# **Capturing student reasoning about molecular structure and behavior**

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### What do we mean by reasoning?

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### **Reasoning**

noun

1. Thinking in which logical processes of an induction or deductive character are used to draw conclusions from facts or premises.

## What do we mean by reasoning?

Rank the following reactions from least favored to most favored:

1. H<sub>2</sub>S (aq) + H<sub>2</sub>O (I) 
$$
\rightleftarrows
$$
 H<sub>3</sub>O<sup>+</sup> (aq) + HS<sup>-</sup> (aq)  
2. HCl (aq) + H<sub>2</sub>O (I)  $\rightleftarrows$  H<sub>3</sub>O<sup>+</sup> (aq) + Cl<sup>-</sup> (aq)  
3. HI(aq) + H<sub>2</sub>O (I)  $\rightleftarrows$  H<sub>3</sub>O<sup>+</sup> (aq) + I<sup>-</sup> (aq)

The thinking process that occurs when we consciously try to solve a problem and/or logically draw conclusions about a phenomena.

## Reasoning Studies in CER

- Reasoning using representations
- Mathematical reasoning
- Conceptual reasoning
- Mechanistic reasoning
- Chemical reasoning
- Argumentation

Anderson, T.R., et al. "Identifying and developing students' ability to reason with concepts and representations in biology." In Multiple representations in biological education. Springer, Doredrecht, 2013. 19-38

Moon, A. et al. "Analysis of inquiry materials to explain complexity of chemical reasoning in physical chemistry students' argumentation" J. Res.Sci. Teach. (2017) 54 (10) 1322-1346

Rodriguez, J.; Towns, M. "Analysis of student reasoning about Michaelis-Mentin enzyme kinetics: Mixed conceptions of enzyme inhibition: Chem. Educ. Res. Pract. 2019, 20 (2) 428-442

K. Bain; Rodriquez, J.; Towns, M. Chemistry and Mathematics: Research and Frameworks to Explore Student Reasoning. J. Chem. Educ. (2019)

Kraft, Adam, Amanda M. Strickland, and Gautam Bhattacharyya. "Reasonable reasoning: multi-variate problem-solving in organic chemistry." *Chemistry Education Research and Practice* 11.4 (2010): 281-292.

Cooper M. M., Kouyoumdjian H., and Underwood S. M., (2016). Investigating Students' Reasoning about Acid-Base Reactions *J. Chem. Educ.*, **93**(10), 1703–1712.

## **Capturing how students reason when they argue about climate change**



### Writing about ocean acidification



#### **Given the following equilibria:**

 $CO<sub>2</sub>(atmos) \rightleftarrows CO<sub>2</sub>(aq)$  $CO<sub>2</sub>$  (aq) + H<sub>2</sub>O (l)  $\rightleftarrows$  H<sub>2</sub>CO<sub>3</sub> (aq)  $\mathsf{H}_2\mathsf{CO}_3$  (aq)  $\rightleftarrows$  H $^+$  +HCO $_3^{\text{-}}$  (aq) H<sup>+</sup> + HCO<sub>3</sub><sup>-</sup> (aq)  $\rightleftarrows$  2H<sup>+</sup> + CO<sub>3</sub><sup>2-</sup>

#### **Explain the plot.**

### Argument Analysis



*> Cognitive complexity increases with number of ontological domains and elements used and related* 

*> Applied to 300 assignments*



#### **Observation**



is. Using the following set of equilibrium systems and Le Châtelier's Principle, this can be easily explained."

## Relative frequency of operations



Capturing Cognitive Complexity with a Single Metric

#### Cognitive  $\sum$ complexity = (cognitive operation score \* # sentences used) total number of sentences

### Relating cognitive complexity to other metrics



 $*$  P (two-tailed)  $< 0.01$ 

Note: students with higher cognitive complexity used fewer moves

### There was no relationship between accuracy and cognitive complexity

#### *complexity*



- Def. = definition Obs. = observation Meas. = measurement Comp. = comparison Ex. = example
- Claim = claim
- Cons. = consequences
- C & E = cause and effect
- Ded. = deduction
- Arg. = argumentation

### Comparison of Low vs. High Tier Assignments

• Using the average weighted complexity, assignments were divided into high, medium and low tiers

> Low:  $3.1 - 5.3$ Medium: 5.4-7.6 High: 7.7-10

• Compared high and low tier assignments

## Low complexity tier pattern



## High complexity tier pattern



### Patterns in low and high tier arguments

### Low tier **High tier**





## Implications

- The adapted framework with complexity score provides a novel approach to holistically assessing student writing
- The framework can be applied to examine patterns in student writing
	- E.g. how likely is one operation to appear after another?
- The cognitive complexity metric appears to measure something unique
	- Students who perform well on typical performance measures don't necessarily perform well on extensive writing tasks

Moon, Alena, et al. "Application and testing of a framework for characterizing the quality of scientific reasoning in chemistry students' writing on ocean acidification." *Chemistry Education Research and Practice* (2019).

### **Capturing how students reason when they explain a reaction mechanism**



### Mechanistic Reasoning



- The primary work of scientists is to uncover the mechanisms underlying natural phenomena
- Mechanistic reasoning is 1) causal 2) built from experience; and 3) describes underlying structure

Russ R. S., Scherr R. E., Hammer D., and Mikeska J., (2008),. *Sci. Educ.*, **92**(3), 499–525

### **Mechanistic Reasoning**

Mechanisms in organic chemistry

• Used to explain or predict outcomes of reactions

Requires processoriented problem-solving • Students are often more product-oriented in their problem-solving

There are many features students must consider when drawing a mechanism<sup>3</sup>

- Alternative reaction pathways
- The dynamic nature of chemical reactions
- Chemically reasonable steps

1. Bhattacharyya, G. *JCE*, **2013**, *90*(10), 1282-1289.

2. Graulich, N. *CERP*. **2015**, *16*, 9-21.

3. (a) Bhattacharyya, G.; Bodner, G.M. *JCE*. **2005**, *82*(9), 1402.; (b) Caspari, I.; Weinrich, M.L.; Sevian, H.; Graulich, N. *CERP*. **2018**, *19*, 42-59.;

(c) Caspari, I.; Kranz, D.; Graulich, N. *CERP*. **2018**, *19*, 1117-1141.; (d) Popova, M.; Bretz, S.L. *JCE*. **2018**, *95*(7), 1806-1093.

4. Ferguson, R.; Bodner, G.M. *CERP.*, **2008**, *9*, 102-113.

## Developing a Therapeutic Analog for Thalidomide



500-754 word email proposal:

- Provided background about the drug **thalidomide**
- Identified **hydrolysis mechanism** that affects thalidomide
- Asked students to **describe the mechanism** to form both products
- Asked students to **propose an analog** that would prevent hydrolysis

### **Mechanistic Reasoning**



Students are often **able to produce a correct mechanism** for common reactions, but there is evidence that they have **minimal**  understanding of the chemical reasoning for particular steps.<sup>2,4</sup>

1. Bhattacharyya, G. *JCE*, **2013**, *90*(10), 1282-1289.

2. Graulich, N. *CERP*. **2015**, *16*, 9-21.

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## Analytical Framework

Categories of Mechanistic Reasoning in Discourse

- 1. Describing the Target Phenomenon
- 2. Identifying Setup Conditions
- 3. Identifying Entities
- 4. Identifying Activities
- 5. Identifying Properties of Entities
- 6. Identifying Organization of Entities
- 7. Chaining: Backward and Forward

Russ R. S., Scherr R. E., Hammer D., and Mikeska J., (2008),. *Sci. Educ.*, **92**(3), 499–525. Machamer, Peter, Lindley Darden, and Carl F. Craver. "Thinking about mechanisms." *Philosophy of science* 67.1 (2000): 1-25. Caspari I., Kranz D., and Graulich N., (2018),. *Chem. Educ. Res. Pract.*, **19**(4), 1117–1141 Moreira P., Marzabal A., and Talanquer V., (2018), *Chem. Educ. Res. Pract.*, **20**(1), 120–131.

## Analytical Framework



*Units: single sentence*

Russ R. S., Scherr R. E., Hammer D., and Mikeska J., (2008),. *Sci. Educ.*, **92**(3), 499–525. Machamer, Peter, Lindley Darden, and Carl F. Craver. "Thinking about mechanisms." *Philosophy of science* 67.1 (2000): 1-25

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#### Identifying activities

included in 100% of responses overall

#### Describes electron movement

- **Explicit electron movement**
- · Implicit electron movement
	- Entity focused
	- "Attacks"
	- Protonates-deprotonates
	- Double bond movement
	- · Passive electron pushing

Describes changes in bonding

- Bond breaking and making
- Ring opening
- Nitrogen leaving

20 0 40 60 80 100 Percent of students including each feature

*"The oxygen in the water molecule then attacks the carbon in the carbonyl, which, through electron pushing, forms a tetrahedral intermediate…*"



 $\overline{4}$ 

Percent of students including each feature

*"Then, water, acting as a nucleophile, attacks the electrophilic carbon."*



 $\overline{4}$ 

Percent of students including each feature

*"Then, water, acting as a nucleophile, attacks the electrophilic carbon."*

To what extent are students using mechanistic reasoning and chemical reasoning together?

## Activities and Chemistry Reasoning



#### *Overlap = number of sentence in which codes appear together*

## Activities and Chemistry Reasoning



*Overlap = number of sentence in which codes appear together*

## Capturing Co-occurrence

"Lift": an association rule which measures the degree of dependence between two items

$$
\mathsf{Lift} = \frac{P(A,B)}{P(A) \cdot P(B)}
$$

Where P(A,B) = probability of code A and code B appearing together  $P(A)$  = probability of code A appearing P(B) probability of code B appearing

Lift < 1: codes appear together less often than expected Lift > 1 : codes appear together more often than expected

*i.e. Lift = 2 means the codes appear together twice as often as expected due to chance*

Dillon, John, et al. "Student Emotion, Co-Occurrence, and Dropout in a MOOC Context." *International Educational Data Mining Society* (2016).

### Case: Co-occurrence of explicit electron movement and chemical reasoning



*Students were less likely relate electron movement to acid-base explanations for the Thalidomide hydrolysis mechanism*

Lift > 1 : codes appear together more often than expected Lift < 1: codes appear together less often than expected

### Case: Co-occurrence of explicit electron movement and chemical reasoning

*The carbonyl group between the two nitrogens lowers the acidity of the molecule (electron density being able to move toward the oxygen makes it more reactive) so it can be protonated (adds hydrogen, H) by hydronium (H3O+) which creates a positive oxygen. Next, water will deprotonate (molecule loses hydrogen) the stereocenter so that carboncarbon double bond is formed within the six membered ring between the carbon that use to be stereocenter and the carbonyl oxygen (the oxygen will become neutral and is now part of an alcohol group, OH). After a water will deprotonate the alcohol group so the double bond of the oxygen reforms and a hydronium will protonate the stereocenter to create the S-stereocenter.* 

## Case: Co-occurrence of explicit electron movement and chemical reasoning

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- Students are appealing to Bronsted-Lowry model more than Lewis model
- Their discussion of electron movement tends to be implicit rather than explicit when using Bronsted-Lowry

## **Implications**

- The adapted framework with Lift metric provides a way to explore how students are using chemistry ideas in their reasoning about mechanisms
- The framework and metric can be applied to examine patterns in student writing
	- E.g. how likely are students to explicitly describe electron movement when appealing to the Bronsted-Lowry model?

Watts, F. et al "What students write about when students write about mechanisms: Analysis of features present in students' written descriptions of an organic reaction mechanism" Chem. Educ. Res. Pract., submitted

### Lingering Questions

- How do these frameworks and metrics function when student are engaging with other types of arguments or reasoning about other types of chemical phenomena?
- What features of assignment prompts elicit more complex arguments or mechanistic reasoning about chemical phenomena?

## **Capturing how undergraduate students reason during NMR spectral interpretation**

**Megan Connor**

## NMR Spectroscopy in the Chemistry Curriculum

- Essential technique to elucidate the structure of molecules
- Difficult to teach and learn; requires understanding of multiple concepts and complex problem solving skills
- We need to know more about how students learn to interpret spectra and how instructor's learn to teach this topic

ACS Guidelines (2015) American Chemical Society; Washington D.C. Cartrette, D. P., and Bodner, G. M. (2010), Non-Mathematical Problem Solving in Organic Chemistry, *J. Res. Sci. Teach*., 47, 643–660

## NMR Spectroscopy in the Chemistry Curriculum

#### **ACS**<br>Chemistry for Life<sup>\*</sup>

#### Undergraduate Professional **Education in Chemistry**



"Approved programs *must* have a functioning NMR spectrometer on site that undergraduates use….If the on-site instrument does not meet all of the program's research needs, stable arrangements must be made with proximal sites to provide ready access to appropriate NMR instrumentation $1.$ "

American Chemical Society, (2015), *Undergraduate professional education in chemistry: ACS guidelines and evaluation procedures for bachelor's degree programs* Simpson et al., 2015, *J. Chem. Ed. , 9*2, 693-697. Topcszewski et al., 2017, *J. Chem. Ed., 94, 29-37.* 

## NMR Spectroscopy in the Chemistry Curriculum

- The majority of publications report teaching ideas
- Only a few studies examining how this complex topic is learned



NMR Spectra through the Eyes of a Student: Eye Tracking Applied to **NMR Items** 



American Chemical Society, (2015), *Undergraduate professional education in chemistry: ACS guidelines and evaluation procedures for bachelor's degree programs* Simpson et al., 2015, *J. Chem. Ed. , 9*2, 693-697. Topcszewski et al., 2017, *J. Chem. Ed., 94, 29-37.* 

## NMR spectral interpretation as "non-mathematical problem solving"

JOURNAL OF RESEARCH IN SCIENCE TEACHING

VOL. 47, NO. 6, PP. 643-660 (2010)

Non-Mathematical Problem Solving in Organic Chemistry

David P. Cartrette, George M. Bodner

Department of Chemistry, Purdue University, West Lafayette, Indiana 47907

More successful participants were more likely to:

- Use consistent approaches
- Draw fragments as they worked
- More carefully mine spectral data
- Check their final answer

## NMR spectral interpretation when arguing from evidence



pubs.acs.org/jchemeduc

Article

### Arguing from Spectroscopic Evidence

Ryan L. Stowe<sup>\*,†</sup><sup>0</sup> and Melanie M. Cooper<sup>®</sup>

Department of Chemistry, Michigan State University, 578 South Shaw Lane, East Lansing, Michigan 48824, United States

#### **Analyzed responses to assessment items:**

- 1. Students could analyze and interpret data from Infrared,  $^{13}$ C NMR, and <sup>1</sup>H NMR traces when prompted to pull specific information
- 2. Students success in completing these tasks was not associated with their success in constructing evidence based claims
- 3. Assessment prompt structures had no impact on student success in constructing evidence based claims





Rank the following reactions from least favored to most favored:

1. H<sub>2</sub>S (aq) + H<sub>2</sub>O (I) 
$$
\rightleftarrows
$$
 H<sub>3</sub>O<sup>+</sup> (aq) + HS<sup>-</sup> (aq)  
2. HCl (aq) + H<sub>2</sub>O (I)  $\rightleftarrows$  H<sub>3</sub>O<sup>+</sup> (aq) + Cl<sup>-</sup> (aq)  
3. Hl(aq) + H<sub>2</sub>O (I)  $\rightleftarrows$  H<sub>3</sub>O<sup>+</sup> (aq) + I<sup>-</sup> (aq)



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## Conceptual Understanding and Modes of Reasoning



### **Sophisticated reasoning**

- Identifies and assesses all relevant spectral cues
- Relies on valid chemical assumptions

#### **Conceptual Understanding**

- 1. Valid chemical assumptions
- 2. Invalid chemical assumptions (problematic Type 2 reasoning) \*

### **Modes of Reasoning**

- 1. Productive reasoning strategies
- 2. Unproductive reasoning strategies (problematic Type 1 reasoning) \*

## Data Collection

Developed spectral interpretation tasks that incorporate difficult features and authenticity for undergraduates

- 1. Difficult features identified through faculty interviews
- 2. Developed three tasks using literature on dayto-day problems of practicing chemists<sup>6</sup>
- 3. Piloted to ensure a range of difficulty



## Data Collection

Eye tracking and retrospective think-aloud interviewing with 18 undergraduate students

#### **Participants and setting**

- 18 undergraduates
- Organic Chemistry II Laboratory



#### **Eye tracking and retrospective think-aloud interviewing**

- Common tools for investigating cognitive processing strategies
- Eye tracking provides insight into visual attention and viewing patterns
- Retrospective think-aloud interviewing provides insight into reasoning

tobileyeX

**Tobii Pro X3-120 screen-based eye tracker** *Sampling frequency*: 120 Hz *Minimum fixation duration*: 100 ms

### Data Collection



## Data Analysis: Analyzed Retrospective Think-aloud interviews for Cognitive Constraints



### **Invalid chemical assumptions**



### **Invalid chemical assumptions**



 $N_{\text{Total}} = 18$ 

*Invalid chemical assumption: IR peaks should be prominent if the functional group is present*

### **Invalid chemical assumptions**



Connor, M.; Finkenstaedt-Quinn, S.; Shultz, G.V. Chem. Educ. Res. Pract. 2019, Advance Article

### **Invalid chemical assumptions**

Number of participants (n) contributing to theme



 $N_{\text{Total}} = 18$ 



"And, then I moved straight to NMR. See what I did. Here's what I counted, right off the bat, the peaks. The phenyl I counted wrong a bunch of times because of the symmetrics. There should be two on the phenyl. Three on the other ring. Three. That lined up good with that." – Participant 17

*Invalid chemical assumption: Isochroman possesses molecular symmetry* 

### **Invalid chemical assumptions**



 $N_{\text{Total}} = 18$ 



strong, my thought process was that it's possibly just a really low concentration of that molecule that might be present. But I wasn't really sure what else could be there if it was a low concentration of just that specific molecule." – Participant 4

*Invalid chemical assumption: Specific parts of a molecule may vary in concentration* 

### **Heuristic reasoning strategies**

### **One-reason decision making:**

*"And then, I basically, I concluded that… those peaks couldn't be singlets. My reasoning for the question."* 

### **Common heuristics7**

- 1. One-reason decision making
- 2. Rigidity
- 3. Generalization
- 4. Processing fluency
- 5. Associative activation
- 6. Affect
- 7. Representiveness
- 8. Reduction
- 9. Overconfidence
- 10. More A More B

### **Heuristic reasoning strategies**

### **Reduction**

*"I'm looking at that 3,000 [cm-1] peak, and I'm having a hard time piecing together what it might be. I think it might be an alkane, but it's not like a big functional group that we talked about a lot, like anything that's really special."*

Failed to recognize important spectral features and eliminated them as information to process

### **Common heuristics7**

- 1. One-reason decision making
- 2. Rigidity
- 3. Generalization
- 4. Processing fluency
- 5. Associative activation
- 6. Affect
- 7. Representiveness
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- 10. More A More B

Talanquer, 2014, *J. Chem. Ed*.

### **Heuristic reasoning strategies**

### **Affective Judgement:**

*"I chose yes because I guess that I feel like it was there in a small amount…. So I could redo the NMR with a higher concentration to see if it was what I thought it was or not. And so I just kind of had a gut feeling that it was there."*

### Participant felt positive about data

### **Common heuristics7**

- 1. One-reason decision making
- 2. Rigidity
- 3. Generalization
- 4. Processing fluency
- 5. Associative activation
- 6. Affect
- 7. Representiveness
- 8. Reduction
- 9. Overconfidence
- 10. More A More B

Talanquer, 2014, *J. Chem. Ed*.

### Some heuristics are more problematic than others



### Students who used multiple problematic heuristics were more likely to give an incorrect response



Connor, M.; Finkenstaedt-Quinn, S.; Shultz, G.V. Chem. Educ. Res. Pract. 2019, Advance Article

## Summary

- Problematic reasoning among students is due to combination of their underlying assumptions and heuristics
- Students who successfully solved tasks evaluated spectral cues differently than those who didn't; Particular invalid chemical assumptions and heuristic reasoning strategies appear to constrain students' reasoning
- We have characterized productive reasoning strategies and valid assumptions and are collecting additional data with more experienced chemists

Connor, Megan C., Solaire A. Finkenstaedt-Quinn, and Ginger V. Shultz. "Constraints on organic chemistry students' reasoning during IR and 1 H NMR spectral interpretation." *Chemistry Education Research and Practice* (2019).

### Acknowledgements

### **Current Group**

Dr. Solaire Finkensteadt-Quinn Megan Connor\* Jeff Spencer Eleni Zotos Field Watts\* and DUE-1524967

Prof. Alena Moon (UNL)\* Robert Moeller\* Prof. Anne Gere



