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11/16/23



# Using Topic Modeling to Improve the Institutional Academic Assessment Review Process (A Meta-Assessment Approach)

*Lissette Tolentino, PhD*  
*Office of the Provost*

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# Introduction

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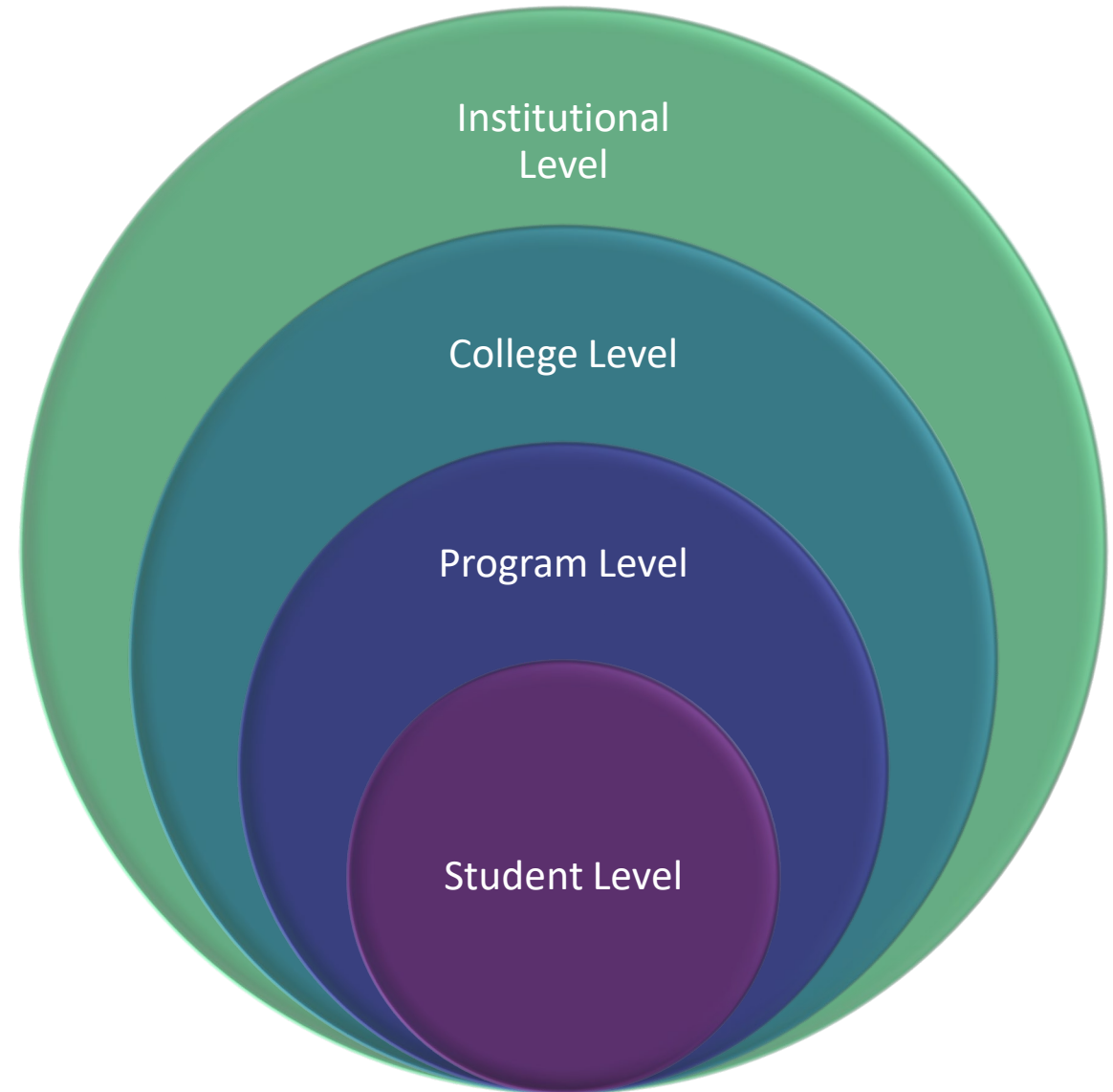
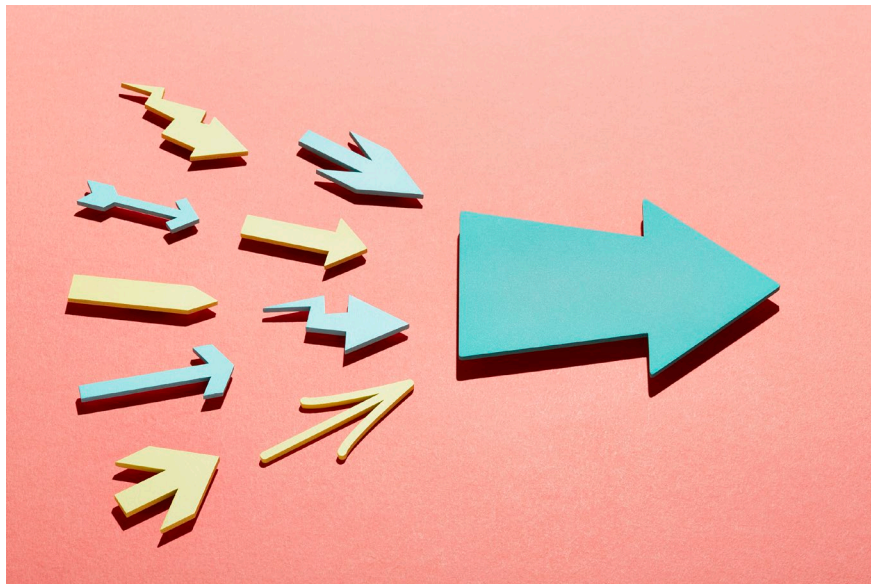
## Introduction

A major purpose of learning in higher education is concerned with student learning outcomes (SLOs)



## Introduction

# Student Learning Outcomes Influence All Levels



## Introduction



### WHO WE ARE...

We are a team of professionals from diverse backgrounds, who collaborate to support institutional effectiveness practices at UF.

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### WHAT WE DO...

Our main projects include:

- Accreditation
- QEP
- Annual Reporting
- General Education
- Quest Assessment
- JAHE
- Assessment Conference

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### CONTACT US

Please contact us if you wish to learn more about the Office of Institutional Assessment.

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## Introduction

# Academic Assessment Review: BA/BS in Statistics

### Student Learning Outcomes | SLOs

#### Content

1. Identify, define, and describe concepts and issues in statistics, including those involved in designing a statistical study, in statistical estimation and in tests of hypotheses.

#### Critical Thinking

2. Identify sources of variability in a given problem setting and formulate an appropriate statistical analysis.

#### Communication

3. Clearly and effectively present ideas in speech and in writing concerning statistical issues and analyses of data.

### ASSESSMENT TYPES

- Exams
- Projects
- Written and oral presentations

**Institutional Assessment asks the question: What is the quality of the assessment practices, and is student learning improving?**



## Introduction

# Assessment Review Process

- Evaluating and providing feedback to over 400+ reports
- Use a holistic rubric with comments
- In the report, faculty and staff create a narrative that encompasses all components of the rubric

• <b>Program Goal</b>	<i>Programmatic goal(s) address(es) programmatic elements (i.e., to graduate students who are prepared for the workplace).</i>
	<i>Section includes evaluation methods describing how goal will be achieved and what measures will be used.</i>
	<i>Section includes results and findings (i.e., What did you find out? Summarize your results here in tables or narrative, and attach redacted data to support your summary).</i>
• <b>Student Learning Outcomes</b>	<p><i>Student Learning Outcomes reflect the curriculum, and as curriculum evolves, learning outcomes change. SLOs should be current, relevant, and rigorous. Effective SLOs focus on what students will know and be able to do in terms of observable and measurable actions or behaviors.</i></p> <p><i>Current outcomes reflect current knowledge and practice in the discipline.</i></p> <p><i>Relevant outcomes relate logically and significantly to the discipline.</i></p> <p><i>Rigorous outcomes require an appropriate degree of academic precision and thoroughness to be met successfully.</i></p>

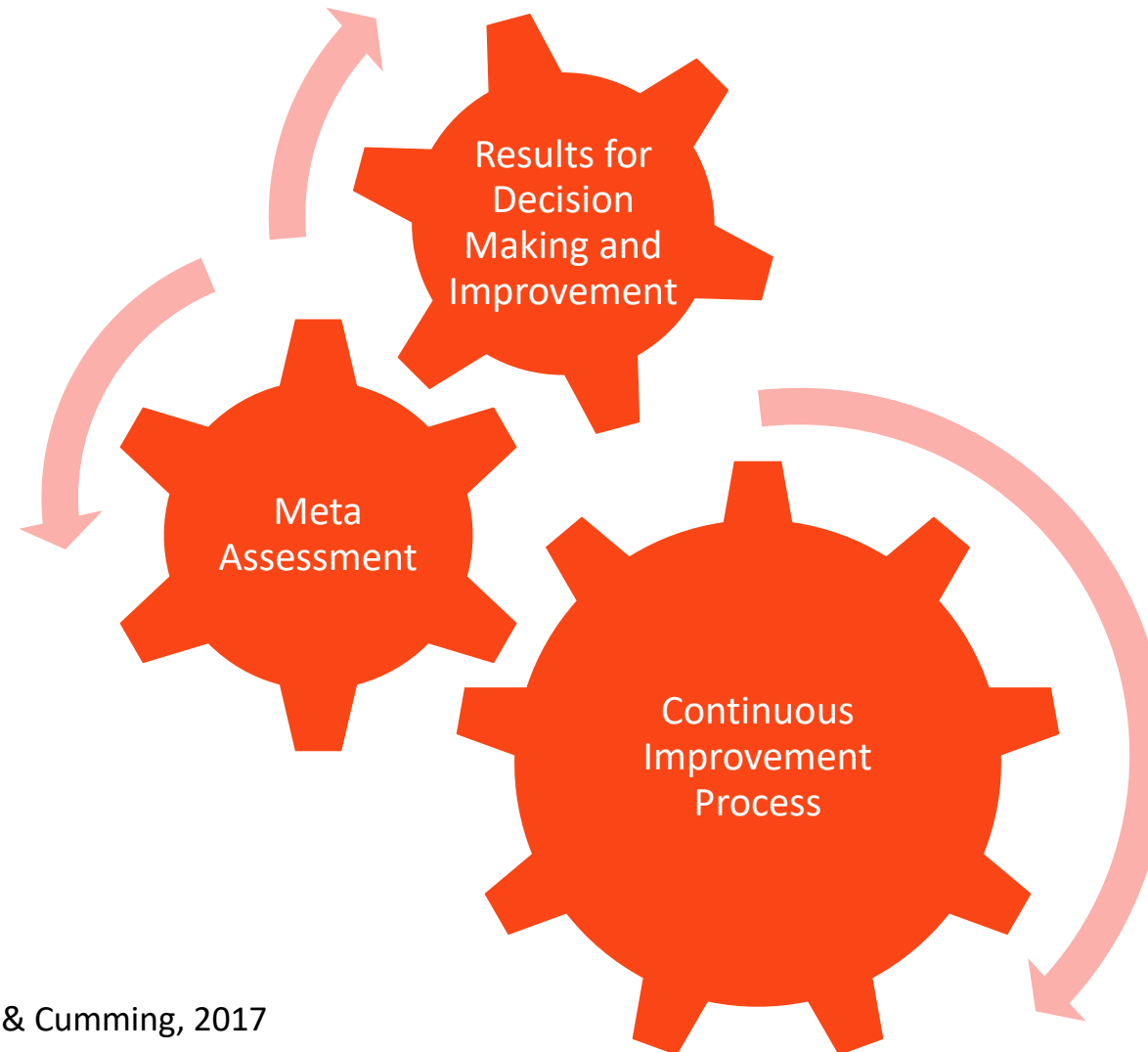


## Assessment Review Process: Feedback

- Do program goals address programmatic outcomes and ~~not~~ student level outcomes?
- Do student learning outcomes (SLOs) reflect recent, relevant, and rigorous outcomes?
- Are the assessment methods appropriate and aligned to the SLOs, and how?
- Are the results being used to improve SLOs and program objectives?

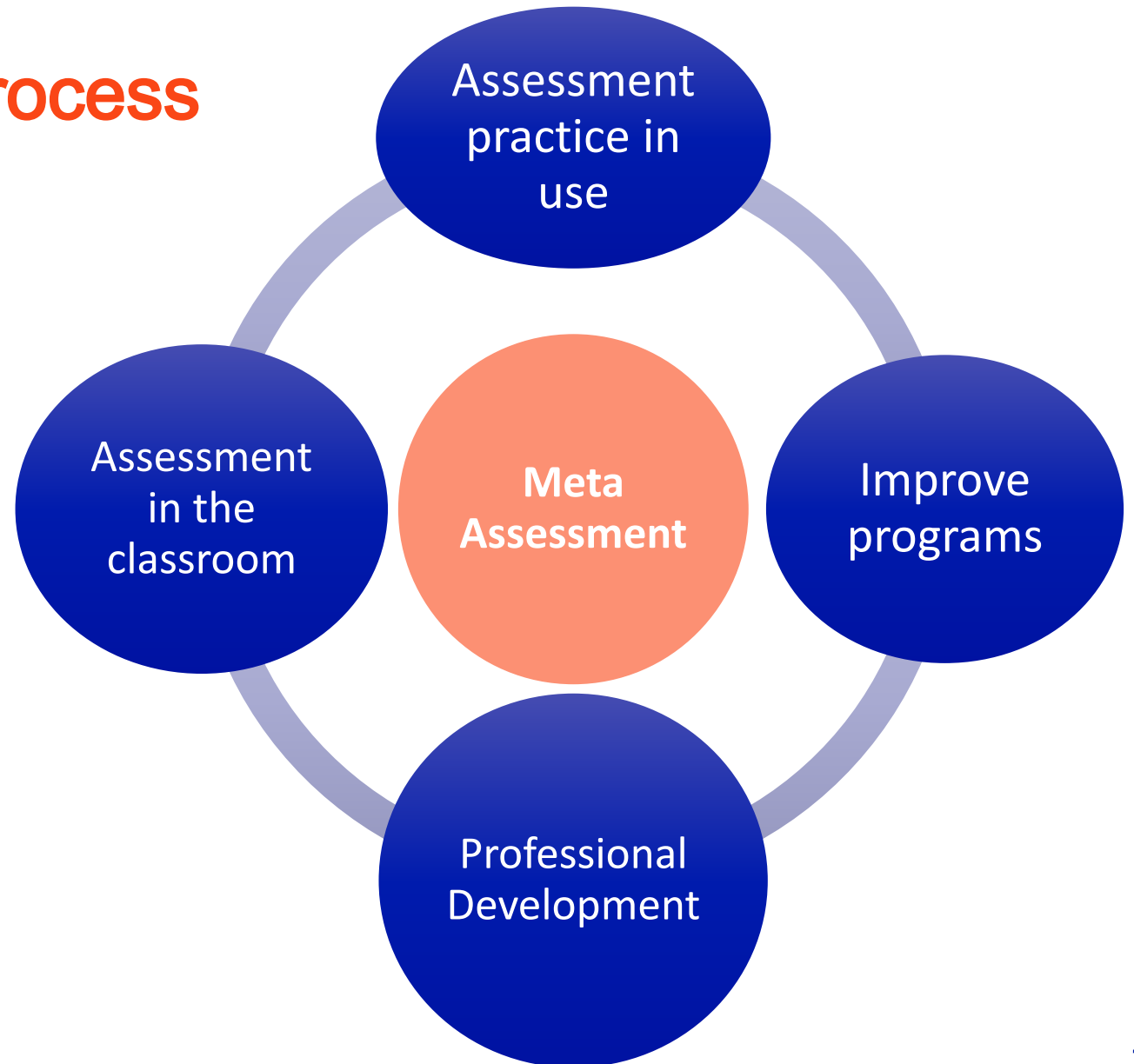
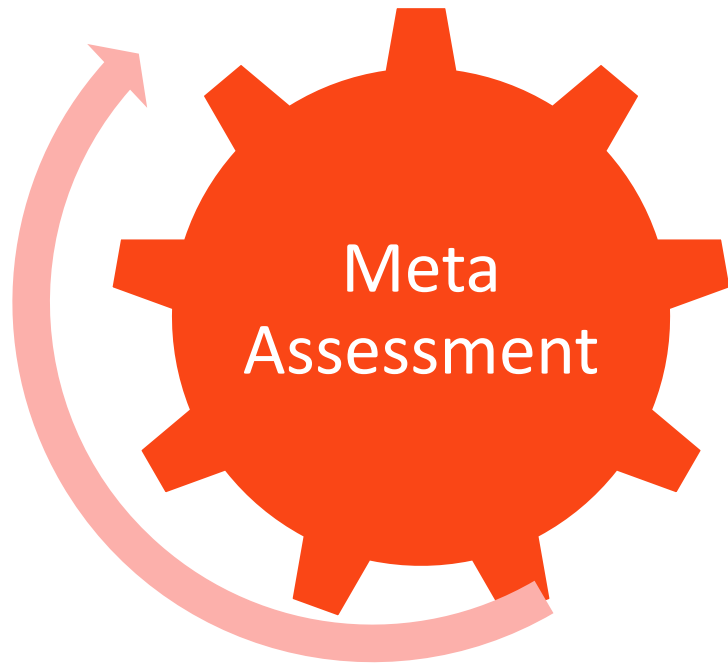
## Introduction

# Continuous Improvement Process



## Introduction

# Continuous Improvement Process

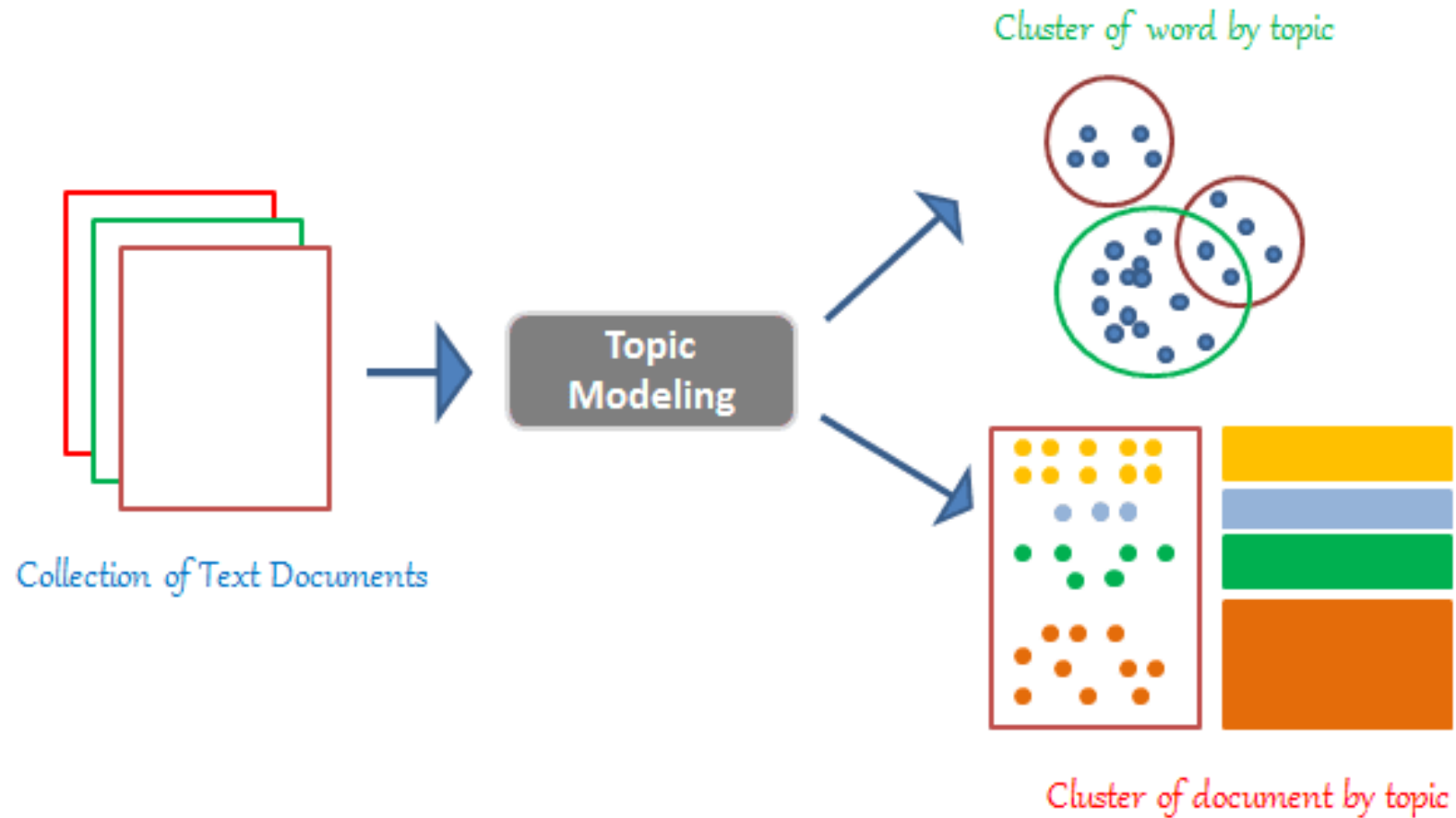


## The Problem



## The Solution

# Topic Modeling





## What is Topic Modeling

**Statistical methods that analyze the words of original texts to discover:**

Themes that occur

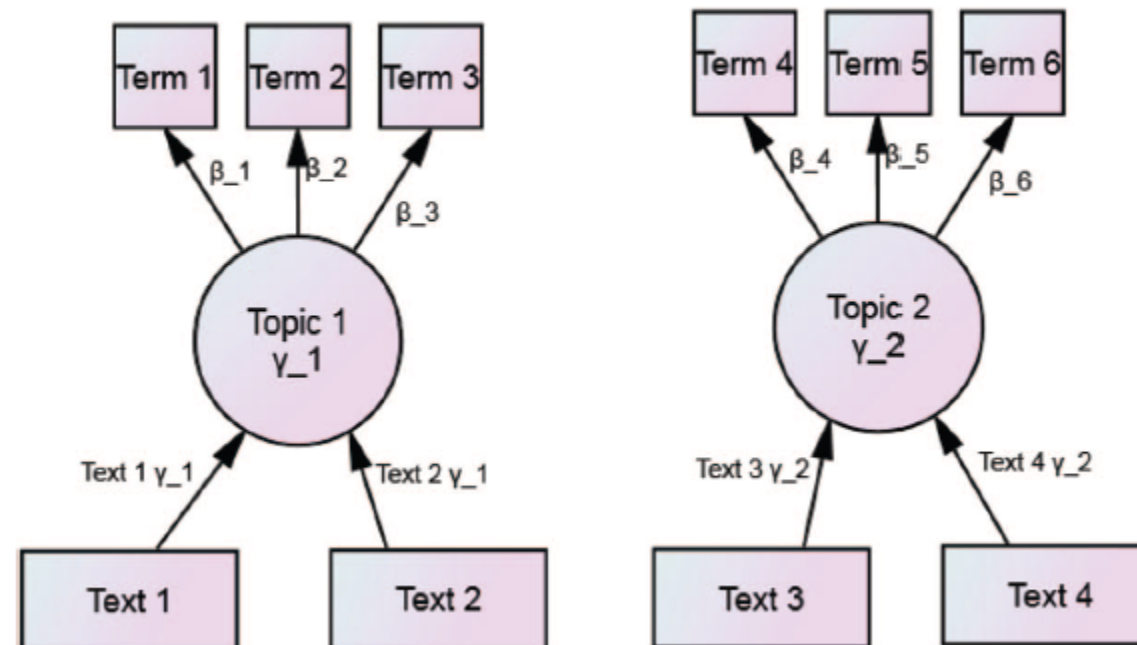
Themes that connect

How they change over time

# Topic Modeling: Latent Dirichlet Allocation

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FINCH, HERNÁNDEZ FINCH, McINTOSH, AND BRAUN



## The Solution

Finch et al.,  
2018

- Used for insights from open ended responses for identifying underlying themes

Hujala et  
al., 2020

- Allows for richer meaning from written feedback *without* having to read every single line of feedback

Gencoglu  
et al., 2023

- Analyzing open-ended feedback is possible and manageable

## Research Question

Why do we want to evaluate our feedback?

## Research Purpose

**We want to evaluate our feedback process (i.e., meta assessment) to help better inform our assessment review process for the following reasons:**

1. Provide evidence of continuous improvement within institutional assessment
2. Make recommendations for improvement
3. Understand common themes and areas of concern



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# Methodology

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## Methodology

# Finch et al., 2018

1. Data downloaded from Qualtrics\*
2. Pre-process data:  
Punctuation, articles, stop words, digits, symbols, and common words (“thank you”, “etc”...) were removed;  
lowercase
3. 439 responses
4. Determine number of topics to retain (Cao et al., 2009)

5. Training and cross validating data set
6. Evaluated the final 3 topic model
7. Bigram analysis
8. Identifying and characterizing topics

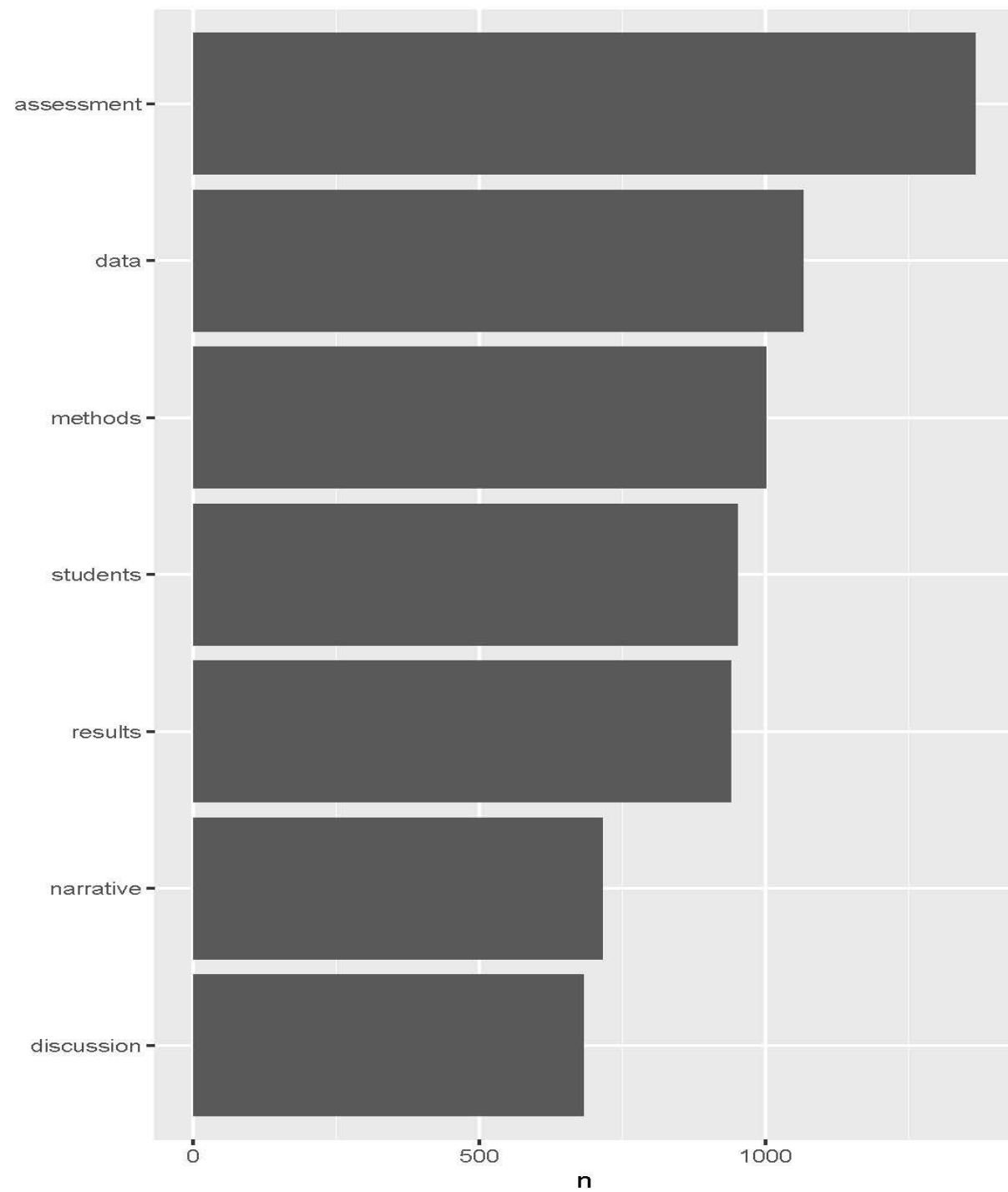
All analysis were completed in RStudio:  
Tidyverse, tidytext, topicmodels, tm

# Results

# Word Cloud from LDA With 3 Topics

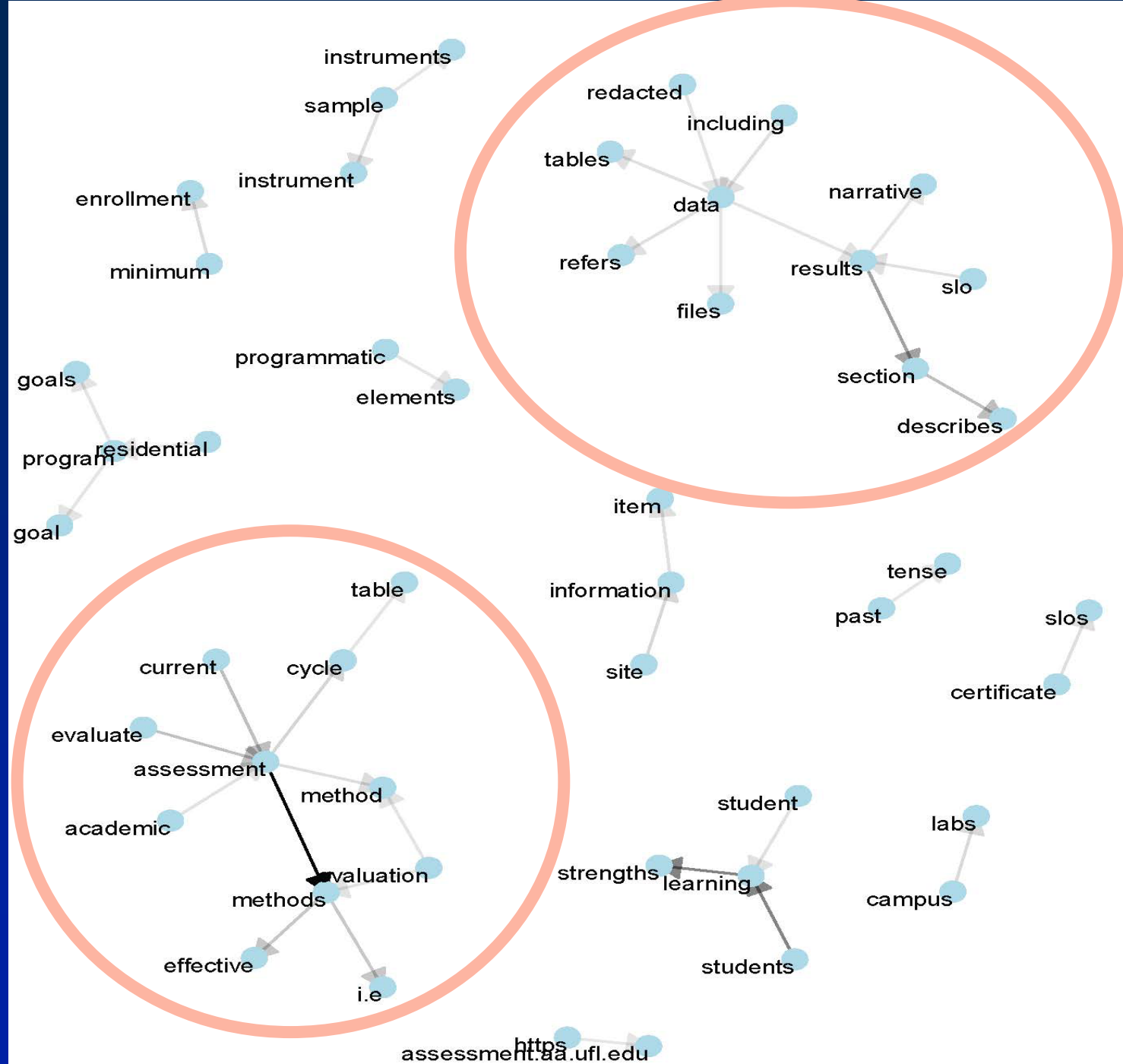


## Top 7 Most Frequent Words

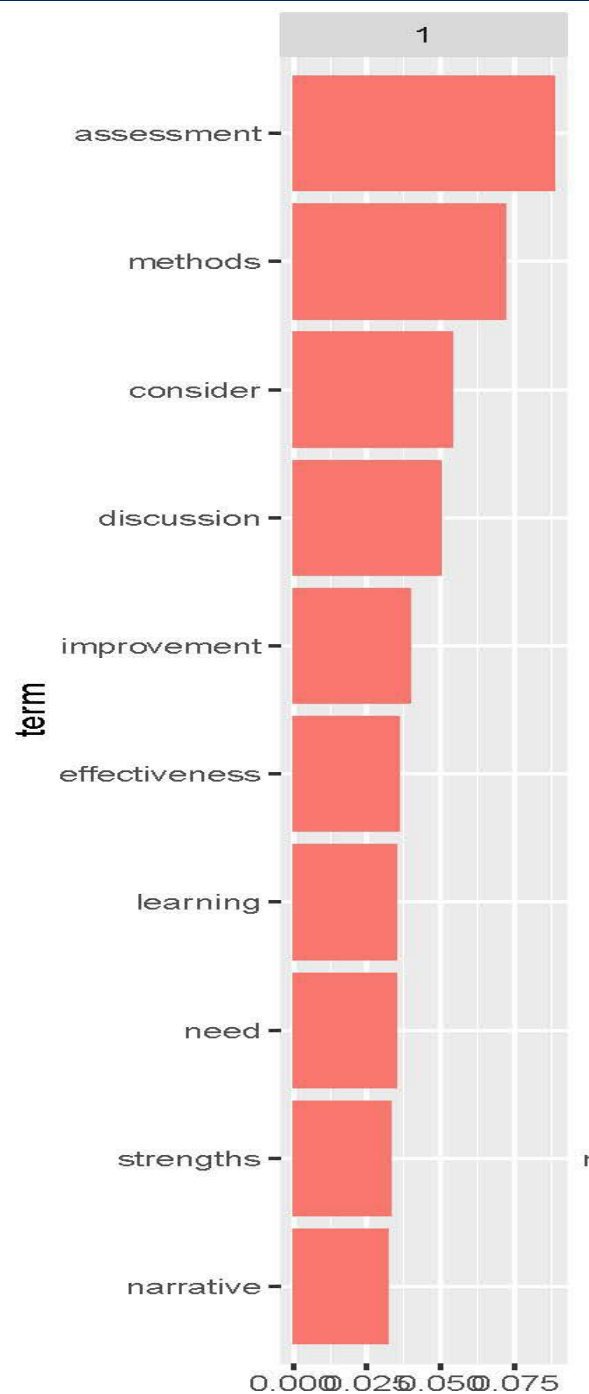




# Bi-gram Displaying Groups Of Connected Words



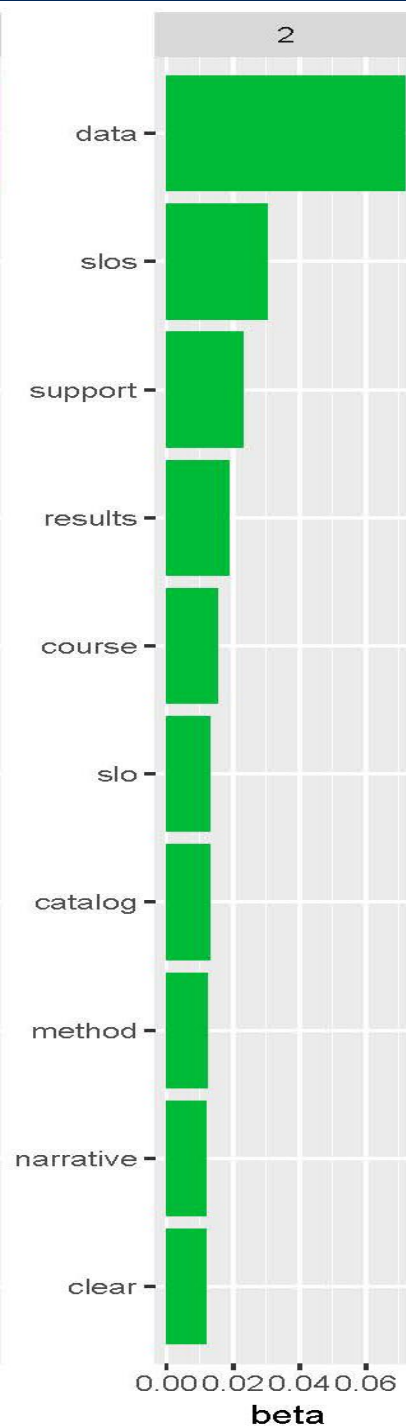
## LDA Topic Model with 3 Topics



## Topic 1: Student Learning Outcome Results

“Are the assessment  
methods meeting what  
students should know  
and be able to do”?

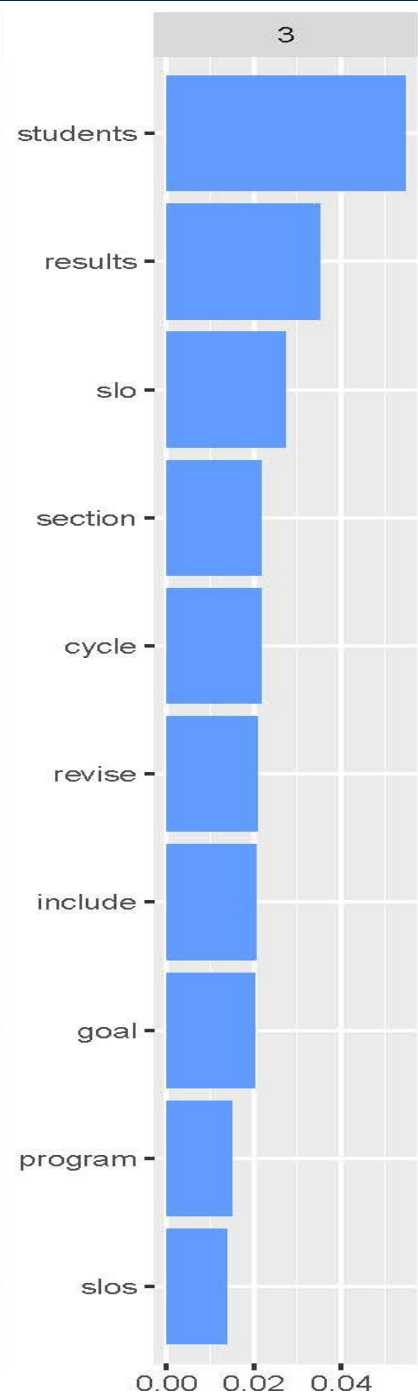
## LDA Topic Model with 3 Topics



## Topic 2: Academic Assessment Process

**“Are the academic assessment  
plans reviewed and approved  
for appropriateness?”**

## LDA Topic Model with 3 Topics



## Topic 3: Assessment Cycle

“When and how are assessment  
results discussed”?

## Main Takeaways

# Putting it all together.

## 3 Main Areas of Emphasis:

Topic 1: Focusing on what students are learning

Topic 2: Consistency of the information provided in the reports

Topic 3: Ensuring that the information is appropriate and accurate

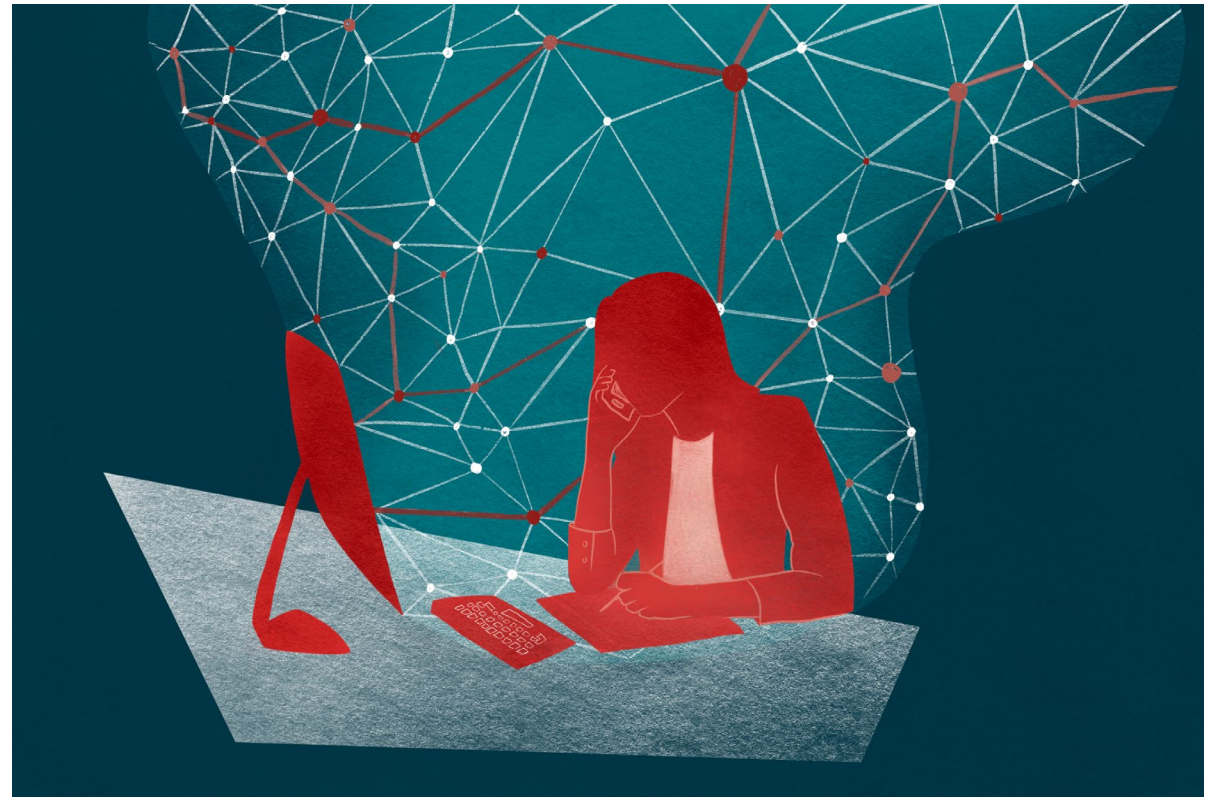




## Impact

### Through this study: What we're currently doing

- Create a framework to better serve institutional assessment objectives such as:
  - Informing current practices to modify feedback process
  - Monitoring progress



## Impact

# Through this study: What we plan on doing

- Our future goals include:
  - Modifying assessment processes
  - Facilitating faculty professional development







# Thank you for your time.

<https://assessment.aa.ufl.edu/office-of-institutional-assessment/>

