

Selection & Recording

Preliminary Sample

Preliminary Findings

Discussion

What is the external validity of sentencing research? A multi-level meta-analysis of race and gender disparities

Jose Pina-Sánchez & Ian Brunton-Smith



Background

- Selection & Recording
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- Discussion

- $\bullet\,$ Most of the sentencing evidence-base stems from the US
 - US Federal Courts
 - State Courts: Pennsylvania, Arizona, Minnesota, Florida



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 - US Federal Courts
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- This body of research has influenced sentencing policy and practice worldwide
 - particularly, debates of disparities and guidelines



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 - US Federal Courts
 - State Courts: Pennsylvania, Arizona, Minnesota, Florida
- This body of research has influenced sentencing policy and practice worldwide
 - particularly, debates of disparities and guidelines
- How generalisable are those findings?
 - we should expect differences across jurisdictions
 - but also across offence types, ethnic groups, model choices, etc.



Current Study

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- We employ multi-level meta-analysis to estimate some of that variability
- We consider both gender and race disparities
 - $-\,$ there are three meta-analyses of race disparities, all of them focus exclusively on the US
 - no real meta-analysis on gender disparities yet



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- Preliminary Sample
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Selection & Recording

- Pre-registered protocol: https://osf.io/2pnua
- $\bullet\,$ We created a pool of 1,024 potentially eligible studies
 - $-\,$ searched Scopus for academic articles, in English, published since $2000\,$
 - "sentencing" AND ("data" OR "quantitative" OR "regress*" OR "model*" OR "multilevel" OR "multi-level") AND ("decisions" OR "outcome*" OR "length" OR "*prison*" OR "custod*").



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- Selection criteria
 - studies based on real sentences imposed on adult offenders
 - reporting the association of gender/race on sentence length conditioning on legal factors



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- Selection criteria
 - studies based on real sentences imposed on adult offenders
 - reporting the association of gender/race on sentence length conditioning on legal factors
- Recording rules
 - $-\,$ estimates are transformed into multiplicative differences, i.e. the $\,\%$ change
 - estimates from different samples and ethnic groups are recorded separately
 - $-\,$ we also record: i) sample details, ii) model information, iii) the study's title, and iv) the number of citations



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Background

Selection & Recording

Preliminary Sample

Preliminary Findings

Discussion

• We have selected 120 studies for gender, 110 for race

- providing 151 estimates of gender disparities and 286 for race



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Selection & Recording

Preliminary Sample

Preliminary Findings

- We have selected 120 studies for gender, 110 for race
 - $-\,$ providing 151 estimates of gender disparities and 286 for race
- We still need to ...
 - work out recording inconsistencies
 - drop studies based on repeated samples



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Selection & Recording

Preliminary Sample

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- We have selected 120 studies for gender, 110 for race
 - $-\,$ providing 151 estimates of gender disparities and 286 for race
- $\bullet\,$ We still need to \ldots
 - work out recording inconsistencies
 - drop studies based on repeated samples
- Most studies are based on jurisdictions from the US
 - 102 out of 120 for gender, 102 out of 110 for race
 - 48 of those from the US Federal courts



Preliminary Findings

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- Preliminary Sample
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- Pooled effects
 - -~3% longer sentences for minority of fenders
 - -~13% shorter sentences for female of fenders



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- Pooled effects
 - -~3% longer sentences for minority of fenders
 - ~13% shorter sentences for female of fenders
- Random effects for race disparities
 - practically all the variability is at the estimate level
 - between-jurisdiction variability: (1.02, 1.04)
 - between-estimate variability: (0.93, 1.12)



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- Preliminary Sample
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- Pooled effects
 - -~3% longer sentences for minority of fenders
 - 13% shorter sentences for female offenders
- Random effects for race disparities
 - practically all the variability is at the estimate level
 - between-jurisdiction variability: (1.02, 1.04)
 - between-estimate variability: (0.93, 1.12)
- Random effects for gender disparities
 - similar variability at the jurisdiction and estimate level
 - between-jurisdiction variability: (0.69, 1.05)
 - between-estimate variability: (0.72, 1.03)

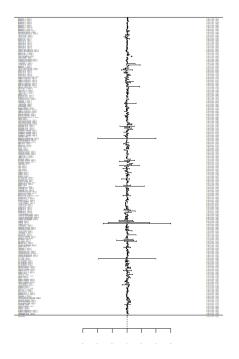


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Selection & Recording

Preliminary Sample

Preliminary Findings

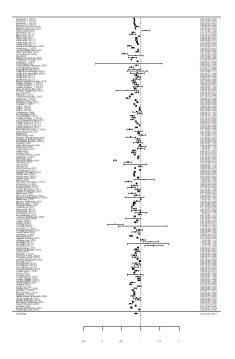




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Preliminary Sample

Preliminary Findings

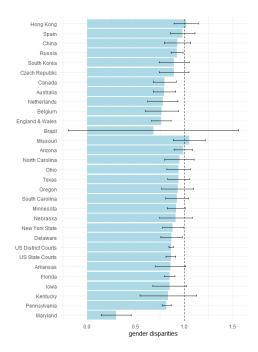




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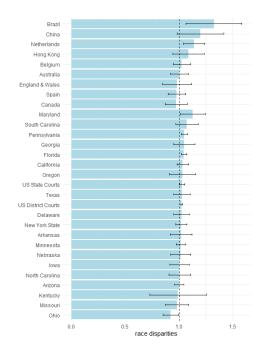




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Preliminary Sample

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Moderating Effects: Race

		estimate	ci.lb	ci.ub
Background	intrcpt	1.07	1.04	1.11
Selection &	offence:drugs	0.03	0.00	0.05
Recording	offence:firearm	-0.08	-0.18	0.03
0	offence:fraud	0.00	-0.10	0.11
Preliminary	offence:homicide	-0.01	-0.12	0.11
Sample	offence:immigration	-0.02	-0.07	0.02
Preliminary	offence:motor	0.01	-0.19	0.20
Findings	offence:property	-0.04	-0.10	0.03
D	offence:sex	0.01	-0.04	0.05
Discussion	offence:terrorism	0.09	-0.18	0.36
	offence:violence	0.03	-0.02	0.08
	probation	0.01	-0.01	0.02
	multiple_counts	-0.01	-0.03	0.01
	criminal_history	-0.02	-0.04	0.01
	recommended_sentence	-0.01	-0.04	0.01
	departure	-0.01	-0.03	0.01
	seriousness_level	0.01	-0.01	0.02
	specific_offence	-0.02	-0.04	0.01
	guilty_agreement	-0.02	-0.04	0.00
	remand	-0.01	-0.03	0.01
	legal_factors	-0.00	-0.01	0.00
	education	0.00	-0.02	0.03
	unemployed	-0.02	-0.05	0.02
	noncitizen	-0.01	-0.02	0.01
	dependents	-0.02	-0.04	-0.00
	$extralegal_factors$	0.003	0.00	0.01

Moderating Effects: Gender



		estimate	ci.lb	ci.ub
Background	intrcpt	0.84	0.77	0.92
Selection &	probation	0.00	-0.03	0.04
Recording	multiple_counts	0.01	-0.02	0.04
0	criminal_history	-0.03	-0.08	0.02
Preliminary	recommended_sentence	0.01	-0.03	0.06
Sample	departure	0.06	0.01	0.11
Preliminary	seriousness_level	0.01	-0.03	0.04
Findings	specific_offence	0.02	-0.01	0.05
Discussion	guilty_agreement	-0.01	-0.05	0.03
	remand	0.02	-0.02	0.06
	additional_legal_factors	0.01	0.00	0.01
	education	0.02	-0.02	0.07
	unemployed	0.00	-0.07	0.07
	noncitizen	-0.01	-0.06	0.03
	dependents	-0.03	-0.08	0.01
	additional_extralegal_factors	-0.00	-0.01	0.01



Selective Reporting

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- Evidence of selective reporting in the race disparities literature
 - $-\,$ when race is mentioned in the title, effect sizes are larger (1.02 vs 1.04)
 - $-\,$ entirely driven by studies reporting Native American disparities $(0.91 \mbox{ vs } 1.18)$
 - there is no evidence of selective reporting for gender disparities



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- Evidence of selective reporting in the race disparities literature
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 - $-\,$ entirely driven by studies reporting Native American disparities $(0.91 \mbox{ vs } 1.18)$
 - there is no evidence of selective reporting for gender disparities
- Evidence of selective citation in the gender disparities literature
 - $-\,$ for every 10 citations* gender disparities widen by 2%
 - no evidence of selective citation for race disparities



Conclusion

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• Sentencing research implications

- minority and male offenders are treated more harshly
- $-\,$ the former appears to be universal, the latter is not
- the American literature is not different from the *rest of the world*



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• Sentencing research implications

- minority and male offenders are treated more harshly
- $-\,$ the former appears to be universal, the latter is not
- the American literature is not different from the *rest of the world*
- Meta-science implications
 - there is a lot of model uncertainty
 - a single study does not tell us much
 - systematic misinterpretation of the literature (publication bias?) due to selective reporting and citation



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Preliminary Sample

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 Sentencing research needs to be cross-jurisdictional (even when focusing on a single country)



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Preliminary Sample

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- 2 We need to publish via pre-registered reports



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- Sentencing research needs to be cross-jurisdictional (even when focusing on a single country)
- 2 We need to publish via pre-registered reports
- 3 We should embrace model uncertainty