |
| core   | of oscillations                     | of the measurements                        |
|        | of luminance                        | of the oscillations                        |
|        | in the theory                       | of luminance                               |
|        | of stellar dynamics                 | of HIP 13044                               |
|        |                                     |  |
|        | in models                           |  |
| base   | in models<br>of stars               | which is a star                            |
| base   | of stars<br>with parameters similar | which is a star<br>with parameters similar |

Physiological concentrations of ADP [adenosine diphosphate] inhibit kinase activity in the oscillator, and a mathematical model constrained by data shows that this effect is sufficient to quantitatively explain entrainment of the cyanobacterial circadian clock.

Rust, M.J., S.S. Golden, and E.K. O'Shea. 2011. Light-driven changes in energy metabolism directly entrain the cyanobacterial circadian oscillator. *Science* 331(6014):220.

| phrase | is sufficient to quantitatively explain |                     |
|--------|---|---------------------|
| top    | The physiological concentration         | the rate            |
| core   | of ADP                                  | of entrainment      |
|        | in the mathematical model               |                     |
|        | of the activity                         |                     |
|        | of kinase                               |                     |
| base   | in circadian clocks                     | in circadian clocks |
|        | of cyanobacteria                        | of cyanobacteria.   |

In summary, changes in water mass formation processes are not necessarily required to explain the high GNAIW [Glacial North Atlantic Intermediate Water] end-member  $\delta^{13}{\rm C}$  values.

Olsen, A., and U. Ninnemann. 2010. Large  $\delta^{13}$ C gradients in the preindustrial North Atlantic revealed. *Science* 330(6004):658.

| phrase | are not necessarily required to explain |                                   |
|--------|---|-----------------------------------|
| top    | Changes                                 | the large size                    |
| core   | in the processes                        | of measurements of $\delta^{13}C$ |
|        | of formation                            | in end-members                    |
|        |   | of GNAIW                          |
| base   | of water masses                         | which is a water mass.            |

# Five Categories

- data
- entity
- kind
- model
- theory

## Data

- a statement about an entity
- Types:
  - measurements
  - observations
  - images
- Examples:
  - ▶ the luminosity measurements of HIP 13044 (A10)
  - the measurements of rates of entrainment of circadian clocks (A4)
  - the measurements of end-member  $\delta^{13}$ C values (A12)
  - the observations of the severity of the Fog phenotype in C. elegans (B58)

# Entity

- a concrete particular thing or process
- Types:
  - stars
  - samples
  - specimens
- Examples:
  - star HIP 13044 (A10)
  - GNAIW's formation process (A12)
  - the Tagish Lake meteorite (A19)
  - the sample of carbon monoxide extracted from ice core D47 in (A15)

# Kind

- an abstract universal class of entities
- Types:
  - natural kinds
  - species
  - universals
- Examples:
  - stars with parameters similar to HIP 13044 (A10)
  - circadian clocks (A4)
  - ► ADP (A4)
  - water masses (A12)
  - lithium (A1)
  - ► *E. coli* (A8)
  - ► Mn<sub>4</sub>CaO<sub>2</sub> (B68)

## Model

- an abstract description of the relationships that hold between kinds and their qualities
- Types:
  - sets of differential equations
  - mechanisms
  - flow charts
- Examples:
  - models of stellar dynamics (A10)
  - mathematical models of kinase activity in circadian clocks (A4)
  - Brownian random walks modelling foraging behaviour (B49)
  - reaction-diffusion equations modelling spatially periodic biological structures (B45)
  - ▶ a hierarchical model of stem cell crypts (A14)

# Theory

- a principle, set of principles, or a formal system that is a building block for models.
- Types:
  - Iaws
  - empirical generalizations
  - mathematical formalisms
- Examples:
  - the theory of stellar dynamics (A10)
  - the theory of chromosomal supercoiling (B21)
  - universal hydrodynamics (B2)
  - the defensive function of sabre teeth (B54)
  - the mathematical theory of differential equations (B45)

## Pairs of Categories



Figure 1: Pairs of categories

Sample A: Variety



Figure 2: Sample A heatmap

#### **Relations Between Categories**



Figure 3: Some relations between instances of categories

#### Structure of an Explanation: Basic



Figure 4: Basic structure of a scientific explanation.

# Scientific Explanation

- 1. explanans:
  - a quality/property/characteristic
  - of a data/entity/kind/model/theory
  - at least as general as the explanandum
- 2. explanandum
  - a quality/property/characteristic
  - of a data/entity/kind/model/theory
  - at least as specific as the explanans
- 3. explain-relation:
  - expresses the counterfactual dependence of the explanandum quality on the explanans quality
  - answers: What if things had been different?
  - supported by a core relation:
    - connects explanans to explanandum
    - counterfactual supporting

#### Structure of an Explanation: Theory-Data



Figure 5: General structure of a theory-data explanation.

## Evidence and Explanation

- in Samples B and C, order can be reversed
- explanation
  - general to specific
  - Iower-left triangle
- evidence
  - specific to general
  - upper-right triangle
- otherwise the same structure

## Sample A: 25 "explain" sentences



Figure 6: Sample A heatmap

## Sample B: 100 sentences



Figure 7: Sample B heatmap

## Sample C: 25 abstracts



Figure 8: Sample C heatmap

Samples A, B, C



Figure 9: Samples A, B, C heatmap

# Room for Other Accounts

- theory-data
  - deductive-nomological (D-N)
- theory/model
  - unification
  - asymptotic
- model/kind/entity
  - intervention
  - mechanistic
  - model-based
- entity/data
  - causal-mechanical
- no room
  - statistical relevance
  - pragmatic

Evidence for Other Accounts in the Science Dataset

- strong evidence
  - intervention
  - mechanistic
  - model-based
- very weak evidence
  - deductive-nomological
  - causal-mechanical (Salmon and Dowe)
- no evidence
  - statistical relevance
  - unification
  - asymptotic
- equivocal
  - pragmatic

## Upshot

- one explain-relation, different core relations
- five categories for the explanans and explanandum
- pairs of categories determine core relation
- generalized counterfactual account
- many existing accounts fit the framework, but not everything goes

## Appendix: Science Informatics

- data: measurements in databases, spreadsheets; images
- entity: subject IDs, barcodes, URIs
- kind: domain ontologies
- model: programs
- theory: software libraries