Training Judges and Civil Servants

A Human-Centric AI Approach

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Roadmap

- Al to understand, diagnose, and address injustice
- Economic impacts of judicial state capacity
 - Physical capital (digital infrastructure)
 - Human capital (training)

How Can We Train Public Officials?

- The training of public officials is one of the key dimensions governments use to improve bureaucratic performance
- For example, in 2017 alone, the U.S. allocated approximately 4% of its annual budget for personnel compensation and benefits, or around \$10 billion, towards training civil servants (Credibility Engine 2021; USA Spending)
- Despite its significance, there is limited empirical research on effective methods to improve the training of public officials using RCTs
- Particularly relevant in the judiciary, as slow and unreliable justice systems represent a key barrier to economic growth

Personnel economics of the state (Finan, Olken, and Pande 2017)

selection

incentives

monitoring

attitudes, preferences, beliefs

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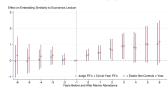
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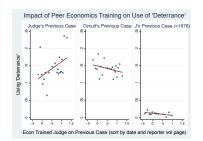
Upon economics training, judges

used economics language in opinions

Effect of Manne Program on Economics Language

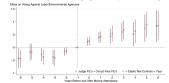


impacted their peers

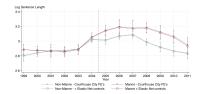


changed how they decided

Effect of Manne Program on Ruling Against Labor/Environment Agencies



rendered 20% longer sentences

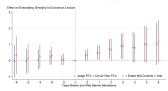


Ash, Chen, and Naidu, Quarterly J Econ R/R

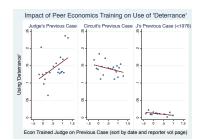
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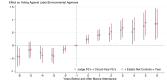


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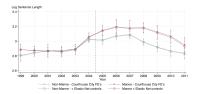


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Effect of Manne Program on Ruling Against Labor/Environment Agencies Effort on Votion Against Labor/Environmental Agancia



rendered 20% longer sentences



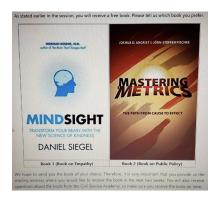
Ash, Chen, and Naidu, Quarterly J Econ R/R

What about econometrics?

Pakistan Civil Service

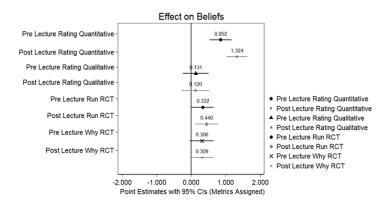
- Advisors to the President, Prime Minister, cabinet ministers, governors and police chiefs.
- "key wheels on which the entire engine of the state runs" (Central Superior Services, 2019)
- Select 1.5% of test-takers

Training deputy ministers in school of thought associated with credibility revolution



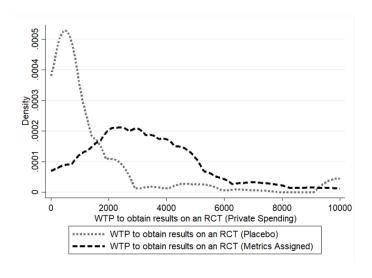
- Book lottery
- Videos by Authors
- Graded summarization and visualization exercises (SEL)
- Self-persuasion presentation to others

Metrics Training Increased Demand for Causal Evidence



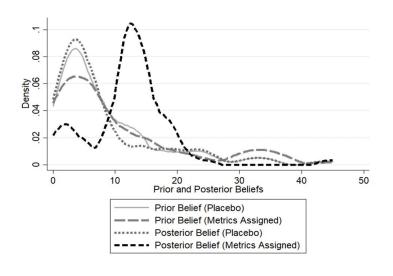
Treated Policymakers' Willingness to Pay for RCTs increase

Treated policymakers' performance in national research methods and public policy exams improves



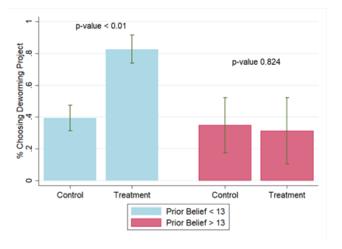
Treated Policymakers Update Posterior Beliefs

Increased Responsiveness to Causal Evidence



Metrics Training Impacts Deworming Project Choice

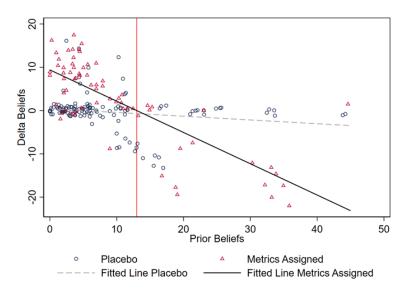
In their official duties, twice as likely to choose and triple funding for policies with RCT evidence

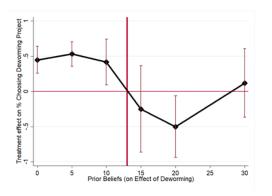


Especially if their prior beliefs were below the evidence from RCT

Non-Treated Policymakers Do Not Update Beliefs

or respond to causal evidence

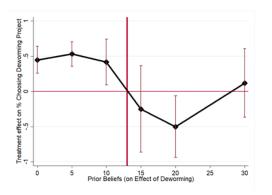




 ${\sf AEARCTR-0010583}, \ \textit{Training Policymakers in Econometrics, Economic Journal R/R}$

DEMAND FOR INFORMATION

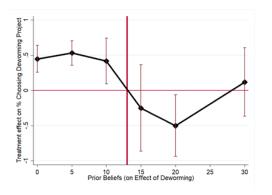
RESPONSIVENESS TO INFORMATION



AEARCTR-0010583, Training Policymakers in Econometrics, Economic Journal R/R

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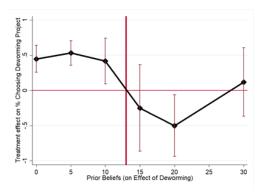
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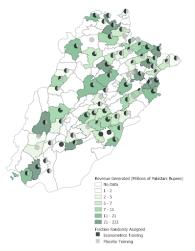
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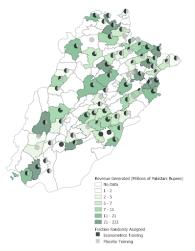
Metrics Training Improves Fiscal State Capacity

The results extend to tax officers: Econometrics education led to a 20% increase in the use of tax reminders and 40% increase in tax collection



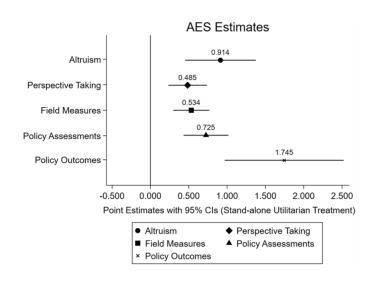
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AEARCTR-0010583, Training Policymakers in Econometrics II, Management Science R/R

Randomizing schools of thought on cultivating prosociality Training effective altruism via the utilitarian value of empathy renders greater altruism



What is empathy

- Puzzle: most profitable firms rank highly in empathy
 - Is cut throatiness not going to get you more profits?
 - Empathy can boost profit
 - Employees and employers with soft skills navigate complex relationships, satisfy client needs, and maintain employee trust and motivation
 - Every new hire is trained in a "Google Empathy Lab"
 - Employees put on virtual reality goggles and practice their perspective-taking or empathy
 - ► The employees are encouraged to take the perspective of homeless person and "see the world from the standpoint of the less fortunate"
 - So 21st century companies like Google may be investing in empathy to improve their profits.
- Qualitative and quantitative evidence backs the idea that empathy is beneficial.

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Malleability (Dweck 2006; Weisz and Zaki 2017)

What is empathy

- Empathy is changeable and can be influenced over time
 - Researchers gave virtual reality goggles to people and made them take perspective of others (e.g. see the lives through the eyes of homeless people and beggars)
 - ► The level of empathy they showed to others increased both in surveys as well as high-stake decisions
- Qualitative and quantitative evidence backs the idea that empathy is not fixed but malleable. It is a skill that can be developed.
- Structure and transcript similar
 - Narratives about public figures
 - Quantitative evidence from scientific articles

GROWTH MINDSET (Yeager et al. Nature 2019)

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Altruism

You keep

4 credit (s)

In this game, we allocate you 10 credits. Your task is to choose how many credits you want to keep for yourself and how many you want to give to another participant.

Please choose an option from the following distributions:

(Click on the axis below to position and move the cursor.)

You are giving
6 credit (s)

 $U \uparrow 6$ percentage points

Charity

In this game, we offer you to make 5 choices. Only one of these choices will be used to determine the credits received if you are drawn.

For each of the choices, you must choose between receiving the credits or donating the credits to UNICEF. If you are drawn, we will transfer your donation to UNICEF and purchase measles vaccines.

Measles is an extremely infectious disease that spreads very quickly in densely populated spaces. In vulnerable children, the disease is often fatal (more than 100,000 deaths per year worldwide), and can cause long-term physical or mental damage. UNICEF conducts major immunization campaigns, especially after natural disasters and other emergencies, to prevent the spread of the disease.

For each row, please choose one of the two options:

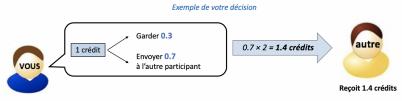
1) (I receive 2 credits; no donation to UNICEF	O donation of 10 credits to UNICEF; no credits for me
2) (I receive 4 credits; no donation to UNICEF	O donation of 10 credits to UNICEF; no credits for me
3) (I receive 6 credits; no donation to UNICEF	O donation of 10 credits to UNICEF; no credits for me
4) (I receive 8 credits; no donation to UNICEF	O donation of 10 credits to UNICEF; no credits for me
5) 〇	I receive 10 credits; no donation to UNICEF	O donation of 10 credits to UNICEF; no credits for me

U ↑ 20 percentage points

Cooperation

Decision on your part

You must decide how much of this initial endowment you wish to transfer to the other participant (between 0 and 1 credit). The transferred quantity will be <u>doubled</u> and the other participant will receive this doubled quantity. What you choose not to transfer remains in your possession but will not however be doubled.



Decision (simultaneous) from your partner

The other participant simultaneously makes the same decision. He decides how much of his initial endowment he wishes to transfer to you (between 0 and 1 credit). You will receive double this transferred amount.

$U \uparrow 14$ percentage points

Coordination

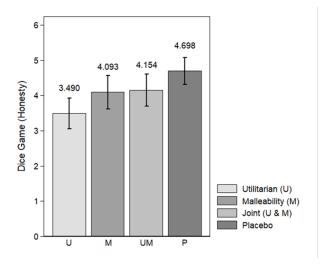
Each round, each of you has the choice between two options: A and B.

Your winnings are shown in the table below (your winnings are in blue, your partner's in black)

		L'autre participant			
		Action A	Action B		
Nous	Action A	3 crédits, 3 crédits	3 crédits, 0 crédits		
	Action B	0 crédits, 3 crédits	5 crédits, 5 crédits		

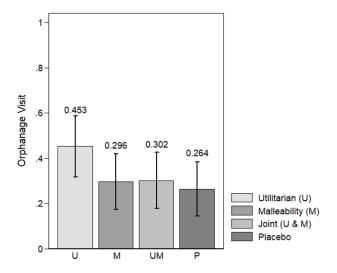
 $U \uparrow 5$ percentage points

Impact on Honesty



Each bar reports the average of self-reported die rolls

Orphanage Visits

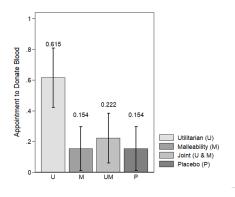


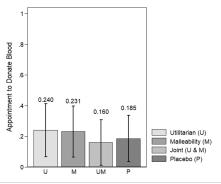
 $U \uparrow 19$ percentage points

Blood Donations

Training effective altruism increased mentalizing on consequences of decisions

Blood donations doubled only for matching blood type





- "Blood is urgently needed at the blood bank"
- "Blood for group O negative is urgently needed at the blood bank"
 - altruist would respond to both
 - effective altruist responds to latter

Altruism in Action

Volunteering increased. Amid official duties, ministers were more likely to choose social policies and recommended 4-fold funding for them

Table 6: Impact of Treatments on Policy

	Orphanage R	enovation Policy	School Ren	ovation Policy
		Funds		Funds
	Letter Sent	Recommended	Letter Sent	Recommended
		(PKR)		(PKR)
	(1)	(2)	(3)	(4)
U	0.306***	72,708**	0.386***	78,101**
	(0.0754)	(30,867)	(0.0892)	(30,181)
M	0.0599	19,007	-0.0381	17,764
	(0.0562)	(25,173)	(0.0768)	(13,888)
UM	0.0939	17,448	-0.0451	25,848
	(0.0597)	(24,144)	(0.0755)	(18,399)
Individual Controls	Yes	Yes	Yes	Yes
Observations	201	201	201	201
R-squared	0.197	0.125	0.253	0.147
Mean of dep. var. (placebo)	0.041	18367.35	0.163	8367.35

The book lottery illustrates the mechanism

Altruism in Action

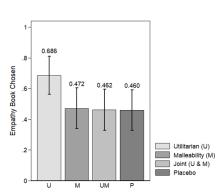
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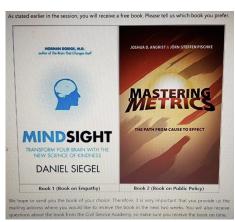
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Impact on Empathy Book Choice





U ↑ 20 percentage points

Demand for Learning Drives Long-Term Impacts

POLICIES ARE INFLUENCED BY TREATMENT ONLY WHEN THE BOOK IS ASSIGNED

Table 9: Causal Mediation Analysis - Mechanism

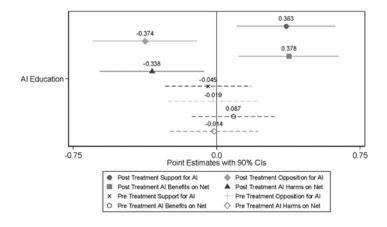
·	Orphanas	ge Renovation Policy	School	Renovation Policy
		Funds Recommended		Funds Recommended
	Letter Sent	(PKR)	Letter Sent	(PKR)
	(1)	(2)	(3)	(4)
U	-0.0703	-31,895	-0.250*	-3,443
	(0.0610)	(20,961)	(0.136)	(20,214)
M	0.208*	71.262	-0.0659	41.749
	(0.108)	(44,827)	(0.151)	(30,768)
UM	0.0284	24,604	-0.0430	60.145
	(0.109)	(51,114)	(0.168)	(45,833)
Empathy Book Assigned	0.0169	22,815	-0.317	-1,291
. , .	(0.0534)	(21,408)	(0.203)	(34,365)
UX Empathy Book Assigned	0.458***	56,736	1.124***	119.067**
	(0.138)	(40,251)	(0.229)	(51,932)
MX Empathy Book Assigned	-0.318**	-115,090**	0.0983	-16,161
,	(0.134)	(47,621)	(0.254)	(45,536)
UMX Empathy Book Assigned	-0.133	-68,845	0.213	-21,556
. , ,	(0.119)	(45,727)	(0.233)	(44,478)
Individual Controls	Yes	Yes	Yes	Yes
Observations	201	201	201	201
R-squared	0.328	0.204	0.429	0.196
Mean of dep. var. (placebo)	0.041	18367.35	0.163	8367.35

Training Public Servants

Civil Servants	Junior	Senior	Frontline
Effective Altruism	×		
Credibility Revolution	×		×
AI Fairness		×	
Gender Rights			х
Public Goods			×

Al Training and Al Fairness Activism

Al Training/Activism Impacts Al Attitudes of Ministers and their Subordinates

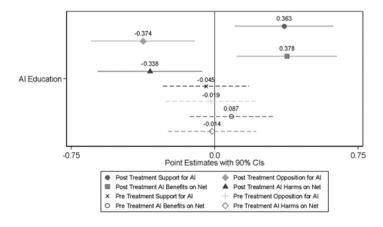


Al Fairness Activism: Weapons of Math Destruction (O'Neill 2016)

AMID LAND RECORD DIGITIZATION EFFORTS...

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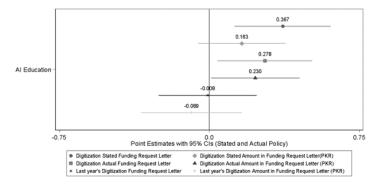
AMID LAND RECORD DIGITIZATION EFFORTS...

Al Training and Al Fairness Activism

Al Training/Activism Impacts Digitization Funding

"Only when the paper-based data is digitized, can we even begin to think of training and implementing AI algorithms"

Al training increased provision of public financing for digitization projects

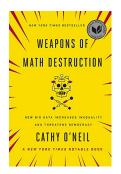


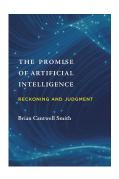
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Impact of AI Fairness Activism

 How does AI Fairness Activism arguments on the inevitability of algorithmic bias impact state and society?

Cross-randomized and distributed 4 months after the first lecture



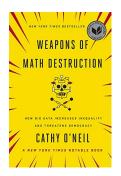


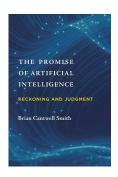
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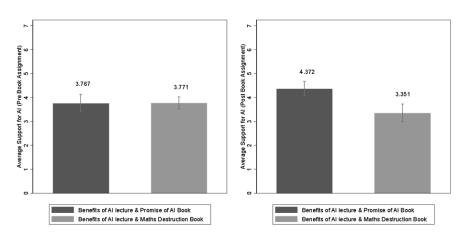




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Book Mechanism Mediates the Impact of AI Training

Figure B5: Ministers Assigned the "Benefits of AI" lectures (Pre vs Post Book Assignment)



Summarization, Visualization, Self-Persuasion

Societal Impacts



e-governance/digital democracy platform to have a uniform measure of civil servant performance

- 4 million registered citizens on its platform
- Citizens rate their satisfaction of public service delivery upon closing of the complaint on a 1 to 5 scale
- We link the deputy ministers to the complaints
- We construct two proxies for deputy ministers' performance
 - ► Citizen rating on the complaint resolution
 - Number of days for which the complaint remains oper

Societal Impacts



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by 33% in resolution time, while AI Fairness Activism worsens resolution of land disputes

Table 9: Impact of AI Education	Training and	Fairness	Activism by l	Land and Placebo	
Cabaala 6	Dood Constru	antion Co.	mulainta		

-	Schools & Road C	onstruction Comple	aints	
	Land and Resi	dential Property	Placebo - Sc.	hools & Road
	Complaints		Construction	n Complaints
	Citizen Rating	Resolution Days	Citizen Rating	Resolution Days
	Average	Average	Average	Average
	(1)	(2)	(3)	(4)
Panel A: AI Education				
AI Education	0.477**	-22.31**	0.203	-12.49
	(0.185)	(8.746)	(0.270)	(9.157)
Controls	Yes	Yes	Yes	Yes
Observations	95	95	95	95
R-squared	0.155	0.269	0.023	0.192
Mean Dep. Variable	1.703	65.356	2.403	63.723
Panel B: AI Fairness Activism				
AI Fairness Activism	-0.332*	15.85*	-0.373	8.512
	(0.192)	(8.709)	(0.251)	(8.617)
Controls	Yes	Yes	Yes	Yes
Observations	95	95	95	95
R-squared	0.126	0.244	0.041	0.182
Mean Dep. Variable	1.703	65.356	2.403	63.723

AEARCTR-0008431, AI Education as State Capacity: Experimental Evidence from Pakistan

Schools of thought have been influential in impacting citizens' lives

WOMEN'S RIGHTS MOVEMENT HAS IMPROVED LIVES OF WOMEN

BUT SLOW PROGRESS IN SOME PLACES SPEAK TO STICKINESS OF NORMS

CAN WE SHIFT THE ATTITUDES OF FRONT LINE CIVIL SERVANTS?

by 33% in resolution time, while AI Fairness Activism worsens resolution of land disputes

Table 9: Impact of AI Education Training and Fairness Activism by Land and Placebo Schools & Road Construction Complaints							
		dential Property plaints	Placebo - Schools & Road Construction Complaints				
	Citizen Rating	Resolution Days	Citizen Rating	Resolution Days			
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AEARCTR-0008431, AI Education as State Capacity: Experimental Evidence from Pakistan Schools of thought have been influential in impacting citizens' lives

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AEARCTR-0008431, AI Education as State Capacity: Experimental Evidence from Pakistan

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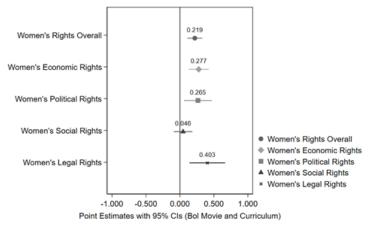
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CAN WE SHIFT THE ATTITUDES OF FRONT LINE CIVIL SERVANTS?

Transmitting Gender Rights Shifts Teacher's Attitudes

Using a visual narrative (best-selling film <u>Bol</u> ("to speak up") developed with Johns Hopkins) and 5-page curricular outline, we randomized teachers to conduct structured semester-long class discussions over women's rights.



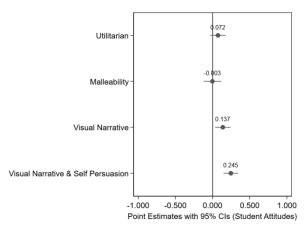
Teachers and students self-reflect together: i) Draw all the work that your father does. ii) Draw all the work that your mother does. iii) Which of these are the same? Which are different? iv) Why is that? v) Would you want the iob of your mother or your father when you grow up? vi) Why is that?

Signing of Petititons and Implicit Attitudes

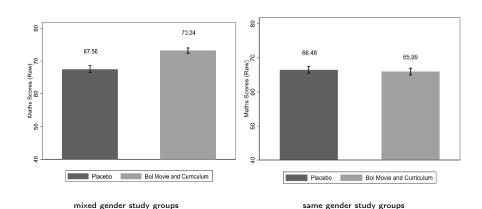
	(1)	(2)	(3)	(4)
	Gender	Petition to	Petition to	Gender IAT
	Recognition	Criminalize	Abolish	Score
	Index	Dowry	Polygamy	
Visual Narrative & Self-Persuasion	0.187***	0.566***	0.512***	0.348**
	[0.0510]	[0.143]	[0.146]	[0.162]
Visual Narrative	0.140***	0.362***	0.349**	0.247*
	[0.0511]	[0.130]	[0.140]	[0.136]
U	0.0607	0.0221	-0.0626	-0.0786
	[0.0445]	[0.104]	[0.0557]	[0.140]
M	0.0897*	0.0595	-0.0191	-0.114
	[0.0531]	[0.109]	[0.0603]	[0.123]
Individual Controls	Yes	Yes	Yes	Yes
School Fixed Effects	Yes	Yes	Yes	Yes
Observations	607	607	607	527
R-squared	0.138	0.140	0.200	0.131

Gender Rights are Oblique Transmitted to Students Even in the treatment arm only using the visual narrative and no curriculum

Figure 3: Impact on Students' Gender Attitudes



Transmitting Gender Rights Improves Student Achievement Only for Mixed Gender Study Groups



Mixed-Gender Study Groups

Increased cooperation and coordination with the opposite gender

Panel A: Responses when facing opposite gender						
	(1)	(2)	(3)	(4)		
	Redistribution	Competitiveness	Cooperation	Coordination		
UX Mixed Study Group	-0.0661	-0.0219	-0.00630	-0.0168		
	[0.0646]	[0.0666]	[0.0377]	[0.0347]		
MX Mixed Study Group	-0.0812	-0.0961	-0.0230	0.0122		
	[0.0642]	[0.0669]	[0.0380]	[0.0345]		
Movie X Mixed Study Group	-0.0375	-0.0666	0.171***	0.184***		
	[0.0705]	[0.0705]	[0.0386]	[0.0481]		
Movie-Curriculum X Mixed Study Group	-0.0406	-0.0358	0.299***	0.333***		
	[0.0671]	[0.0733]	[0.0349]	[0.0347]		
Playing with Opposite Gender	Yes	Yes	Yes	Yes		
Individual Controls & School FE	Yes	Yes	Yes	Yes		
Observations	9,145	9,145	9,145	9,145		
R-squared	0.008	0.013	0.610	0.331		

AEARCTR-0007465, Mehmood, Naseer, and Chen, American Economic J: Policy 2024

students looking up to teachers can explain oblique transmission

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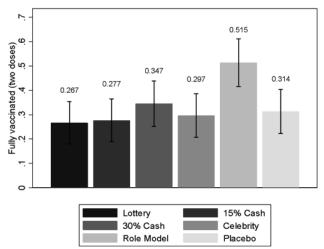
AEARCTR-0007465, Mehmood, Naseer, and Chen, American Economic J: Policy 2024 students looking up to teachers can explain oblique transmission

Role Models Matter for Public Goods

Covid vaccination

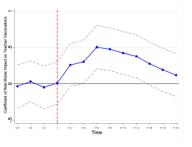
and Cash Incentives Do Not

Figure 1: Impact on Full Vaccinations

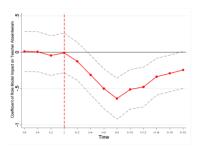


$.. Reducing\ Absentee is m$

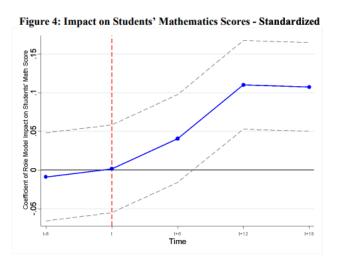
Panel A: Impact of Role Model on Teachers' Vaccinations



Panel B: Impact of Role Model on Teachers' Absenteeism



..Increasing Student Achievement



Empathy Elevates Receptiveness to Messenger (theory of mind)

Table 2: Impact on Vaccinations - Standardized							
		Fully V	accinated				
	(1)	(2)	(3)	(4)			
Lottery	-0.144	-0.150	-0.137	-0.152			
	(0.140)	(0.137)	(0.140)	(0.137)			
Cash 15%	-0.0782	-0.0599	-0.0796	-0.0542			
	(0.137)	(0.138)	(0.138)	(0.139)			
Cash 30%	0.0591	0.0655	0.0636	0.0656			
	(0.139)	(0.137)	(0.139)	(0.138)			
Celebrity	0.00251	0.00582	0.00415	0.00486			
	(0.138)	(0.139)	(0.138)	(0.139)			
Role Model	0.374**	0.198	0.390**	0.211			
	(0.150)	(0.147)	(0.151)	(0.148)			
Role Model X Female RMET		0.219**		0.204*			
		(0.102)		(0.109)			
Role Model X Male RMET			0.00508	0.110			
			(0.110)	(0.107)			
Female RMET		0.127***		0.146**			
		(0.0468)		(0.0593)			
Male RMET			0.0454	-0.0324			
			(0.0455)	(0.0566)			
Individual Teacher Controls	Yes	Yes	Yes	Yes			
School Fixed Effects	Yes	Yes	Yes	Yes			
Observations	607	607	607	607			
R-squared	0.163	0.197	0.165	0.199			

PROGRESSIVE CENDER ATTITUDES CAN BE FOSTERED

AND TRANSMITTED THROUGH ROLE MODELS

WHAT STYMIES RIGHTS REVOLUTIONS?

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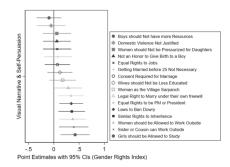
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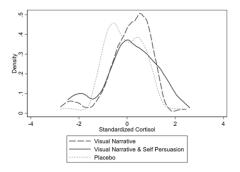
PROGRESSIVE GENDER ATTITUDES CAN BE FOSTERED

AND TRANSMITTED THROUGH ROLE MODELS

WHAT STYMIES RIGHTS REVOLUTIONS?

Progressive Gender Rights Increases Stress





elevated stress in blood cortisol

Progressive Gender Rights Increases Domestic Violence

Panel A: Impact on Domestic Violen	-	-				
	(1)	(2)	(3)	(4)	(5)	(6)
	Victim of	Domestic :	Beliefs abo	ut Domestic	Victim of	Domestic
	Viol	ence	Viol	ence	Viole	епсе
					(Marlowe	-Crowne)
Visual Narrative	0.285**	0.273**	-0.216*	-0.205	0.274*	0.267*
	[0.129]	[0.128]	[0.128]	[0.129]	[0.162]	[0.161]
Visual Narrative & Self-Persuasion	0.375***	0.357**	0.0996	0.114	0.344**	0.332*
	[0.144]	[0.144]	[0.135]	[0.135]	[0.172]	[0.173]
Individual Controls	No	Yes	No	Yes	No	Yes
School Fixed Effects	Yes	Yes	Yes	Yes	Yes	Yes
Observations	607	607	607	607	526	526
R-squared	0.093	0.101	0.123	0.130	0.096	0.106
Mean of Dep. Variable	0.000	0.000	0.000	0.000	0.000	0.000

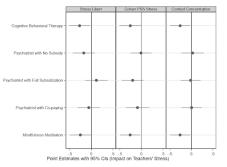
Novel nonconformist ideas can be fostered but it comes with costs to norm subverters

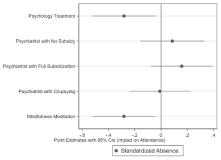
Some costs dissipate once the new norms diffuse in society

reduction of 1.8 standard deviations in blood cortisol stress when all peers are also treated

	(1)	(2)	(3)	(4)
	Stress Likert	Stress Dummy	Cortisol Raw	Standardized
		•		Cortisol
Fraction of Joint Treated	0.854	-0.120	-5.988**	-1.810**
Teachers X Joint Treatment	[1.160]	[0.317]	[2.666]	[0.806]
Visual Narrative & Self- Persuasion	0.217	0.263**	2.729***	0.825***
rersuasion	[0.362]	[0.102]	[0.823]	[0.249]
Individual Controls	Yes	Yes	Yes	Yes
School Fixed Effects	Yes	Yes	Yes	Yes
Observations	607	607	607	607
R-squared	0.157	0.293	0.151	0.151
Mean of Dep. Variable	2.269	0.091	11.152	0.000

More so than cognitive behavioral therapy, meditation, or psychiatry





Mental health support reduces stress by 0.2 sd

and reduces absenteeism, improving test scores

AEARCTR-0007465, Enhancing Public Sector Performance: Mindfulness and CBT

Social solidarity increases the efficacy of mental health interventions

to 0.8 standard deviations of cortisol stress

	(1)	(2)	(3)	(4)	(5)	(6)
	Stress	Likert	Cohen F	Cohen PSS Stress		tisol
					Concer	itration
Cognitive Behavioral Therapy X Wristband (CBT x T)	0.00584	-0.0876	-0.153	-0.185	-0.124	-0.106
	[0.412]	[0.412]	[0.345]	[0.353]	[0.349]	[0.373]
Psychiatrist No Subsidy X Wristband (PNS x T)	-0.0254	-0.00854	0.0326	0.127	-0.708	-0.628
	[0.428]	[0.432]	[0.410]	[0.417]	[0.500]	[0.504]
Psychiatrist Full Subsidization X Wristband (PFS x T)	-0.839*	-0.839*	-0.913**	-0.848**	-0.841**	-0.714*
	[0.475]	[0.456]	[0.410]	[0.408]	[0.376]	[0.378]
Psychiatrist with Co-paying X Wristband (PCP x T)	-0.786*	-0.695*	-0.891**	-0.827**	-0.742**	-0.715*
	[0.407]	[0.409]	[0.393]	[0.401]	[0.369]	[0.370]
Mindfulness Meditation X Wristband (MM x T)	0.236	0.222	-0.0744	-0.0526	-0.195	-0.206
	[0.433]	[0.434]	[0.393]	[0.405]	[0.391]	[0.407]
Wristband	-0.0913	-0.0723	0.206	0.166	0.275	0.221
	[0.326]	[0.319]	[0.264]	[0.270]	[0.251]	[0.260]

How Can We Train Public Officials?

are there principles that extend to training judges and apply to human-centric AI?

- SELF-REFLECTION (effective altruism, econometrics, gender rights)
- DEMAND FOR LEARNING (effective altruism, econometrics)
- SOCIAL-EMOTIONAL LEARNING (effective altruism, econometrics, AI)
- COMMUNITY FOR NORM CHANGE (gender rights, mental health)

Civil Servants	
Effective Altruism	Simplified Feedback (Stage 1)
Econometrics	Socratic Method (Stage 2)
Al Fairness	Self Reflection (IATs) (Stage 3)
Gender Rights	Social Emotional Learning (SEL) (Stage 4)
Role Models	Social Comparison (Stage 5)
Moral Bandwagoning	Community of Practice (Stage 6)

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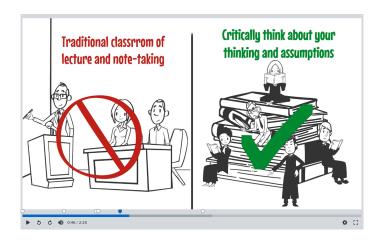
Civil Servants	Judges
Effective Altruism	Simplified Feedback (Stage 1)
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AI Fairness	Self Reflection (IATs) (Stage 3)
Gender Rights	Social Emotional Learning (SEL) (Stage 4)
Role Models	Social Comparison (Stage 5)
Moral Bandwagoning	Community of Practice (Stage 6)

Setting

- Judicial Academy of Peru is working on the transition from theory to case-based teaching, which was already the primary method of teaching in American law schools since the 1970s (Moskovitz 1992).
- In this two-year engagement, we embarked on four randomized light-touch interventions.

Socratic Method (Study 1)

a pedagogical innovation from antiquity focusing on reflective inquiry



Socratic Treatment

 Socratic treatment encourages student to think critically - challenging their own as well as their teachers and classmates assumptions about the material covered in class.

THINK ABOUT THESE QUESTIONS

- 1. WHAT OPINIONS do you have about today's topic?
- 2. What ASSUMPTIONS are you making towards that opinion?
 - 3. During the class, are your assumptions proving TRUE or getting CHALLENGED?
- 4. WHEN are your assumptions the SAME as your classmates?
- 5. WHEN are your assumptions DIFFERENT from your classmates?

Control treatment reminded students to focus on the teacher's ideas and take notes

Data Collection

- Performance in the judge academy
- Endline survey one month after course completion
 - ▶ A measure of curiosity/desire to learn the truth
- Curiosity elicited as part of an exercise based on a supreme court case
 - Participants read a brief description of the case
 - Asked to make guesses about several aspects of case outcome
 - ▶ They could choose to learn more about ruling in the supreme court case

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Socratic Training improved Performance

Students assigned to Socratic treatment were 2.6 percentage points more likely to pass and increased grades by 0.23 standardized units

	IT	T	To	T
	(1)	(2)	(3)	(4)
VARIABLES	grade	pass	grade	pass
Assigned to Socratic	0.311*	0.026*		
	(0.173)	(0.014)		
Saw Socratic	[0.088]	[0.088]	0.950* (0.542)	0.080* (0.045)
Constant	15.633*** (0.195)	0.844*** (0.015)	[0.080] 15.633*** (0.195)	[0.080] 0.844*** (0.015)
Observations R-squared	1,368 0.001	1,370 0.001	1,368	1,370
Individuals	1368	1370	1368	1370

Click data shows larger treatment effects on those who finished the 4-minute video (ToT)

Socratic Training reduced Motivated Reasoning

Students assigned to Socratic treatment were 6.5 percentage points more curious

		ITT			ToT	
	(1)	(2)	(3)	(4)	(5)	(6)
VARIABLES	VDO	SBU	Curiosity	VDO	SBU	Curiosity
Assigned to Socratic	-0.016	0.028	0.065**			
Thoughed to booldine	(0.042)	(0.047)	(0.027)			
	[0.904]	[0.896]	[0.030]			
Saw Socratic	1		[]	-0.038	0.066	0.122**
				(0.100)	(0.109)	(0.053)
				[0.910]	[0.896]	[0.020]
Constant	0.980***	0.980***	0.874***	0.980***	0.980***	0.874***
	(0.030)	(0.029)	(0.023)	(0.030)	(0.029)	(0.023)
Observations	498	498	300	498	498	300
R-squared	0.000	0.001	0.013		0.004	
Individuals	498	498	300	498	498	300

and requested additional information on the supreme court case vignette

Community of Practice (Study 2)

- Community of Practice (Wenger 1991) a pedagogical innovation focusing on regular and concrete learning from peers.
 - ► The peer met the teacher to provide feedback
 - ★ teaching strategies: case method, role play, student participation

8-months intervention

JAT trained 604 active judges and prosecutors across 8 rounds of 22 classes in virtual sessions in 2020

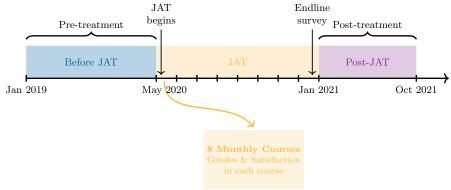


Figure: Program timeline

Course timeline

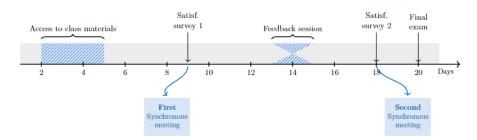


Figure: Course timeline

Data

- Data on academic and behavioral outcomes:
 - Grades in homework, tests, and final exams in each course
 - Judicial training satisfaction with the learning experience
 - Endline survey of behavioral exercises (including gender IAT)
- Data on professional outcomes (case records):
 - ▶ We scrape & merge all publicly available case records from 2018-2021
 - We create indicators of efficiency and quality:
 - ★ clearance rate: # cases resolved / # cases filed
 - ★ time to disposition: time from filing to resolution of the case
 - ★ appeal rates: # cases appealed / # cases resolved
 - ★ rates of appeals' reversal: # reversals / # appeals

Community of Practice increases Grades and Satisfaction

		Grades					Satisfaction	
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	
	Forum grade	Reading grade	Homework grade	Exam grade	Final grade	With teacher	With course	
Monitoring	0.0702	0.0818**	0.0794	0.1609	0.1196**	0.0964*	0.0875*	
	(0.0759)	(0.0347)	(0.0499)	(0.0956)	(0.0578)	(0.0553)	(0.0504)	
Observations	4,968	4,988	5,017	5,000	5,021	10,023	9,967	
R ²	0.13221	0.16559	0.12541	0.06765	0.09313	0.02617	0.03810	
Dependent variable mean	0.04144	0.01453	0.05110	0.08771	0.07569	0.06086	0.06448	
Round fixed effects Course fixed effects	√	√	√	√	√	√	✓	

- 0.12 standard devations (SD) in final grades
- 0.10 and 0.09 SDs in satisfaction

Community of Practice increases Case Clearance Rates

	(1)	(2)	(3)	(4)	(5)	(6)
	Ruling favors plaintiff	Appeal of ruling	Reversal of ruling	Clearance rate	Time to disposition	Timely Resolved
Panel A: Post Treatment						
Monitoring	0.0866	-0.1017	-0.0038	0.1683**	-0.2410	0.1799*
	(0.1189)	(0.1384)	(0.0591)	(0.0759)	(0.2485)	(0.1047)
Observations	169	169	169	203	219	219
R Squared	0.102	0.326	0.158	0.101	0.182	0.191
Dependent variable mean	0.8182	0.4915	0.0899	0.3220	-0.0496	0.4622

Note: Standard errors are clustered at the judge level. Time to disposition is standardized with respect to the control group mean. All regressions include strata controls. All regressions include judge pre treatment covariates including age, sex, years of tenure, years in the bar association. They also include case speciality covariates. Panel A shows regression coefficients from a post-treatment specification. Panel B shows coefficients from a DiD specification. * $^*p^* < 0.10$, * $^*p^* < 0.05$, * $^*p^* < 0.01$.

8-month training program

Personalized feedback mechanism

To evaluate whether the effect is primarily driven by the monitoring or the peer feedback component of the intervention

- we use the fact that the feedback only affects the second class
- whereas monitoring affects both classes

Personalized feedback mechanism

We find that the effects seem to be driven by the second class

	Satisfaction with teacher				Satisfaction with course				
	(1) First	(2) Second	(3) Avg.	(4) Diff.	(5) First	(6) Second	(7) Avg.	(8) Diff.	
Monitoring	0.0482 (0.0527)	0.1324** (0.0529)	0.0894* (0.0518)	0.0821*** (0.0202)	0.0457 (0.0502)	0.1295** (0.0525)	0.0866* (0.0505)	0.0814*** (0.0192)	
Observations \mathbb{R}^2 Dependent variable mean	$\begin{array}{c} 4,986 \\ 0.03318 \\ 0.02951 \end{array}$	$\begin{array}{c} 4,981 \\ 0.03584 \\ 0.09125 \end{array}$	$\begin{array}{c} 4,988 \\ 0.03763 \\ 0.05933 \end{array}$	$\begin{array}{c} 4,979 \\ 0.01182 \\ 0.05933 \end{array}$	$\begin{array}{c} 4,986 \\ 0.04004 \\ 0.02765 \end{array}$	$\begin{array}{c} 4,981 \\ 0.04111 \\ 0.10134 \end{array}$	$\begin{array}{c} 4,988 \\ 0.04475 \\ 0.06341 \end{array}$	$\begin{array}{c} 4,979 \\ 0.01431 \\ 0.07122 \end{array}$	
Round fixed effects Course fixed effects	√ ✓	√							

the feedback component may be driving the results of the intervention

Community of Practice effects are larger for females

Females in treated classes had higher grades and satisfaction

		Satisfaction					
	(1)	(2)	(3)	(4)	(5)	(6) With teacher	(7) With course
	Forum grade	Reading grade	Homework grade	Exam grade	Final grade	with teacher	with course
Panel A: Males							
Monitoring	0.0556	0.0467	0.0536	0.1425	0.0829	0.0567	0.0332
	(0.0813)	(0.0470)	(0.0590)	(0.0950)	(0.0663)	(0.0592)	(0.0567)
Observations	3108	3123	3142	3129	3145	6248	6248
R Squared	0.137	0.162	0.119	0.057	0.088	0.035	0.042
Dependent variable mean	0.0371	-0.0076	0.0496	0.0836	0.0644	0.0518	0.0685
Panel B: Females							
Monitoring	0.0971	0.1437***	0.1012*	0.1769	0.1555**	0.1389	0.1794*
9	(0.0734)	(0.0511)	(0.0518)	(0.1108)	(0.0672)	(0.0951)	(0.0969)
Observations	1860	1865	1875	ì871	1876	3719	3719
R Squared	0.140	0.200	0.169	0.105	0.129	0.050	0.061
Dependent variable mean	0.0487	0.0516	0.0537	0.0945	0.0946	0.0747	0.0576

Community of Practice reduces Gender IAT bias

especially for male judges and prosecutors

	Baseline			Baseline+Controls			
	(1) All	(2) Females	(3) Males	(4) All	(5) Females	(6) Males	
Monitoring	0.3580** (0.1469)	0.1451 (0.2268)	0.4183** (0.1929)	0.3575** (0.1498)	0.1362 (0.2332)	0.4192** (0.1957)	
Lee Lower bound Lee Upper bound	-0.0065 0.5551	-0.0571 0.2424	-0.0057 0.7446	-0.0065 0.5551	-0.0571 0.2424	-0.0057 0.7446	
Observations \mathbb{R}^2 Dependent variable mean	$\begin{array}{c} 292 \\ 0.02836 \\ 0.15741 \end{array}$	112 0.07132 0.09413	$180 \\ 0.03628 \\ 0.19678$	$\begin{array}{c} 291 \\ 0.03820 \\ 0.15607 \end{array}$	112 0.10496 0.09413	179 0.06437 0.19482	

highlights potential for cultivating active participation in mixed groups in reducing implicit bias in high-stakes decision-makers

AEARCTR-0007113, Training and Bureaucratic Performance

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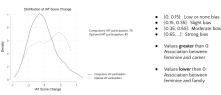
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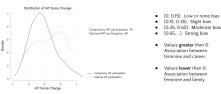
AEARCTR-0007113, Training and Bureaucratic Performance

WHAT ABOUT DIRECTLY ADDRESSING IMPLICIT BIAS

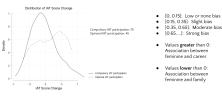
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 - ► The more people feel that their autonomy is protected and that they are in control of the conversation—able to choose when feedback is given—the better they respond to it (West, et al. 2018)
 - ▶ Does the choice to learn about implicit biases reduce implicit bias?
- Judges randomly assigned to
 - have the option to take IAT became less biased in their IATs



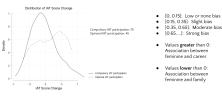
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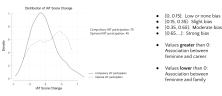
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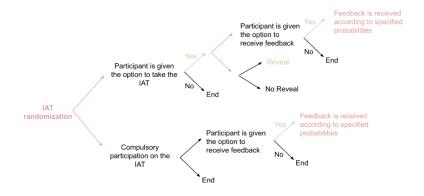


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Self Reflection Can Be Theoretically Unpacked

Stage I: Choose to self-examine



Stage II: Choose to see information conditional on examination

Stage III: Receive information conditional on demand

Self Reflection Can Be Theoretically Unpacked

Stage I: Option to self-reflect (vs. Compulsory IAT)

Stage II: Option to receive information (vs. no information)

	No Option to See Feedback	Option to See Feedback	
Compulsory IAT Participation (%)	68 (5%)	617 (45%)	685
Optional IAT Participation (%)	343 (25%)	342 (25%)	685
	411	959	Total participants: 1370

Having the option to self-reflect appears key

	(1)	(2)	(3)	(4)
VARIABLES	IAT score change	IAT score change	IAT score endline	IAT score endline
Option to Take IAT	0.132** (0.0316)	0.110*** (0.000259)	0.0963 (0.105)	0.124*** (0.000259)
Option to Receive Feedback	0.0281	0.0142	0.0362	0.0160
IAT and Feedback	(0.584)	(0.430)	(0.428)	(0.430)
options interaction	-0.0487	-0.0604*	-0.0659	-0.0677*
Observations Controls	(0.589) 120 No	(0.0662) 120 Yes	(0.408) 243 No	(0.0662) 120 Yes
Mean of dep var. ctrl.	.428	.428	.486	.462
Robust pval in parentheses	*** p<0.01, ** p<0.05, * p<0.1			

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Reshaping Beliefs about Oneself and Others

Teaching civil servants about malleability of disadvantaged reduces implicit biases

Table 3: Impact on IAT scores

	(1)	(2)	(2)	
	(1)	(2)	(3)	(4)
VARIABLES	IAT	IAT	IAT score -	IAT score -
	Score	Score	standardized	standardized
Growth Mindset (T1)	0.081*	0.092*	0.235*	0.267*
	(0.049)	(0.048)	(0.141)	(0.140)
Role-model (T2)	-0.053	-0.043	-0.153	-0.124
	(0.044)	(0.044)	(0.128)	(0.127)
Evidence (T3)	-0.070	-0.073	-0.203	-0.213
	(0.048)	(0.048)	(0.140)	(0.140)
Constant	-0.010	0.162	0.028	0.526
	(0.031)	(0.170)	(0.091)	(0.493)
Observations	400	400	400	400
R-squared	0.029	0.061	0.029	0.061
Controls	No	Yes	No	Yes
Mean of dependent variable	-0.0191	-0.0191	0	0

Relevant for debates on disparate treatment or sentencing severity

Social-Emotional Learning (SEL) (Study 4)

- SEL is a pedagogical innovation focusing on self-reflection.
- Judges were randomized to write 15 minutes twice a month along 10 different social-emotional learning exercises.
- Prior academic studies find SELs to have positive impact

see e.g. Eskreis-Winkler, Milkman, Gromet, Duckworth, PNAS 2019

AEARCTR-0007113, The Impact of Social-Emotional Learning on Judges

Research Design: Self-Reflection vs. Self-Distancing

Topic 1: Advice

- Personalized: Take 15-30 minutes to give advice to someone who is starting a new judge or prosecutor position like yours.
- **Generalized**: Take 15-30 minutes to write about some legal issues that new judges or prosecutors should know better.
- Topic 2: Values Reflect on a value that is important to you / others (efficiency, fairness, ..)
- Topic 3: Empowerment Reflect on talents that make you / others a good judge
- IOPIC 4: Recognition Reflect on something you are proud / not proud of as a judge
- Topic 5: Goal-Setting Reflect on a goal of yours / others
- Topic 6: Gratitude Reflect on how the program can be helpful to you
- Topic 7: Curiosity Be curious about a legal issue helpful to you / others
- TOPIC 8: Growth Mindset Reflect on some personal characteristic you can change / that is important
- Topic 9: Challenges When did you not meet expectations / and how did you deal
- IOPIC 10: VOCation Write about your motivations / others

No specific exercise significantly impacted judges' performance or implicit attitudes

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I OPIC 5: GOal-Setting - Reflect on a goal of yours / others

Topic 6: Gratitude - Reflect on how the program can be helpful to you

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No specific exercise significantly impacted judges' performance or implicit attitudes

Research Design: Self-Reflection vs. Self-Distancing

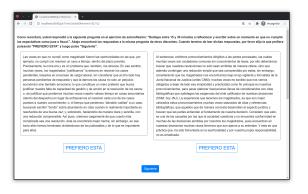
Topic 1: Advice

- Personalized: Take 15-30 minutes to give advice to someone who is starting a new judge or prosecutor position like yours.
- **Generalized**: Take 15-30 minutes to write about some legal issues that new judges or prosecutors should know better.
- Topic 2: Values Reflect on a value that is important to you / others (efficiency, fairness, ..)
- Topic 3: Empowerment Reflect on talents that make you / others a good judge
- Topic 4: Recognition Reflect on something you are proud / not proud of as a judge
- Topic 5: Goal-Setting Reflect on a goal of yours / others
- Topic 6: Gratitude Reflect on how the program can be helpful to you
- Topic 7: Curiosity Be curious about a legal issue helpful to you / others
- Topic 8: Growth Mindset Reflect on some personal characteristic you can change / that is important
- Topic 9: Challenges When did you not meet expectations / and how did you deal
- Topic 10: Vocation Write about your motivations / others

No specific exercise significantly impacted judges' performance or implicit attitudes

Causal Impact of Receiving Advice?

Social-Emotional Learning Exercises - Advice Giving & Grading

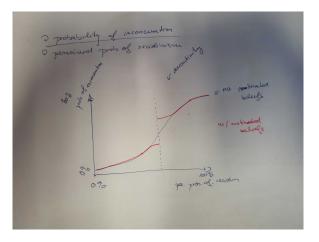


In a second monthly activity, students also reviewed and rated written responses of classmates (anonymized) to evaluate which included the best information for future judges and prosecutors.

10 months-long intervention

Motivated Reasoning in Sentencing (Study 5)

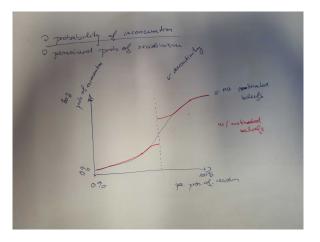
Czech judges write predicted recidivism in each sentencing decision



RCT information provision on actual recidivism

Motivated Reasoning in Sentencing (Study 5)

Czech judges write predicted recidivism in each sentencing decision



RCT information provision on actual recidivism

Can digital platforms increase recognition-respect through better

measurement of normative commitments?

COVID-19 within families amplifies the prosociality gap between adolescents of high and low socioeconomic status

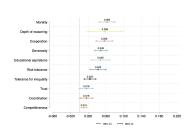
*Department of Economics, University of Lausanne, 1015 Lausanne, Switzerland; *Toulouse School of Economics, 31990 Toulouse, France; *Caperimental Economics Group, Max Planck Institute for Research on Collective Goods Econ, 33113 Bonn, Germany; *Department of Economics, University of Cologne 5005 Cologne, Certainer, or of Cologne 5005 Cologne, Certainer, or of Switzerland, Auditory of Cologne, Cologne, Certainer, or of Switzerland, Auditory of Institute, Cologne, Certainer, Cologne, Certainer, Certa

Edited by Mortheur O. Jackson, Stanford University, Stanford, CA, and approved Ottober 1, 2001 (sees) led for event lane 12, 2021; COVID-19 has had worse health, education, and labor market effects on groups with few se

effects on groups with low scoleconemic status (ESS) than on those with high SLS. Little is known, however, about whether those with high SLS. Little is known, however, about whether that are important for life soutcomes, Using parel data from before and during the pandemic, we show that COVM-19 effects one key noncognitive-skill, that is, prosocially, While promosibility is steady over for low-SLS audients gain for the pandemic, we show that over for low-SLS audients gain for the pandemic, we show that the pandemic shows the state of the pandemic we show that the pandemic shows the pandemic we show that he was the pandemic shows the shows the pandemic we show that he was the pandemic shows the shows the pandemic we show the however french high school students of high and low SLS by about the pandemic shows the pandemic shows the pandemic shows the however french high school students of high and low SLS by about the pandemic shows the pandemic shows the pandemic shows the pandemic shows the shows the pandemic shows the shows the pandemic shows the pandemic shows the pandemic shows the shows the pandemic shows the shows the pandemic sho

preferences dois implies that dismpting life enters (34) could out in the other direction and that reinforce social inequality. Here, we provide evidence on how a COVID-19 inforwhish families affects the proceedingly of high- and low-SE deters. More specifically, we sak whether COVID-19 cope neuroused by an adolescent or a farmly member in COVID-19, reinforces incepualities in proceedingly better high- and low-SES adolescents. There are sevent reasons. SES adolescents in different ways. One mount is medical distonal on hashing COVID-19, changes of been housely

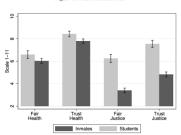
PNAS 2021





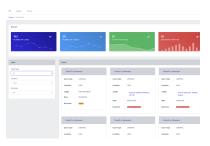
Nature Education 2024

Figure 11: Institutional Trust



Personalized Case-Based Teaching?

using the tools of machine learning



Leverages history of judge's own written decisions to evaluate how such judge would decide on a case similar to a curricular example (predicted self)

- Bringing case-based teaching to the next level
- Community of practice, Role models (predictions of others)
- Helping create culture of precedent

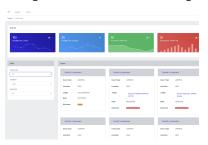
EVALUATING JUSTICE IS NOT ONLY ABOUT ECONOMIC OUTCOMES,

BUT ALSO ABOUT PERCEIVED LEGITIMACY

WHAT IS THE IMPACT OF LEGITIMACY AND TRUST IN HIDGES?

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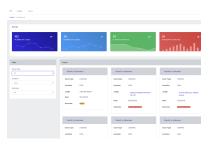
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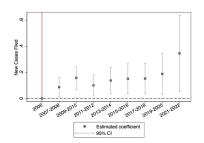
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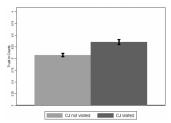
Chief Justice Chaudhry and Pakistan's democratic transition



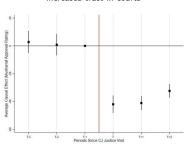
Pakistan's lawyer's movement



increased access to justice



increased trust in courts



shaped political attitudes, bringing down autocratic rule

Network Effects in Democratic Reform

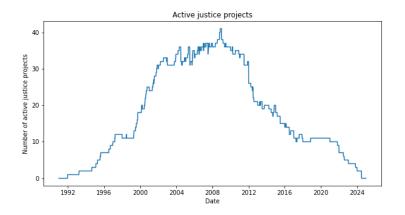
Al can increase Access, Efficiency, and Fairness of Justice reduce market level constraints to economic development

Judges	Citizens	
Static dashboards	Search	
Static dashboards with nudges	E-access	
Dynamic dashboards	E-resolution	
Top-down smart assignments	Chatbots	
Bottom-up smart assignments	Decision-Support	
Static peer-to-peer exchange	Missing Cases	
Dynamic peer-to-peer exchange	Legitimacy	
Training attitudes and preferences	Recognition-Respect	

Mexico Australia Colombia Taiwan Vietnam China Canada Asylum Brazil Germany

Do multilaterial organizations care about justice?

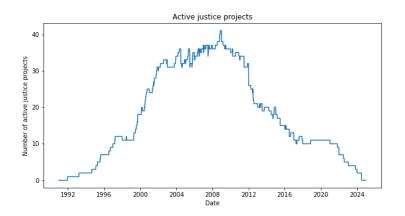
Decline in Justice Projects at the World Bank



Should we invest more in justice?

Do multilaterial organizations care about justice?

Decline in Justice Projects at the World Bank

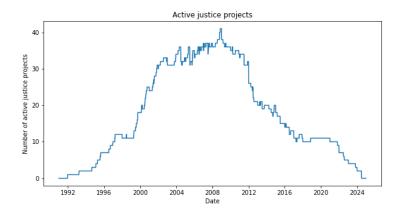


Should we invest more in justice?

What questions do you want to ask?

Do multilaterial organizations care about justice?

Decline in Justice Projects at the World Bank



Should we invest more in justice?
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