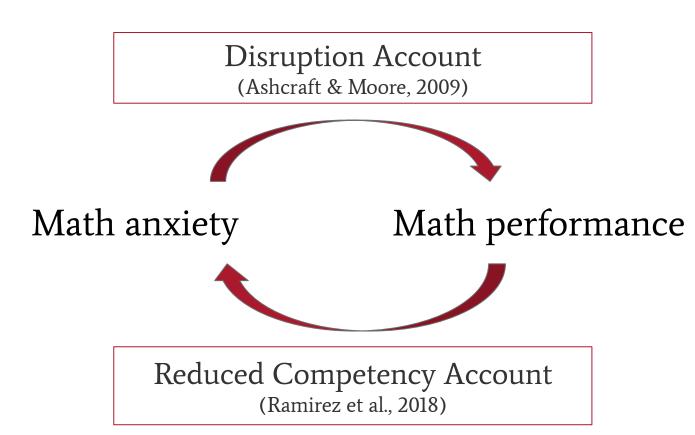


Alena Egorova, Stacy T. Shaw, Ji-Eun Lee, Erin Ottmar Worcester Polytechnic Institute

# Background & Research Questions

 Research shows that anxiety in mathematics negatively correlates with mathematics performance:



- Some studies examined potential moderators in these relationships, showing that some highly math anxious students still perform well in mathematics (Ramirez et al., 2018).
- However, few studies examine how often students diverge from this linear relationships and which other variables can explain potential deviation from reduced competency account theory.

**RQ1** How many groups will emerge if we cluster students based on their math anxiety and performance?

**RQ2** How students from those clusters differ in math anxiety, performance, and self-efficacy?

# Study 1

**Participants.** 1,029 students in 7th grade (typically 13-14-year-olds) from 11 US schools. 47% girls, 50% White, 27% Asian, 16% Hispanic/Latino, 7% Other.

**Methodology**. Online survey administered by teachers during math class across 2020-21 school year. A total of 76% of students attended class in person, others – remotely.

Math performance. Items adapted from Star et al. (2015): 4 – conceptual understanding in algebra, 3 – procedural knowledge, and 3 – math flexibility (see osf.io/bafdr). No feedback was given.

Math anxiety. Math Anxiety Scale for Young Children-R (Ganley & McGraw, 2016).

Math self-efficacy. Academic Efficacy subscale of the Patterns of Adaptive Learning Scales (Midgley et al., 2000) adapted for math.

# Study 2

Participants. 473 6th grade students from 14 US schools. 49% girls, 85% White, 5% Multi-racial, 3% Black, 3% Hispanic/Latino.

**Methodology**. Online survey administered during the math class time across 2023-24 school year. All students were in person.

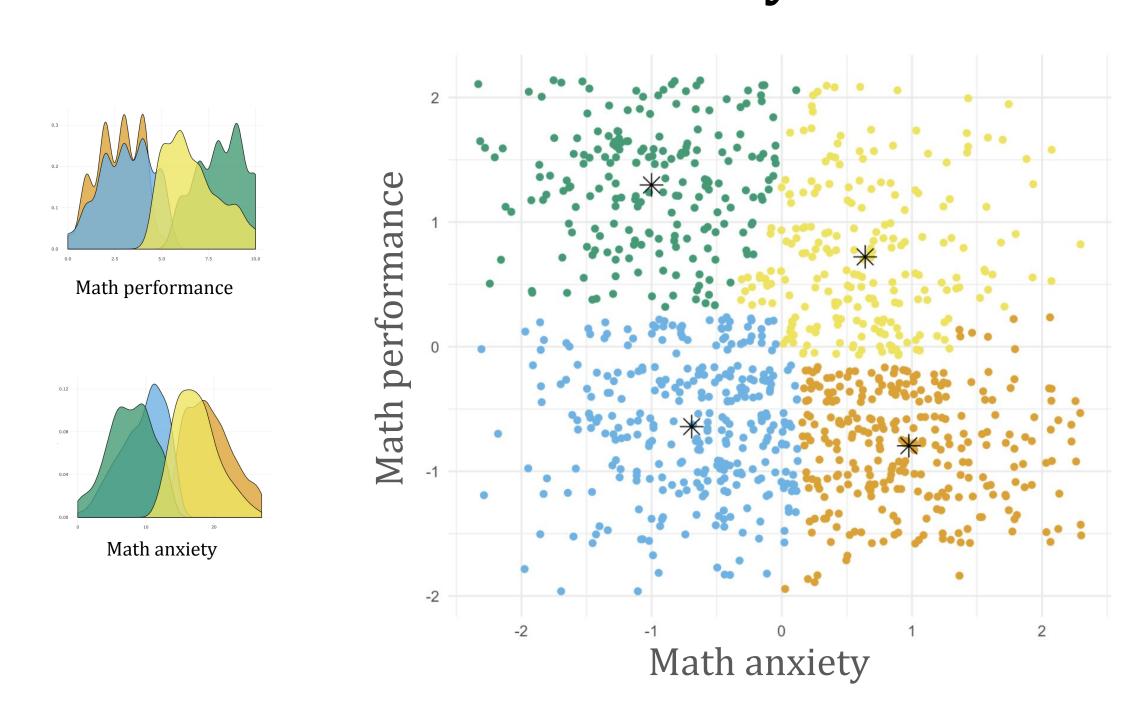
Math performance. 12 order-of-operations problems (Joseph, 2014). No feedback was given.

**Math anxiety measure.** The same as in study 1.

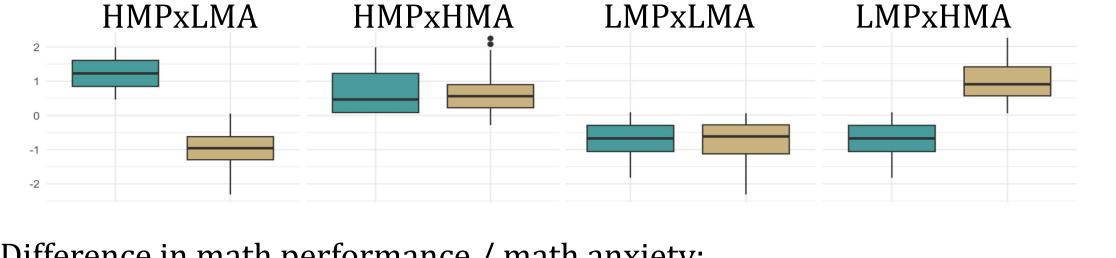
# Data Analysis Methods

- K-means clustering (with elbow method and silhouette scores)
- Kruskal Wallis H-test, Dunn tests with Bonferroni correction
- Regression analysis with a moderator

# Study 1



All clusters differed significantly from each other in performance, except for the low-performing clusters. Only the low-anxious clusters did not differ significantly in anxiety.



Difference in math performance / math anxiety:

	HMPxHMA	HMPxLMA	LMPxHMA	
HMPxLMA	- 4.5*** / 17.7***			
LMPxHMA	18.1 *** / - 3.5*	22.3*** / - 22.1***	_	
LMPxLMA	16.3 *** / 16.2***	20.6*** / - 3.2 (p = .2)	-2.4 (p = .05) / 21.2***	

# Results: RQ1

## **Both studies showed** 4 distinct clusters:

- High Math Performance, How Math Anxiety (HMPxLMA): study 1 n=205, study 2 n=130
- High Math Performance, High Math Anxiety (HMPxHMA):
- study 1 n=225, study 2 n=120 Low Math Performance, LowMath Anxiety (LMPxLMA):
- study 1 *n*=314, study 2 *n*=98 Low Math Performance,
- High Math Anxiety (LMPxHMA): study 1 *n*=285, study 2 *n*=125

## Variable

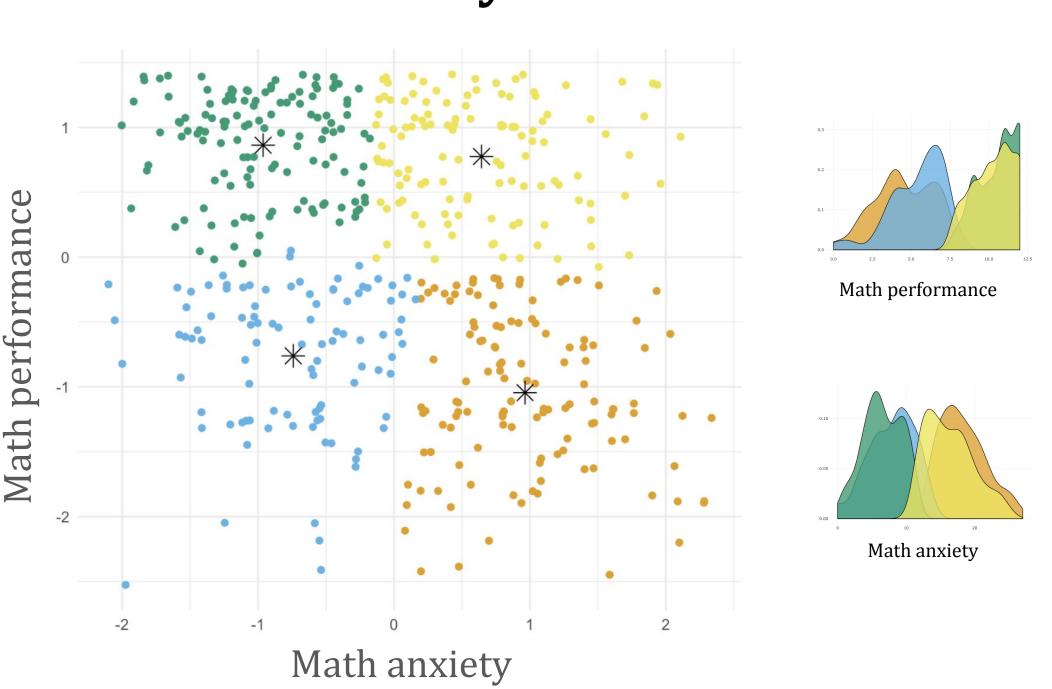
- Math performance
- **Math** anxiety

Note. All math performance, anxiety and

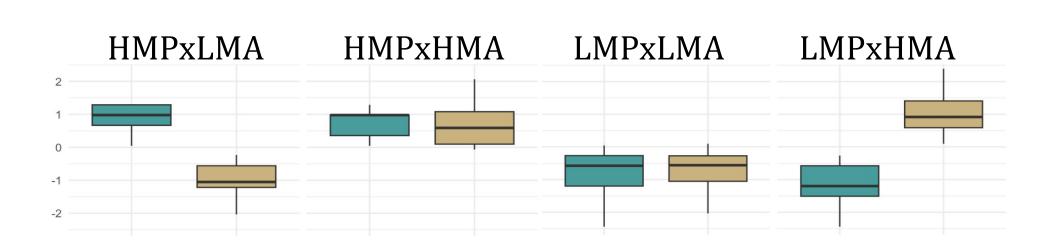
self-efficacy tables show pairwise Dunn test comparisons with Bonferroni correction. Statistics show absolute difference, df = 3. \*\*\* *p* < .001. \**p* < .05 Pearson's correlations (p < .01 for all): Study 1: MA and MP: r = -.23 [-.29, -.17], MA and MSE: r = -.56 [-.60, -.52], MP and MSE: r = .35 [.30, .41].

Study 2: MA and MP: r = -.27 [-.35, -.18]

# Study 2



Differences in performance were similar to Study 1, except that high-performing clusters did not differ in performance. Differences in anxiety were similar to Study 1.



Difference in math performance / math anxiety:

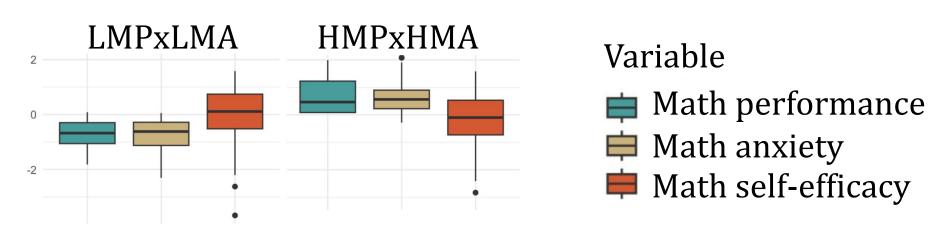
	HMPxHMA	HMPxLMA	LMPxHMA
HMPxLMA	-0.9 (p = 1)/13.1***		
LMPxHMA	14.0***/-2.4 ( <i>p</i> =.05)	15.1*** / - 15.7***	_
LMPxLMA	11.4*** / 10.5***	12.4***/ - 1.7 ( <i>p</i> =.3)	- 1.8 ( <i>p</i> =.2) / 13.0***

# Results: RQ2

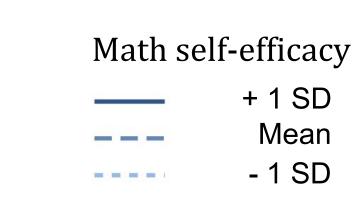
All clusters significantly differed in their self-efficacy. Difference in math self-efficacy (MSE):

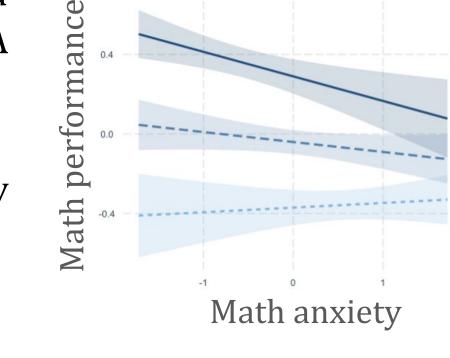
	<i>5</i>		
	HMPxHMA	HMPxLMA	LMPxHMA
HMPxLMA	-10.2***		
LMPxHMA	6.9***	17.5***	_
LMPxLMA	-2.8 (p=.02)	8.4***	-10.6 (p = .003)

Cluster with low performance and low anxiety showed slightly but significantly higher level of math self-efficacy than cluster with high performance and high anxiety:



MSE significantly moderated relationships between MA and MP (p < .01):



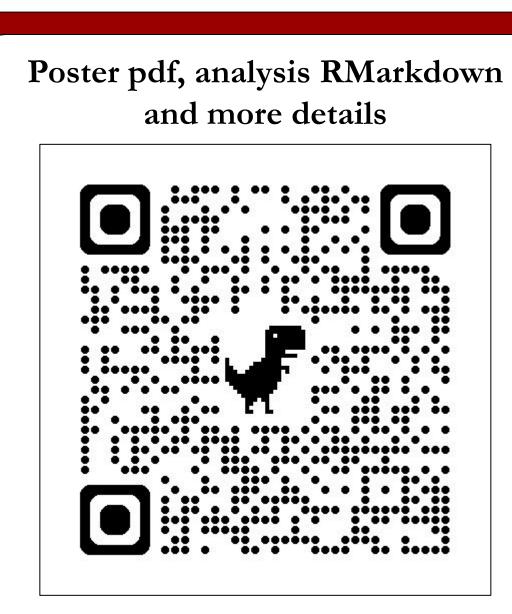


# Conclusions

- Clustering showed the extent to which students tend to deviate from the traditional linear perspective on association between math performance (MP) and math anxiety (MA) and two directions of this deviation.
- In about one-fourth of students, high MA did not prevent them from showing high levels of MP. However, in the Study 1, those students demonstrated significantly lower performance compared to high-performing low-anxious students – supporting the idea that high anxiety can prevent students from performing at the highest level.
- Deviation from the reduced competency account theory in another quarter of participants can be associated with their differences in self-efficacy, signaling that students from this cluster could overestimate their math abilities and, thus, not experience increased negative feelings around math.
- These findings highlight the importance of searching and always accounting for multiple moderation variables when aiming to predict performance from anxiety and vice versa.

# Funding

The research reported here was supported by the Institute of Education Sciences, U.S. Department of Education, through Grant R305A180401 (Study 1) and the National Science Foundation, through an ECR Core grant (2300764) to WPI (Study 2).

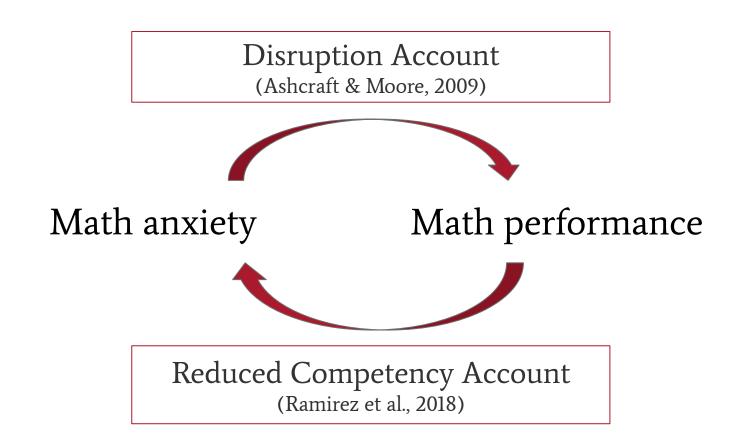




Alena Egorova, Stacy T. Shaw, Ji-Eun Lee, Erin Ottmar Worcester Polytechnic Institute

# Background & Research Questions

Research shows that anxiety in mathematics negatively correlates with mathematics performance:



Some studies examined potential moderators in these relationships, showing that some highly math anxious students still perform well in mathematics (Ramirez et al., 2018). However, few studies examine how often students diverge from this linear relationships and which other variables can explain potential deviation from reduced competency account theory.

**RQ1** How many groups will emerge if we cluster students based on their math anxiety and performance?

**RQ2** How students from those clusters differ in math anxiety, performance, and self-efficacy?

# Study 1

**Participants.** 1,029 students in 7th grade (typically 13-14-year-olds) from 11 US schools. 47% girls, 50% White, 27% Asian, 16% Hispanic/Latino, 7% Other.

**Methodology**. Online survey administered by teachers during math class across 2020-21 school year. A total of 76% of students attended class in person, others – remotely.

**Math performance.** Items adapted from Star et al. (2015): 4 – conceptual understanding in algebra, 3 – procedural knowledge, and 3 – math flexibility (see <u>osf.io/bafdr</u>). No feedback was given.

**Math anxiety.** Math Anxiety Scale for Young Children-R (Ganley & McGraw, 2016).

**Math self-efficacy.** Academic Efficacy subscale of the Patterns of Adaptive Learning Scales (Midgley et al., 2000) adapted for math.

# Study 2

**Participants.** 473 6th grade students from 14 US schools. 49% girls, 85% White, 5% Multi-racial, 3% Black, 3% Hispanic/Latino.

**Methodology**. Online survey administered during the math class time across 2023-24 school year. All students were in person.

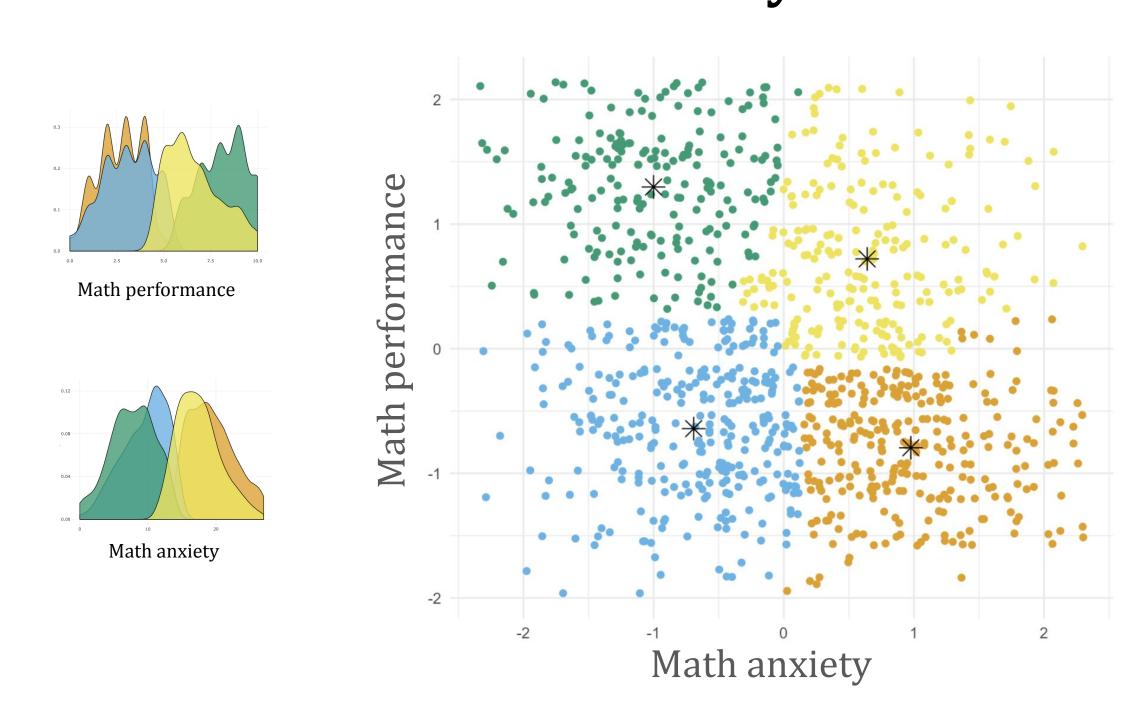
Math performance. 12 order-of-operations problems (<u>Joseph</u>, <u>2014</u>). No feedback was given.

**Math anxiety measure.** The same as in study 1.

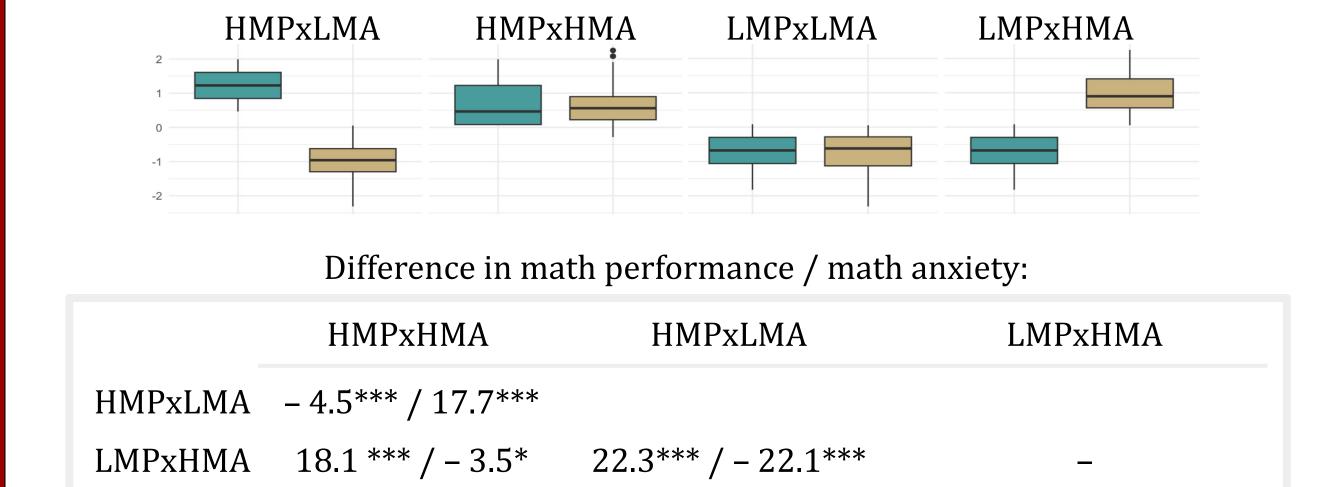
# Approach to clustering analysis

First, we standardized values using z-scores. To chose the number of clusters, we used elbow method and silhouette scores. We applied k-means for clustering.

# Study 1



All clusters differed significantly from each other in performance, except for the low-performing clusters. Only the low-anxious clusters did not differ significantly in anxiety.



LMPxLMA 16.3 \*\*\* / 16.2 \*\*\* 20.6 \*\*\* / - 3.2 (p = .2) - 2.4 (p = .05) / 21.2 \*\*\*

# Results: RQ1

# Both studies showed 4 distinct clusters:

- High performance, low anxiety (HMPxLMA): study 1 n=205, study 2 n=130
  - High performance,
- high anxiety (HMPxHMA): study 1 n=225, study 2 n=120
- Low performance, low anxiety (LMPxLMA): study 1 n=314, study 2 n=98
  - Low performance,
- high anxiety (LMPxHMA): study 1 n=285, study 2 n=125

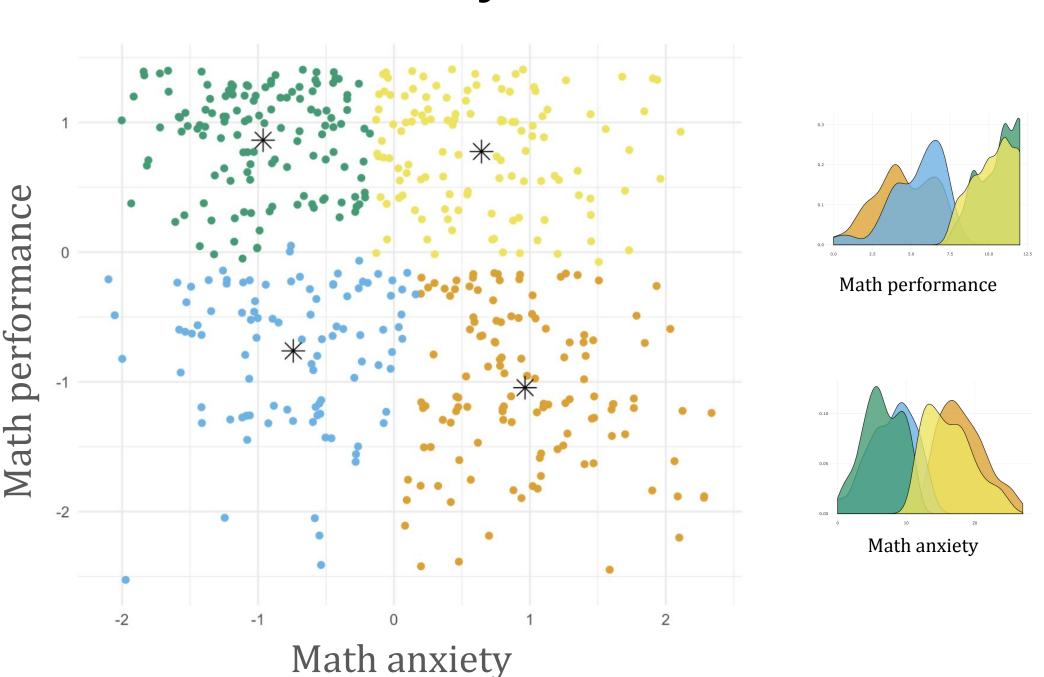
# Variable Math performance Math anxiety

Note. All math performance, anxiety and self-efficacy tables show pairwise Dunn test comparisons with Bonferroni correction. Statistics show absolute difference, df = 3.

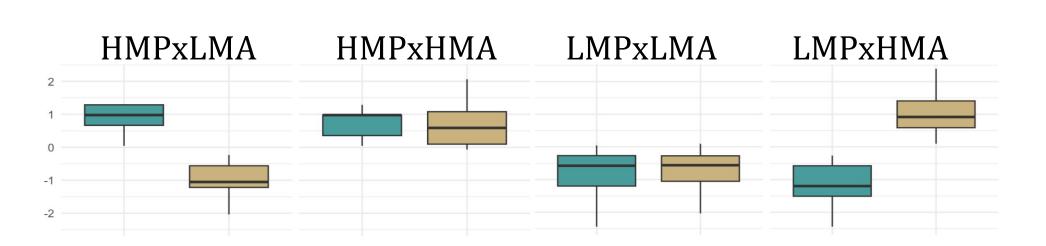
\*\*\* p < .001. \*p < .05

Pearson's correlations (p < .01 for all): Study 1: MA and MP: r = -.23 [-.29, -.17], MA and MSE: r = -.56 [-.60, -.52], MP and MSE: r = .35 [.30, .41]. Study 2: MA and MP: r = -.27 [-.35, -.18]

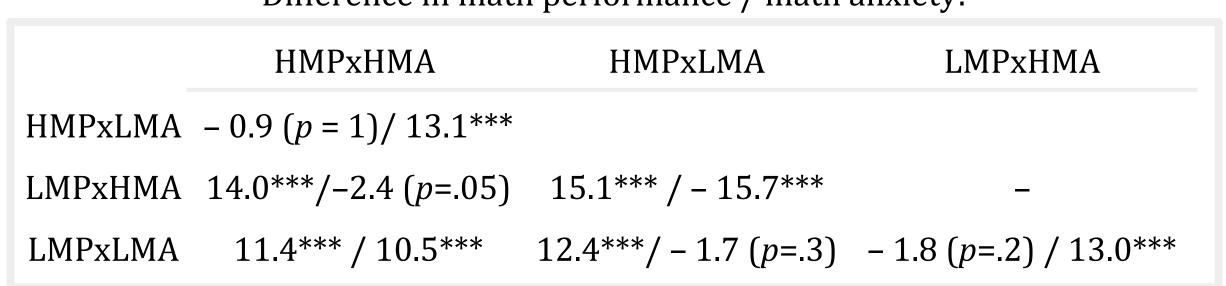
# Study 2



Differences in performance were similar to Study 1, except that high-performing clusters did not differ in performance. Differences in anxiety were similar to Study 1.



Difference in math performance / math anxiety:

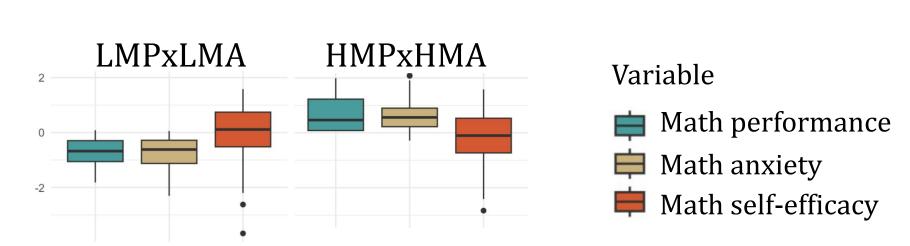


# Results: RQ2

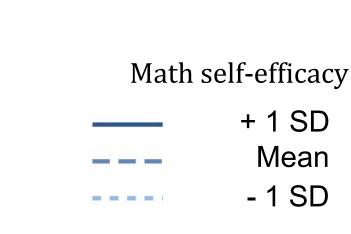
All clusters differed significantly in their self-efficacy. Difference in math self-efficacy (MSE):

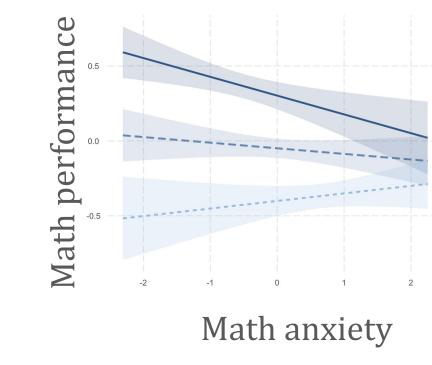
	HMPxHMA	HMPxLMA	LMPxHMA
HMPxLMA	-9.6***		
LMPxHMA	6.0***	16.0***	_
LMPxLMA	-2.8***	7.7***	-9.6 (p = .003)

Cluster with low performance and low anxiety showed slightly but significantly higher level of math self-efficacy than cluster with high performance and high anxiety:



MSE significantly moderated relationships between MA and MP (p < .01):





## Conclusions

- Clustering showed the extent to which students tend to deviate from the traditional linear perspective on association between math performance (MP) and math anxiety (MA) and two directions of this deviation.
- In about one-fourth of students, high MA did not prevent them from showing high levels of MP. However, in the Study 1, those students demonstrated significantly lower performance compared to high-performing low-anxious students supporting the idea that high anxiety can prevent students from performing at the highest level.
- Deviation from the reduced competency account theory in another quarter of participants can be associated with their differences in self-efficacy, signaling that students from this cluster could overestimate their math abilities and, thus, not experience increased negative feelings around math.
- These findings highlight the importance of searching and always accounting for moderation variables when aiming to predict performance from anxiety and vice versa.

# Funding

The research reported here was supported by the Institute of Education Sciences, U.S. Department of Education, through Grant R305A180401 (study 1) and the National Science Foundation, through an ECR Core grant (2300764) to WPI (study 2).

This poster, analysis code and more details

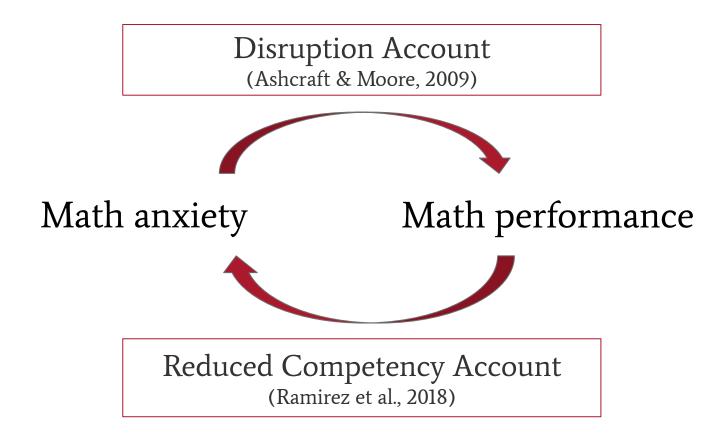




Alena Egorova, Stacy T. Shaw, Ji-Eun Lee, Erin Ottmar Worcester Polytechnic Institute

# Background & Research Questions

Research shows that anxiety in mathematics negatively correlates with mathematics performance:



Some studies examined potential moderators in these relationships, showing that some highly math anxious students still perform well in mathematics (Ramirez et al., 2018). However, few studies examine how often students diverge from this linear relationships and which other variables can explain potential deviation from reduced competency account theory.

**RQ1** How many groups will emerge if we cluster students based on their math anxiety and performance?

RQ2 How students from those clusters differ in math anxiety, performance, and self-efficacy?

# Study 1

**Participants.** 1,029 students in 7th grade (typically 13-14-year-olds) from 11 US schools. 47% girls, 50% White, 27% Asian, 16% Hispanic/Latino, 7% Other.

**Methodology**. Online survey administered by teachers during math class across 2020-21 school year. A total of 76% of students attended class in person, others – remotely.

Math performance. Items adapted from Star et al. (2015): 4 – conceptual understanding in algebra, 3 – procedural knowledge, and 3 – math flexibility (see osf.io/bafdr). No feedback was given.

Math anxiety. Math Anxiety Scale for Young Children-R (Ganley & McGraw, 2016).

Math self-efficacy. Academic Efficacy subscale of the Patterns of Adaptive Learning Scales (Midgley et al., 2000) adapted for math.

# Study 2

Participants. 473 6th grade students from 14 US schools. 49% girls, 85% White, 5% Multi-racial, 3% Black, 3% Hispanic/Latino.

**Methodology**. Online survey administered during the math class time across 2023-24 school year. All students were in person.

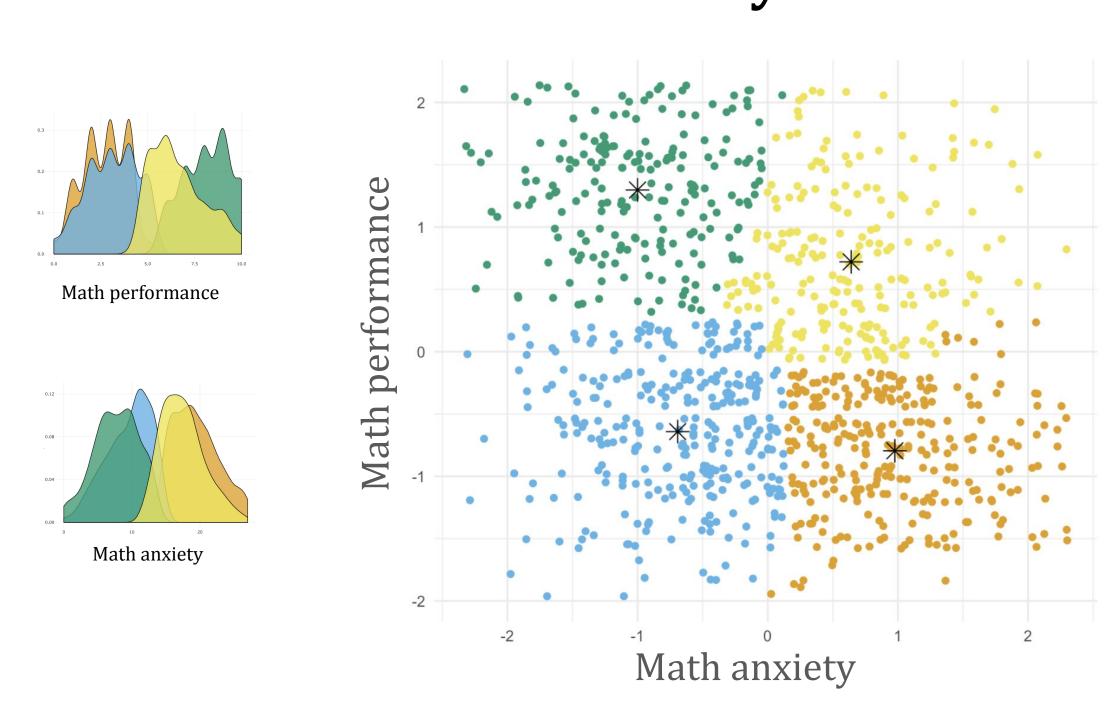
Math performance. 12 order-of-operations problems (Joseph, 2014). No feedback was given.

**Math anxiety measure.** The same as in study 1.

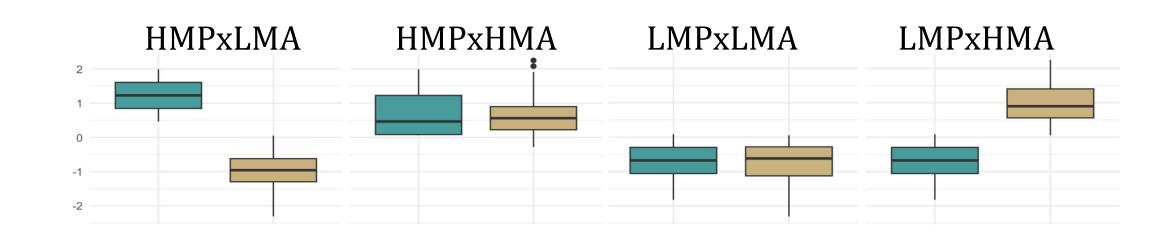
# Approach to clustering analysis

First, we standardized values using z-scores. To chose the number of clusters, we used elbow method and silhouette scores. We applied k-means for clustering.

# Study 1



All clusters differed significantly from each other in performance, except for the low-performing clusters. Only the low-anxious clusters did not differ significantly in anxiety.



Difference in math performance / math anxiety:

	HMPxHMA	HMPxLMA	LMPxHMA	
HMPxLMA	- 4.5*** / 17.7***			
LMPxHMA	18.1 *** / - 3.5*	22.3*** / - 22.1***	_	
LMPxLMA	16.3 *** / 16.2***	20.6*** / - 3.2 (p = .2)	-2.4 (p = .05) / 21.2***	

# Results: RQ1

## **Both studies showed** 4 distinct clusters:

- High performance, low anxiety (HMPxLMA): study 1 *n*=205, study 2 *n*=130
  - High performance,
- high anxiety (HMPxHMA): study 1 n=225, study 2 n=120
  - Low performance,
- low anxiety (LMPxLMA): study 1 *n*=314, study 2 *n*=98
- Low performance,
- high anxiety (LMPxHMA): study 1 *n*=285, study 2 *n*=125

# Variable Math performance

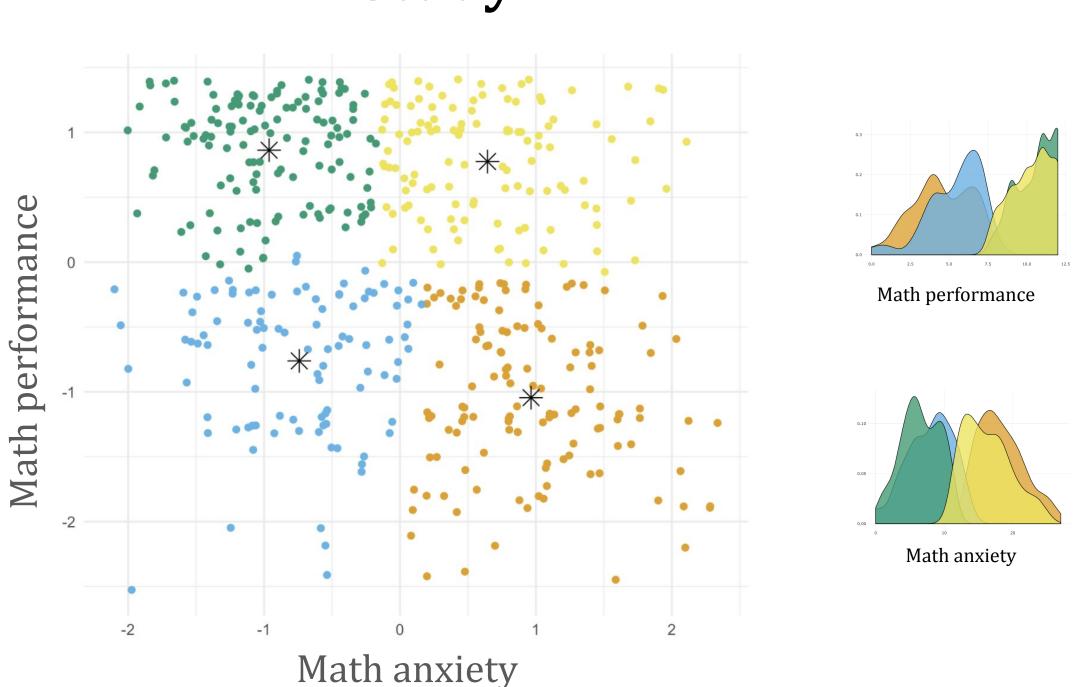
Math anxiety

*Note.* All math performance, anxiety and self-efficacy tables show pairwise Dunn test comparisons with Bonferroni correction. Statistics show absolute difference, df = 3. \*\*\* *p* < .001. \**p* < .05

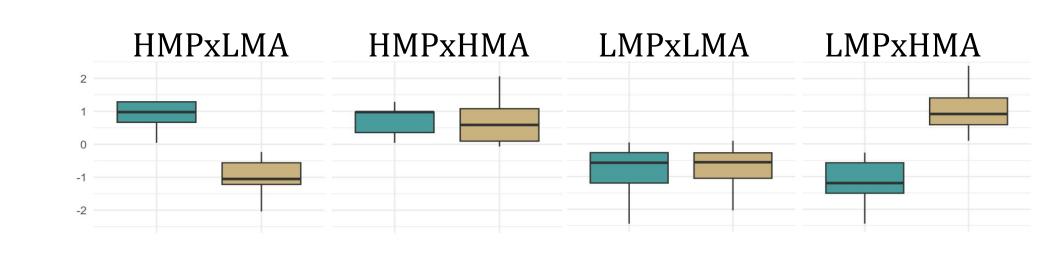
Pearson's correlations (p < .01 for all): Study 1: MA and MP: r = -.23 [-.29, -.17], MA and MSE: r = -.56 [-.60, -.52], MP and MSE: r = .35 [.30, .41].

Study 2: MA and MP: r = -.27 [-.35, -.18]

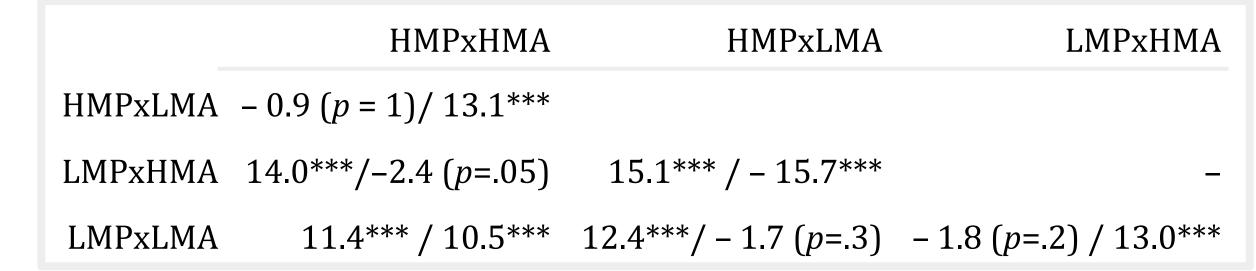
# Study 2



Differences in performance were similar to Study 1, except that high-performing clusters did not differ in performance. Differences in anxiety were similar to Study 1.



Difference in math performance / math anxiety:

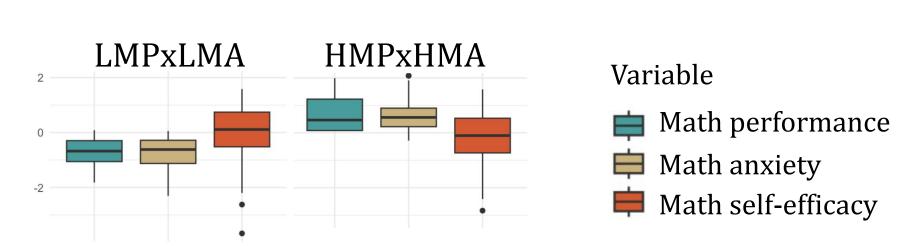


# Results: RQ2

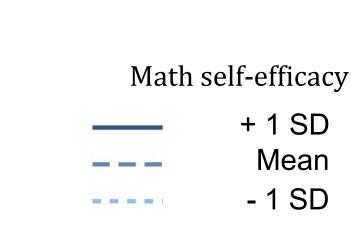
All clusters significantly differed in their self-efficacy. Difference in math self-efficacy (MSE):

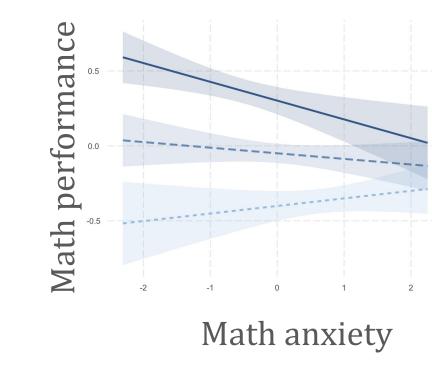
	HMPxHMA	HMPxLMA	LMPxHMA
HMPxLMA	-9.6***		
LMPxHMA	6.0***	16.0***	_
LMPxLMA	-2.8***	7.7***	-9.6 (p = .003)

Cluster with low performance and low anxiety showed slightly but significantly higher level of math self-efficacy than cluster with high performance and high anxiety:



MSE significantly moderated relationships between MA and MP (p < .01):





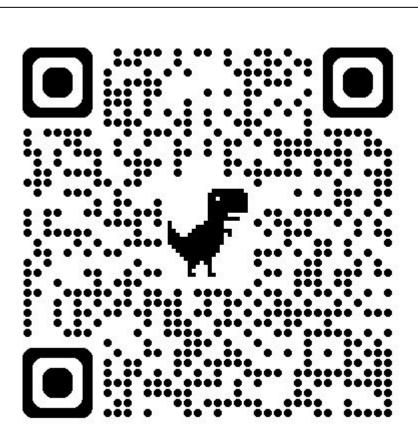
#### Conclusions

- Clustering showed the extent to which students tend to deviate from the traditional linear perspective on association between math performance (MP) and math anxiety (MA) and two directions of this deviation.
- In about one-fourth of students, high MA did not prevent them from showing high levels of MP. However, in the Study 1, those students demonstrated significantly lower performance compared to high-performing low-anxious students - supporting the idea that high anxiety can prevent students from performing at the highest level.
- Deviation from the reduced competency account theory in another quarter of participants can be associated with their differences in self-efficacy, signaling that students from this cluster could overestimate their math abilities and, thus, not experience increased negative feelings around math.
- These findings highlight the importance of searching and always accounting for moderation variables when aiming to predict performance from anxiety and vice versa.

# Funding

The research reported here was supported by the Institute of Education Sciences, U.S. Department of Education, through Grant R305A180401 (study 1) and the National Science Foundation, through an ECR Core grant (2300764) to WPI (study 2).

This poster, analysis code and more details

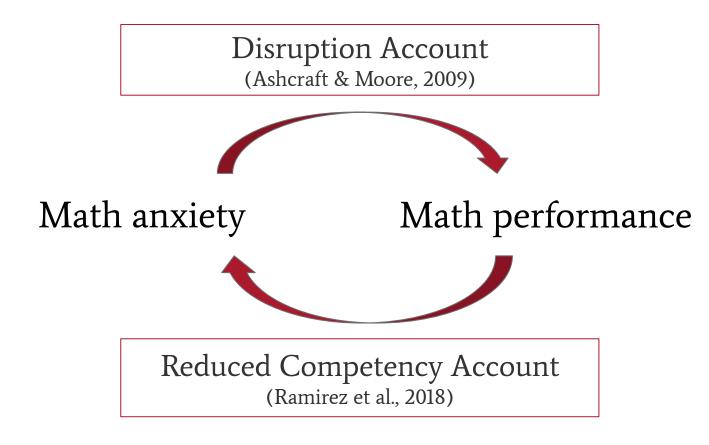




Alena Egorova, Stacy T. Shaw, Ji-Eun Lee, Erin Ottmar Worcester Polytechnic Institute

# Background & Research Questions

Research shows that anxiety in mathematics negatively correlates with mathematics performance:



Some studies examined potential moderators in these relationships, showing that some highly math anxious students still perform well in mathematics (Ramirez et al., 2018). However, few studies examine how often students diverge from this linear relationships and which other variables can explain potential deviation from reduced competency account theory.

**RQ1** How many groups will emerge if we cluster students based on their math anxiety and performance?

**RQ2** How students from those clusters differ in math anxiety, performance, and self-efficacy?

# Study 1

**Participants.** 1,029 students in 7th grade (typically 13-14-year-olds) from 11 US schools. 47% girls, 50% White, 27% Asian, 16% Hispanic/Latino, 7% Other.

**Methodology**. Online survey administered by teachers during math class across 2020-21 school year. A total of 76% of students attended class in person, others – remotely.

**Math performance.** Items adapted from Star et al. (2015): 4 – conceptual understanding in algebra, 3 – procedural knowledge, and 3 – math flexibility (see <u>osf.io/bafdr</u>). No feedback was given.

Math anxiety. Math Anxiety Scale for Young Children-R (Ganley & McGraw, 2016).

**Math self-efficacy.** Academic Efficacy subscale of the Patterns of Adaptive Learning Scales (Midgley et al., 2000) adapted for math.

# Study 2

**Participants.** 473 6th grade students from 14 US schools. 49% girls, 85% White, 5% Multi-racial, 3% Black, 3% Hispanic/Latino. **Mathodology** Online survey administered during the math class.

**Methodology**. Online survey administered during the math class time across 2023-24 school year. All students were in person.

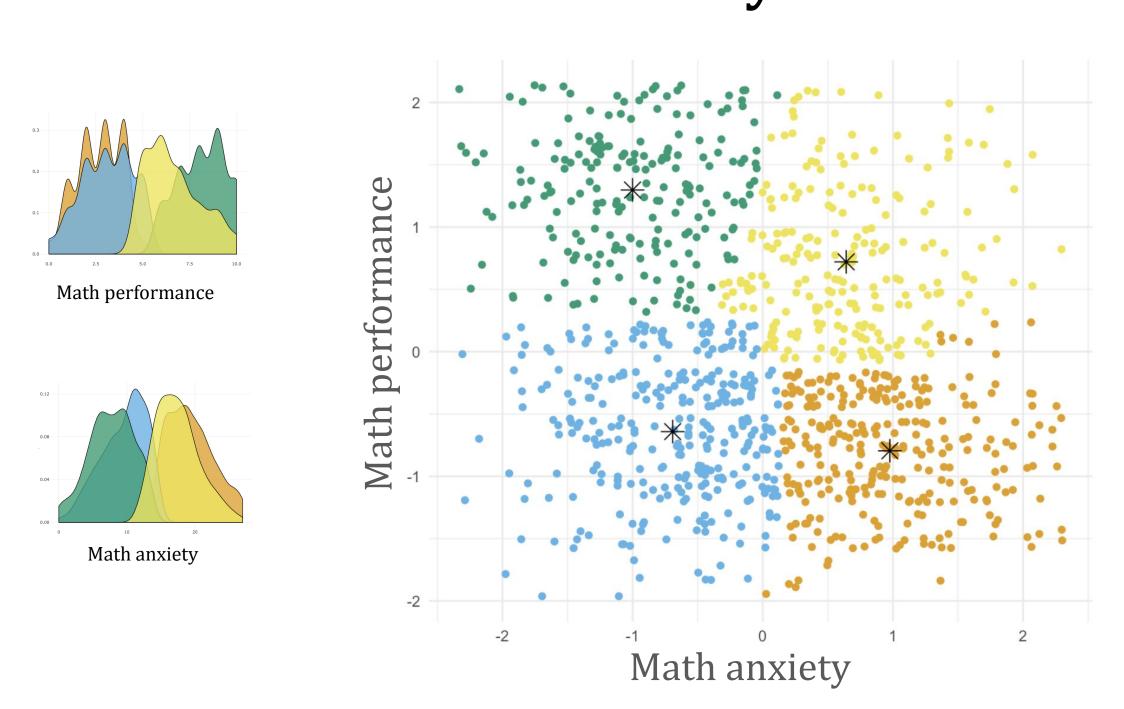
Math performance. 12 order-of-operations problems (<u>Joseph</u>, <u>2014</u>). No feedback was given.

**Math anxiety measure.** The same as in study 1.

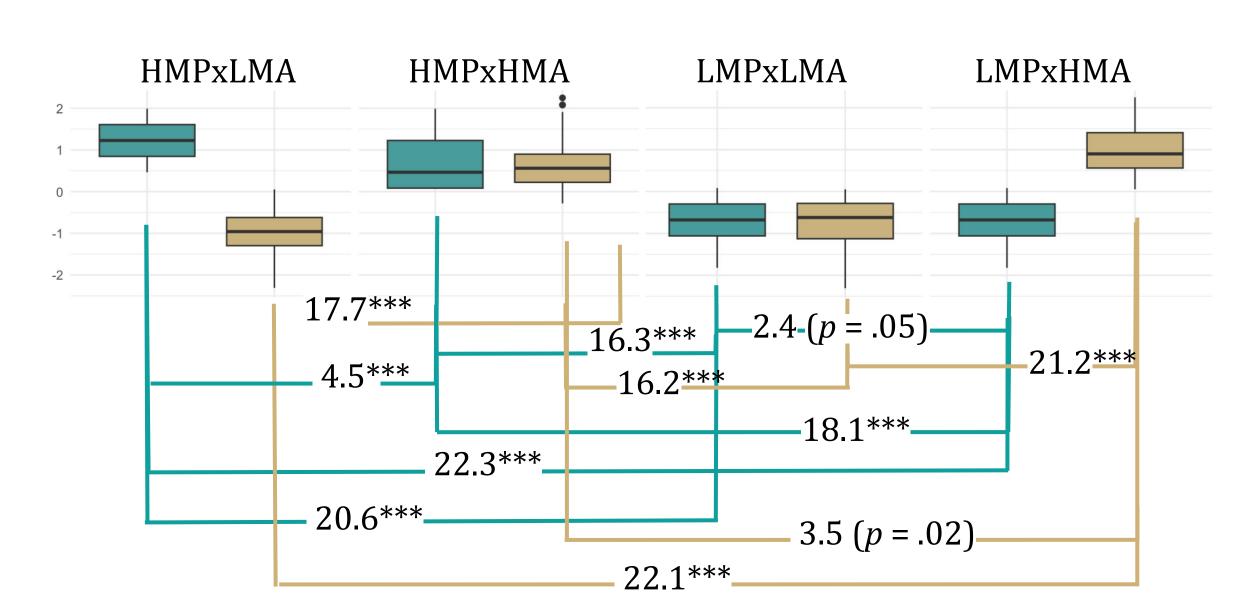
# Approach to clustering analysis

First, we standardized values using z-scores. To chose the number of clusters, we used elbow method and silhouette scores. We applied k-means for clustering.

# Study 1



All clusters significantly differed in performance.
Only low anxious clusters did not significantly differed in anxiety.



# Results: RQ1

# Both studies showed 4 distinct clusters:

High performance, low anxiety (HMPxLMA): study 1 n=205, study 2 n=130

High performance,

- high anxiety (HMPxHMA): study 1 *n*=225, study 2 *n*=120 Low performance,
- low anxiety (LMPxLMA):
   study 1 n=314, study 2 n=98

Low performance,
high anxiety (LMPxHMA):
study 1 n=285, study 2 n=125

Variable

Math performance

Math anxiety

Note. All math performance, anxiety and self-efficacy

tables show pairwise Dunn test comparisons with

Bonferroni correction. Statistics show absolute

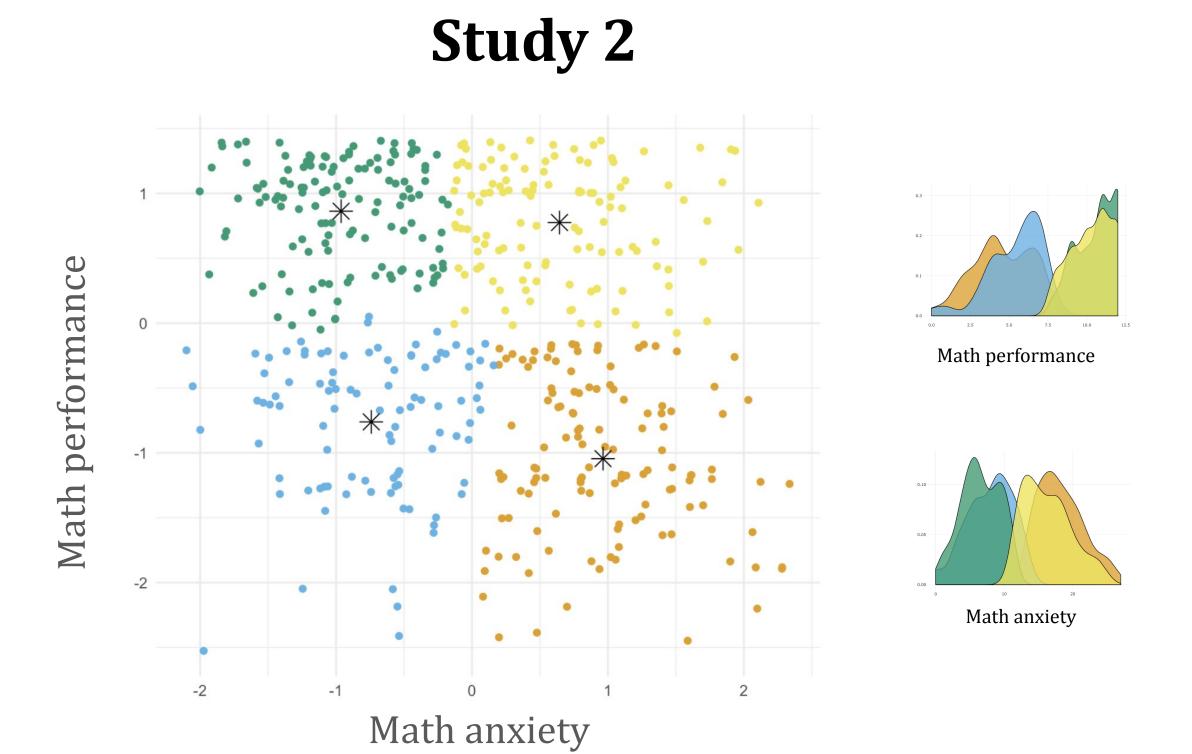
difference, df = 3. \*\*\*

p < .001.

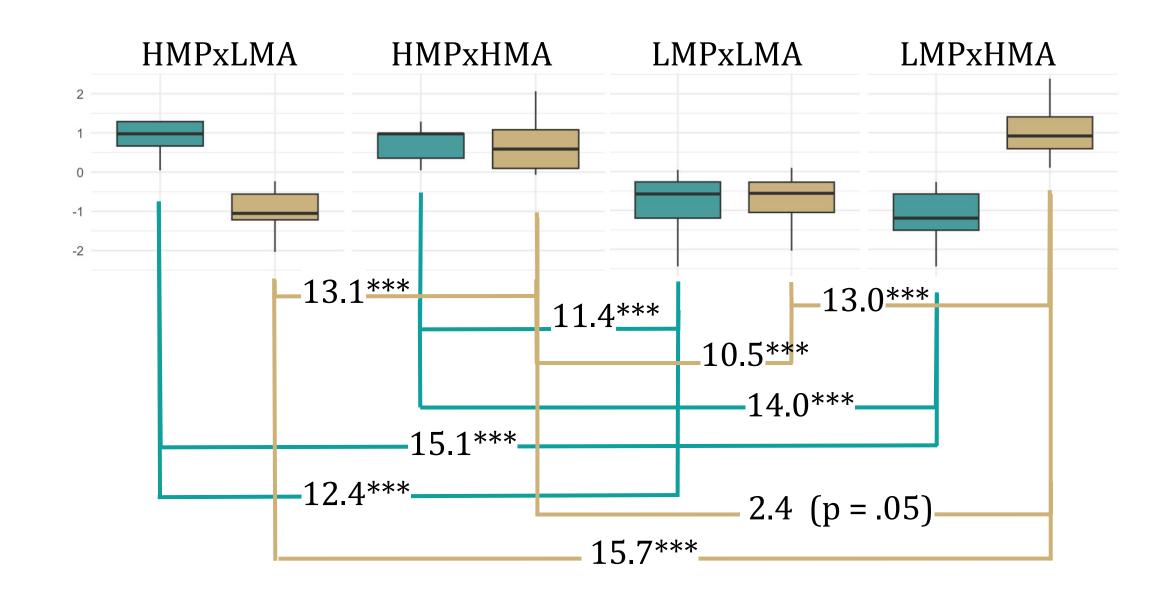
Pearson's correlations (p < .01 for all):

MA and MP: r = -.23 [-.29, -.17], MA and MSE: r = -.56

[-.60, -.52], MP and MSE: r = .35 [.30, .41].



Less significant differences in performance between clusters. Differences in anxiety were similar to study 1.



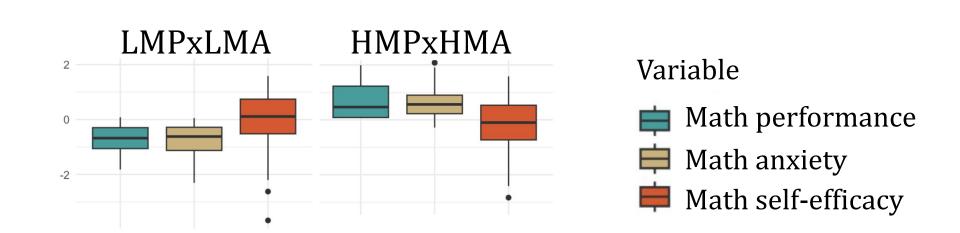
# Results: RQ2

All clusters significantly differed in their self-efficacy.

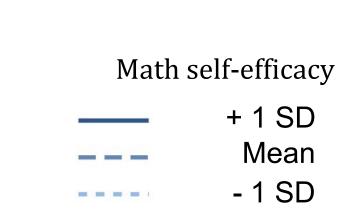
Difference in math self-efficacy (MSE):

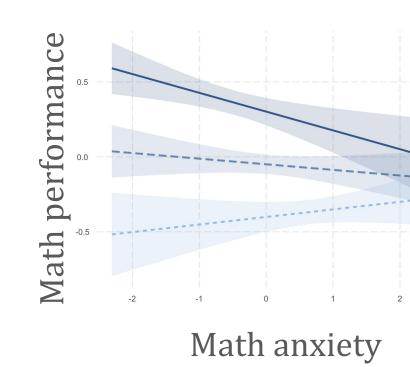
	1		
	HMPxHMA	HMPxLMA	LMPxHMA
HMPxLMA	-9.6***		
LMPxHMA	6.0***	16.0***	_
LMPxLMA	-2.8***	7.7***	-9.6 (p = .003)

Cluster with low performance and low anxiety showed slightly but significantly higher level of math self-efficacy then cluster with high performance and high anxiety:



MSE significantly moderated relationships between MA and MP (p < .01)





#### Conclusions

- Clustering showed the extent to which students tend to deviate from traditional linear perspective on association between math performance (MP) and math anxiety (MA) and two directions of this deviation.
- In about one fourth of students, high MA did not prevent students from showing high levels of MP. However, in Study 1, those students demonstrated significantly lower performance compared to high performing low anxious students supporting the idea that high anxiety can prevent students from performing on the highest level.
- Deviation from reduced competency account theory in another quarter of participants can be associated with their difference in self-efficacy, signaling that students from this cluster could overestimate their math abilities and, thus, not increase in negative feelings around math.
- These findings highlight importance for searching and always accounting for moderation variables when aiming to predict performance from anxiety and vice versa.

# Funding

The research reported here was supported by the Institute of Education Sciences, U.S. Department of Education, through Grant R305A180401 (study 1) and the National Science Foundation, through an ECR Core grant (2300764) to WPI (study 2).

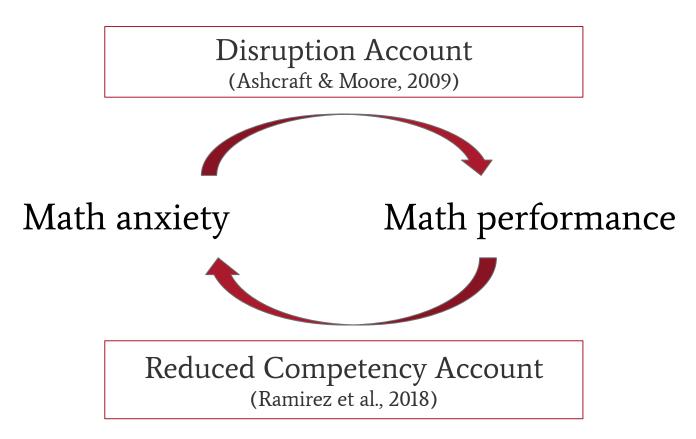




Alena Egorova, Stacy T. Shaw, Ji-Eun Lee, Erin Ottmar Worcester Polytechnic Institute

# Background & Research Questions

Research shows that anxiety in mathematics negatively correlates with mathematics performance:



Some studies examined potential moderators in these relationships, showing that some highly math anxious students still perform well in mathematics (Ramirez et al., 2018). However, few studies examine how often students diverge from this linear relationships and which other variables can explain potential deviation from reduced competency account theory.

**RQ1** How many groups will emerge if we cluster students based on their math anxiety and performance?

**RQ2** How students from those clusters differ in math anxiety, performance, and self-efficacy?

# Study 1

**Participants.** 1,029 students in 7th grade (typically 13-14-year-olds) from 11 US schools. 47% girls, 50% White, 27% Asian, 16% Hispanic/Latino, 7% Other.

**Methodology**. Online survey administered by teachers during math class across 2020-21 school year. A total of 76% of students attended class in person, others – remotely.

**Math performance measure.** Items adapted from Star et al. (2015): 4 – conceptual understanding in algebra, 3 – procedural knowledge, and 3 – math flexibility (see <a href="osf.io/bafdr">osf.io/bafdr</a>). No feedback was given.

Math anxiety measure. Math Anxiety Scale for Young Children-R (Ganley & McGraw, 2016).

**Math self-efficacy.** Academic Efficacy subscale of the Patterns of Adaptive Learning Scales (Midgley et al., 2000) adapted for math.

# Study 2

**Participants.** 473 6th grade students from 14 US schools. 49% girls, 85% White, 4.9% Multi-racial, 2.7% Black, 2.7% Hispanic/Latino.

**Methodology**. Online survey administered during the math class time across 2023-24 school year. All students participated in person.

Math performance measure: 12 order-of-operations problems (<u>loseph, 2014</u>). No feedback was given.

**Math anxiety measure:** The same as in study 1.

# Approach to clustering analysis

First, we standardized anxiety and performance using z-scores. To chose the number of clusters, we used elbow method and silhouette scores. Then, we applied k-means clustering with 4 centers.

# Results: RQ1

#### Clusters

High performance,

low anxiety (HMPxLMA):
 study 1 n=205, study 2 n=130

High performance,

- high anxiety (HMPxHMA): study 1 *n*=225, study 2 *n*=120 Low performance,
- low anxiety (LMPxLMA):
   study 1 n=314, study 2 n=98

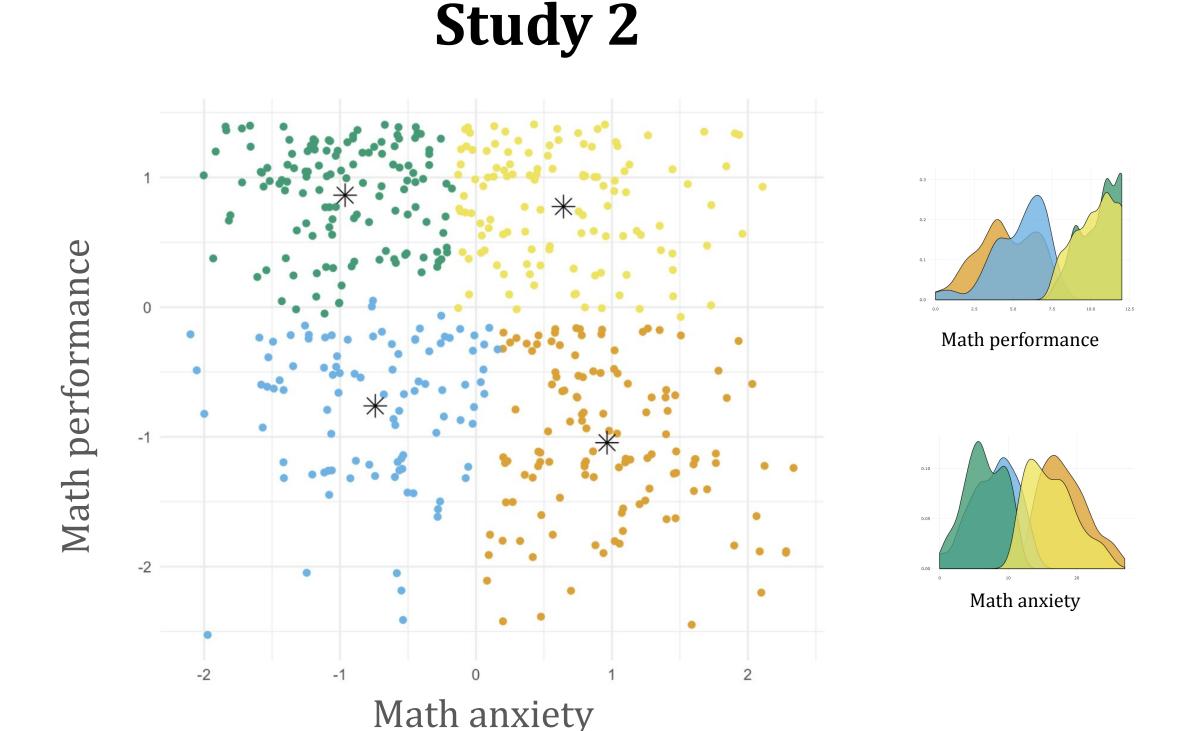
Low performance,

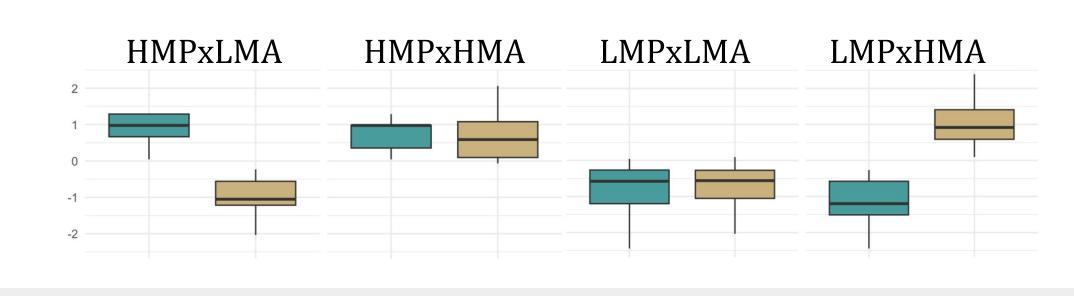
Variable

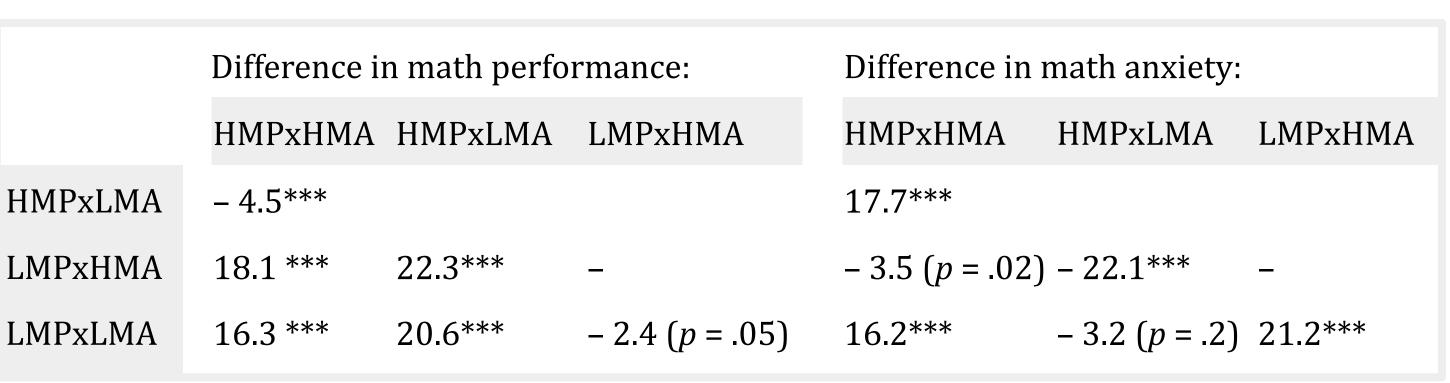
Math performance

Math anxiety

high anxiety (LMPxHMA):
 study 1 n=285, study 2 n=125







Math anxiety

LMPxLMA

**LMPxHMA** 

Study 1

Difference in math performance: Difference in math anxiety: HMPxHMA HMPxLMA LMPxHMA  $-0.9\ (p=1)$   $13.1^{***}$   $-2.4\ (p=.05)-15.7^{***}$  - LMPxLMA  $11.4^{***}$   $12.4^{***}$   $-1.8\ (p=.2)$   $10.5^{***}$   $-1.7\ (p=.3)\ 13.0^{***}$ 

*Note.* All math performance, anxiety and self-efficacy tables show pairwise Dunn test comparisons with Bonferroni correction. Statistics show column mean minus row mean, df = 3. \*\*\* p < .001.

# Results: RQ2

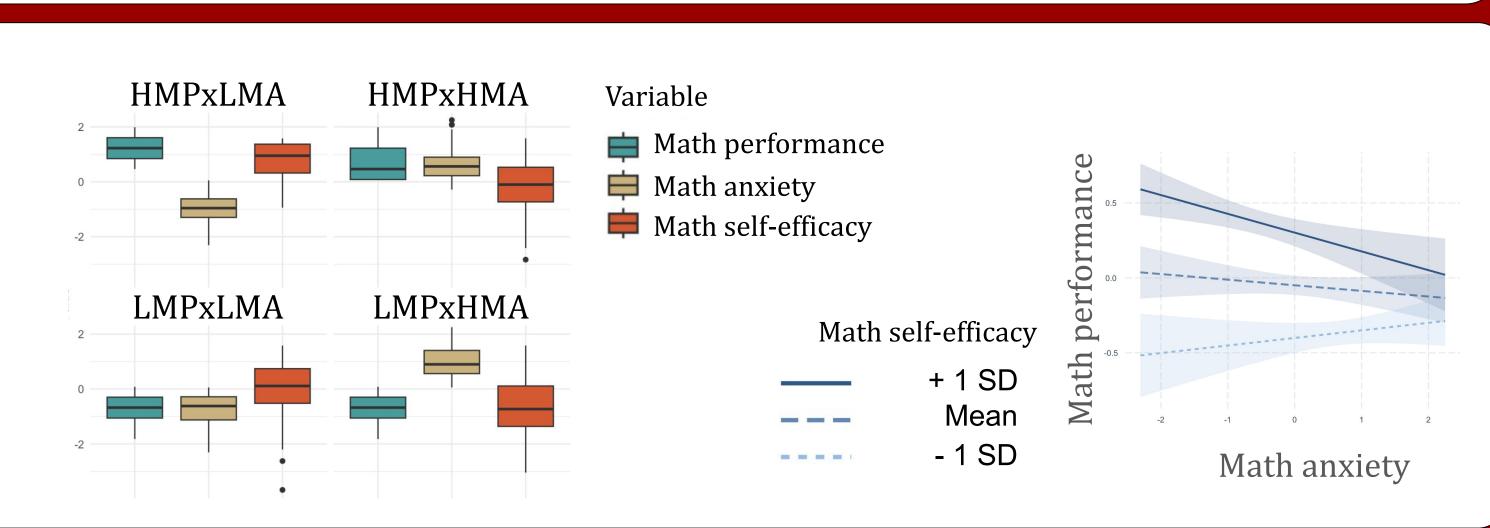
Math performance

Math anxiety

**HMPxLMA** 

**HMPxHMA** 

Correlational matrix			Difference in math self-efficacy:			
	Math perform.	Math anxiety		HMPxHMA	HMPxLMA	LMPxHMA
Math anxiety	23** [29,17]	<del>_</del>	HMPxLMA	-9.6***		
Math	.35**	56**	LMPxHMA	6.0***	16.0***	<del>_</del>
self-effica	cy [.30, .41]	[60,52]	LMPxLMA	-2.8***	7.7***	-9.6 (p = .003)



#### Conclusions

- Clustering showed the extent to which students deviate from traditional linear perspective on association between math performance (MP) and math anxiety (MA) and directions of this deviation.
- About one fourth of students showed high levels of MP and MA. In Study 1, performance of this cluster was significantly lower compared to high performing low anxious students supporting the idea that high anxiety can prevent students from performing on the highest level.
- The LMPxHMA cluster shows relatively low levels of MP and MA not significantly different levels of MA compared to cluster with the highest MP. Moreover, this cluster demonstrated slightly but significantly higher levels of math self-efficacy compared to HMP x HMA students, signaling that students from this cluster could overestimate their math abilities and, thus, not increase in negative feelings around math.
- These findings highlight importance for searching and always accounting for moderation variables when aiming to predict performance from anxiety and vice versa.

# Funding

The research reported here was supported by the Institute of Education Sciences, U.S.
Department of Education, through Grant R305A180401 (study 1) and the National Science Foundation, through an ECR Core grant (2300764) to WPI (study 2).

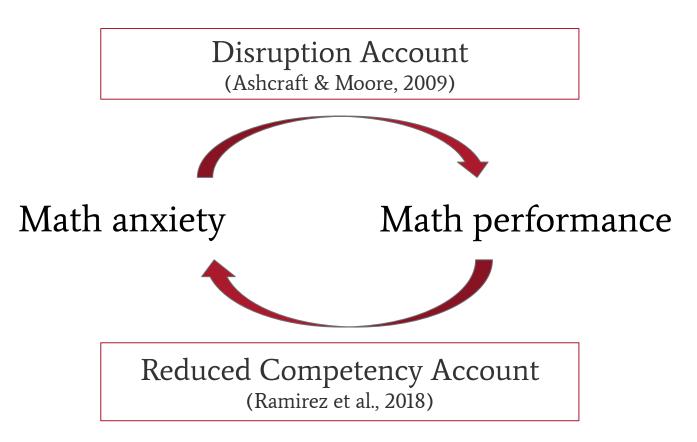




Alena Egorova, Stacy T. Shaw, Ji-Eun Lee, Erin Ottmar Worcester Polytechnic Institute

# Background & Research Questions

Research shows that anxiety in mathematics negatively correlates with mathematics performance:



Some studies examined potential moderators in these relationships, showing that some highly math anxious students still perform well in mathematics (Ramirez et al., 2018). However, few studies examine how often students diverge from this linear relationships and which other variables can explain potential deviation from reduced competency account theory.

**RQ1** How many groups will emerge if we cluster students based on their math anxiety and performance?

**RQ2** How students from those clusters differ in math anxiety, performance, and self-efficacy?

# Study 1

**Participants.** 1,029 students in 7th grade (typically 13-14-year-olds) from 11 US schools. 47% girls, 50% White, 27% Asian, 16% Hispanic/Latino, 7% Other.

**Methodology**. Online survey administered by teachers during math class across 2020-21 school year. A total of 76% of students attended class in person, others – remotely.

**Math performance measure.** Items adapted from Star et al. (2015): 4 – conceptual understanding in algebra, 3 – procedural knowledge, and 3 – math flexibility (see <a href="osf.io/bafdr">osf.io/bafdr</a>). No feedback was given.

Math anxiety measure. Math Anxiety Scale for Young Children-R (Ganley & McGraw, 2016).

**Math self-efficacy.** Academic Efficacy subscale of the Patterns of Adaptive Learning Scales (Midgley et al., 2000) adapted for math.

# Study 2

**Participants.** 473 6th grade students from 14 US schools. 49% girls, 85% White, 4.9% Multi-racial, 2.7% Black, 2.7% Hispanic/Latino.

**Methodology**. Online survey administered during the math class time across 2023-24 school year. All students participated in person.

Math performance measure: 12 order-of-operations problems (<u>Ioseph, 2014</u>). No feedback was given.

**Math anxiety measure:** The same as in study 1.

# Approach to clustering analysis

First, we standardized anxiety and performance using z-scores. To chose the number of clusters, we used elbow method and silhouette scores. Then, we applied k-means clustering with 4 centers.

# Results: RQ1

#### Clusters

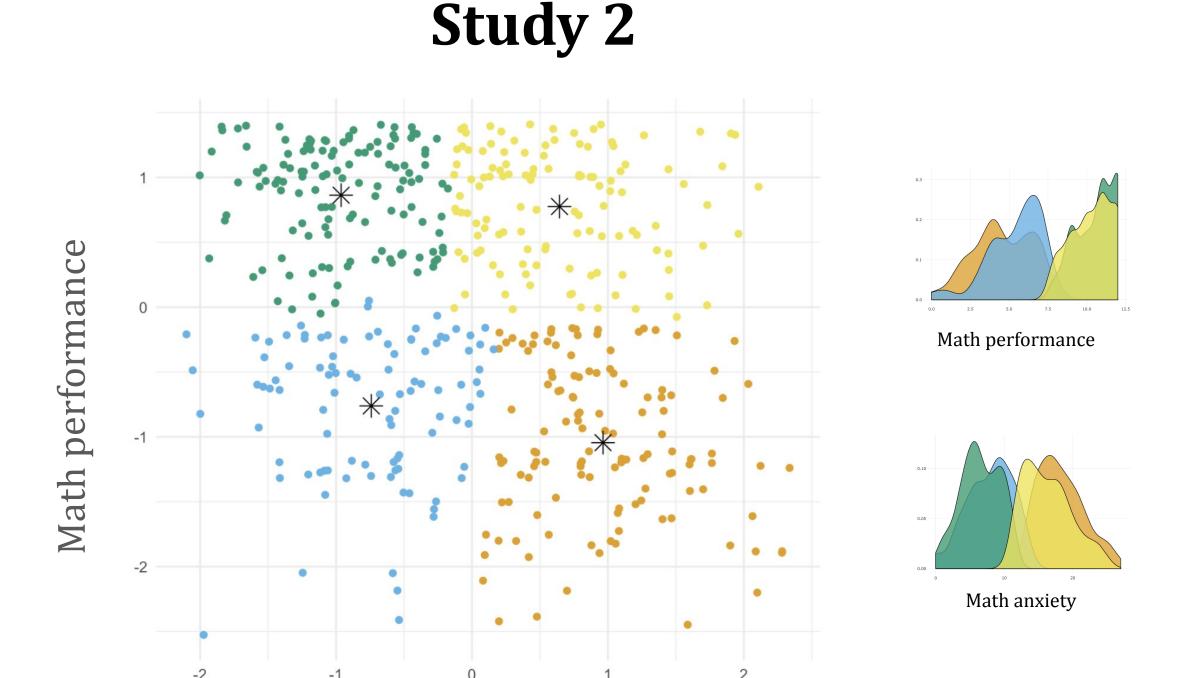
High performance,

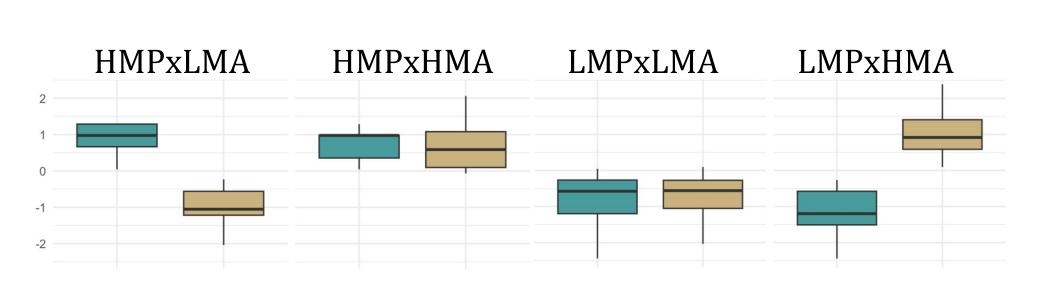
- low anxiety (HMPxLMA):
   study 1 n=205, study 2 n=130
- High performance,
- high anxiety (HMPxHMA): study 1 *n*=225, study 2 *n*=120 Low performance,
- low anxiety (LMPxLMA):
   study 1 n=314, study 2 n=98
- Low performance,
- high anxiety (LMPxHMA):
   study 1 n=285, study 2 n=125

Math performance

Math anxiety

Variable





Math anxiety

Difference in math performance (MP):

HMPxHMA HMPxLMA LMPxHMA HMPxLMA LMPxHMA HMPxLMA LMPxHMA

HMPxLMA  $-4.5^{***}$  17.7\*\*\*

LMPxHMA  $18.1^{***}$  22.3\*\*\* - -3.5 (p = .02)  $-22.1^{***}$  - LMPxLMA  $16.3^{***}$  20.6\*\*\* -2.4 (p = .05)  $16.2^{***}$  -3.2 (p = .2) 21.2\*\*\*

Math anxiety

LMPxLMA

**LMPxHMA** 

Study 1

Difference in math performance (MP): Difference in math anxiety (MA): HMPxHMA HMPxLMA LMPxHMA HMPxLMA LMPxHMA HMPxLMA LMPxHMA HMPxLMA LMPxHMA  $-0.9\ (p=1)$  13.1\*\*\*

LMPxHMA 14.0\*\*\* 15.1\*\*\* -  $-2.4\ (p=.05)-15.7***$  - LMPxLMA 11.4\*\*\* 12.4\*\*\*  $-1.8\ (p=.2)$  10.5\*\*\*  $-1.7\ (p=.3)\ 13.0***$ 

Note. All math performance, anxiety and self-efficacy tables show pairwise Dunn test comparisons with Bonferroni correction. Statistics show column mean minus row mean, df = 3. \*\*\* p < .001.

# Results: RQ2

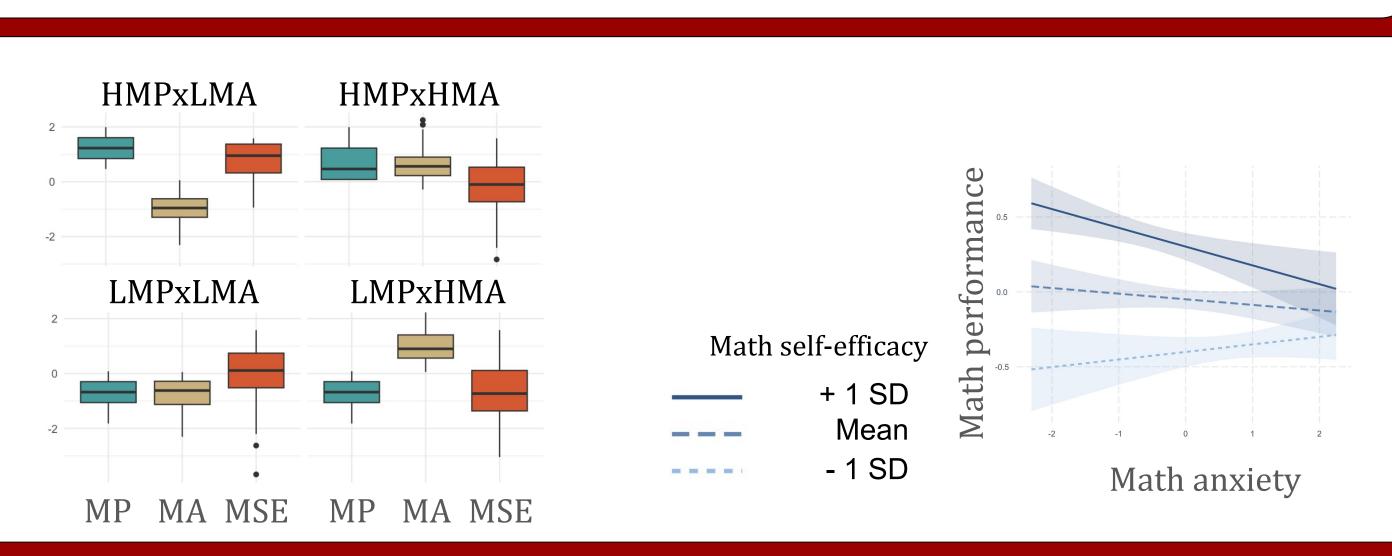
Math performance

Math anxiety

**HMPxLMA** 

**HMPxHMA** 

Correlational matrix			Difference in math self-efficacy (MSE):			
	Math perform	. Math anxiety		HMPxHMA	HMPxLMA	LMPxHMA
Math anxiety	23** [29,17]	_	HMPxLMA	-9.6***		
Math	.35**	56**	LMPxHMA	6.0***	16.0***	_
self-effica	cy [.30, .41]	[60,52]	LMPxLMA	-2.8***	7.7***	-9.6 (p = .003)



#### Conclusions

- Clustering showed the extent to which students deviate from traditional linear perspective on association between math performance (MP) and math anxiety (MA) and directions of this deviation.
- About one fourth of students showed high levels of MP and MA. In Study 1, performance of this cluster was significantly lower compared to high performing low anxious students supporting the idea that high anxiety can prevent students from performing on the highest level.
- The LMPxHMA cluster shows relatively low levels of MP and MA not significantly different levels of MA compared to cluster with the highest MP. Moreover, this cluster demonstrated slightly but significantly higher levels of math self-efficacy compared to HMP x HMA students, signaling that students from this cluster could overestimate their math abilities and, thus, not increase in negative feelings around math.
- These findings highlight importance for searching and always accounting for moderation variables when aiming to predict performance from anxiety and vice versa.

# Funding

The research reported here was supported by the Institute of Education Sciences, U.S.
Department of Education, through Grant R305A180401 (study 1) and the National Science Foundation, through an ECR Core grant (2300764) to WPI (study 2).

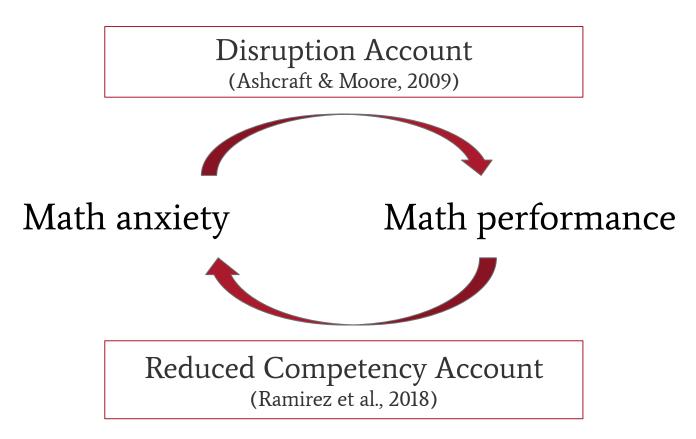




Alena Egorova, Stacy T. Shaw, Ji-Eun Lee, Erin Ottmar Worcester Polytechnic Institute

# Background & Research Questions

Research shows that anxiety in mathematics negatively correlates with mathematics performance:



Some studies examined potential moderators in these relationships, showing that some highly math anxious students still perform well in mathematics (Ramirez et al., 2018). However, few studies examine how often students diverge from this linear relationships and which other variables can explain potential deviation from reduced competency account theory.

**RQ1** How many groups will emerge if we cluster students based on their math anxiety and performance?

**RQ2** How students from those clusters differ in math anxiety, performance, and self-efficacy?

# Study 1

**Participants.** 1,029 students in 7th grade (typically 13-14-year-olds) from 11 US schools. 47% girls, 50% White, 27% Asian, 16% Hispanic/Latino, 7% Other.

**Methodology**. Online survey administered by teachers during math class across 2020-21 school year. A total of 76% of students attended class in person, others – remotely.

**Math performance measure.** Items adapted from Star et al. (2015): 4 – conceptual understanding in algebra, 3 – procedural knowledge, and 3 – math flexibility (see <a href="osf.io/bafdr">osf.io/bafdr</a>). No feedback was given.

Math anxiety measure. Math Anxiety Scale for Young Children-R (Ganley & McGraw, 2016).

**Math self-efficacy.** Academic Efficacy subscale of the Patterns of Adaptive Learning Scales (Midgley et al., 2000) adapted for math.

# Study 2

**Participants.** 473 6th grade students from 14 US schools. 49% girls, 85% White, 4.9% Multi-racial, 2.7% Black, 2.7% Hispanic/Latino.

**Methodology**. Online survey administered during the math class time across 2023-24 school year. All students participated in person.

Math performance measure: 12 order-of-operations problems (<u>Ioseph, 2014</u>). No feedback was given.

**Math anxiety measure:** The same as in study 1.

# Approach to clustering analysis

First, we standardized anxiety and performance using z-scores. To chose the number of clusters, we used elbow method and silhouette scores. Then, we applied k-means clustering with 4 centers.

# Results: RQ1

#### Clusters

High performance,

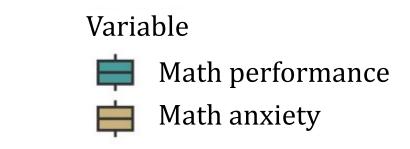
low anxiety (HMPxLMA):
 study 1 n=205, study 2 n=130

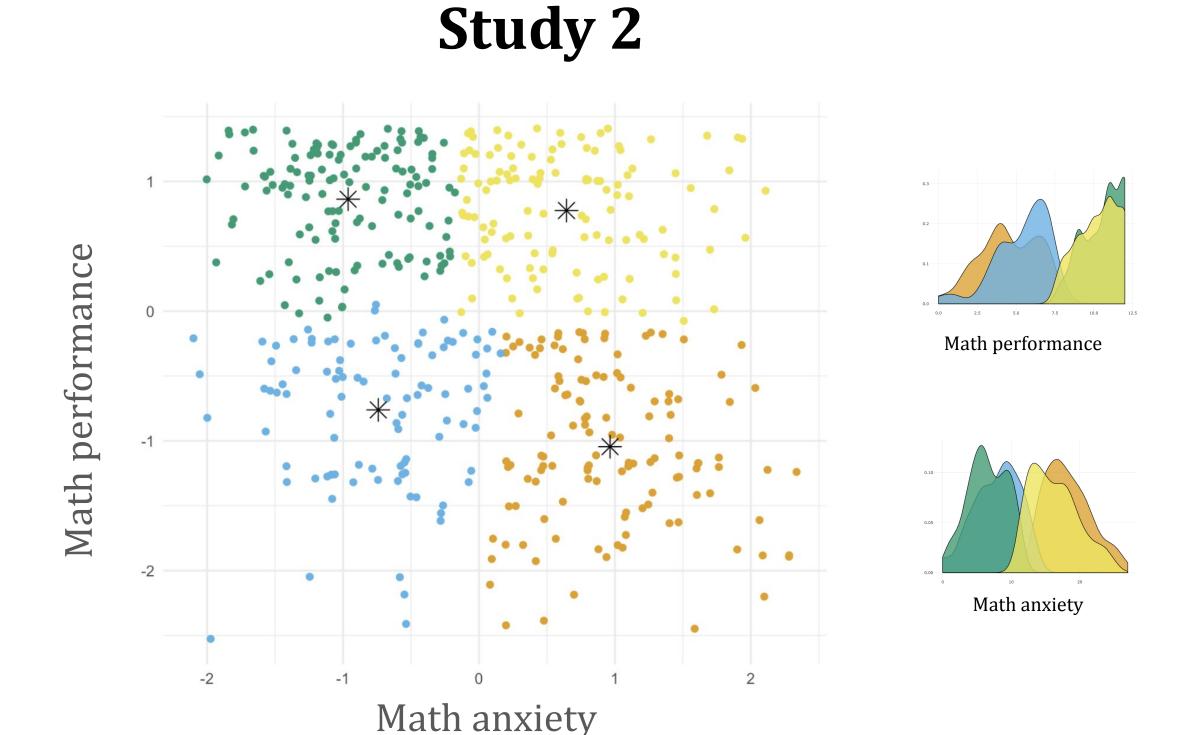
High performance, high anxiety (HMPxHMA): study 1 n=225, study 2 n=120

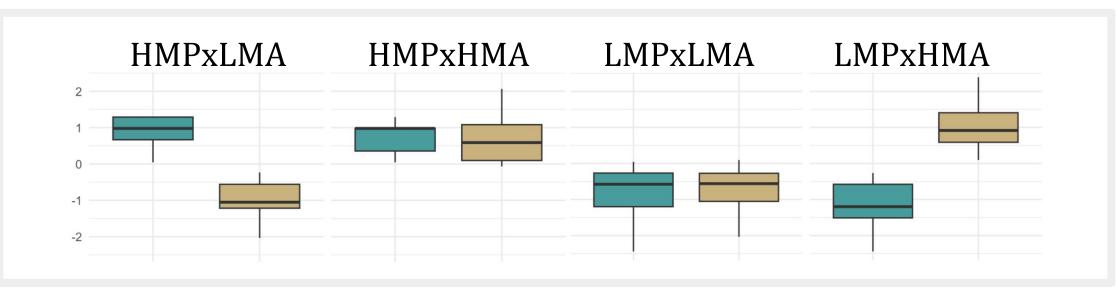
Low performance,
 low anxiety (LMPxLMA):
 study 1 n=314, study 2 n=98

Low performance,

high anxiety (LMPxHMA):
 study 1 n=285, study 2 n=125







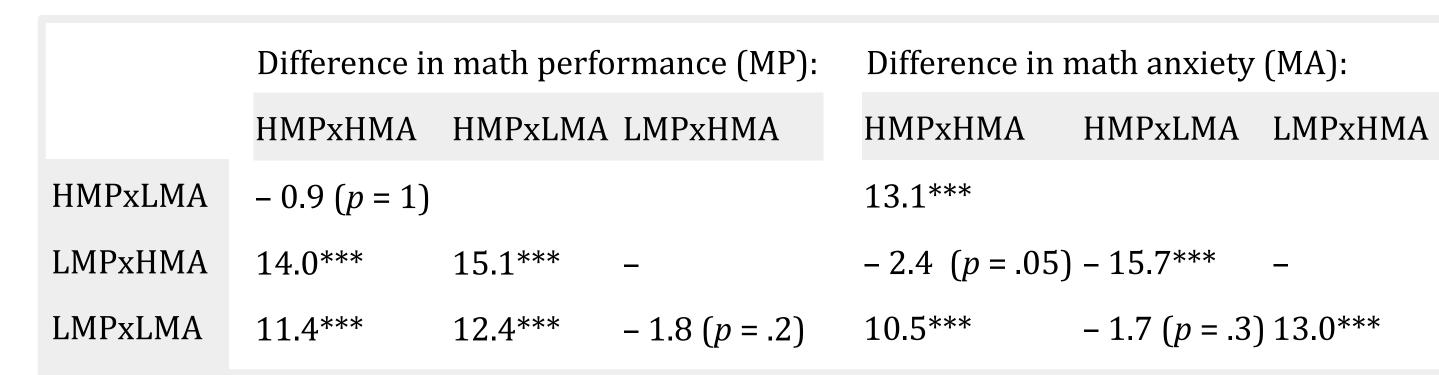
	Difference in math performance (MP):			Difference in math anxiety (MA):		
	HMPxHMA	HMPxLMA	LMPxHMA	HMPxHMA	HMPxLMA	LMPxHMA
HMPxLMA	<b>- 4.5</b> ***			17.7***		
LMPxHMA	18.1 ***	22.3***	_	-3.5 (p = .02)	- 22.1***	_
LMPxLMA	16.3 ***	20.6***	-2.4 (p = .05)	16.2***	-3.2 (p = .2)	21.2***

Math anxiety

LMPxLMA

LMPxHMA

Study 1



Note. All math performance, anxiety and self-efficacy tables show pairwise Dunn test comparisons with Bonferroni correction. Statistics show column mean minus row mean, df = 3. \*\*\* p < .001.

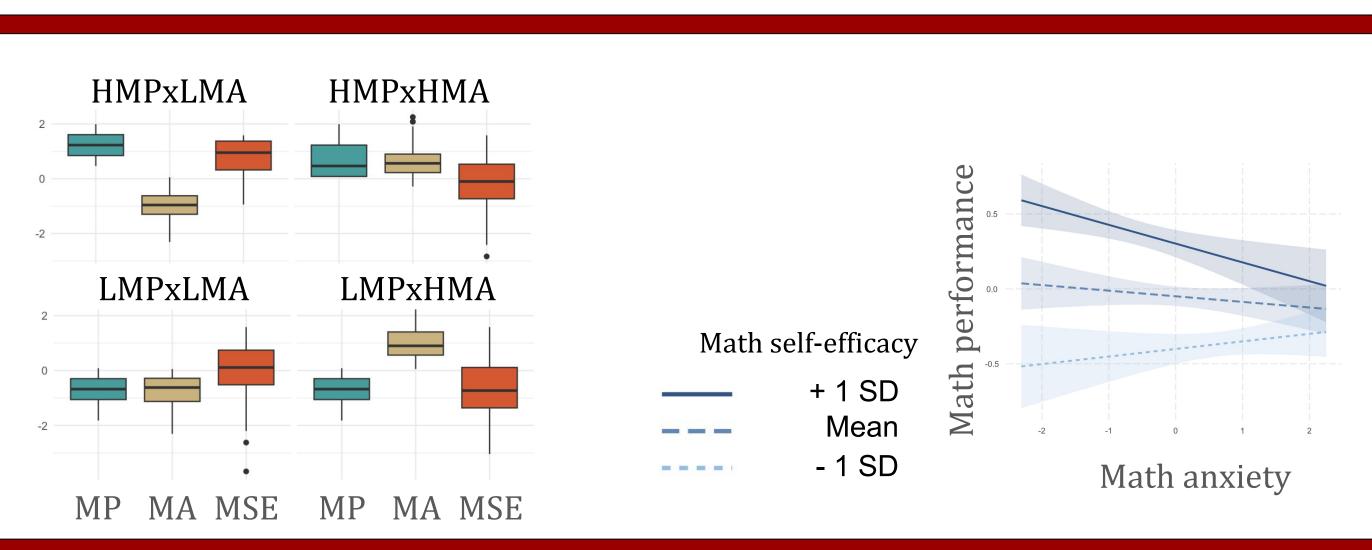
# Results: RQ2

Math performance

**HMPxLMA** 

**HMPxHMA** 

Correlational matrix			Difference in math self-efficacy (MSE):			
	Math perforn	n. Math anxiety		HMPxHMA	HMPxLMA	LMPxHMA
Math anxiety	23** [29,17]	_	HMPxLMA	-9.6***		
Math	.35**	56**	LMPxHMA	6.0***	16.0***	_
self-effica	cy [.30, .41]	[60,52]	LMPxLMA	-2.8***	7.7***	-9.6 (p = .003)



# Conclusions

- Clustering showed the extent to which students deviate from traditional linear perspective on association between math performance (MP) and math anxiety (MA) and directions of this deviation.
- About one fourth of students showed high levels of MP and MA. In Study 1, performance of this cluster was significantly lower compared to high performing low anxious students supporting the idea that high anxiety can prevent students from performing on the highest level.
- The LMPxHMA cluster shows relatively low levels of MP and MA not significantly different levels of MA compared to cluster with the highest MP. Moreover, this cluster demonstrated slightly but significantly higher levels of math self-efficacy compared to HMP x HMA students, signaling that students from this cluster could overestimate their math abilities and, thus, not increase in negative feelings around math.
- These findings highlight importance for searching and always accounting for moderation variables when aiming to predict performance from anxiety and vice versa.

# Funding

The research reported here was supported by the Institute of Education Sciences, U.S.
Department of Education, through Grant R305A180401 (study 1) and the National Science Foundation, through an ECR Core grant (2300764) to WPI (study 2).

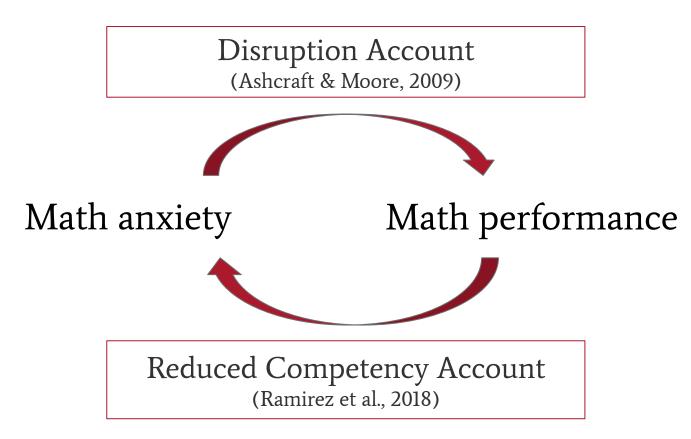




Alena Egorova, Stacy T. Shaw, Ji-Eun Lee, Erin Ottmar Worcester Polytechnic Institute

# Background & Research Questions

Research shows that anxiety in mathematics negatively correlates with mathematics performance:



Some studies examined potential moderators in these relationships, showing that some highly math anxious students still perform well in mathematics (Ramirez et al., 2018). However, few studies examine how often students diverge from this linear relationships and which other variables can explain potential deviation from reduced competency account theory.

**RQ1** How many groups will emerge if we cluster students based on their math anxiety and performance?

**RQ2** How students from those clusters differ in math anxiety, performance, and self-efficacy?

# Study 1

**Participants.** 1,029 students in 7th grade (typically 13-14-year-olds) from 11 US schools. 47% girls, 50% White, 27% Asian, 16% Hispanic/Latino, 7% Other.

**Methodology**. Online survey administered by teachers during math class across 2020-21 school year. A total of 76% of students attended class in person, others – remotely.

**Math performance measure.** Items adapted from Star et al. (2015): 4 – conceptual understanding in algebra, 3 – procedural knowledge, and 3 – math flexibility (see <a href="mailto:osf.io/bafdr">osf.io/bafdr</a>). No feedback was given.

Math anxiety measure. Math Anxiety Scale for Young Children-R (Ganley & McGraw, 2016).

**Math self-efficacy.** Academic Efficacy subscale of the Patterns of Adaptive Learning Scales (Midgley et al., 2000) adapted for math.

# Study 2

**Participants.** 473 6th grade students from 14 US schools. 49% girls, 85% White, 4.9% Multi-racial, 2.7% Black, 2.7% Hispanic/Latino.

**Methodology**. Online survey administered during the math class time across 2023-24 school year. All students participated in person.

Math performance measure: 12 order-of-operations problems (<u>Ioseph, 2014</u>). No feedback was given.

**Math anxiety measure:** The same as in study 1.

# Approach to clustering analysis

First, we standardized anxiety and performance using z-scores. To chose the number of clusters, we used elbow method and silhouette scores. Then, we applied k-means clustering with 4 centers.

# Results: RQ1 Study 1

# n = 225 Clusters

**LMPxHMA** 

Difference in math anxiety:

-3.5(p = .02) - 22.1\*\*\*

**HMPxHMA** 

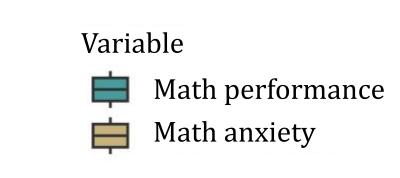
17.7\*\*\*

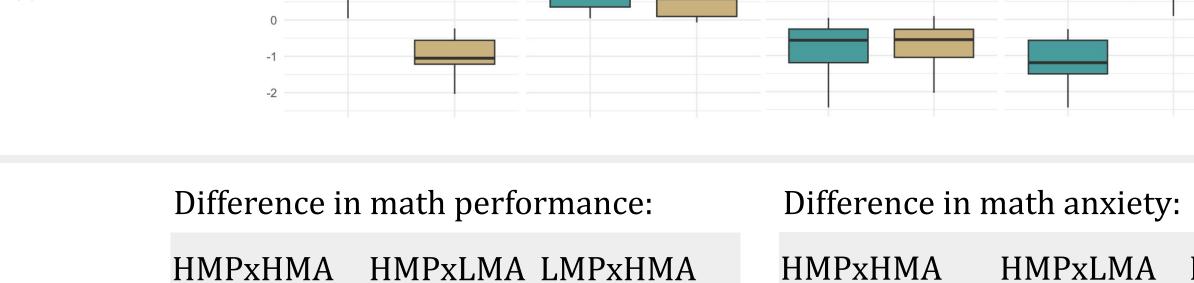
16.2\*\*\*

- High performance, low anxiety (HMPxLMA)
- High performance, high anxiety (HMPxHMA)
- Low performance, low anxiety (LMPxLMA)
- Low performance, high anxiety (LMPxHMA)

# n = 130 math anxiety n = 120 Math anxiety n = 125

Study 2





**HMPxHMA** 

**HMPxLMA** 

Difference in math performance P(p) HMPxLMA HMPxLMA P(p) HMPx

LMPxHMA HMPxLMA LMPxHMA  $13.1^{***}$   $- 2.4 (p = .05) - 15.7^{***} -$   $- 1.8 (p = .2) 10.5^{***} - 1.7 (p = .3) 13.0^{***}$ 

LMPxHMA

Note. All math performance, anxiety and self-efficacy tables show pairwise Dunn test comparisons with Bonferroni correction. Statistics show column mean minus row mean, df = 3. \*\*\* p < .001.

-3.2 (p = .2) 21.2\*\*\*

HMPxLMA LMPxHMA

# Results: RQ2

**HMPxLMA** 

**- 4.5**\*\*\*

**HMPxLMA** 

LMPxHMA

LMPxLMA

**HMPxHMA** 

Difference in math performance:

20.6\*\*\*

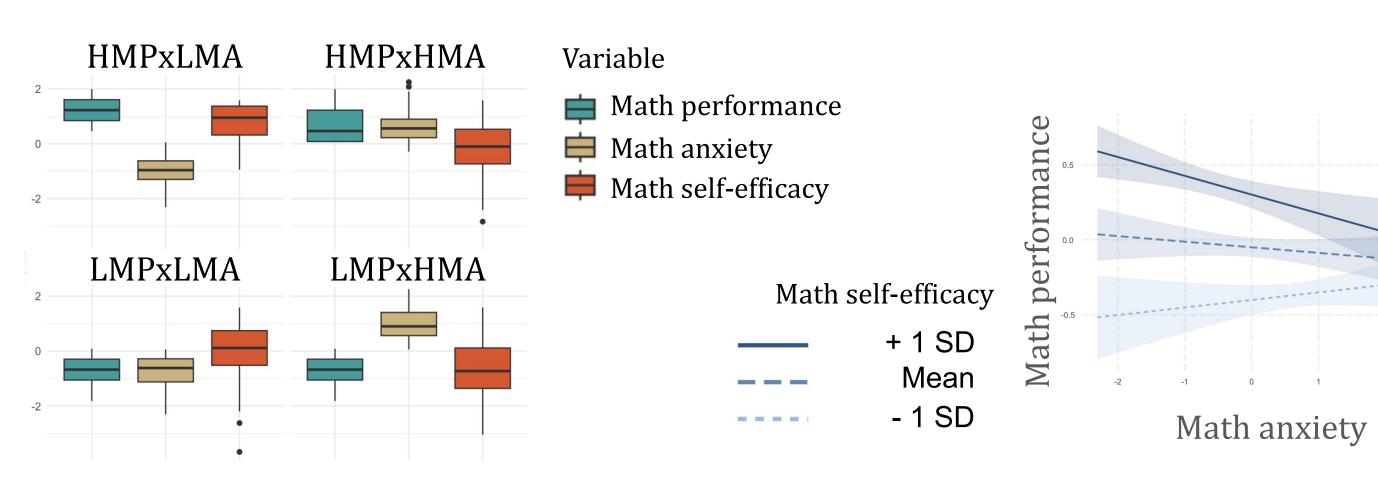
HMPxHMA HMPxLMA LMPxHMA

Correlational matrix			Difference in math self-efficacy:			
	Math perform	. Math anxiety		HMPxHMA	HMPxLMA	LMPxHMA
Math anxiety	23** [29,17]	<del></del>	HMPxLMA	-9.6***		
Math	.35**	56**	LMPxHMA	6.0***	16.0***	_
self-efficac		[60,52]	LMPxLMA	-2.8***	7.7***	-9.6 (p = .003)

Math anxiety

LMPxLMA

-2.4 (p = .05)



# Funding

The research reported here was supported by the Institute of Education Sciences, U.S.
Department of Education, through Grant R305A180401 (study 1) and the National Science Foundation, through an ECR Core grant (2300764) to WPI (study 2).

This poster, code analysis and more details



### Conclusions

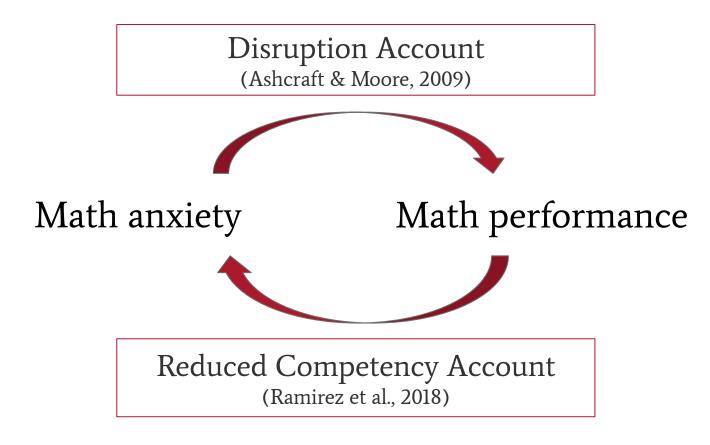
- Clustering showed the extent to which students deviate from traditional linear perspective on association between math performance (MP) and math anxiety (MA) and directions of this deviation.
- About one fourth of students showed high levels of MP and MA. In Study 1, performance of this cluster was significantly lower compared to high performing low anxious students supporting the idea that high anxiety can prevent students from performing at the highest level.
- The LMPxHMA cluster shows relatively low levels of MP and MA not significantly different levels of MA compared to cluster with the highest MP. Moreover, this cluster demonstrated slightly but significantly higher levels of math self-efficacy compared to HMP x HMA students, signaling that students from this cluster could overestimate their math abilities and, thus, not increase in negative feelings around math.
- These findings highlight importance for searching and always accounting for moderation variables when aiming to predict performance from anxiety and vice versa.



Alena Egorova, Stacy T. Shaw, Ji-Eun Lee, Erin Ottmar Worcester Polytechnic Institute

# Background & Research Questions

Research shows that anxiety in mathematics negatively correlates with mathematics performance:



Some studies examined potential moderators in these relationships, showing that some highly math anxious students still perform well in mathematics (Ramirez et al., 2018). However, few studies examine how often students diverge from this linear relationships and which other variables can explain potential deviation from reduced competency account theory.

**RQ1** How many groups will emerge if we cluster students based on their math anxiety and performance?

**RQ2** How students from those clusters differ in math anxiety, performance, and self-efficacy?

# Study 1

**Participants.** 1,029 students in 7th grade (typically 13-14-year-olds) from 11 US schools. 47% girls, 50% White, 27% Asian, 16% Hispanic/Latino, 7% Other.

**Methodology**. Online survey administered by teachers during math class across 2020-21 school year. A total of 76% of students attended class in person, others – remotely.

**Math performance.** Items adapted from Star et al. (2015): 4 – conceptual understanding in algebra, 3 – procedural knowledge, and 3 – math flexibility (see <u>osf.io/bafdr</u>). No feedback was given.

Math anxiety. Math Anxiety Scale for Young Children-R (Ganley & McGraw, 2016).

**Math self-efficacy.** Academic Efficacy subscale of the Patterns of Adaptive Learning Scales (Midgley et al., 2000) adapted for math.

# Study 2

**Participants.** 473 6th grade students from 14 US schools. 49% girls, 85% White, 5% Multi-racial, 3% Black, 3% Hispanic/Latino.

**Methodology**. Online survey administered during the math class time across 2023-24 school year. All students were in person.

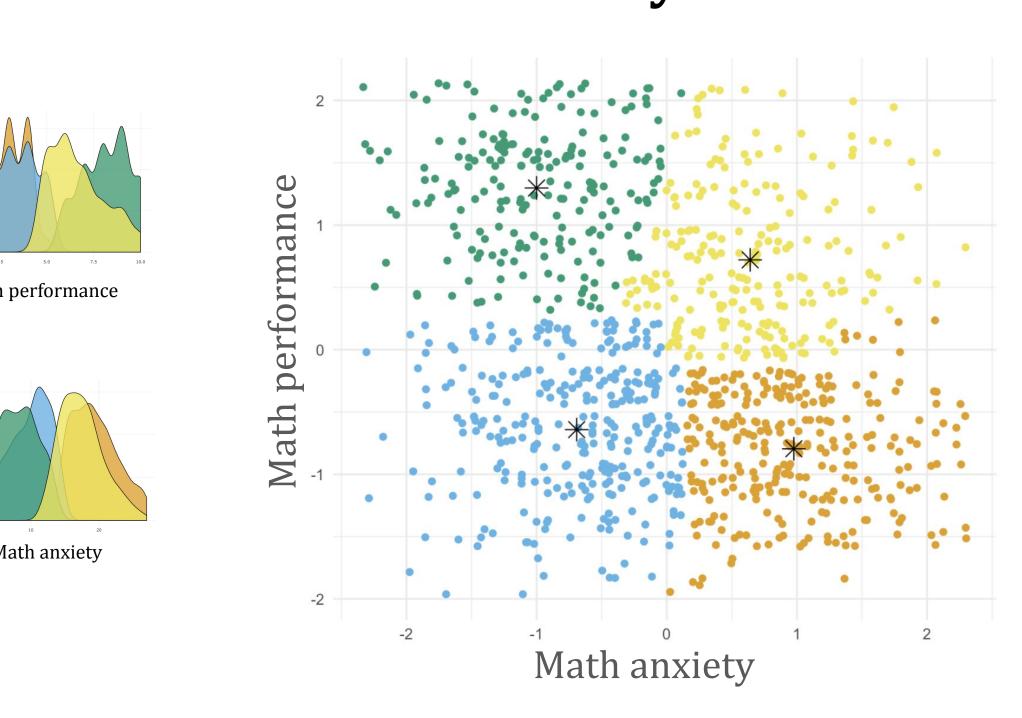
Math performance. 12 order-of-operations problems (<u>Joseph</u>, <u>2014</u>). No feedback was given.

Math anxiety measure. The same as in study 1.

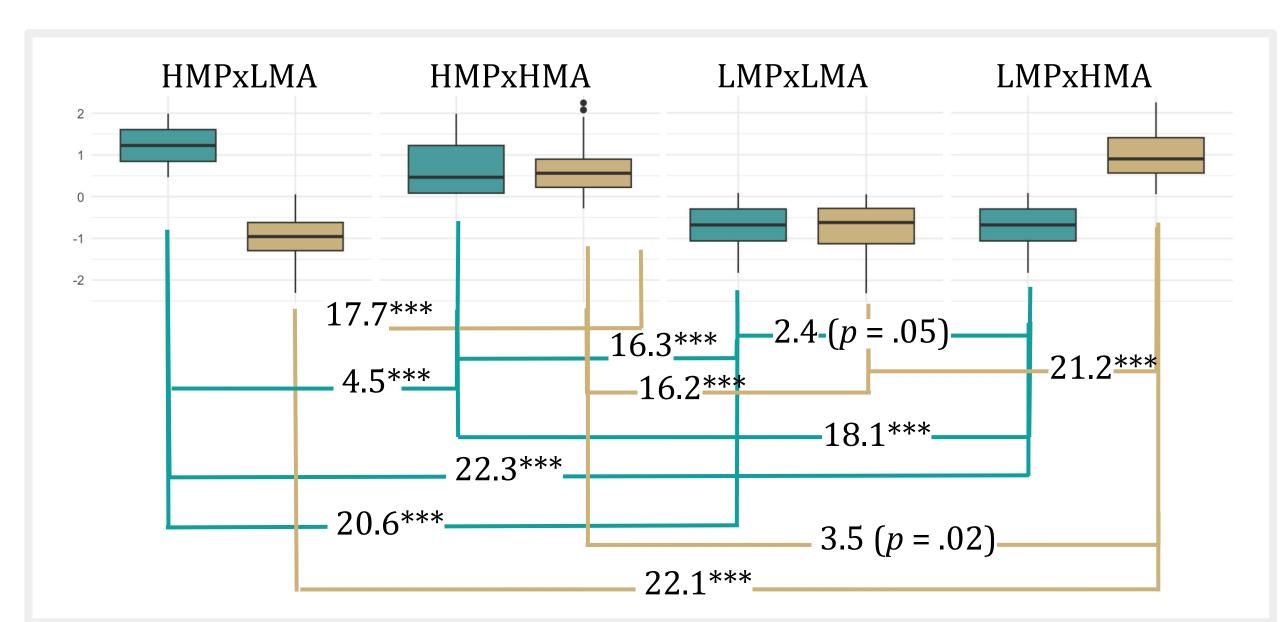
# Approach to clustering analysis

First, we standardized values using z-scores. To chose the number of clusters, we used elbow method and silhouette scores. We applied k-means for clustering.

# Study 1



All clusters significantly differed in performance.
Only low anxious clusters did not significantly differed in anxiety.



# Results: RQ1

# Both studies showed 4 distinct clusters:

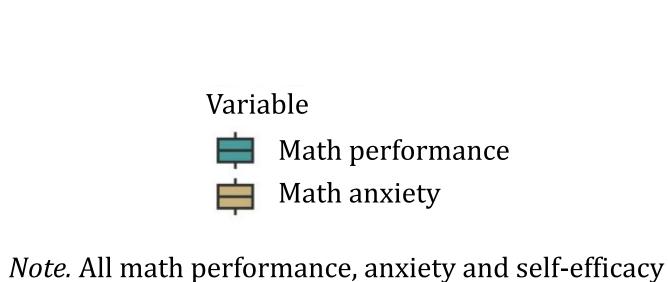
High performance, low anxiety (HMPxLMA): study 1 n=205, study 2 n=130

High performance,

- high anxiety (HMPxHMA): study 1 *n*=225, study 2 *n*=120 Low performance,
- low anxiety (LMPxLMA):
   study 1 n=314, study 2 n=98

Low performance,high anxiety (LMPxHMA):

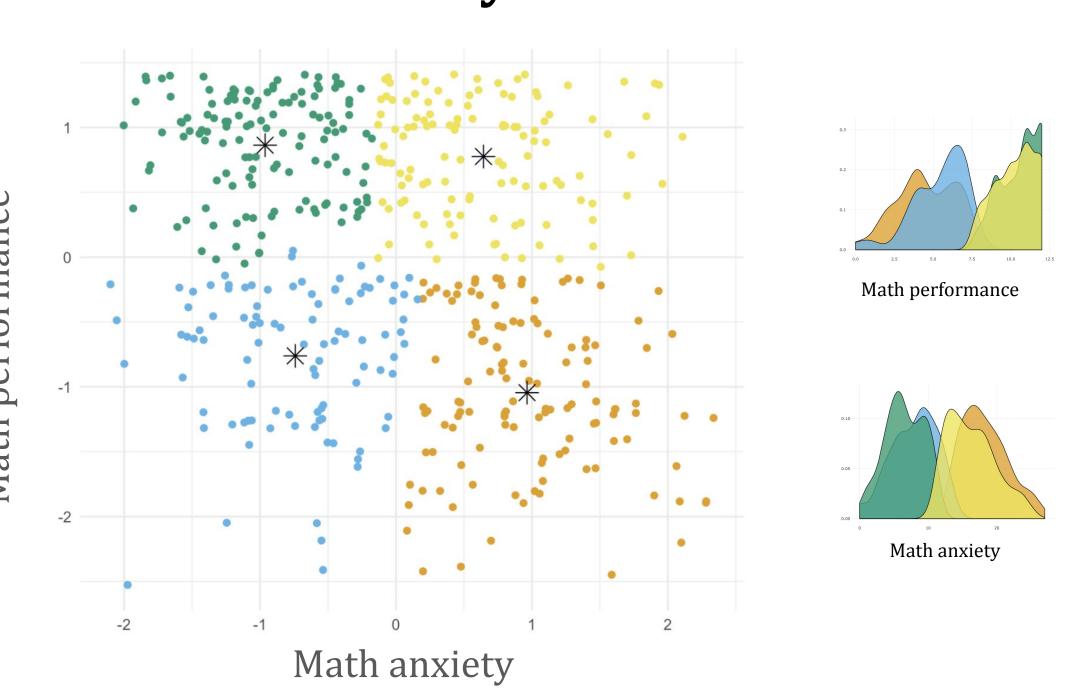
study 1 *n*=285, study 2 *n*=125



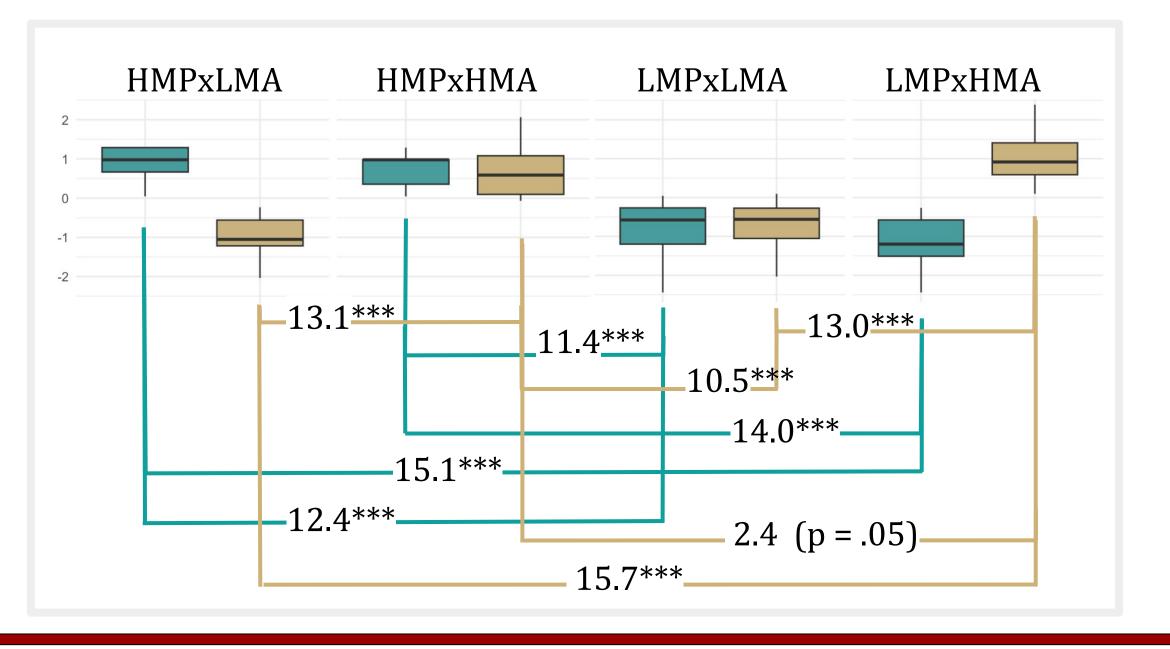
tables show pairwise Dunn test comparisons with Bonferroni correction. Statistics show absolute difference, df = 3. \*\*\* p < .001.

Pearson's correlations (p < .01 for all): MA and MP: r = -.23 [-.29, -.17], MA and MSE: r = -.56 [-.60, -.52], MP and MSE: r = .35 [.30, .41].

# Study 2



Less significant differences in performance between clusters. Differences in anxiety were similar to study 1.



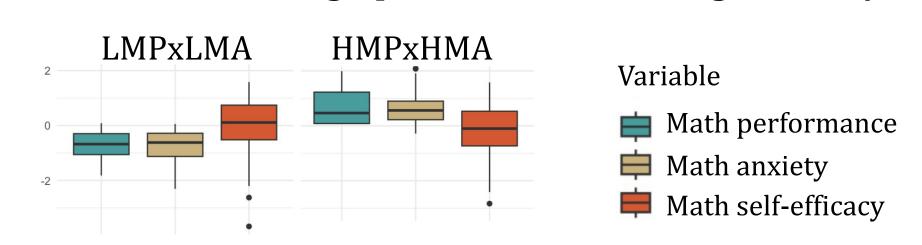
# Results: RQ2

All clusters significantly differed in their self-efficacy.

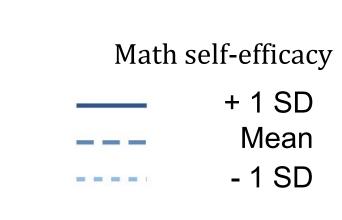
Difference in math self-efficacy (MSE):

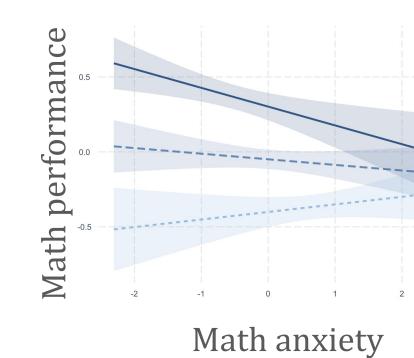
	HMPxHMA	HMPxLMA	LMPxHMA
HMPxLMA	-9.6***		
LMPxHMA	6.0***	16.0***	_
LMPxLMA	-2.8***	7.7***	-9.6 (p = .003)

Cluster with low performance and low anxiety showed slightly but significantly higher level of math self-efficacy then cluster with high performance and high anxiety:



MSE significantly moderated relationships between MA and MP (p < .01)





### Conclusions

- Clustering showed the extent to which students deviate from traditional linear perspective on association between math performance (MP) and math anxiety (MA) and directions of this deviation.
- In about one fourth of students, high MA did not prevent students from showing high levels of MP. However, in Study 1, those students demonstrated significantly lower performance compared to high performing low anxious students supporting the idea that high anxiety can prevent students from performing on the highest level.
- Deviation from reduced competency account theory in another quarter of participants can be associated with their difference in self-efficacy, signaling that students from this cluster could overestimate their math abilities and, thus, not increase in negative feelings around math.
- These findings highlight importance for searching and always accounting for moderation variables when aiming to predict performance from anxiety and vice versa.

# Funding

The research reported here was supported by the Institute of Education Sciences, U.S. Department of Education, through Grant R305A180401 (study 1) and the National Science Foundation, through an ECR Core grant (2300764) to WPI (study 2).



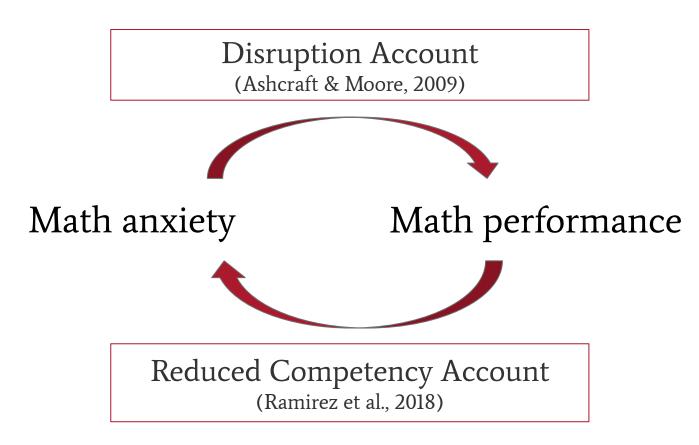
# old options



Alena Egorova, Stacy T. Shaw, Ji-Eun Lee, Erin Ottmar Worcester Polytechnic Institute

# Background & Research Questions

Research shows that anxiety in mathematics negatively correlates with mathematics performance:



Some studies examined potential moderators in these relationships, showing that some highly math anxious students still perform well in mathematics (Ramirez et al., 2018). However, few studies examine how often students diverge from this linear relationships and which other variables can explain potential deviation from reduced competency account theory.

**RQ1** How many groups will emerge if we cluster students based on their math anxiety and performance?

**RQ2** How students from those clusters differ in math anxiety, performance and self-efficacy?

# Study 1

**Participants.** 1,029 students in 7th grade (typically 13-14-year-olds) from 11 US schools. 47% girls, 50% white, 27% asian, 16% hispanic/latino, 7% other races.

**Methodology**. Online survey administered by teachers during math class across 2020-21 school year. 76% of students attended class in person, others – remotely.

**Math performance measure.** Items adapted from Star et al. (2015): 4 – conceptual understanding in algebra, 3 – procedural knowledge, and 3 – math flexibility (see <a href="mailto:osf.io/bafdr">osf.io/bafdr</a>). No feedback was given.

Math anxiety measure. Math Anxiety Scale for Young Children-R (Ganley & McGraw, 2016).

**Math self-efficacy.** Academic Efficacy subscale of the Patterns of Adaptive Learning Scales (Midgley et al., 2000) adapted for math.

# Study 2

**Participants.** 473 6th grade students from 14 US schools. 49% girls, 85% white, 4.9% multi-racial, 2.7% black, 2.7% hispanic/latino.

**Methodology**. Online survey administered during the math class time across 2023-24 school year. All students participated in person.

Math performance measure: 12 order-of-operations problems (<u>Joseph</u>, <u>2014</u>). No feedback was given.

Math anxiety measure: The same as in study 1.

# Approach to clustering analysis

First, we standardized anxiety and performance using z-scores. To chose the number of clusters, we used elbow method and silhouette scores (). Then, we applied k-means clustering with 4 centers.

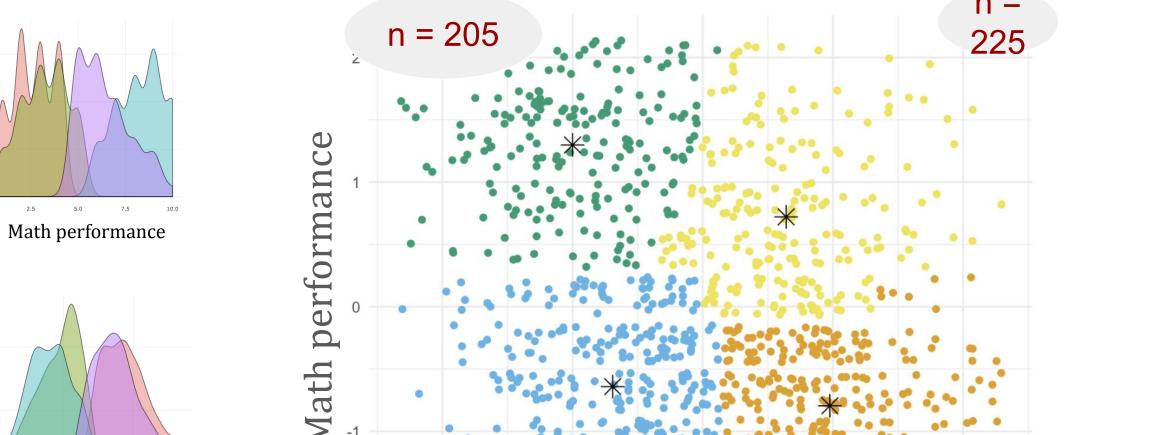
# Results: RQ1

# Study 1

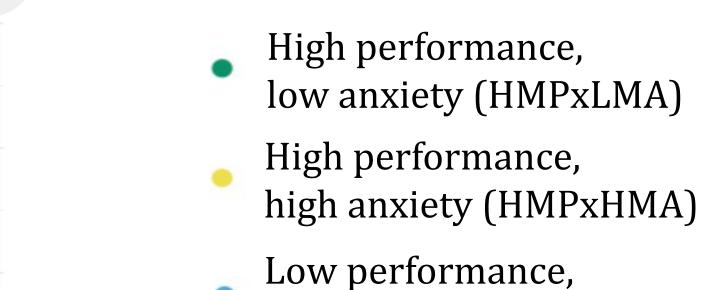
Math anxiety

LMPxLMA

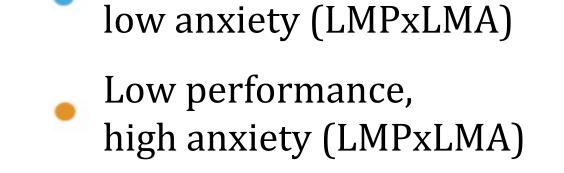
cluster

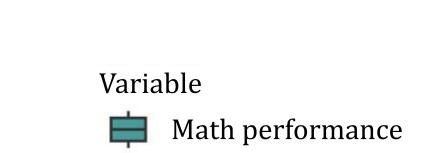


-2.4 (p = .05)



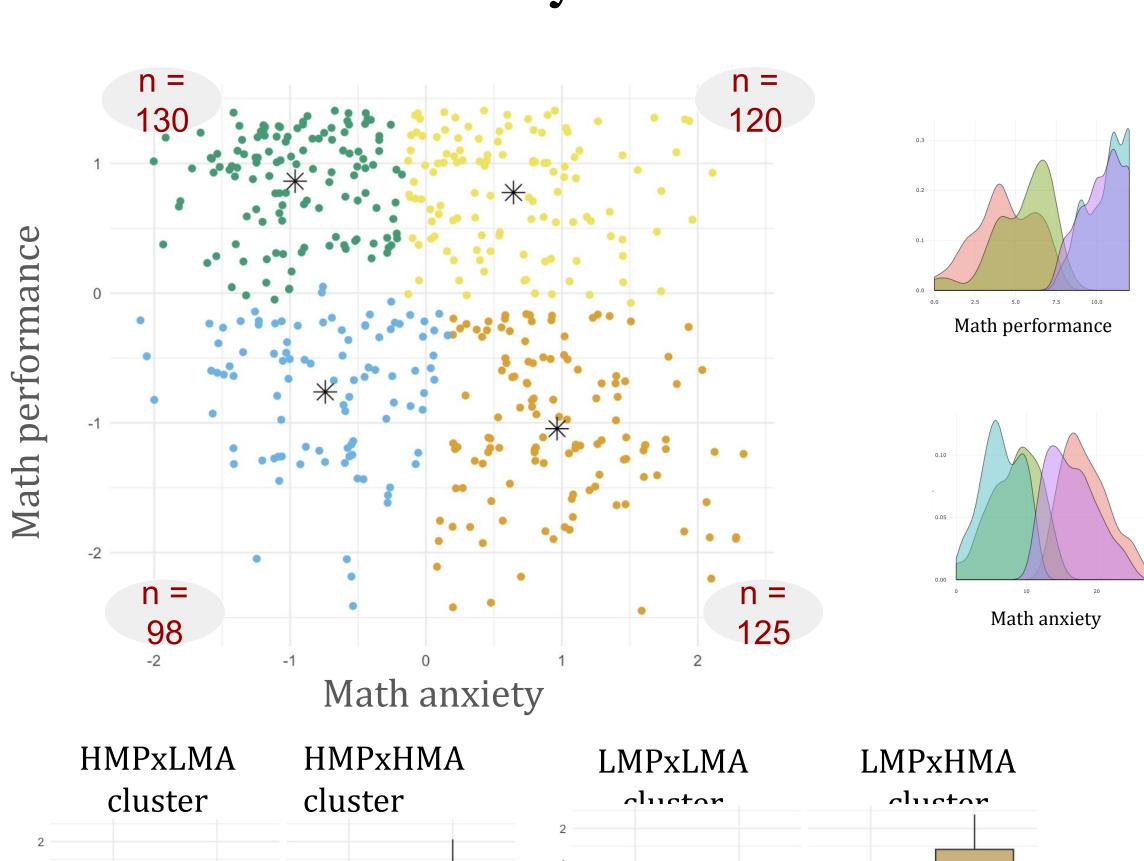
Clusters





Math anxiety

# Study 2



	-2			
	Difference in math performance:			
	HMPxHMA HMPxLMA LMPxHMA			
HMPxLMA	-0.9 (p = 1)			

15.1\*\*\*

12.4\*\*\*

-1.8 (p = .2)

**Funding** 

The research reported here

R305A180401 (study 1) and

<mark>Foundation, through an ECR</mark>

Core grant (2300764) to

WPI (study 2). Travel grant

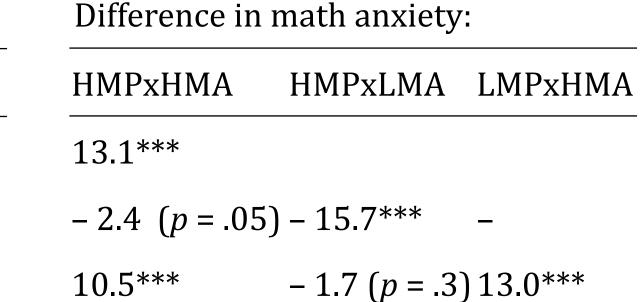
presentation was awarded

to Alena Egorova by ...

was supported by the

the National Science

for attending this



Note. All tables show pairwise Dunn test comparisons with Bonferroni correction. Statistics show column mean minus row mean, df = 3.\*\*\*p < .001.

17.7\*\*\*

LMPxHMA

cluster

Difference in math anxiety:

-3.5 (p = .02) - 22.1\*\*\*

HMPxLMA LMPxHMA

-3.2 (p = .2) 21.2\*\*\*

# Results: RQ2

**-4.5**\*\*\*

**HMPxLMA** 

LMPxHMA

**LMPxLMA** 

**HMPxLMA** 

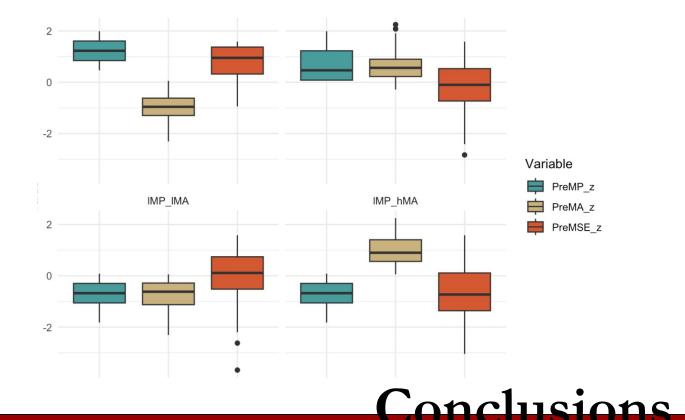
cluster

**HMPxHMA** 

Difference in math performance:

HMPxHMA HMPxLMA LMPxHMA

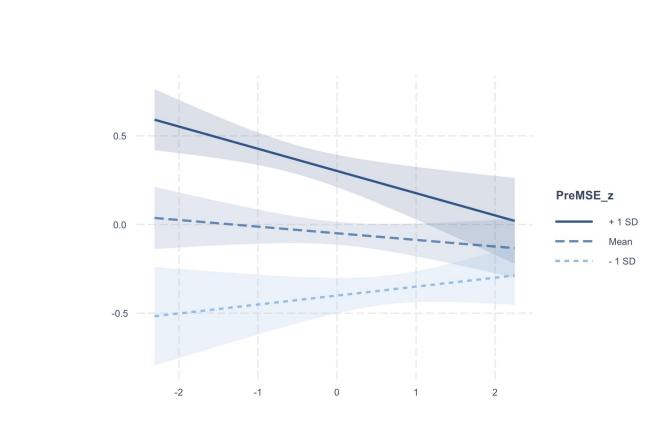
cluster



Difference in math self efficacy:

	HMPxHMA	HMPxLMA	LMPxHMA
HMPxLMA	-9.6***		
LMPxHMA	6.0***	16.0***	_
LMPxLMA	-2.8***	7.7***	-9.6 (p = .003)

LMPxLMA



- Clustering approach helped highlight the extent to which students deviate from traditional linear perspective on association between math performance and anxiety. In two studies, students were grouped into 4 distinct clusters while 2 clusters were in accordance with traditional negative linear perspective, about half of students showed pattern of another sort.
- About one fourth of students showed high levels of math performance and anxiety. In the first study, performance of this cluster was significantly lower compared to high performing low anxious students supporting the idea that high anxiety can prevent students from performing on the highest level. Potential ceiling effect in performance can lead to this cluster not showing decreased performance in the second study.
- The last cluster also about one fourth of students show relatively low levels of math performance and anxiety not significantly different levels of anxiety compared to cluster with the highest performance. Moreover, this cluster demonstrated slightly but significantly higher levels of math self-efficacy compared to higher performing higher anxious students, signaling that students from this cluster could misjudge their math abilities and, thus, not increase in negative feelings around math.
- This findings highlight importance for searching and always accounting for moderation variables when aiming to predict performance from anxiety and vice versa. Specifically, more research is needed to explore what helps students from high

Institute of Education
Sciences, U.S. Department of
Education, through Grant
This poster, code analysis



and more details



Alena Egorova, Stacy T. Shaw, Ji-Eun Lee, Erin Ottmar Worcester Polytechnic Institute

## Background & Research Questions

Research shows that anxiety in mathematics negatively correlates with mathematics performance:

Some studies examine potential moderators in math anxiety-performance relationships, showing that some highly math anxious students still perform well in mathematics (Ramirez et al., 2018). However, few studies examine how often students diverge from this linear relationships and which moderators can explain potential deviation from reduced competency account theory.

**RQ1** How many groups will emerge if we cluster students based on their math anxiety and performance?

# Study 1

Participants. 1,029 students in 7th grade (typically 13-14-year-olds) from 11 US schools. 47% girls, 50% white, 27% asian, 16% hispanic/latino, 7% other races.

**Methodology**. Online survey administered by teachers during the math class time across the 2020-21 school year. 76% of students attended class in person, others – remotely.

#### Math performance measure:

Items were adapted from Star et al. (2015): 4 assessed conceptual understanding in algebra, 3 – procedural knowledge, and 3 – mathematical flexibility (see osf.io/bafdr). No feedback on performance was given.

#### Math anxiety measure:

Math Anxiety Scale for Young Children-R (Ganley & McGraw, 2016).

### Math self-efficacy:

Academic Efficacy subscale of the Patterns of Adaptive Learning Scales (Midgley et al., 2000) adapted for math.

#### Study 2

Participants. 473 6th grade students from 14 US schools. 49% girls, 85% white, 4.9% multi-racial, 2.7% black, 2.7% hispanic/latino.

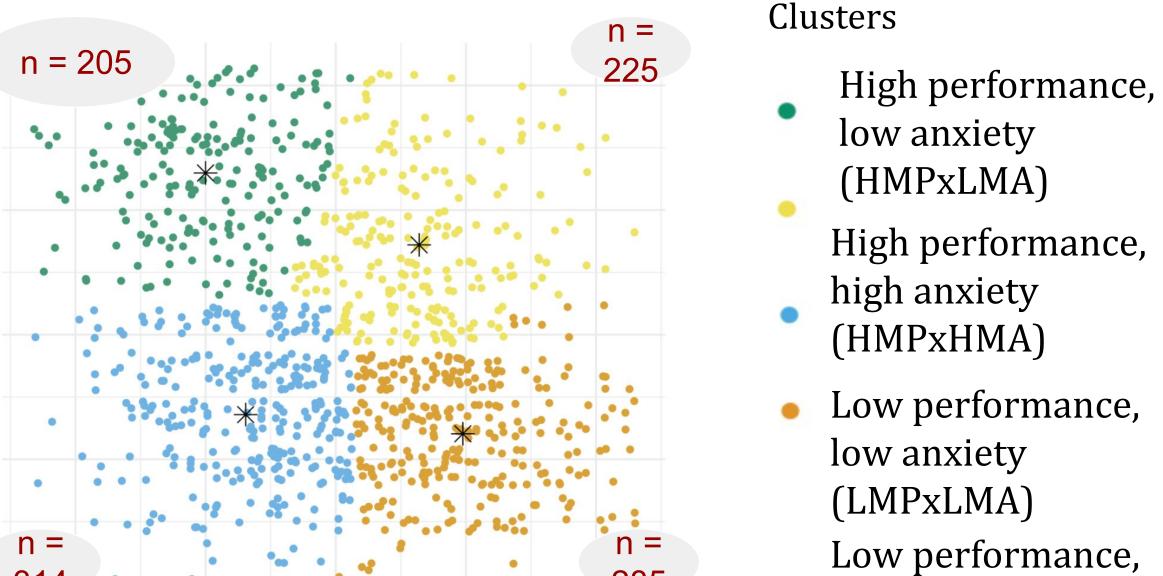
**Methodology**. Online survey administered during the math class time across 2023-24 school year. All students participated in person.

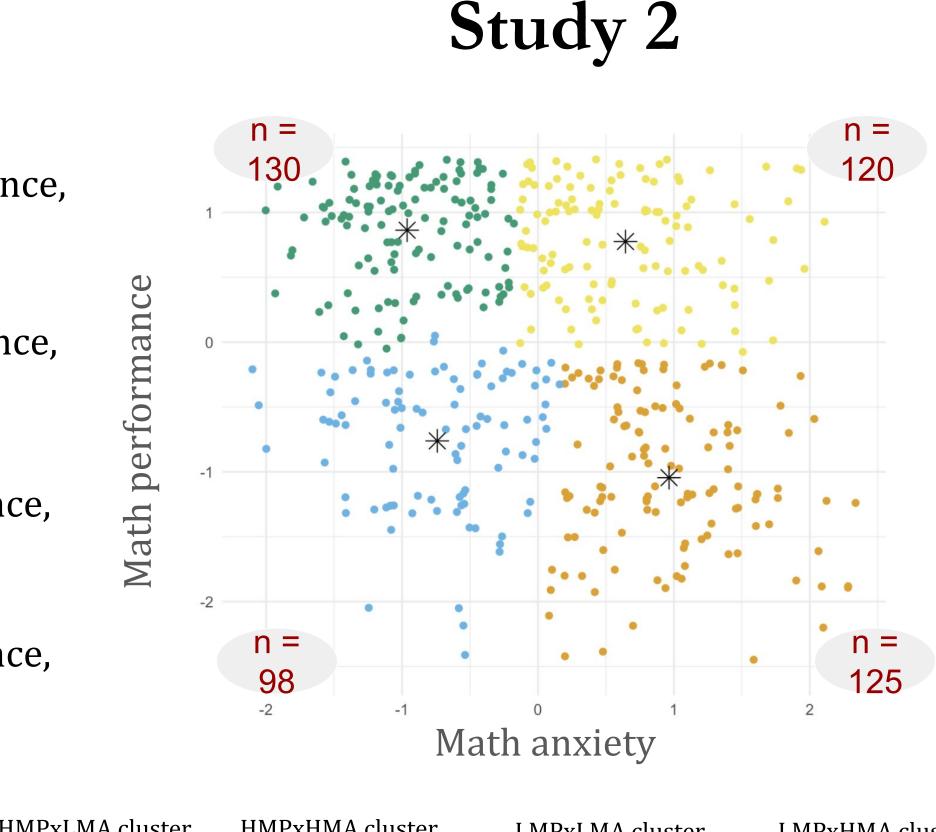
#### Math performance measure:

12 order-of-operations problems (<u>Joseph, 2014</u>). No feedback on performance was given.

#### Math anxiety measure:

# Results: RQ1





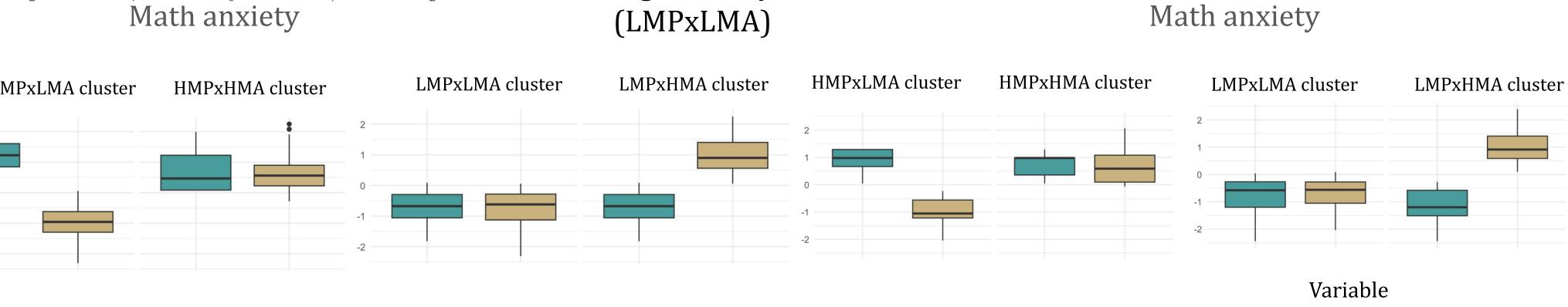
Math performance

Statistics show

minus row mean,

column mean

Math anxiety



high anxiety

# pairwise Dunn test comparisons with Bonferroni correction LMPxHMA -4.5 (p < .001)22.3 (p < .001) -20.6 (p < .001) - 2.4 (p = .052)

pairwise Dunn test comparisons with Bonferroni correction

-22.1 (p < .001) -

-3.2 (p = .147) 21.2 (p < .001)\*

Statistical difference in math performance:

Statistical difference in math anxiety:

17.7 (p < .001)

16.2 (p < .001)

Correlational matrix

Math anxiety -.23\*\*

self-efficacy [.30, .41]

Cluster

Math

performance

[-.29, -.17]

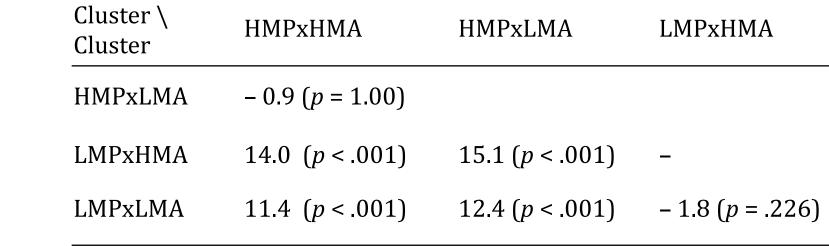
HMPxHMA

-9.6 (p < .001)

6.0 (p < .001)

-2.8 (p < .001)

Study 1



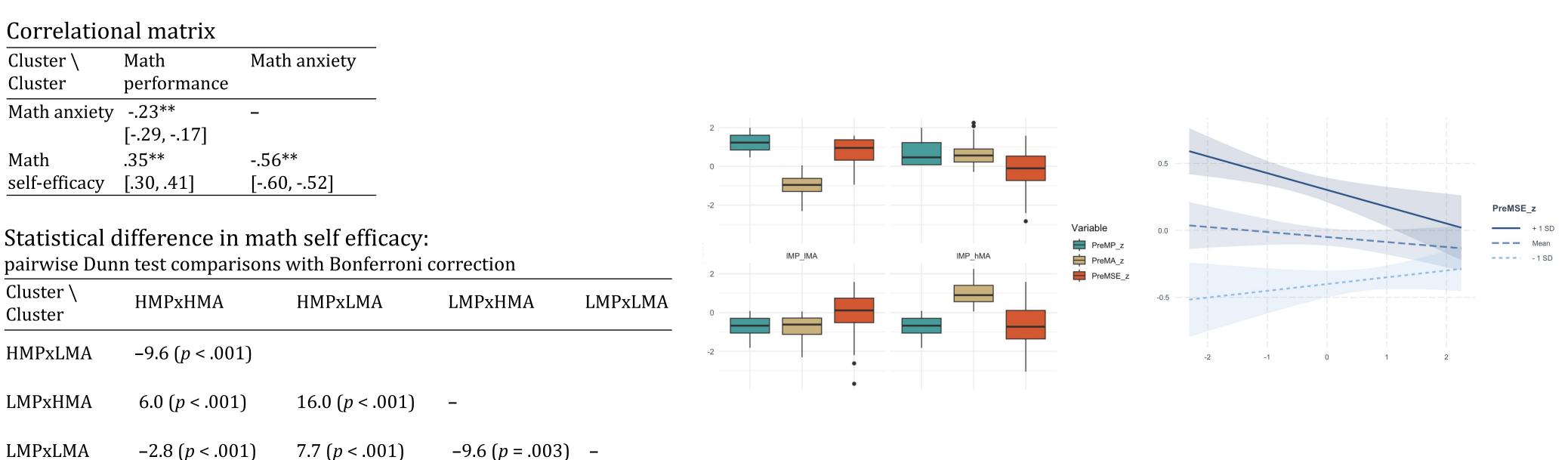
Statistical difference in math performance:

pairwise Dunn test comparisons with Bonferroni correction

# Statistical difference in math anxiety: pairwise Dunn test comparisons with Bonferroni correction

Cluster	HMPxHMA	HMPxLMA	LMPxHMA
HMPxLMA	13.1 ( <i>p</i> < .001)		
LMPxHMA	-2.4 (p = .050)	- 15.7 ( <i>p</i> < .001)	-
LMPxLMA	10.5 $(p < .001)$	- 1.7 ( <i>p</i> = .261)	13.0 ( <i>p</i> < .001)*

# Results: RQ2

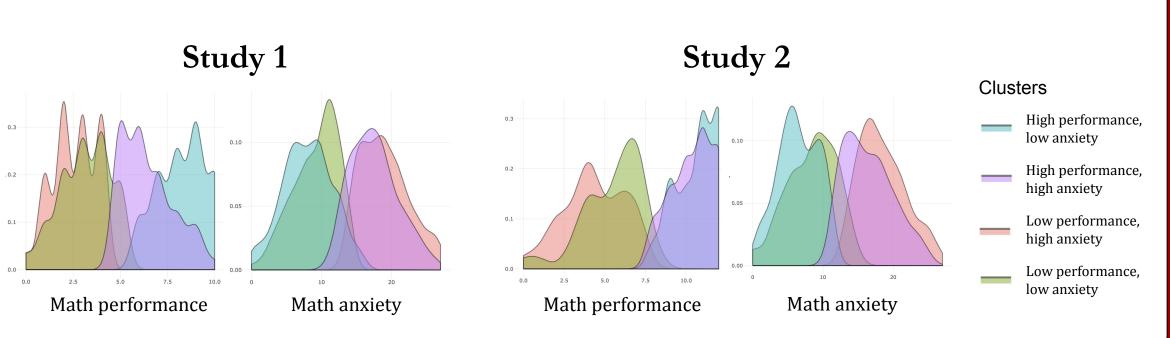


# Approach to clustering analysis

We standardized anxiety and performance using z-scores. We decided on the number of clusters based on elbow method and silhouette scores ().

We applied k-means clustering.

# Anxiety and performance distributions



# Conclusions

- Lastering approach helped highlight the extent to wh students deviate from traditional linear perspective on association between math performance and anxiety. In two studies, students were grouped into 4 distinct clusters – while 2 clusters were in accordance with traditional negative linear perspective, about half of students showed pattern of another sort.
- About one fourth of students showed high levels of math performance and anxiety. In the first study, performance of this cluster was significantly lower compared to high performing low anxious students – supporting the idea that high anxiety can prevent students from performing on the highest level. Potential ceiling effect in performance can lead to this cluster not showing decreased performance in the second study.
- The last cluster also about one fourth of students show relatively low levels of math performance and anxiety – not significantly different levels of anxiety compared to cluster with the highest performance. Moreover, this cluster demonstrated slightly but significantly higher levels of math self-efficacy compared to higher performing higher anxious students, signaling that students from this cluster could misjudge their math abilities and, thus, not increase in negative feelings around math.
- This findings highlight importance for searching and always accounting for moderation variables when aiming to predict performance from anxiety and vice versa. Specifically, more research is needed to explore what helps students from high performance high anxiety cluster perform relatively well in math and why some

# performance.

# **Funding**

The research reported here was supported by the Institute Education Sciences, U.S. Department of Education, rrough Grant R305A180401 (study 1) and the ational Science Foundation, through an ECR Core grant (2300764) to WPI (study 2). Travel grant for attending this presentation was awarded to Alena Egorova by ...





# To correlate or not to correlate? Math anxiety and performance relationships

Alena Egorova, Stacy T. Shaw, Ji-Eun Lee, Erin Ottmar Worcester Polytechnic Institute

# Background & Research Questions

- Rest, leisure, and breaks should be a *right*, but they are often a *privilege* [1].
  - For example, rest is fundamental to human learning and memory [2, 3, 4] and leisure engagement is bidirectionally linked to subjective well-being [5].
- Students who are first-generation (FG), community college transfer students (TS), and international students (INT) may face additional barriers to resting in college [6, 7, 8] as they can face additional pressures and stressors [9].
- Postsecondary institutions have encouraged students to rest through formal initiatives, but little is known as to whether these initiatives are actually effective in (1) encouraging student rest and (2) creating a culture where rest is valued.
- Researchers explored FG, TS, and INT perspectives on the WPI campus given its unique challenges to rest, culture as a competitive STEM-focused university, and increased efforts to improve mental health of its students.
- **RQ1)** What unique obstacles prevent underrepresented students from getting rest?
- **RQ2)** What do these students believe is the purpose of a "Wellness Day"?
- **RQ3)** What suggestions do these students have for WPI to improve work-rest balance?

# Participants & Methodology

- First-generation, transfer, and international WPI students (n=36).
- The total sample had an average age of 20.89; n=20 female, 12 male, 2 non-binary, 2 non specified; n=16 Asian (broad), n=11 White, n=5Hispanic, n=2 African, and n=2 White/Hispanic.
- Online survey administered during the 2022-23 school year.
- Inductive Thematic Content Analysis [10] among three raters to develop codes representing overarching themes in responses.
- Natural Language Processing (Sentiment Analysis using VADER) to gauge overall student attitudes toward the purpose of Wellness Day.

# RQ1) What specific obstacles do students face to engaging in rest?



Internal struggles (52.7%) and pressure to succeed (38.8%)



Educational background and academics (22.2%)



Adjustment to campus



Family's lack of understanding (19.4%) and support (11.1%)



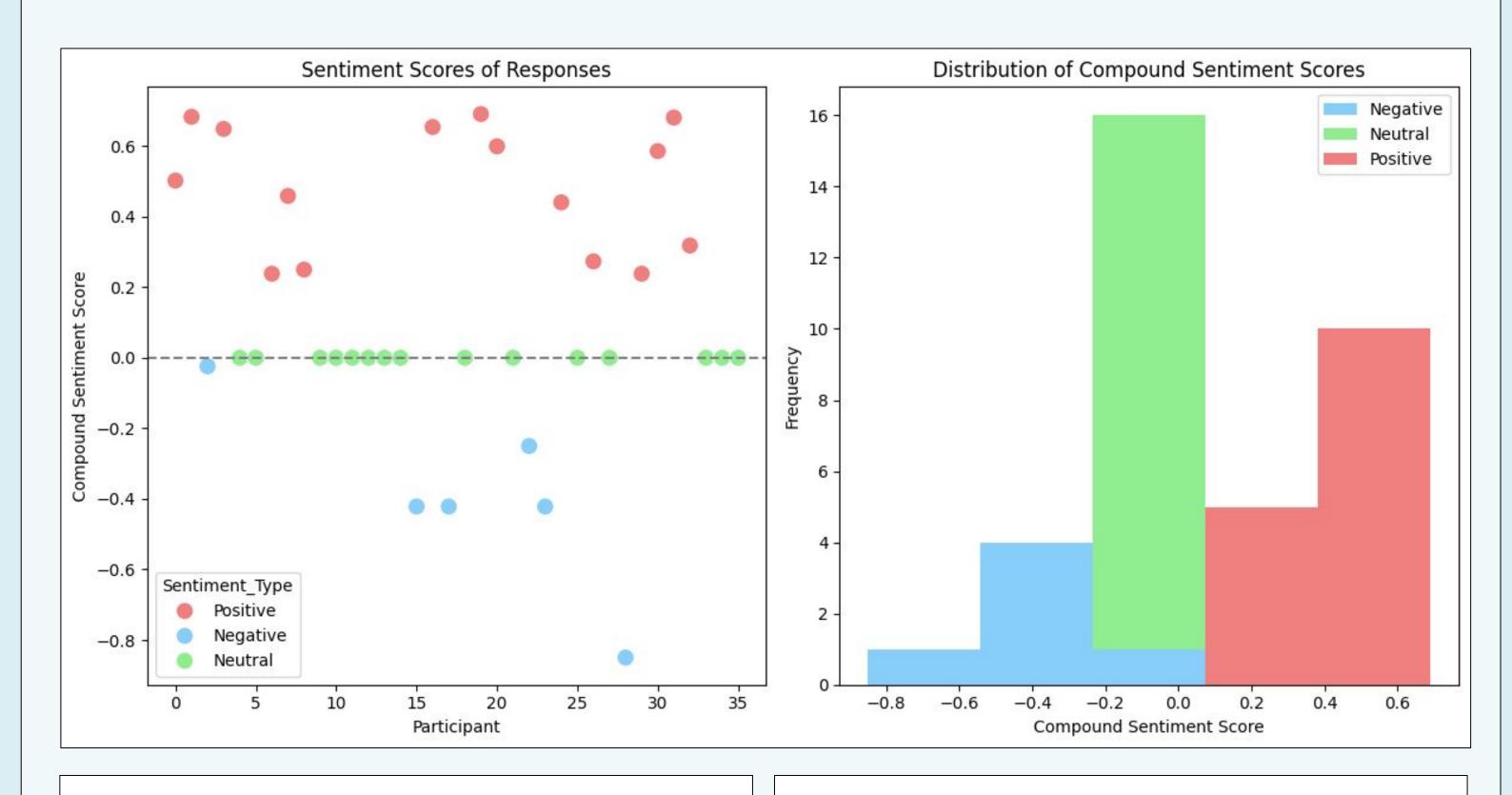
Financial stress (33.3%) and employment (13.8%)



Guilt (13.8%)

# RQ2) What do you think the purpose of WPI Wellness Day is?

Sentiment Analysis: Participant responses about Wellness Day ranged from negative to positive sentiment, but were neutral on average.



## Theme 1: Rest (63.8%)

Participants explicitly mentioned rest or implied it is a day for students to recharge and enjoy themselves.

"Give students a chance to **rest and relax"** "To take a moment to **step back, reflect,** and recharge."

## **Theme 2: Studying (38.8%)**

Participants mentioned catching up on work, studying for classes, doing work to stay on top of academics; extra time to get work done.

"Honestly it is just a day without lecture, we still have tons of work."

## **Theme 3: Misuse (33.3%)**

Participants mentioned the a distinction between perceived purpose and the actual use by themselves or the student body.

"It is marketed as a day to legitimately rest and recharge. I use it as a day to catch **up** on all the work that needs to be done."

# **Theme 4: Break from Work** <u>(27.7%)</u>

Participants mentioned taking a break or a step back from work.

"To give students a 'break' or at the very least a day to catch up..." "To make sure that students can **take** breaks and refocus"

#### Theme 5: Awareness of Wellness Practices (22.2%)

Participants mentioned an opportunity for the institution to demonstrate why rest is important and offer reflection; mindfulness.

"To rest and to acknowledge the importance of de-stressing and self care habits."

# RQ3) What is one academic factor that WPI can change to improve work/rest?



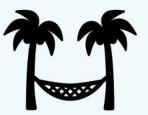
Theme 1: Faculty Accountability (39.3%)



Theme 2: Respect for Student Wellness (27.2%)



Theme 3: Change of Schedule (18.1%)



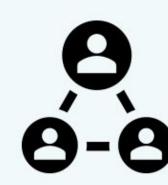
Theme 4: Promoting Rest (18.1%)



Theme 5: Less Work (15.1%)



Theme 6: Organizational Support (15.1%)



Theme 7: Campus Resources (15.1%)

# Discussion

- FG, TS, and INT students face unique challenges to engage in rest, and therefore need unique supports to engage in rest consistently and without guilt. Our data suggest:
  - Institutional advocacy for flexible faculty that can empathize with students.
  - Stricter adherence to recommended hours of work (e.g. course adjustments).
  - o Iterative feedback on Wellness Days and avoiding tight deadlines near the day.
  - Campus support groups for FG, TS, and INT students that attend to their needs.

# Acknowledgments + Funding

Thanks to Paul Pacheco for his efforts with data collection on this project. Funding: These data were collected with the support of a WPI DEIJ Seed grant awarded to Shaw, Skorinko, Kmiotek, Callahan-Panday, and Fitzpatrick and the first and second author were funded by an NSF REU grant #1950683.



References