

Machine Learning in the Judicial Process

Yutong Dai and Yunjie Su



Introduction

- Machine learning algorithms are rising in popularity across the judicial process:
 - gathering legal evidence (Relativity)
 - pretrial and bail (PSA)
 - trial and final sentencing (COMPAS)
- However, the algorithms currently employed often perpetuate historical bias.
- Our project analyzes features of major algorithms currently in use to propose the most ethical places of implementation and regulation.

Major Positions

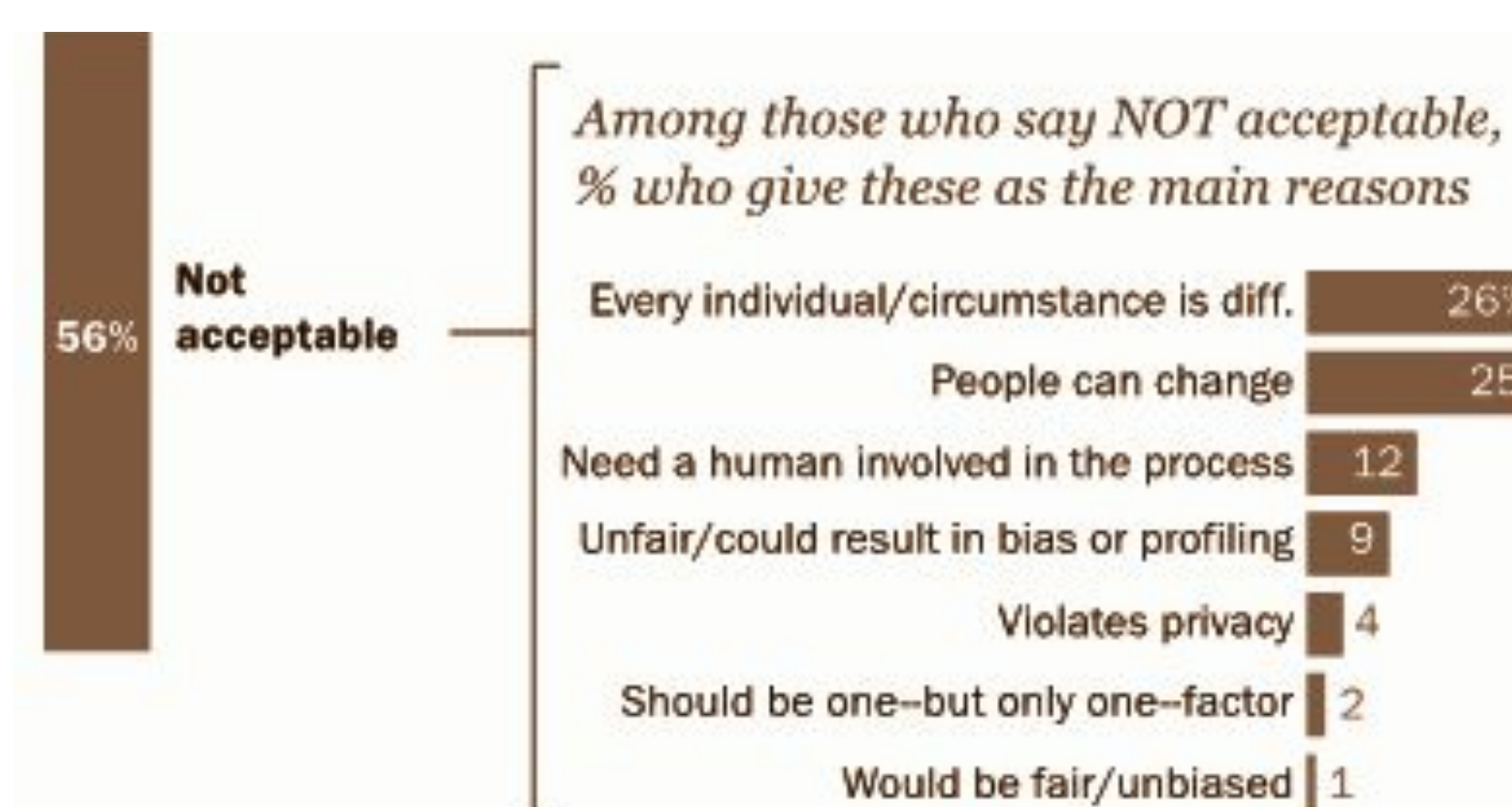
Supporting Use: Efficient, Logical, Corrects Human Bias

- From 2013-2017, NYC courts consistently took an average of 1-2 years to reach a verdict for criminal court cases. [3]



Against Use: Lack of Transparency & Accountability, Unfair

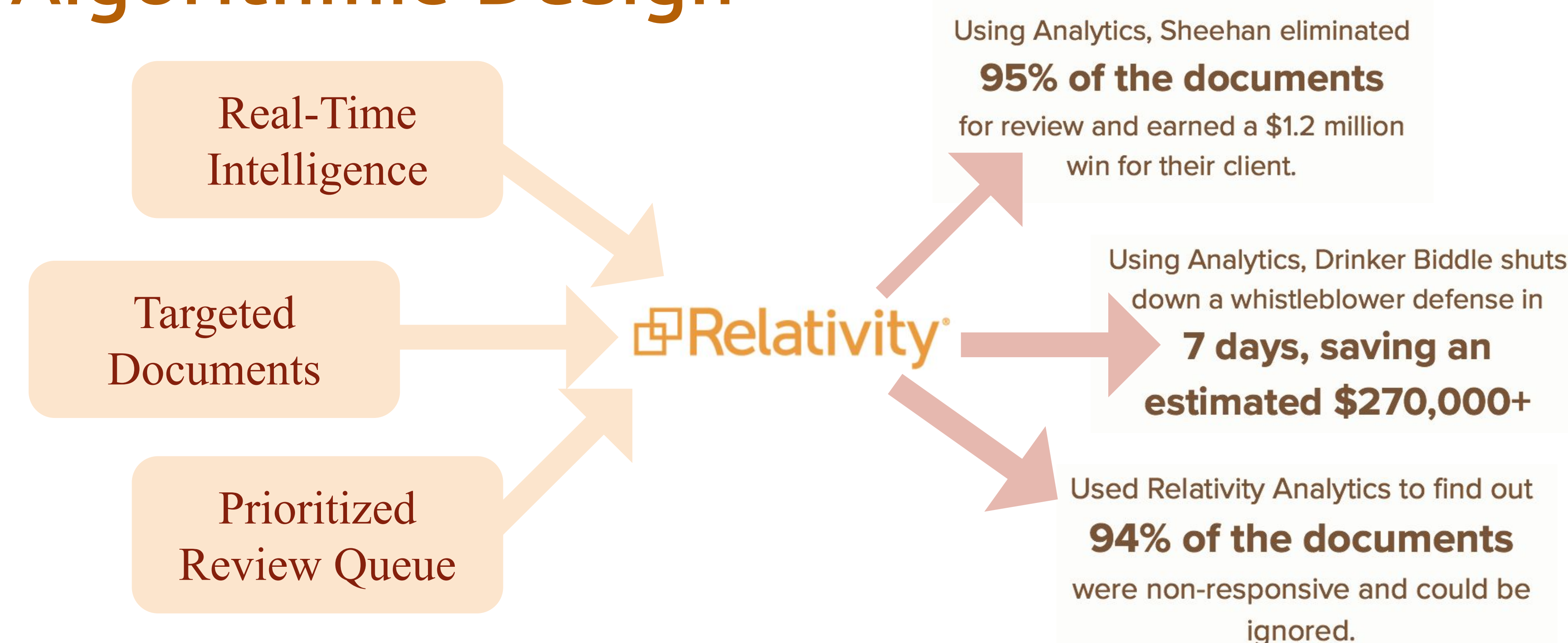
- 2018 PEW Research Survey found that 56% of Americans thought automated criminal risk scores not acceptable



“...it seems like you’re determining a person’s future based on another person’s choices.” [4]

Findings

Algorithmic Design

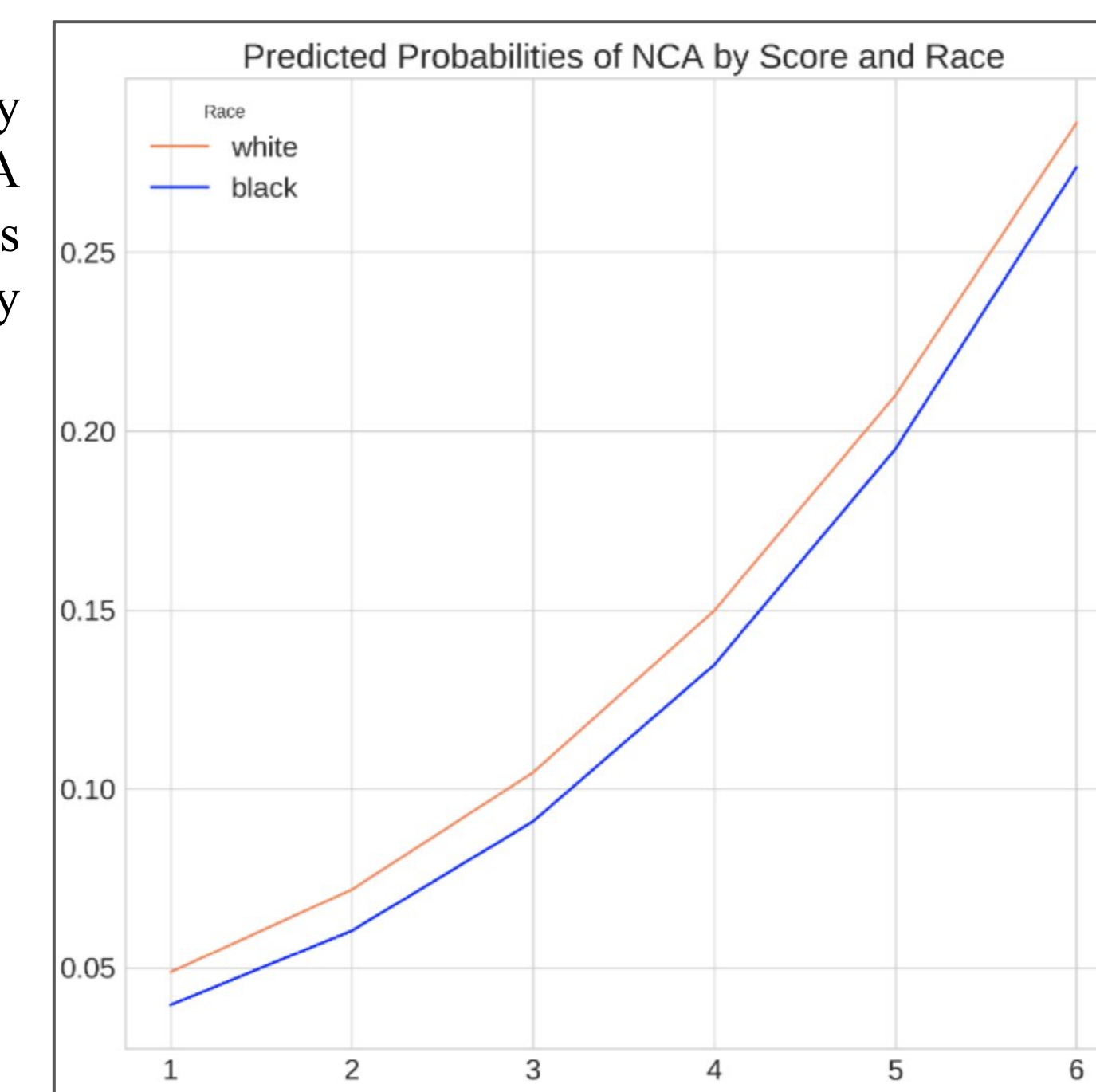


While the Public Safety Assessment clearly states its factors and relative weights, there remains a measurably significant difference in failure rate based on race.

New Criminal Activity (NCA)		
Risk Factor	Points	NCA Scaled Score
Age at current arrest	23 or older = 0 22 or younger = 2	0 = 1 1 = 2 2 = 3 3 = 4 4 = 5 5 = 6 6 = 7 7 = 8 8 = 9 9 = 10 10 = 11 11 = 12 12 = 13 13 = 14
Pending charge at the time of offense	No = 0 Yes = 3	0 = 1 1 = 2 2 = 3 3 = 4 4 = 5 5 = 6 6 = 7 7 = 8 8 = 9 9 = 10 10 = 11 11 = 12 12 = 13 13 = 14
Prior misdemeanor conviction	No = 0 Yes = 1	0 = 1 1 = 2 2 = 3 3 = 4 4 = 5 5 = 6 6 = 7 7 = 8 8 = 9 9 = 10 10 = 11 11 = 12 12 = 13 13 = 14
Prior felony conviction	No = 0 Yes = 1	0 = 1 1 = 2 2 = 3 3 = 4 4 = 5 5 = 6 6 = 7 7 = 8 8 = 9 9 = 10 10 = 11 11 = 12 12 = 13 13 = 14
Prior violent conviction	0 = 0 1 = 1 2 = 1 3 or more = 2	0 = 1 1 = 2 2 = 3 3 = 4 4 = 5 5 = 6 6 = 7 7 = 8 8 = 9 9 = 10 10 = 11 11 = 12 12 = 13 13 = 14
Prior failure to appear in past 2 years	0 = 0 1 = 1 2 or more = 2	0 = 1 1 = 2 2 = 3 3 = 4 4 = 5 5 = 6 6 = 7 7 = 8 8 = 9 9 = 10 10 = 11 11 = 12 12 = 13 13 = 14
Prior sentence to incarceration	No = 0 Yes = 2	0 = 1 1 = 2 2 = 3 3 = 4 4 = 5 5 = 6 6 = 7 7 = 8 8 = 9 9 = 10 10 = 11 11 = 12 12 = 13 13 = 14

NCA chart from the PSA, which also includes FTA and NVCA charts

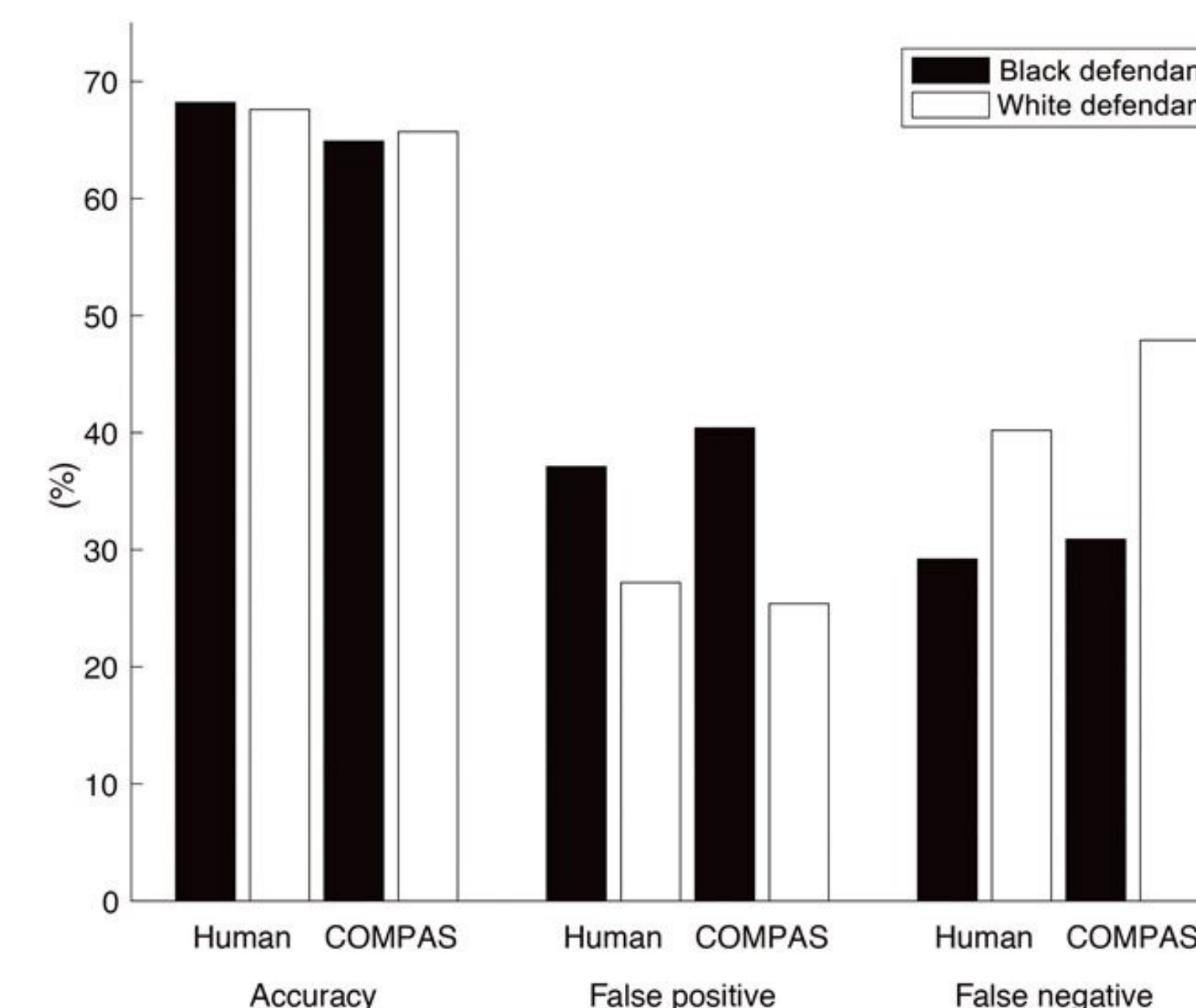
Accuracy of the PSA’s NSA calculations as separated racially



Although COMPAS considers factors that exhibit significant correlation to further arrest within two years, its predictions of recidivism in trials were found to be racially biased.

COMPAS Scale	Point-Biserial Correlation	AUC	Odds Ratio
General Recidivism Risk	0.34	0.70	3.31
Criminal Involvement	0.20	0.61	1.10
Noncompliance History	0.16	0.61	1.11
Violence History	0.11	0.58	1.06
Current Violence	-0.05	0.52	0.92
Criminal Associates	0.14	0.60	1.09
Substance Abuse	0.02	0.51	1.02
Financial Problems	0.09	0.55	1.08
Voced Problems	0.17	0.61	1.11
Family Crime	0.07	0.54	1.11
Social Environment	0.10	0.56	1.12
Leisure	0.11	0.57	1.07
Residential Instability	0.08	0.55	1.04
Social Adjustment	0.15	0.60	1.10
Socialization Failure	0.18	0.62	1.13
Criminal Opportunity	0.19	0.62	1.10
Social Isolation	0.04	0.52	1.02
Criminal Thinking	0.11	0.57	1.04
Criminal Personality	0.13	0.58	1.05
Cognitive Behavioral	0.23	0.63	1.05

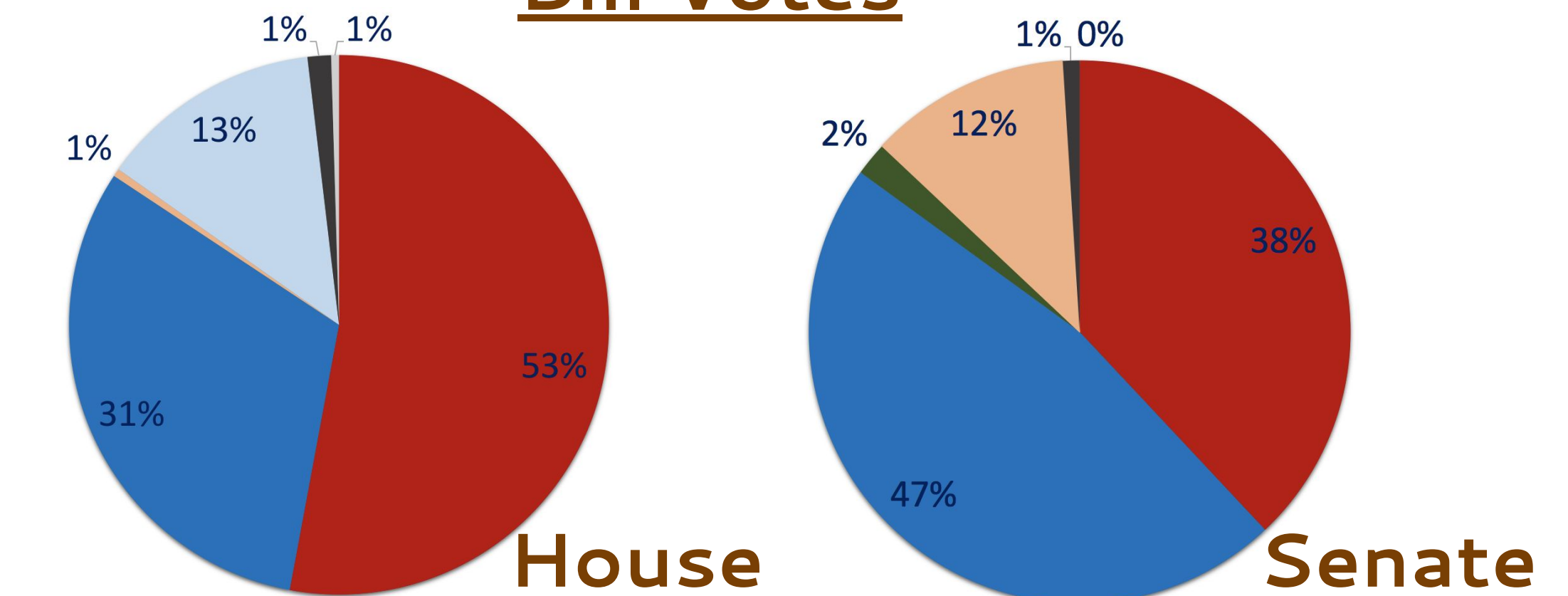
Table depicts Association Between COMPAS Core Scales and Any Arrest Within Two Years [1]



Regulation

- Gardner v. Florida* established precedent against using confidential passages against a defendant in capital cases.
- S.3649 - First Step Act**, approved late 2018, gives the Attorney General seven months to develop a risk/needs assessment system for inmates that could potentially shorten their prison sentences

Bill Votes



Conclusion

- At present, it is most ethically sound to restrict the implementation of machine learning algorithms to the initial legal evidence gathering phase, which involves more direct interaction with the lawyer, increasing efficiency while minimizing unfairness.
- Current algorithms are not sophisticated enough to accurately perform their intentions of reducing bias in judges’ final verdicts; hence, their influence of final verdicts should be highly monitored.

References

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