

## Developments in Economics Education Conference 2023

# The effect of a flipped classroom where students work on exercises in groups during class time

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Yasukazu Ichino (email: [yasukazuichino@gmail.com](mailto:yasukazuichino@gmail.com) ),

Toru Kawai and Mai Seki

Ritsumeikan University, Japan

# What is a flipped classroom?

**Before class**  
(outside of class time)

**During class**

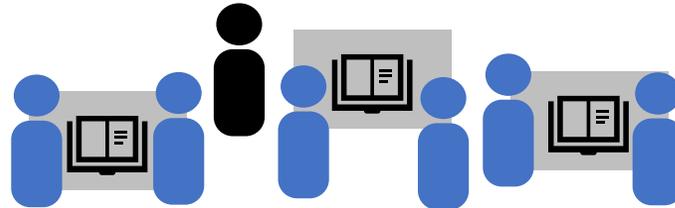
**After class**  
(outside of class time)

**Flipped  
classroom**

Watch video lectures

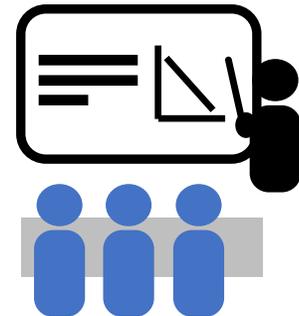


Review the lecture, work on exercises, and other activities with classmates



**Traditional  
lecture**

Have a lecture with  
classmates



Review the lecture and  
work on exercises



# Why is a flipped classroom supposed to be effective?

**Before class**  
(outside of class time)

**During class**

**After class**  
(outside of class time)

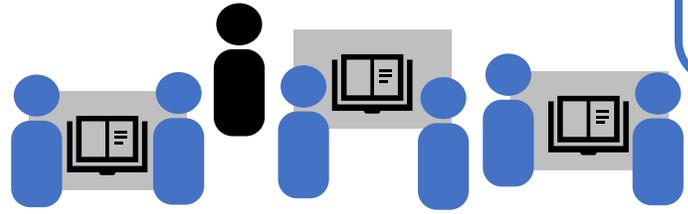
**Flipped classroom**

Watch video lectures

**Flexibility**

Students can take **video lectures** at any time they like at their own pace.

Review the lecture, work on exercises, and other activities with classmates

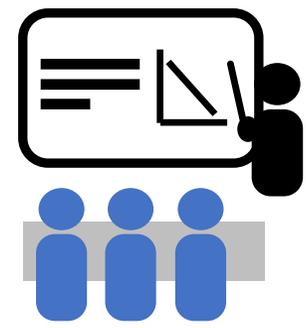


**Peer teaching**

Students can receive real-time feedback from their classmates.

**Traditional lecture**

Have a lecture with classmates



Review the lecture and work on exercises



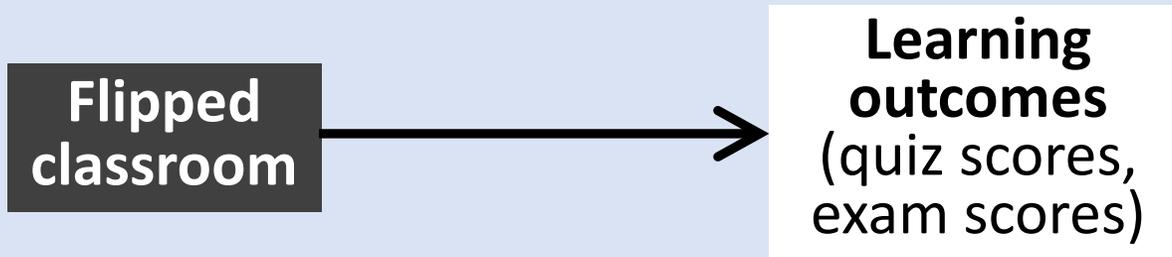
# Related Studies

No randomized controlled study  
for large-sized classes

Study	Course	Treatment # of sections, n =	Control # of obs.	Learning outcomes	Class activities	RCT?	Positive effect?
Calimeris & Sauer (2015)	principles of microeconomics	1, n=31	1, n=35	midterm, final exam	experiments, discussing news articles & video clips	partially yes	mixed
Caviglia-Harris (2016)	principles of microeconomics	2, n=50 (full flip) 2, n=55 (partial flip)	2, n=58	final exam, common questions	in-class exercises & games, clicker questions	no	yes
Balaban <i>et al.</i> (2016)	principles of economics	1, n=367	1, n=362	final exam	problem solving	no	yes
Wozny <i>et al.</i> (2018)	introduction to econometrics	7 (5 lessons) n=137 in total	7 (5 lessons) n=137 in total	quizzes, midterm, final exam	independent & group work on exercises, mini lectures	partially yes	mixed
Lombardini <i>et al.</i> (2018)	principles of microeconomics	1, n=146 (partial flip) 1, n=117 (full flip)	1, n=157	exams, students' evaluation, likelihood of D, F, and withdraw	pair and group activities, exercises and discussions	no	mixed
Ficano (2019)	introductory microeconomics	3, n=58	3, n=72	exams	work on application questions in groups	no	no
Yamarik (2019)	international economics	2, n=63	2, n=59	midterm, final exam, student perceptions	Individual & group exercises, group experiments	no	no
Craft & Linask (2020)	principles of microeconomics	6, n=117	6, n=122	course grade, final exam, TUCE posttest	solving problems, classroom experiments, discussion	partially yes	mixed
Setren <i>et al.</i> (2021)	introduction to calculus, principles of economics	26, n=435 (math) 14, n=226 (econ)	25, n=417 (math) 15, n=250 (econ)	quizzes, final exam	problem set	yes	mixed

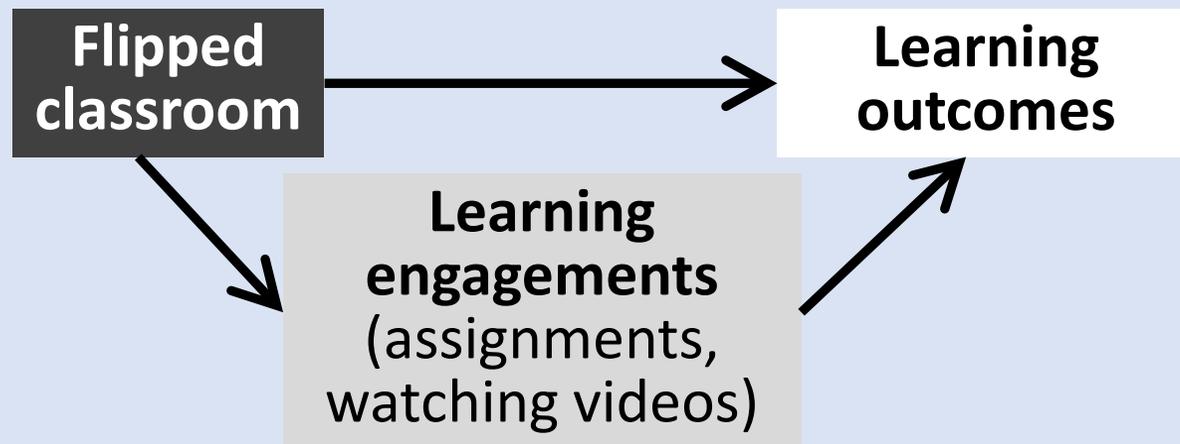
# The objectives of our study

1



Examine the effect of flipped classrooms on student learning outcomes under **a randomized controlled design** in **large-sized classes**.

2



Examine the effect of flipped classrooms on learning outcomes **through learning engagements**.

# Introduction to Economics course in spring 2022

- First-year undergrad students were assigned randomly to the sections by the admin office.
- The experiment was conducted on the 7 lessons in 2 sections (C and D) of the course.
- The same instructor has taught Section C and D.

Traditional lectures and flipped classrooms applied to the both sections

Lesson	1	2	3	4	5	6	7
Date	11 Apr.	18 Apr.	25 Apr.	2 May	16 May	23 May	30 May
<b>Section C</b> 185 students (180 consented)	Traditional lecture				Flipped classroom		

Lesson	1	2	3	4	5	6	7
Date	6 Jun.	13 Jun.	20 Jun.	27 Jun.	4 Jul.	11 Jul.	18 Jul.
<b>Section D</b> 179 students (158 consented)	Flipped classroom				Traditional lecture		

# Class format

Lecture

Exercises

Quiz

Problems similar to  
the quiz

Five multiple-choice  
questions

# Class format and assignments

## Flipped classroom

Before class

Video  
lecture

Submit a question about the lecture to the course website

During class

**Exercises** in randomly assigned groups

At the end of the class

Quiz

## Traditional lecture

During class

Live lecture  
in the classroom

Submit a question about the lecture to the course website

After class

**Exercises**  
by each student

At the beginning of  
the next class

Quiz

# Panel data of 338 students × 7 lessons

## Student learning outcomes

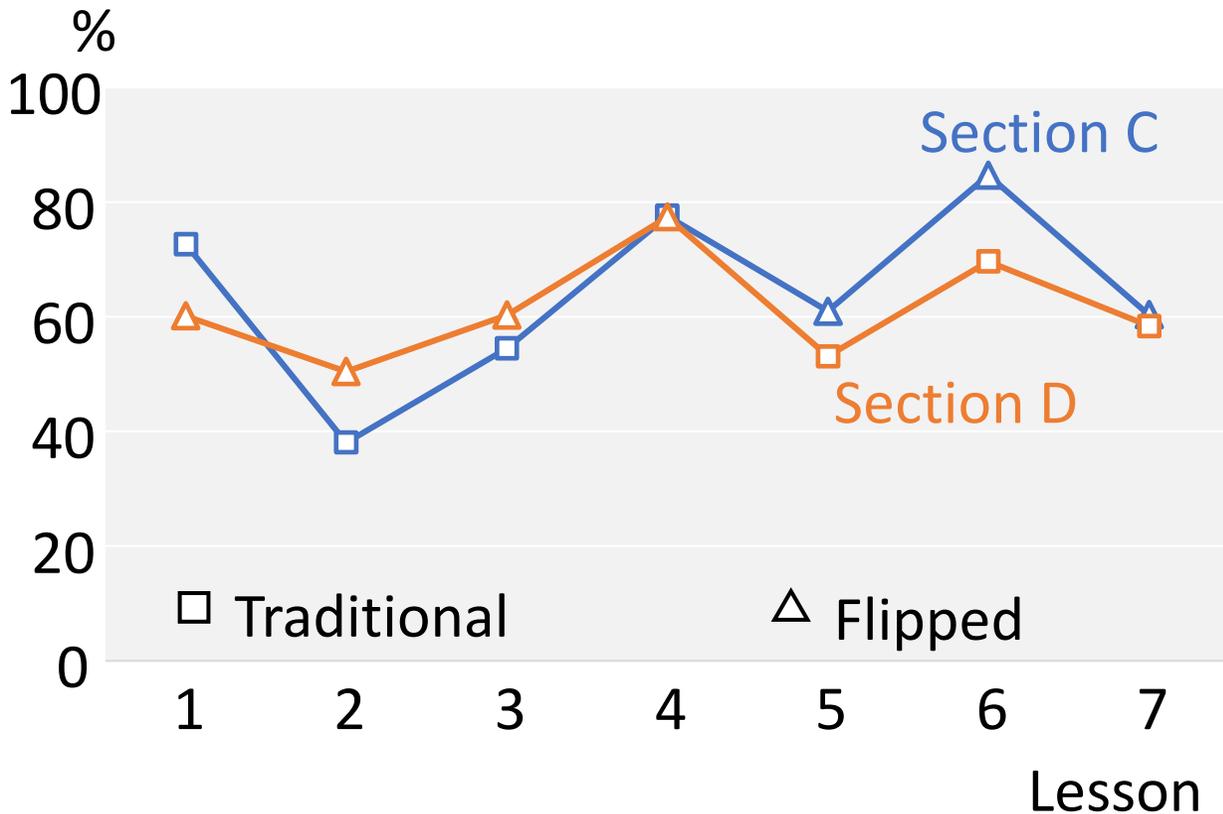
- Quiz scores (short-term learning outcomes)
- Final exam scores (long-term learning outcomes)
  - ◆ 18 questions in total, each question related to one of the seven lessons

## Student learning engagements

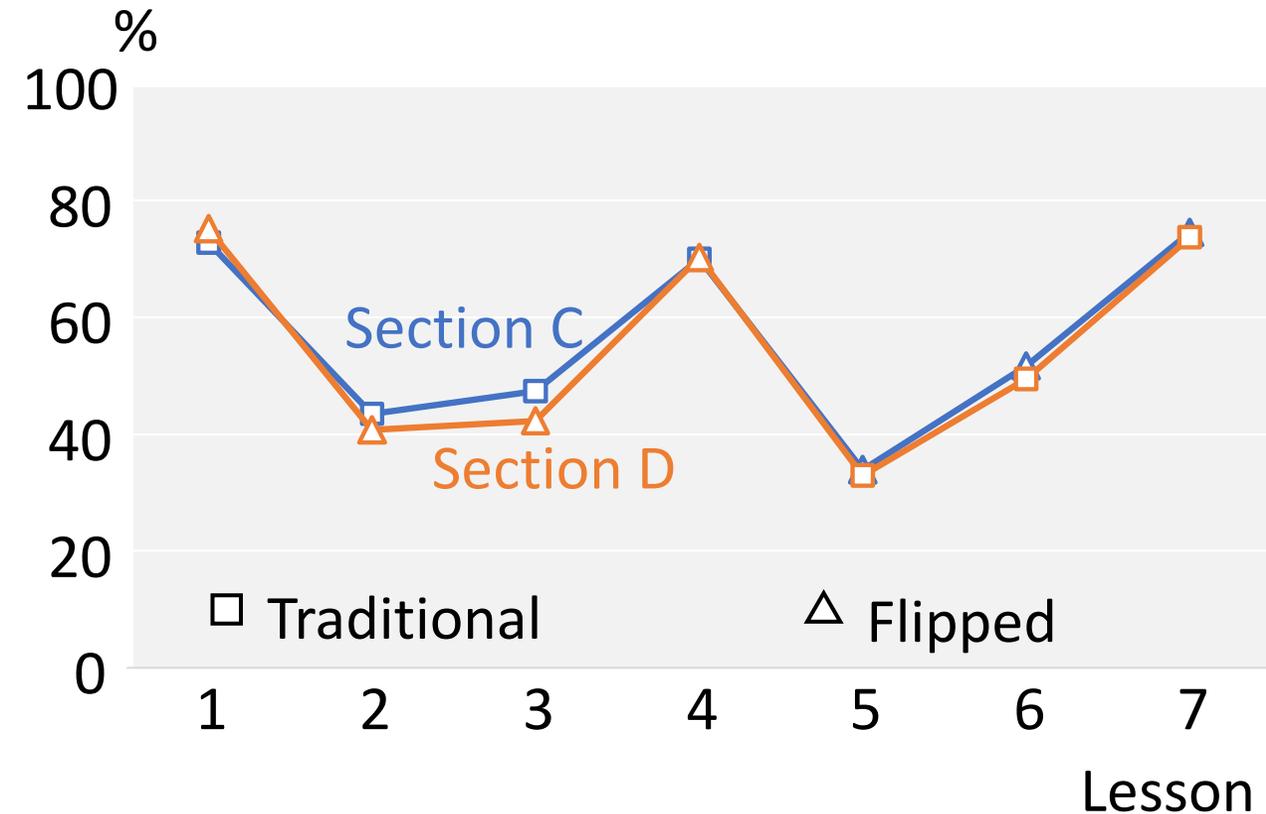
- Questions about the lecture
  - Submitted or not
  - Question length (the number of characters)
- The scores of exercise problems
- Completion rate of watching videos
- attendance

# The effect of flipped classrooms on learning outcomes

## The averages of % of correct answers in the quizzes



## The averages of % of correct answers in the final exam



# The effect of flipped classrooms on learning outcomes

Pooled OLS	Quiz scores (Standardized for each lesson)				Final exam scores (Standardized for each lesson)	
	All lessons	All lessons	Except lesson1	Except lesson 1		
<b>Flipped</b>	<b>0.1802***</b> (0.0385)	<b>-0.4214*</b> (0.2503)	<b>0.2862***</b> (0.0408)	<b>-0.4985*</b> (0.2786)	<b>0.0193</b> (0.0342)	<b>0.1672</b> (0.2125)
Standardized math placement test score	0.1182*** (0.0287)	0.1224*** (0.0286)	0.1325*** (0.0300)	0.1384*** (0.0292)	0.0840** (0.0340)	0.0949*** (0.0318)
Standardized English placement test score	0.1623*** (0.0358)	0.1589*** (0.0362)	0.1475*** (0.0394)	0.1456*** (0.0392)	0.1759*** (0.0402)	0.1760*** (0.0386)
Female	-0.0329 (0.0655)	-0.0148 (0.0665)	-0.0331 (0.0699)	-0.0116 (0.0703)	0.0325 (0.0664)	0.0469 (0.0642)
Attitude toward group learning (Likert scale)		-0.1861*** (0.0576)		-0.2289*** (0.0657)		-0.1096** (0.0464)
Attitude toward group learning * Flipped		0.1618*** (0.0684)		0.2117*** (0.0757)		-0.0387 (0.0569)
Observations	1857	1818	1584	1549	2072	2037
R <sup>2</sup>	0.0689	0.0758	0.0771	0.0878	0.0479	0.0561

## The effect

Positive effect of the flipped classrooms on the quiz scores

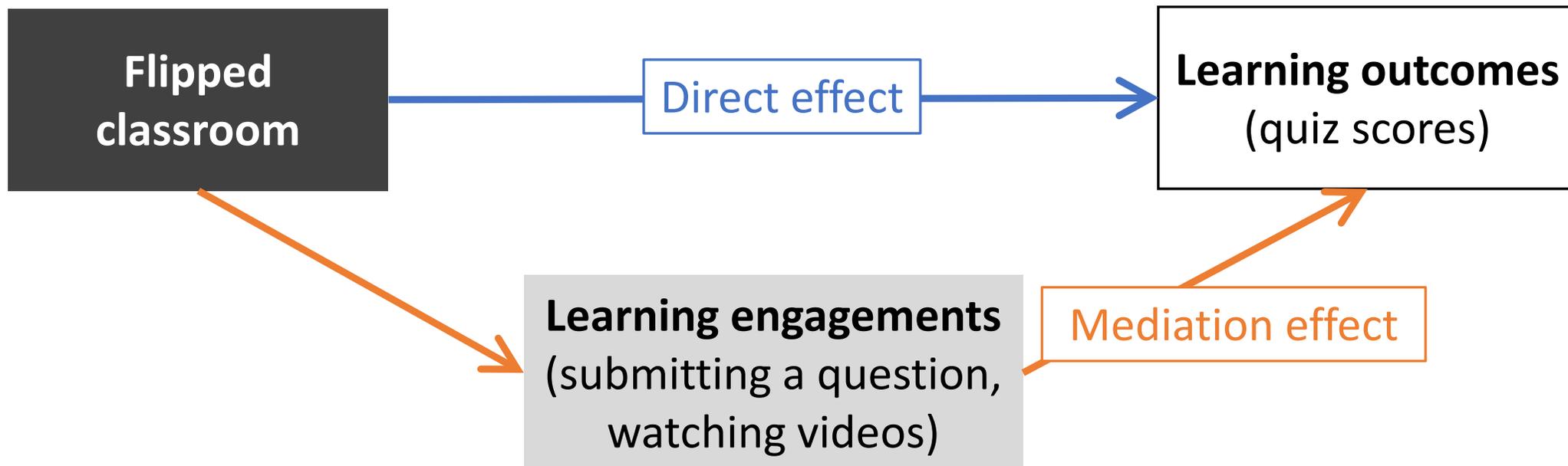
No effect of the flipped classrooms on the final exam scores

Pooled OLS	Quiz scores (Standardized for each lesson)				Final exam scores (Standardized for each lesson)	
	All lessons	All lessons	Except lesson1	Except lesson 1		
<b>Flipped</b>	<b>0.1802***</b> (0.0385)	<b>-0.4214*</b> (0.2503)	<b>0.2862***</b> (0.0408)	<b>-0.4985*</b> (0.2786)	<b>0.0193</b> (0.0342)	<b>0.1672</b> (0.2125)
Standardized math placement test score	0.1182*** (0.0287)	0.1224*** (0.0286)	0.1325*** (0.0300)	0.1384*** (0.0292)	0.0840** (0.0340)	0.0949*** (0.0318)
Standardized English placement test score	0.1623*** (0.0358)	0.1580*** (0.0358)	0.1475*** (0.0358)	0.1456*** (0.0358)	0.1750*** (0.0358)	0.1760*** (0.0358)
Female	-0.0329 (0.0655)					
Attitude toward group learning (Likert scale)		<b>-0.1861***</b> (0.0576)		<b>-0.2289***</b> (0.0657)		<b>-0.1096**</b> (0.0464)
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Observations	1857	1818	1584	1549	2072	2037
R <sup>2</sup>	0.0689	0.0758	0.0771	0.0878	0.0479	0.0561

Positive attitude toward group learning decreases the quiz scores but strengthens the effect of the flipped classrooms.

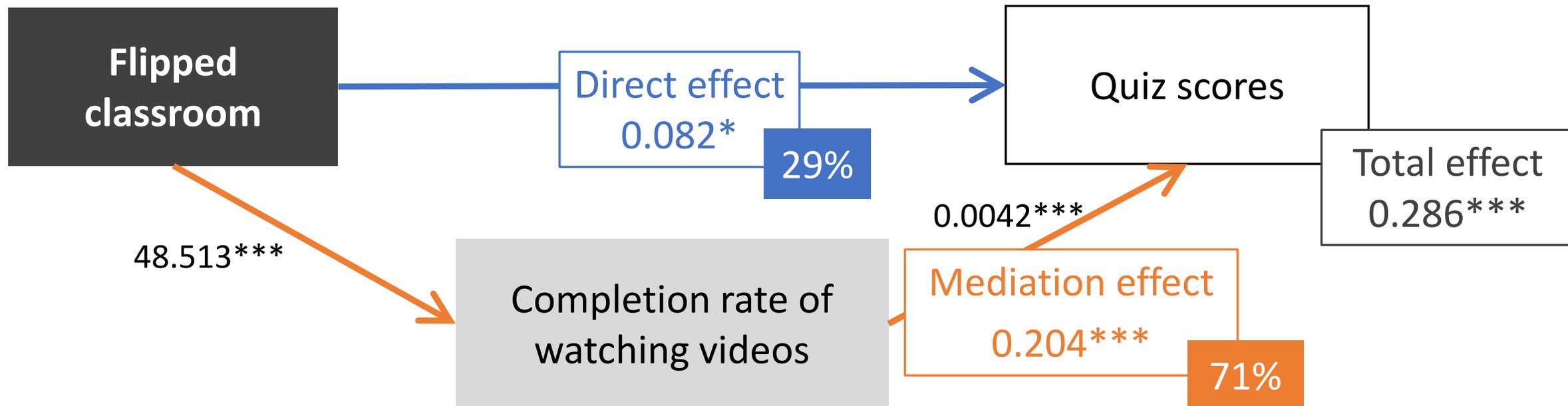
# Causal mediation analysis

Examine the effect of the flipped classrooms on learning outcomes through learning engagements

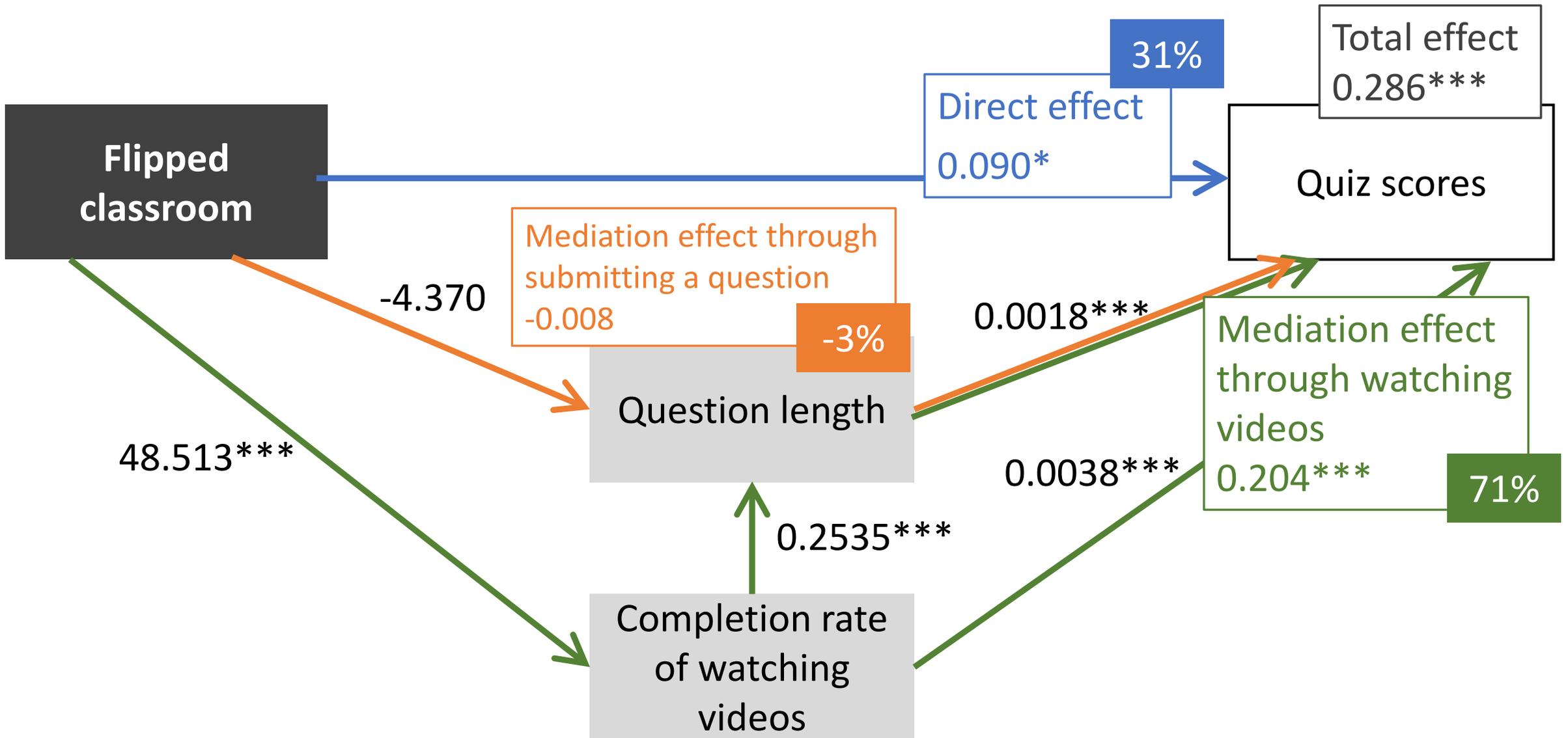


# Causal mediation analysis: results

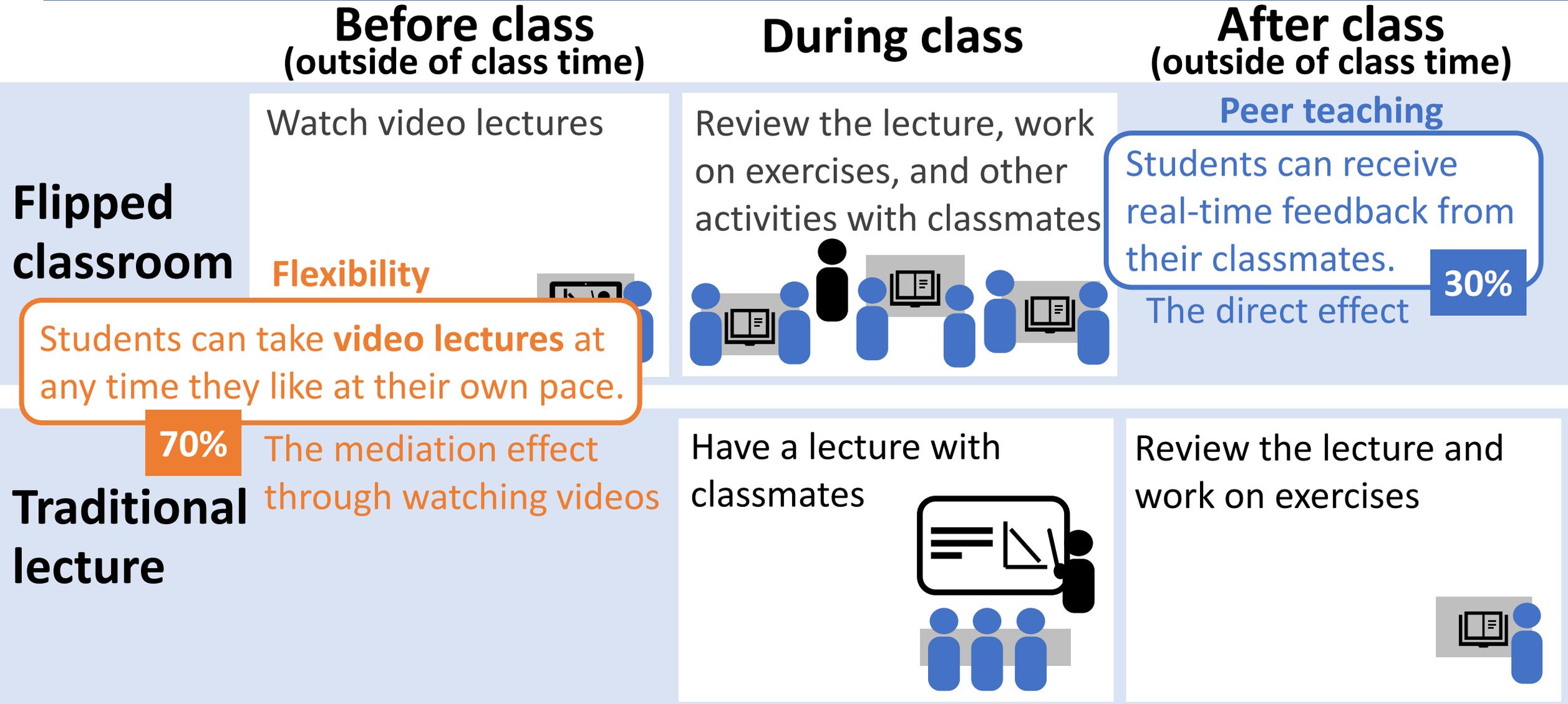
Examine the effect of the flipped classrooms on learning outcomes through learning engagements



# Two-mediator mediation analysis



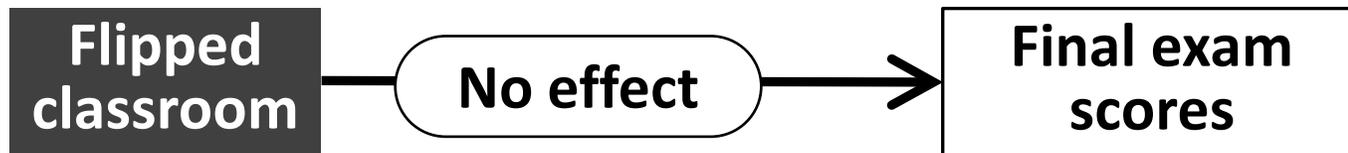
# Why is a flipped classroom supposed to be effective?



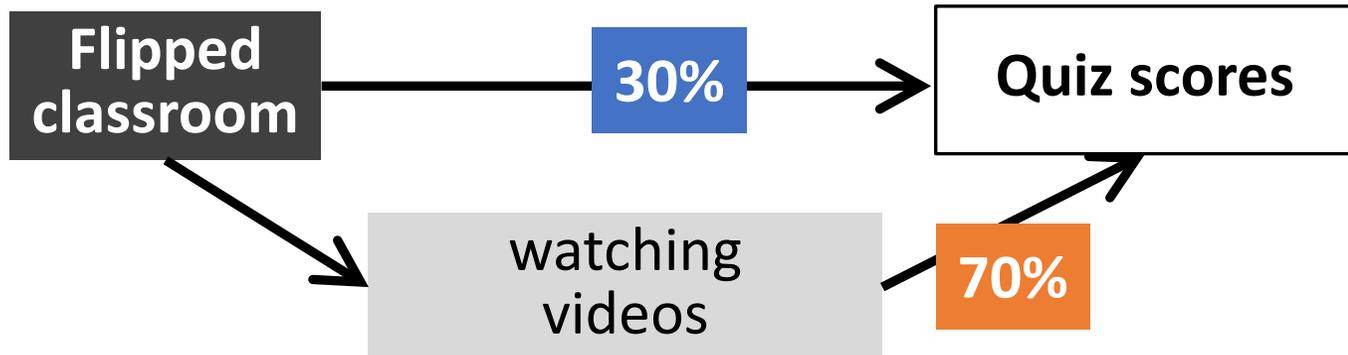
# Summary of the findings



Positive effect of the flipped classroom on quiz scores (short-term learning outcome) about 0.18 to 0.29 standard deviation



No significant effect of the flipped classroom on exam scores (long-term learning outcome)



Of the total effect of flipped classrooms, 70% is mediated through watching videos, and the remaining 30% is the direct effect, interpreted as the effect of activities during class.

# Our experiment in 2021 : original design

Lesson	1	2	3	4	5	6	7
Date	12 Apr.	19 Apr.	26 Apr.	10 May	24 May	31 May	5 Jun.
<b>Section C</b> 196 students	Traditional lecture				Flipped classroom		

Lesson	1	2	3	4	5	6	7
Date	7 Jun.	14 Jun.	21 Jun.	28 Jun.	5 Jul.	12 Jul.	19 Jul.
<b>Section D</b> 191 students	Flipped classroom				Traditional lecture		

# Our experiment in 2021 : what was done

Due to the COVID-19, classes were held online from mid-April to mid-June.

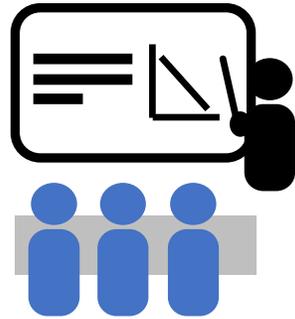
Lesson	1	2	3	4	5	6	7
Date	12 Apr.	19 Apr.	26 Apr.	10 May	24 May	31 May	5 Jun.
<b>Section C</b>	Traditional lecture			Flipped classroom			
196 students	In person			Online			

Lesson	1	2	3	4	5	6	7
Date	7 Jun.	14 Jun.	21 Jun.	28 Jun.	5 Jul.	12 Jul.	19 Jul.
<b>Section D</b>	Flipped classroom			Traditional lecture			
191 students	Online				In person		

# The effect of in-person and online flipped classroom in 2021 and 2022

## In person (2021)

Traditional lecture

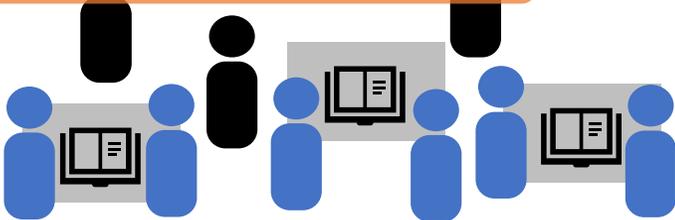


**-0.347**

Negative effect of in-person flipped classroom

Flipped classroom

Freely formed groups



## Online (2021)

Traditional lecture

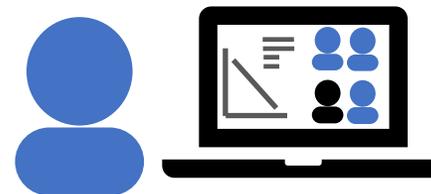


**+0.641**

Positive effect of online flipped classroom

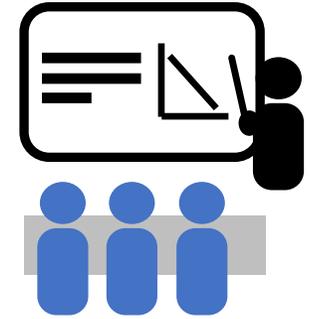
Flipped classroom

Randomly assigned groups



## In person (2022)

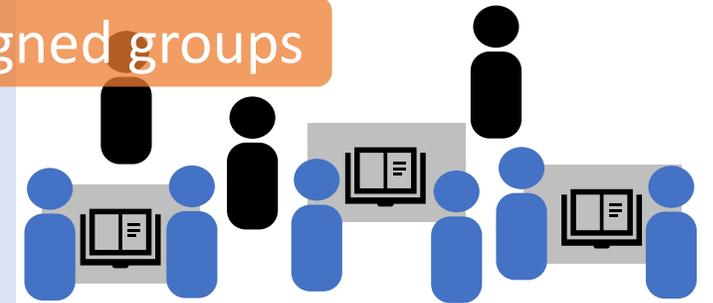
Traditional lecture



**+0.286**

Positive effect of in-person flipped classroom

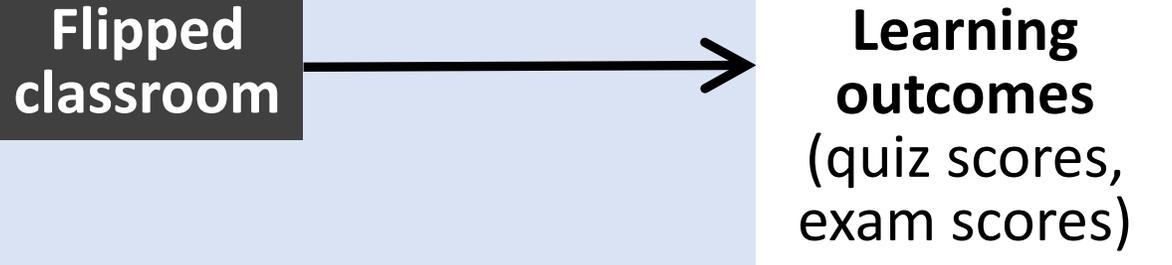
Flipped classroom



# Summary of the findings

1

Flipped  
classroom



Learning  
outcomes  
(quiz scores,  
exam scores)

- Positive effect of the flipped classroom on quiz scores (short-term learning outcome) about 0.16 to 0.29 standard deviation
- No significant effect of the flipped classroom on exam scores (long-term learning outcome)
- Randomly assigned groups can be a successful ingredient for flipped classrooms.

# Supplementary materials

# Introduction to Economics course in spring 2022

Week	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15
Date	11 Apr.	18 Apr.	25 Apr.	2 May	9 May	16 May	23 May	30 May	6 Jun.	13 Jun.	20 Jun.	27 Jun.	4 Jul.	11 Jul.	18 Jul.
Section C 185 students	micro and macroeconomics								heterodox economics						
	 Instructor Y								 Instructor Z						
Section D 179 students	 Instructor Z								 Instructor Y						
	heterodox economics								micro and macroeconomics						

# Experiment on the 7 lessons of “Introduction to Economics”

Lesson	1	2	3	4	5	6	7								
Date	11 Apr.	18 Apr.	25 Apr.	2 May	9 May	16 May	23 May	30 May							
Section C 185 students	micro and macroeconomics							heterodox economics							
								Lesson	1	2	3	4	5	6	7
								Date	6 Jun.	13 Jun.	20 Jun.	27 Jun.	4 Jul.	11 Jul.	18 Jul.
Section D 179 students	heterodox economics							micro and macroeconomics							

# Introduction to Economics course in spring 2022

First-year undergrad students were assigned randomly to the sections by the admin office.

Lesson	1	2	3	4		5	6	7
Date	11 Apr.	18 Apr.	25 Apr.	2 May	9 May	16 May	23 May	30 May
Section C 185 students	Traditional lecture					Flipped classroom		

The experiment was conducted on the 7 lessons in 2 sections (section C and D) of the course

Traditional lectures and flipped classrooms applied to the both sections

Lesson	1	2	3	4	5	6	7
Date	6 Jun.	13 Jun.	20 Jun.	27 Jun.	4 Jul.	11 Jul.	18 Jul.
Section D 179 students	Flipped classroom				Traditional lecture		

# Contents of the course

## Based on Mankiw's ten principles of economics

**Lesson 1** Tradeoffs

**Lesson 2** Cost, rational choice, incentives

**Lesson 3** Marginal principle, profit maximization

**Lesson 4** Gains from trade

**Lesson 5** Efficiency of a market economy, market failure

**Lesson 6** GDP

**Lesson 7** Price levels, inflation and unemployment

# Class format and assignments

## Flipped classroom

Before class

Video  
lecture

Submit a **question about the lecture** to the course website before class

During class

**Exercises** in randomly assigned groups

Submit **answers to the exercises** to the course website after class

At the end of the class

Quiz

## Traditional lecture

During class

Live **lecture**  
in the classroom

Submit a **question about the lecture** to the course website after class

After class

**Exercises**  
by each student

Submit **answers to the exercises** to the course website after class

At the beginning of  
the next class

Quiz

# Class format

Lecture

Exercises

Quiz

## Before class

## During class

## After class

## Next class

### Flipped classroom

- Readings
- Video **lecture**
- Submit a question about the lecture

- Work on **exercises** by randomly assigned groups
- Take a **quiz** in the last 10 minutes

- Submit the answers to exercises

———— **90 minutes** ———— ———— **A week** ————

### Traditional lecture

- Readings

- Live **lecture** in the classroom

- Work on **exercises** by each and submit the answers
- Submit a question about the lecture

- Take a **quiz** in the first 10 minutes

Before class

During class

After class

Next class

# Grading

**Final exam**  
**30%**

**quizzes**  
**40%**

**Question about  
the lecture**  
**20%**

**Exer-  
cises**  
**10%**

# Regression using panel data of 338 students $\times$ 7 lessons

Learning outcome $_{ij} = \alpha + \beta \text{Flipped}_{ij}$

$$+ \sum_k \gamma_k \text{Student characteristics}_{ki}$$

$$+ \sum_j \theta_j \text{Lesson dummies}_j + \varepsilon_{ij}$$

$i$  for students and  $j$  for lessons

# Characteristics of students

- English placement test score
- Math placement test score
- Gender

## **Survey about learning**

- Self-regulated learning strategies
- Attitude toward group learning
- Eagerness to learn

# Survey about learning

Before  
the  
experiment

After  
traditional  
lectures

After  
flipped  
classrooms

Lesson 1 2 3 4 5 6 7

Date 11 Apr. 18 Apr. 25 Apr. 2 May 16 May 23 May 30 May

**Section C**  
185  
students

**Traditional lecture**

**Flipped  
classroom**

Before  
the  
experiment

After  
flipped  
classrooms

After  
traditional  
lectures

Lesson 1 2 3 4 5 6 7

Date 6 Jun. 13 Jun. 20 Jun. 27 Jun. 4 Jul. 11 Jul. 18 Jul.

**Section D**  
179  
students

**Flipped classroom**

**Traditional  
lecture**

# Survey about learning

## Self-regulated learning strategies (24 questions)

### Behavioral strategies (6 questions)

- I plan ahead.
- ...

### Emotional strategies (4 questions)

- I try not to think too much about how bad things could happen.
- ...

### Cognitive strategies (8 questions)

- I think about what I needed to understand in class.
- ...

### Motivational strategies (6 questions)

- I am motivated to take classes even if I am not interested.
- ...

## Attitude toward group learning (8 questions)

- A team makes better decisions than one person.
- It's fun to work with classmates.
- Listen carefully to others.
- ...

# Summary statistics : Sections and student characteristics

Section	# of students consented/# of students	
C	180/185	
D	158/179	

	Section	mean	Std. dev	min	max	# of obs.
<b>Gender (male=0, female=1)</b>	C	0.21	0.41	0	1	180
	D	0.25	0.43	0	1	158
<b>Math placement test scores (out of 42 points)</b>	C	24.39	6.59	10	39	169
	D	23.50	6.89	5	39	150
<b>English placement test scores (out of 1000 points)</b>	C	542.16	109.33	76	735	179
	D	539.46	100.85	117	762	158

# The effect of flipped classrooms on learning outcomes: Quiz scores

Pooled OLS	Dependent variable: standardized quiz score			
	(1) All lessons	(2) All lessons	(3) Except lesson 1	(4) Except lesson 1
Flipped	.180 (.038) ***	-.177 (.278)	.286 (.041) ***	-.297 (.323)
Standardized math placement test score	.118 (.029) ***	.116 (.028) ***	.133 (.030) ***	.134 (.028) ***
Standardized English placement test score	.162 (.036) ***	.151 (.034) ***	.148 (.039) ***	.137 (.037) ***
Female	-.033 (.065)	-.020 (.064)	-.033 (.070)	-.019 (.069)
Attitude toward group learning		-.178 (.063) ***		-.235 (.071) ***
Attitude toward group learning * Flipped		.242 (.080) ***		.279 (.086) ***
Behavioral learning strategies		-.057 (.054)		-.035 (.059)
Behavioral learning strategies * Flipped		-.065 (.057)		-.090 (.062)
Cognitive learning strategies		-.080 (.063)		-.078 (.071)
Cognitive learning strategies * Flipped		.094 (.089)		.087 (.096)
Emotional learning strategies		-.015 (.041)		.001 (.046)
Emotional learning strategies * Flipped		-.058 (.045)		-.044 (.050)
Motivational learning strategies		.124 (.053) **		.116 (.063) *
Motivational learning strategies * Flipped		-.151 (.070) **		-.102 (.082)
Observations / R <sup>2</sup>	1857	1813	1584	1544
R <sup>2</sup>	0.0689	0.0842	0.0771	0.0927

# The effect of flipped classroom

## Quiz scores

Positive effect of the flipped classrooms on the quiz scores on average

Pooled OLS

Dependent variable: standardized quiz score

	(1) All lessons	(2) All lessons	(3) Except lesson 1	(4) Except lesson 1
Flipped	.180 (.038) ***	-.177 (.278)	.286 (.041) ***	-.297 (.323)
Standardized math placement test score	.118 (.029) ***	.116 (.028) ***	.133 (.030) ***	.134 (.028) ***
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Female	-.033 (.065)	-.020 (.064)	-.033 (.070)	-.019 (.069)
Attitude toward group learning		-.178 (.063) ***		-.235 (.071) ***
Attitude toward group learning * Flipped		.242 (.080) ***		.279 (.086) ***
Behavioral learning strategies		-.057 (.054)		-.025 (.050)
Behavioral learning strategies * Flipped				
Cognitive learning strategies				
Cognitive learning strategies * Flipped				
Motivational learning strategies		.094 (.089)		.087 (.096)
Motivational learning strategies * Flipped		-.015 (.041)		.001 (.046)
Motivational learning strategies		-.058 (.045)		-.044 (.050)
Motivational learning strategies * Flipped		.124 (.053) **		.116 (.063) *
Motivational learning strategies * Flipped		-.151 (.070) **		-.102 (.082)
Observations / R <sup>2</sup>	1857	1813	1584	1544
R <sup>2</sup>	0.0689	0.0842	0.0771	0.0927

Motivational learning strategies raise the scores but weaken the effect of the flipped classrooms.

Positive attitude toward group learning lowers the scores but strengthens the effect of the flipped classrooms.

# The effect of flipped classrooms on learning outcomes: Final exam scores

Pooled OLS	Dependent variable: standardized final exam score	
	(1)	(2)
Flipped	.019 (.034)	.201 (.257)
Standardized math placement test score	.084 (.034) **	.092 (.032) ***
Standardized English placement test score	.176 (.040) ***	.168 (.038) ***
Female	.033 (.066)	.051 (.064)
Attitude toward group learning		-.062 (.060)
Attitude toward group learning * Flipped		-.042 (.061)
Behavioral learning strategies		-.123 (.053) **
Behavioral learning strategies * Flipped		.091 (.057)
Cognitive learning strategies		.014 (.071)
Cognitive learning strategies * Flipped		-.036 (.070)
Emotional learning strategies		-.052 (.034)
Emotional learning strategies * Flipped		-.011 (.038)
Motivational learning strategies		.049 (.055)
Motivational learning strategies * Flipped		-.049 (.051)
Observations	2072	2,030
R <sup>2</sup>	0.0479	0.0616

# The effect of flipped classrooms on learning outcomes: Final exam scores

Pooled OLS	Dependent variable: standardized final exam score	
	(1)	(2)
Flipped	.019 (.034)	.201 (.257)
Standardized math placement test score	.084 (.034) **	.092 (.032) ***
Standardized English placement test score	.176 (.040) ***	.168 (.038) ***
Female	.033 (.066)	.051 (.064)
Attitude toward group learning		-.062 (.060)
Attitude toward group learning * Flipped		-.042 (.061)
Behavioral learning strategies		-.123 (.053) **
Behavioral learning strategies * Flipped		.091 (.057)
Cognitive learning strategies		.014 (.071)
Cognitive learning strategies * Flipped		-.036 (.070)
Emotional learning strategies		-.052 (.034)
Emotional learning strategies * Flipped		-.011 (.038)
Motivational learning strategies		.049 (.055)
Motivational learning strategies * Flipped		-.049 (.051)
Observations	2072	2,030
R <sup>2</sup>	0.0479	0.0616

No significant effect of the flipped classrooms on the final exam scores

# The effect of flipped classrooms on learning engagements

Positive effects on learning engagements on average.

	Question submission (submitted=1)	Question length	The scores of exercise problems (0,1, or 2)	Attendance (attended=1)	Completion rate of watching videos(%)
	probit	pooled OLS	ordered probit	probit	pooled OLS
<b>Flipped</b>	<b>0.0872</b> <b>(0.0605)</b>	<b>9.6629***</b> <b>(2.2452)</b>	<b>0.2878***</b> <b>(0.0570)</b>	<b>0.1585***</b> <b>(0.0543)</b>	<b>43.402***</b> <b>(1.8024)</b>
Standardized math placement test score	0.1854*** (0.0561)	8.3528*** (2.4601)	0.1380*** (0.0560)	0.0991*** (0.0396)	0.0140 (1.1568)
Standardized English placement test score	-0.1824*** (0.0603)	0.4154 (2.8134)	-0.0951* (0.0521)	-0.0286 (0.0448)	2.6259* (1.3490)
Female	0.4382*** (0.1483)	1.4785 (4.8033)	0.4234*** (0.1475)	0.3093** (0.1218)	8.8676*** (3.1619)
Observations	2233	2233	2233	2233	2233
R <sup>2</sup>	0.0502 (pseudo)	0.0747	0.0540 (pseudo)	0.0316 (pseudo)	0.2710

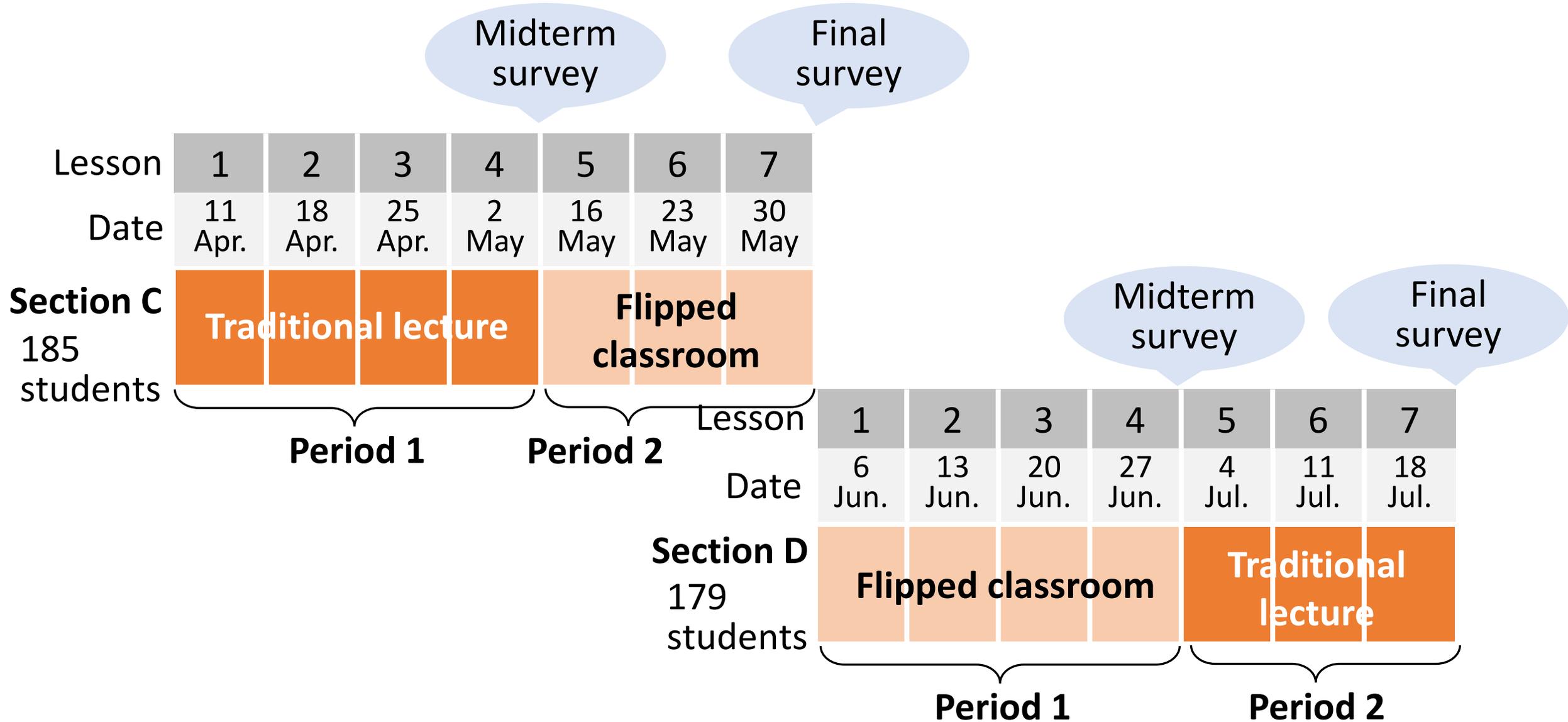
# Student satisfaction

	Student satisfaction Pooled OLS	
<b>Flipped</b>	<b>-0.2973***</b> (0.0643)	<b>-1.7389***</b> (0.4479)
Standardized math placement test score	0.0762 (0.0458)	0.0476 (0.0420)
Standardized English placement test score	0.0046 (0.0398)	0.0044 (0.0380)
Female	0.0497 (0.0978)	0.0081 (0.0900)
Attitude toward group learning		0.1861** (0.0731)
Attitude toward group learning * Flipped		0.3899*** (0.1105)
Period-2 dummy	-0.1280* (0.0646)	-.1469** (0.0619)
Observations	609	596
R <sup>2</sup>	0.0405	0.1390

Less satisfied with the Flipped classrooms than the traditional lectures

The students with highly positive attitude toward group learning are satisfied with the flipped classrooms but the other students are not.

# Student satisfaction



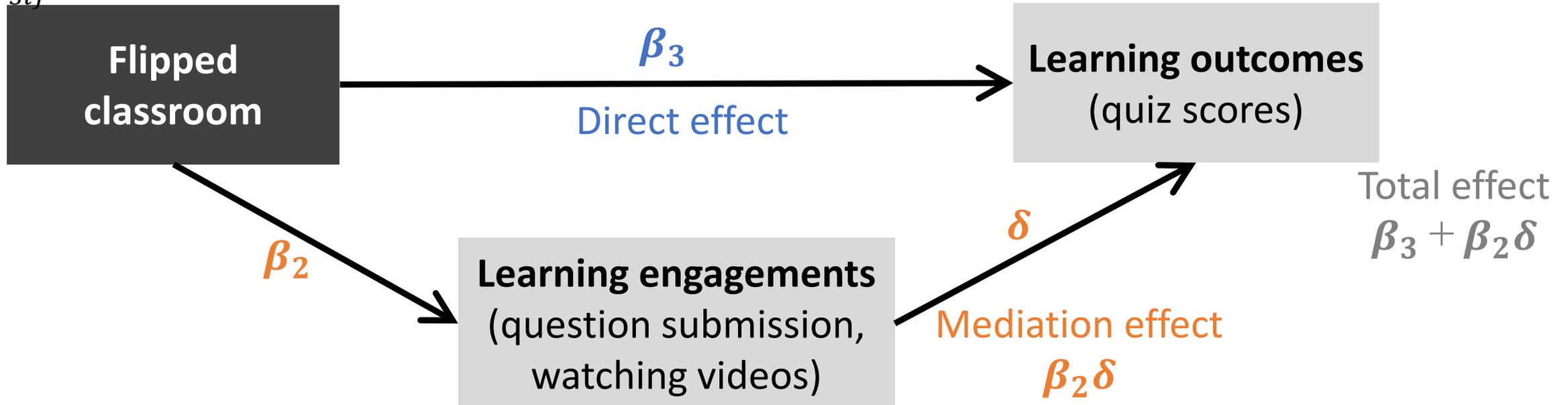
# Causal mediation analysis

Learning engagement<sub>ij</sub>

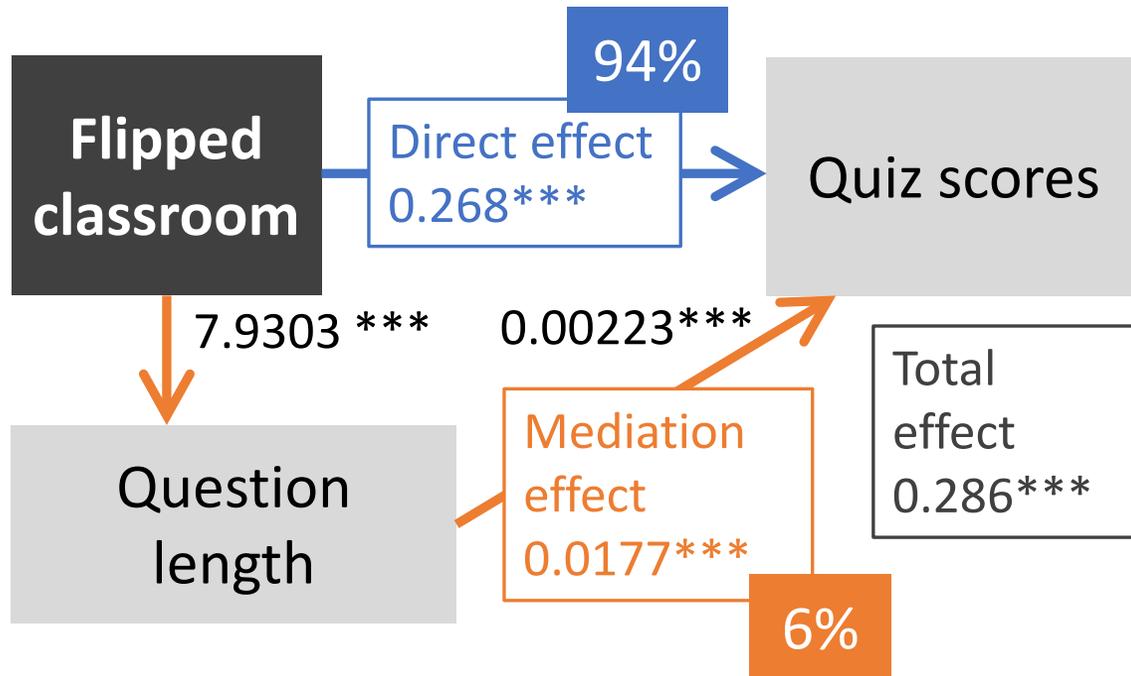
$$= \alpha_2 + \beta_2 \text{Flipped}_{ij} + \sum_k \gamma_k \text{Student characteristics}_{ki} + \sum_j \theta_j \text{Lesson dummies}_j + \varepsilon_{2ij}$$

Learning outcome<sub>ij</sub>

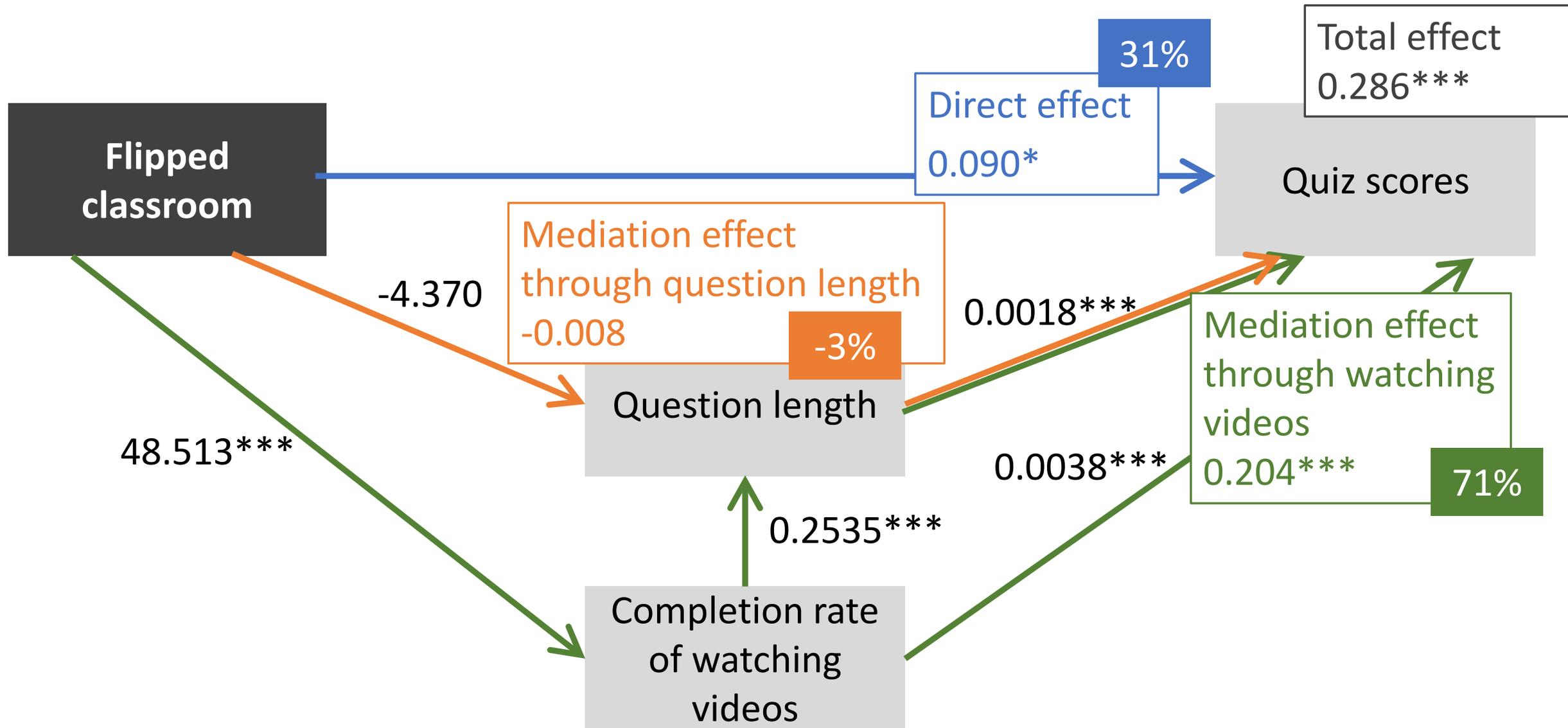
$$= \alpha_3 + \beta_3 \text{Flipped}_{ij} + \delta \text{Learning engagement}_{ij} + \sum_k \gamma_k \text{Student characteristics}_{ki} + \sum_j \theta_j \text{Lesson dummies}_j + \varepsilon_{3ij}$$



# Causal mediation analysis: results



# Two-mediator mediation analysis



# Summary statistics : learning outcomes

		Mean	Std. dev.	Min	Max	# of obs.
<b>Quiz scores</b>	<b>Flipped</b>	3.25	1.27	0	5	1001
	<b>Traditional</b>	3.04	1.39	0	5	966
<b>Final exam scores</b>	<b>Flipped</b>	1.41	0.99	0	3	1082
	<b>Traditional</b>	1.39	0.95	0	3	1102

# Summary statistics: learning engagements

		Mean	Std. dev.	Min	Max	# of obs.
The scores of exercise problems	Flipped	1.72	0.70	0	2	1172
	Traditional	1.59	0.81	0	2	1194
Question submission (submitted=1, not=0)	Flipped	0.78	0.42	0	1	1172
	Traditional	0.76	0.43	0	1	1194
Question length	Flipped	61.84	58.95	0	381	1172
	Traditional	51.98	55.11	0	374	1194
Attendance (Attended=1, not=0)	Flipped	0.85	0.35	0	1	1172
	Traditional	0.81	0.39	0	1	1194

		% of students who ever watched videos	Completion rate of watching videos among the students who ever watched videos(%)				# of obs.
			Mean	Std. dev.	Min	Max	
Watching videos before taking quizzes	Flipped	58.45	79.12	39.98	0.10	243.40	685
	Traditional	4.77	77.45	43.05	0.08	137.29	57

## Summary statistics : Survey before the experiment

	Section	Mean	Std. dev.	Min	Max	# of obs.	
<b>Attitude toward group learning</b>	C	3.77	0.64	1.88	5.00	175	
	D	3.69	0.74	1.50	5.00	155	
<b>Eagerness to learn</b>	C	3.50	0.61	1.00	4.00	170	
	D	3.60	0.56	2.00	4.00	149	
<b>Self-regulated learning strategies</b>	<b>Behavioral</b>	C	3.26	0.89	1.00	5.00	176
		D	3.14	0.89	1.00	5.00	155
	<b>Cognitive</b>	C	3.59	0.67	1.75	5.00	175
		D	3.38	0.67	1.38	5.00	154
	<b>Emotional</b>	C	3.02	0.98	1.00	5.00	176
		D	2.97	1.09	1.00	5.00	155
	<b>Motivational</b>	C	3.36	0.81	1.17	5.00	175
		D	3.12	0.85	1.00	5.00	155

## Summary statistics : Survey after flipped classrooms and after traditional lectures

		Mean	Std. dev.	Min	Max	# of obs.	
<b>Satisfaction</b>	<b>Flipped</b>	3.81	1.02	1.00	5.00	324	
	<b>Traditional</b>	4.15	0.80	1.00	5.00	322	
<b>Attitude toward group learning</b>	<b>Flipped</b>	3.79	0.69	1.25	5.00	321	
	<b>Traditional</b>	3.80	0.70	1.00	5.00	322	
<b>Eagerness to learn</b>	<b>Flipped</b>	3.24	0.63	1.00	4.00	324	
	<b>Traditional</b>	3.27	0.66	1.00	4.00	324	
<b>Self-regulated learning strategies</b>	<b>Behavioral</b>	<b>Flipped</b>	3.32	0.86	1.00	5.00	322
		<b>Traditional</b>	3.39	0.92	1.00	5.00	321
	<b>Cognitive</b>	<b>Flipped</b>	3.56	0.68	1.00	5.00	323
		<b>Traditional</b>	3.60	0.69	1.25	5.00	323
	<b>Emotional</b>	<b>Flipped</b>	3.29	1.00	1.00	5.00	321
		<b>Traditional</b>	3.42	0.93	1.00	5.00	323
	<b>Motivational</b>	<b>Flipped</b>	3.45	0.79	1.00	5.00	320
		<b>Traditional</b>	3.67	0.76	1.67	5.00	323