



# Government by Algorithm

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Governance Task	Description	Prototypical Examples
prioritizing enforcement	help agency identify or prioritize enforcement targets	<ul><li>SEC, CMS, IRS predictive targeting tools</li><li>CBP and TSA facial recognition tools</li></ul>
regulatory monitoring and analysis	inform agency policy-making and research	<ul> <li>NOAA thunderstorm hazard prediction</li> <li>FDA analysis of adverse drug event data</li> <li>FCC analysis of rulemaking comments</li> <li>CFPB analysis of consumer complaints</li> </ul>
supporting adjudication	aid agency adjudication of benefits, licenses, regulatory violations	<ul> <li>SSA Insight System for correcting adjudicatory errors</li> <li>USPTO tools for adjudicating patent and trademark applications</li> </ul>
citizen services and engagement	support provision of services to public or communication with public	<ul> <li>USPS, HUD use of chatbots</li> <li>USPS autonomous vehicles project and handwriting recognition tool</li> </ul>
internal agency and personnel management	aid agency resource allocation – managing employees, prioritizing work, procurement	<ul> <li>HHS Accelerate tool to assist contracting officer procurement decisions</li> </ul>

## Case #1 – Enforcement (and Legal Puzzles of AI)

#### Enforcement by Algorithm





#### ITEM 9: DISCIPLINARY INFORMATION

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Disclosure is required for:

- · Criminal or civil actions
- Administrative procedures before the Securities and Exchange Commission (or any other foreign, federal or state regulatory agency); or,
- · Proceedings by a self-regulatory association.





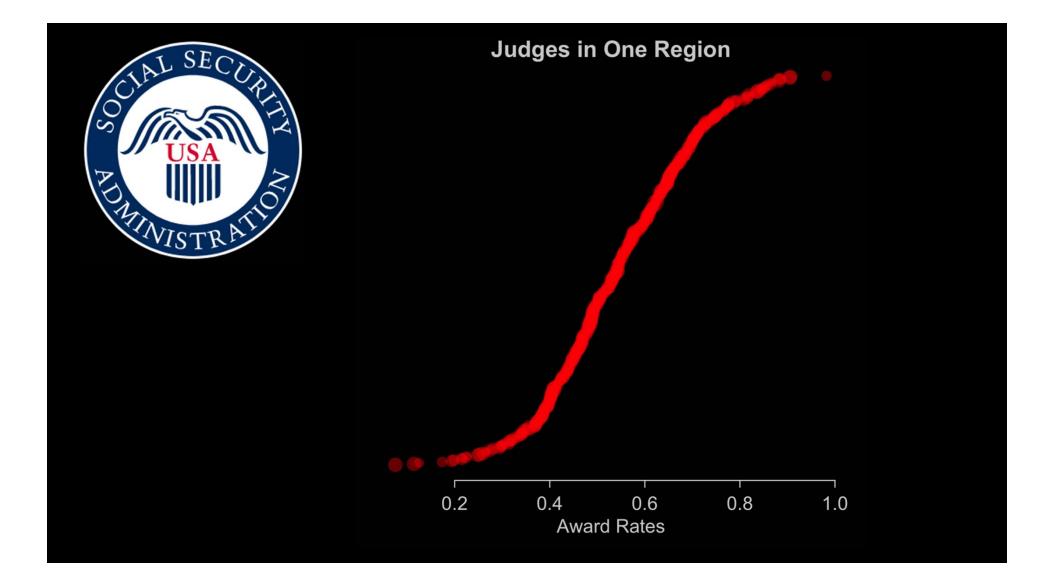
### Legal Puzzles

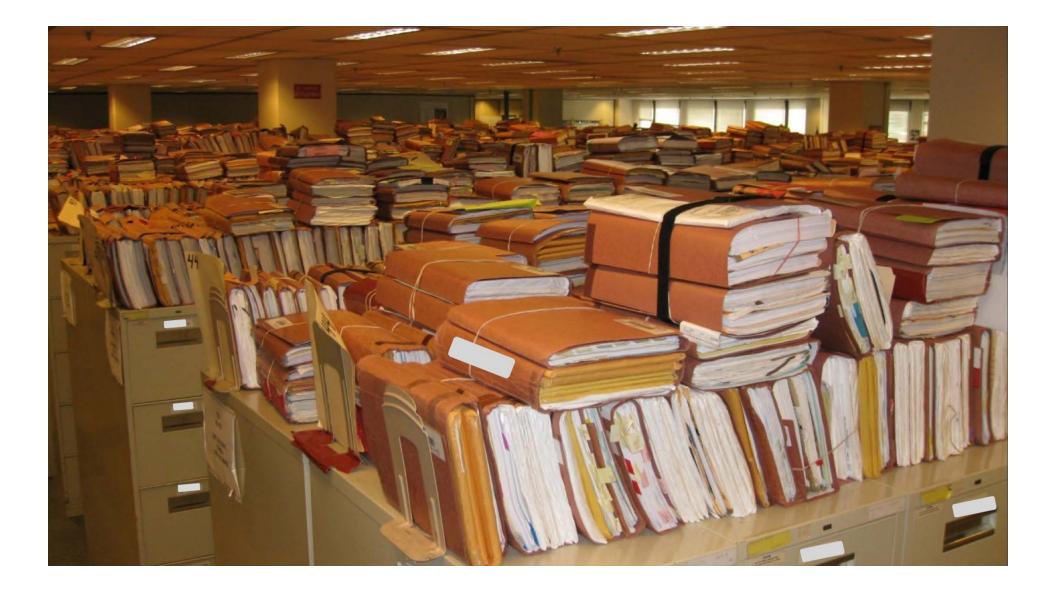
- Collision: legal reason-giving v. black boxes
- *Heckler* holds?
  - Reviewability concern = generalist judges, no "focal point"
  - Do algos make this worse or better?
- Transparency's limits

Algos encode law, priorities -- rebuts *Heckler*? -- rules subject to N&C?



### Case #2 – Formal Adjudication (and Capacity-Building Challenges)







#### The New Lawyering

#### Possible Clusters of Pivotal Issues Label Pivotal Issue Count % Obs P01A 1A. GC Est. for not FT2AC 1,604 1.4% P01B 1B. GC NOT Est. for not FT2AC 1,251 1.1% PO3 3. Evidence issue 11,679 0.49 P04 4. Error of law 4,488 4.0% PO7 7. General procedural 655 0.5% PO8 8. SGA Issue 6.559 5.8% P09 9. DI Insured issue 5,990 5.3% P11 11. New & Material Evi. Sub 16,312 14.59 P11A 11a. Any new evidence Sub. 36,588 2.59 P14 14. Eval. of treat. source opin. 9.2% 10,398 P15 15. Eval. of other opinion 22.821 0.31 P17 17. Claimant credibility (any) 5.7% 6,364 P18 18. 3rd party credibility 222 0.2% P19 19. DA&A Issue Corr. Act. Rec 2,769 2.5% P19A 19A. DA&A Issue in case 12,479 1.19 P20 20. S2 Not severe - Any 15,588 3.95 21. S3 MorE Listing - Any 7.0% P21 7,886 7.2% P22A 22A. RFC: Eval. Exert Limits 8,070 P22B 22B, RFC: Eval. non-exert. limit 18,772 6 79 P22D 22D. RFC: Com. of Imp./other 939 0.8% P23 23. VE not obtained 1,113 1.0% 5.4% P24 24. VE Evidence deficient, etc. 6,086 P26 25. S4 Eval of PRW 10,088 9.0% 27&31. S5 Treatment of age P273 1,184 1.1% issue/borderline age issue 12,636 P27A 27A. S5-med-voc issues - Any 11.2% P28 28. S5-Misapp. of grid rules 1,023 0.9% 2,354 P29 29, S5-Misapp, of framework 2.1% 30. S5-transferable skills 747 0.7% P30 32&32A Closed period case P32N 1,087 1.0% needs correction - yes or no

P33 33. Fail to follow presc.treat.

P34 34. Step 5 education issue

642 0.6% 2.0%

2,200

Gerald K. Ray\* and Jeffrey S. Lubbers\*\*

A Government Success Story:

## PITA 0 P228 P33 P21

P22B

P24

P26

P01B

POIA

P32N

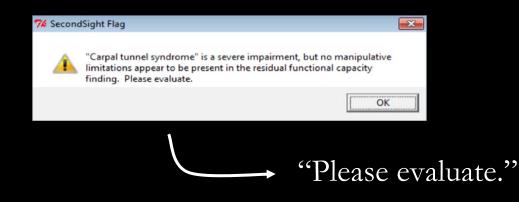


#### A Government Success Story:

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#### NLP-based error detection ("Insight")

The New Lawyering

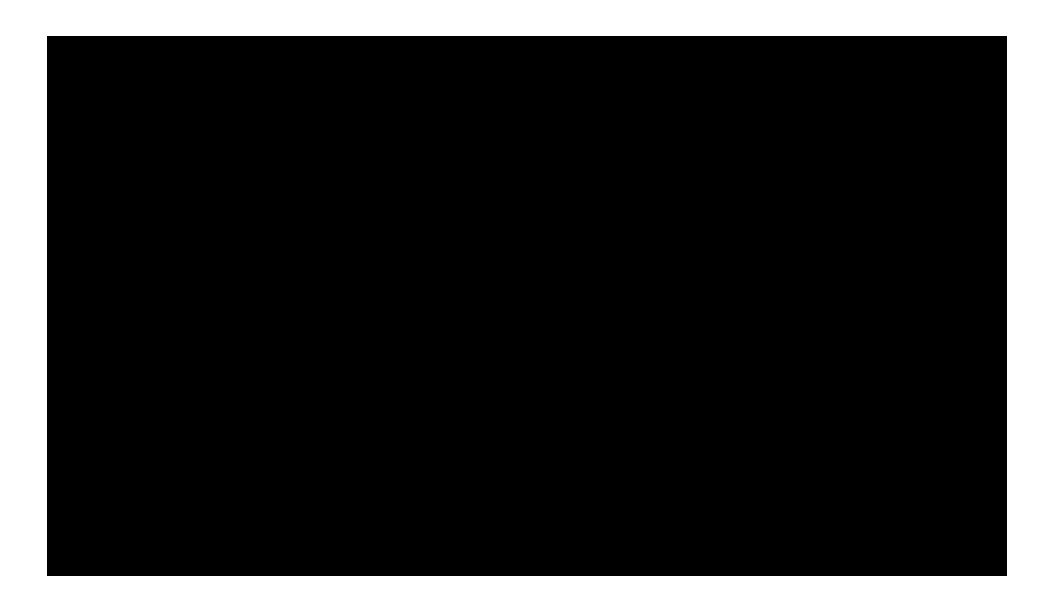


#### How Accountability?



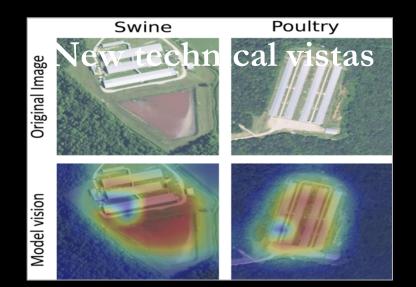
## Benchmarking – "human alongside the loop"?





#### Technical Challenges





#### Sky's the Limit?

	United States Government Accountability Office	
GAO	Testimony Before the Subcommittee on Environment and Hazardous Materials, Committee on Energy and Commerce, House of Representatives	
For Release on Delivery Expected at 10:00 a.m. EDT Wednesday, September 24, 2008	CONCENTRATED ANIMAL FEEDING OPERATIONS	
	EPA Needs More Information and a Clearly Defined Strategy to Protect Air and Water Quality	
	Statement of Anu K. Mittal, Director Natural Resources and Environment	
	G A O	



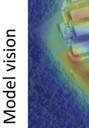
#### nature sustainability

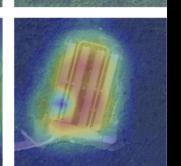
Swine

Poultry









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