

# An Introduction to Ranking Data and a Case Study of a National Survey of First Responders

Adam Pintar

April 27, 2023

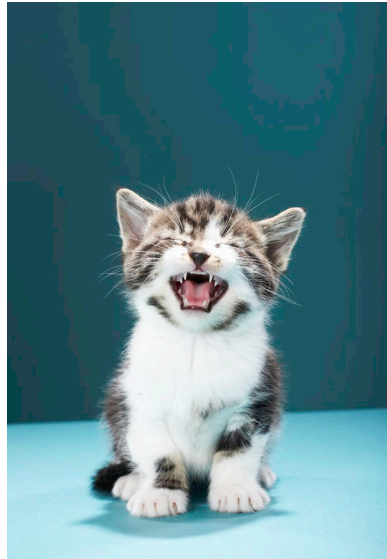
- Choices and ranking data
- First responders ranking data
- Plackett-Luce model
- First responders results
- Software

# Choice Data: Two Alternatives



Choose the cutest kitten

# Choice Data: More than two Alternatives

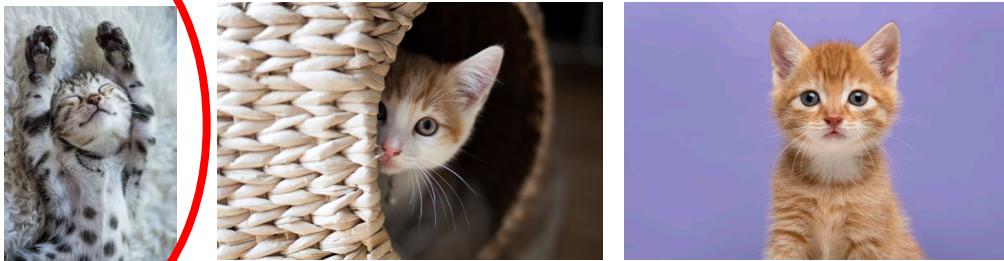


Same question: which is the cutest?

# Ranking Data: Sequence of Choices



First Choice



Second Choice



Third Choice

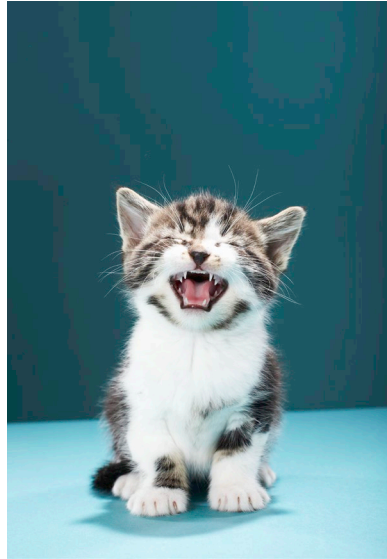
# Final Ranking



(2,



3,



1,



4)

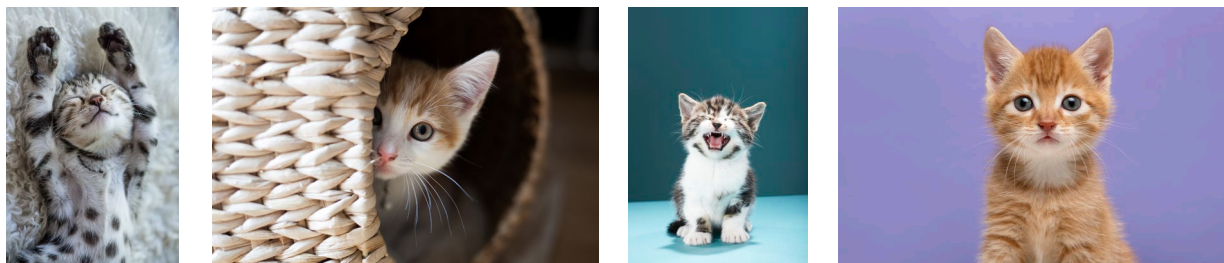
# Ordering Versus Ranking



Original sequence



Ordering



(2,

3,

1,

4)

Ranking

# Partial Ranks



(2,



Not Ranked,



1,



Not Ranked)



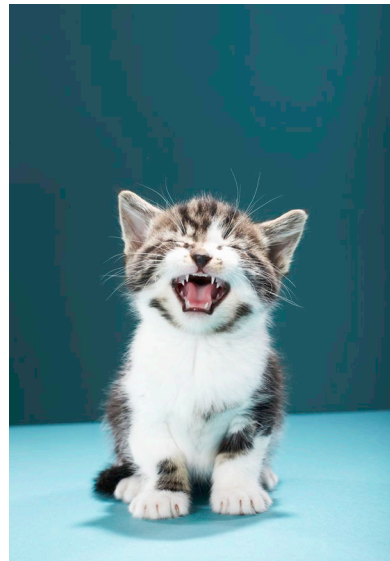
# Ties



(1,



3,



1,



3)

# First Responders Ranking Data

# PSCR Usability Team (2017-2022)



**Kerriane Buchanan**  
*Social Scientist*



**Yee-Yin Choong**  
*Human Factors Scientist*



**Shanée Dawkins**  
*Computer Scientist*



**Susanne Furman**  
*Cognitive Scientist*



**Kristen Greene**  
*Cognitive Scientist*



**Kurtis Goad**  
*Social Scientist*



**Kevin Mangold**  
*Computer Scientist*



**Adam Pinar**  
*Mathematical Statistician*



**Brian Stanton**  
*Cognitive Scientist*



**Mary Theofanos**  
*Computer Scientist*



**Michelle Steves**  
*Computer Scientist (retired)*



**Sandra Prettyman**  
*Social Scientist (NIST Associate)*



**Gavriel Salvendy**  
*Distinguished Professor, University of Central Florida*

# Survey Respondents by FEMA Region



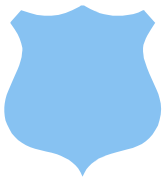
911



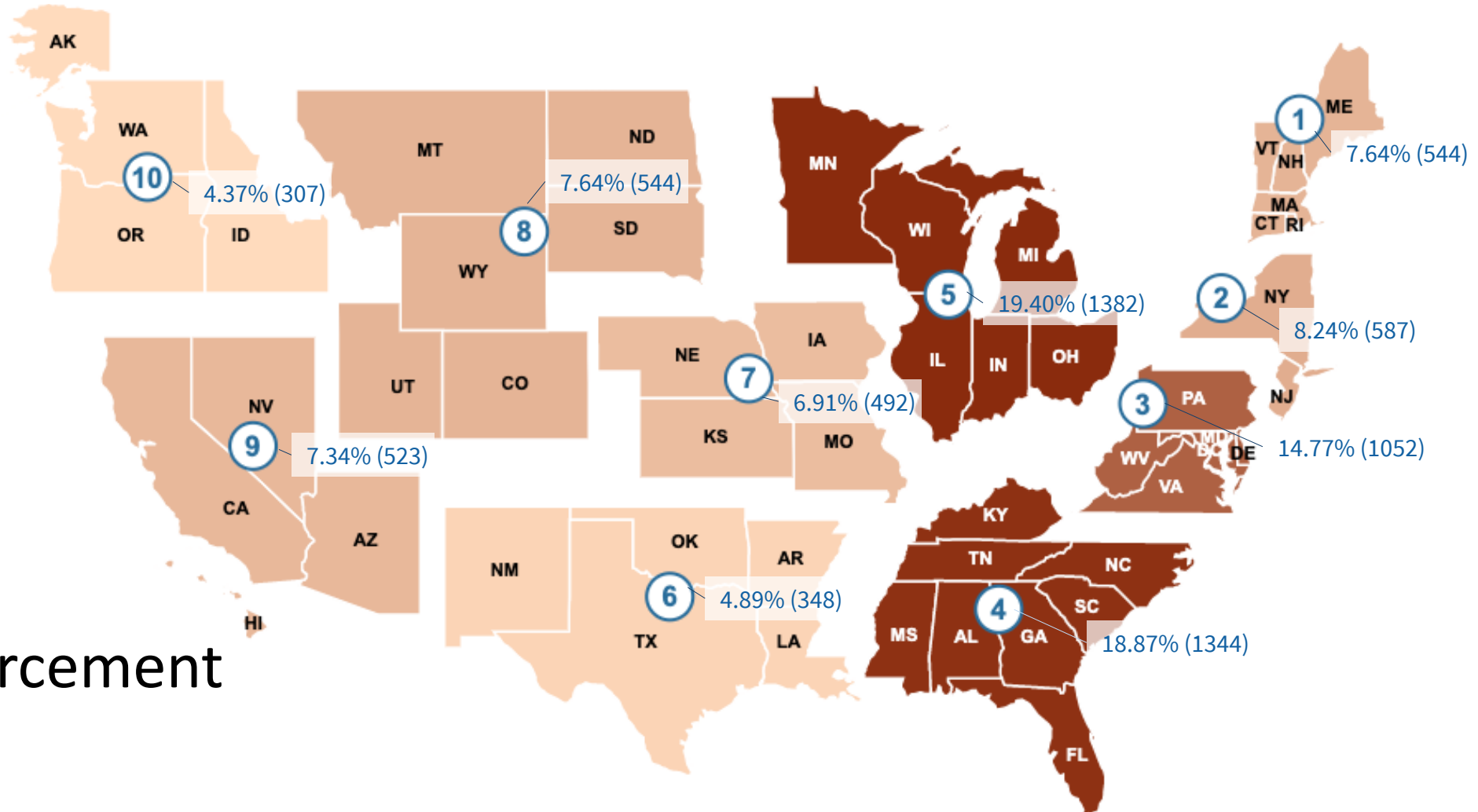
EMS



Fire



Law Enforcement



# Ranking Survey Question

## Use of technology in your DAY-TO-DAY work

Of the following applications/software, rank up to 5 that **are most useful** in your **DAY-TO-DAY** work, with 1 being the most useful.

Click or drag each item into a rank position.

CAD (computer-aided dispatch)	Criminal databases
Electronic policies/laws	Email
First responder vehicle tracking	Language translation
Mapping/driving directions	RMS (records management system)
Report writing software	Traffic apps/software
Weather apps/software	

1	1
2	2
3	3
4	4
5	5

# Auxiliary Information (Area)

Rural



Urban/Suburban



# Auxiliary Information (Responder Roles)

Chief/Management



Supervising Responder



Frontline Responder

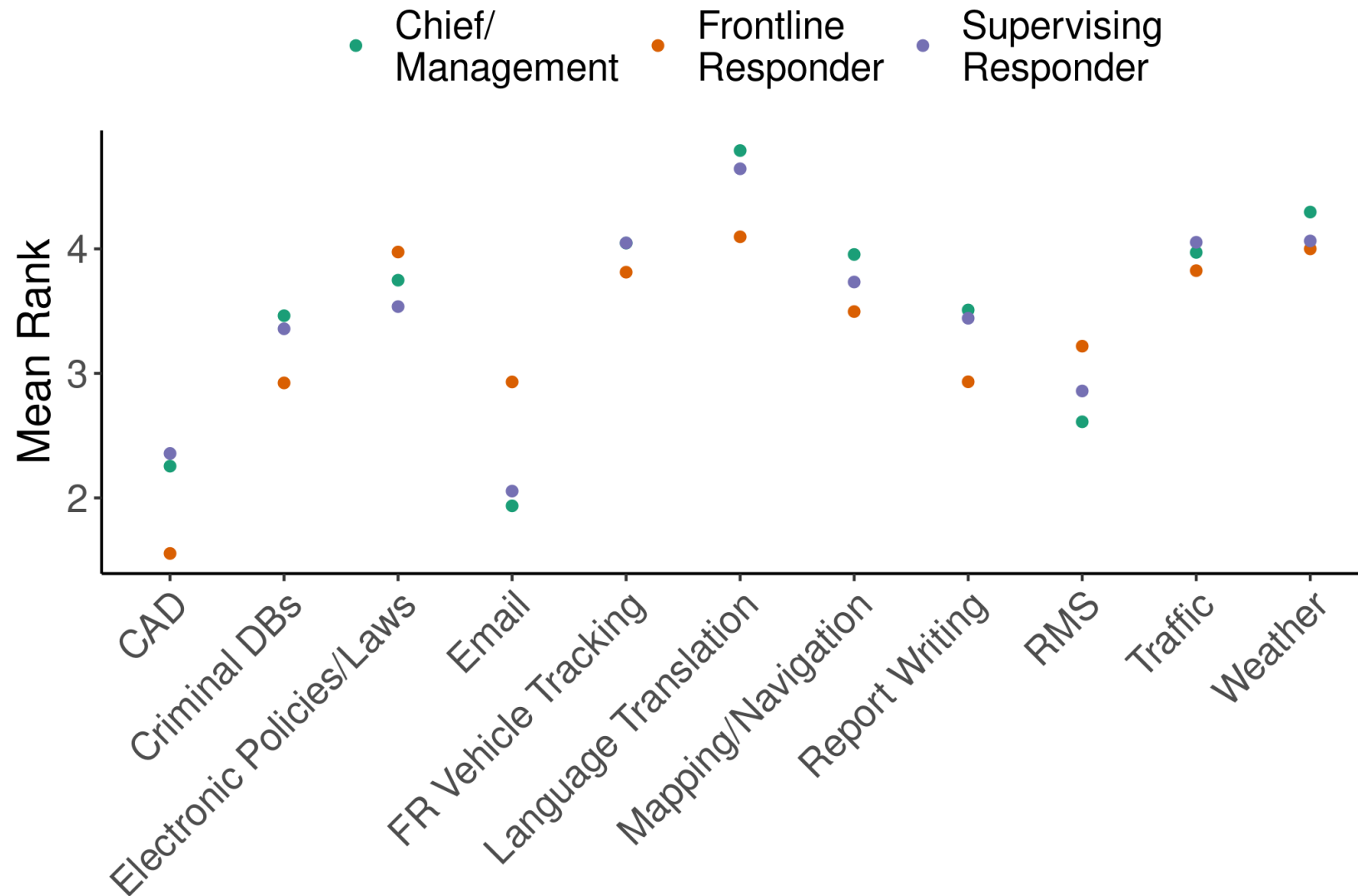


# Marginals by Responder Role

Rank	Responder Role											
	CAD	Criminal DBs	Electronic Policies/Laws	Email	FR Vehicle Tracking	Language Translation	Mapping/Navigation	Report Writing	RMS	Traffic	Weather	
5	39	129	151	41	37	15	79	79	51	27	102	management chief/ management
4	85	172	131	67	26	4	59	96	106	20	36	
3	103	133	100	117	15		36	88	180	18	26	
2	151	106	70	134	6		23	58	257	4	12	
1	234	30	9	124	2		2	13	113	1		
5	12	36	47	54	13	15	36	26	38	11	17	frontline responder
4	13	53	32	57	19	7	36	39	53	16	5	
3	19	57	29	63	10	6	25	67	49	8	4	
2	29	85	9	49	6	3	30	74	48	5	5	
1	205	30	1	68			6	16	18	1		
5	42	90	75	37	27	10	56	60	54	22	29	supervising responder
4	55	87	75	52	21	3	45	66	78	21	16	
3	78	94	55	67	9		39	67	100	9	11	
2	89	80	65	103	3		25	46	112	5	7	
1	162	26	6	254	3		4	14	66			

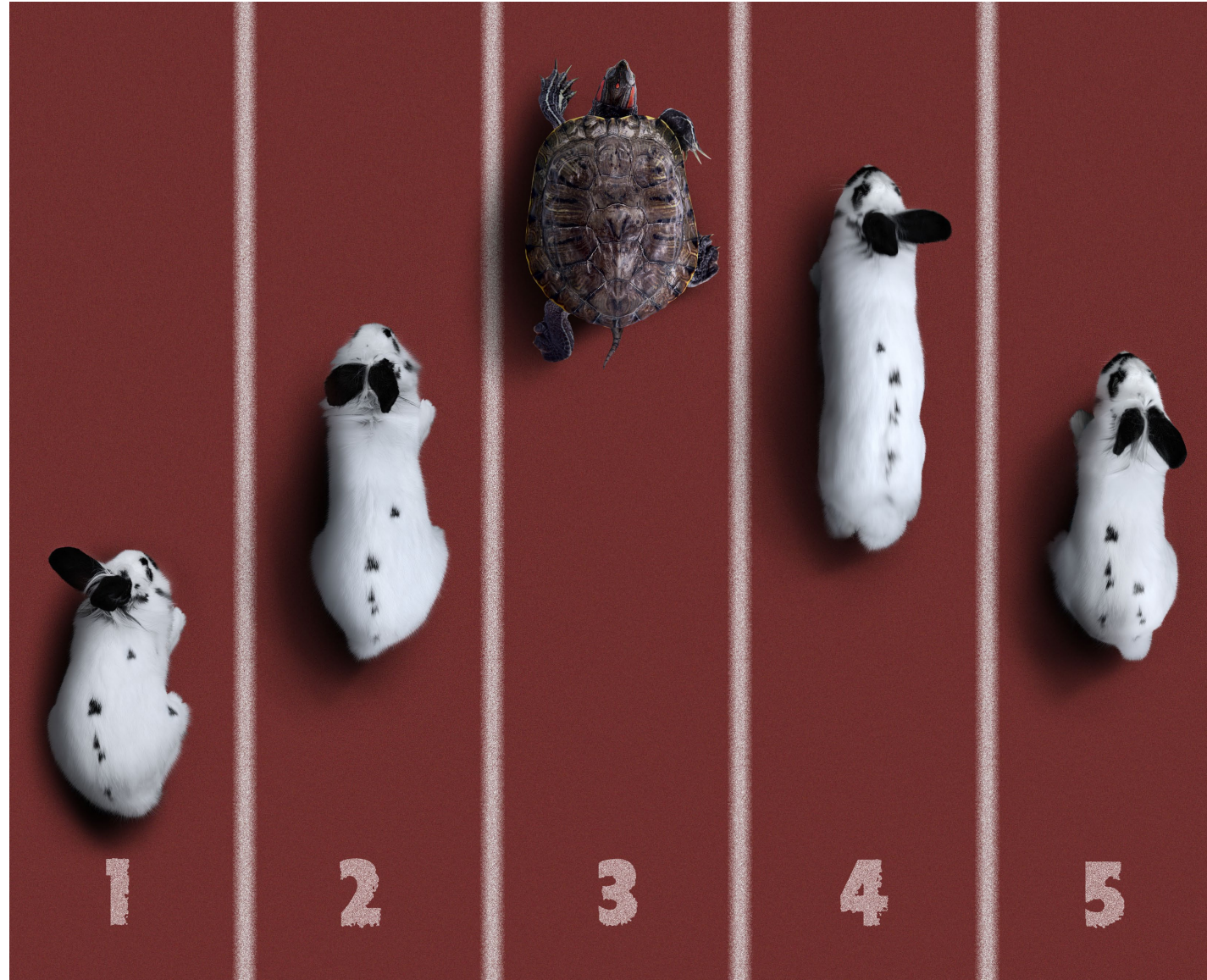


# Mean Rank by Responder Role



# Plackett-Luce Model

# Track Racing Analogy



## Track Racing Analogy

## First Responder Survey

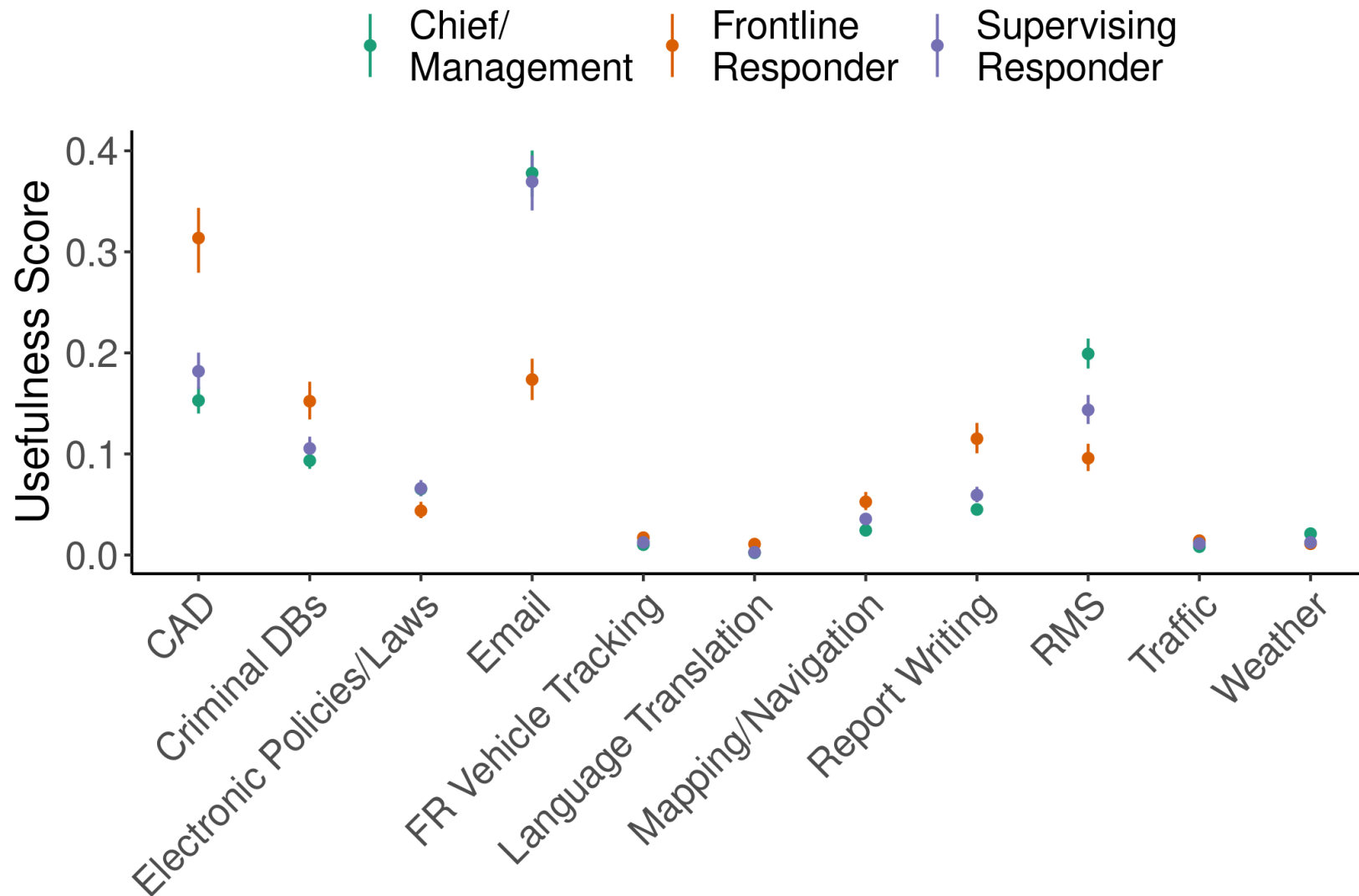
---

Athletes → Communication devices and applications

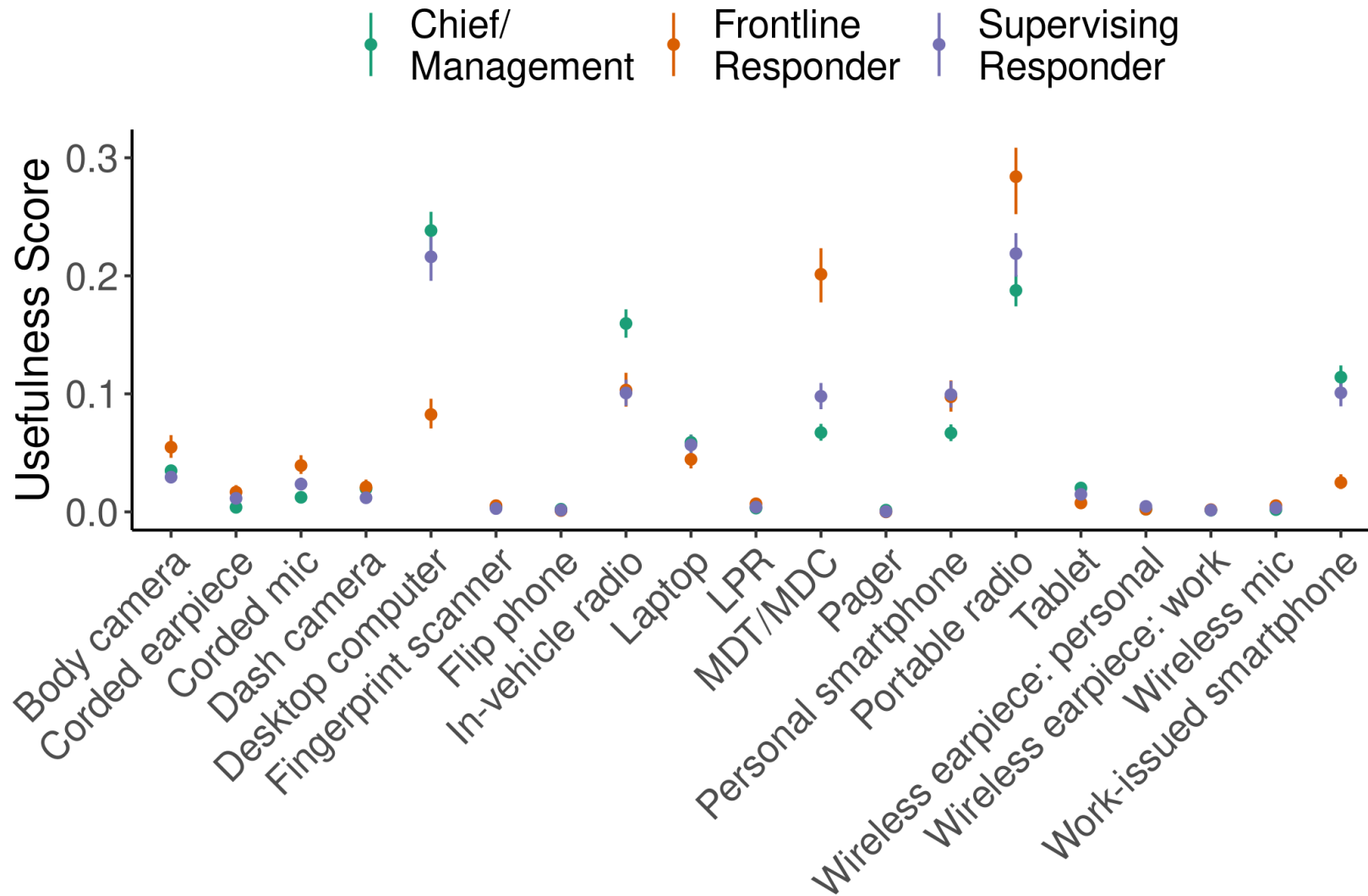
Track races → Survey respondents

# First Responder Results

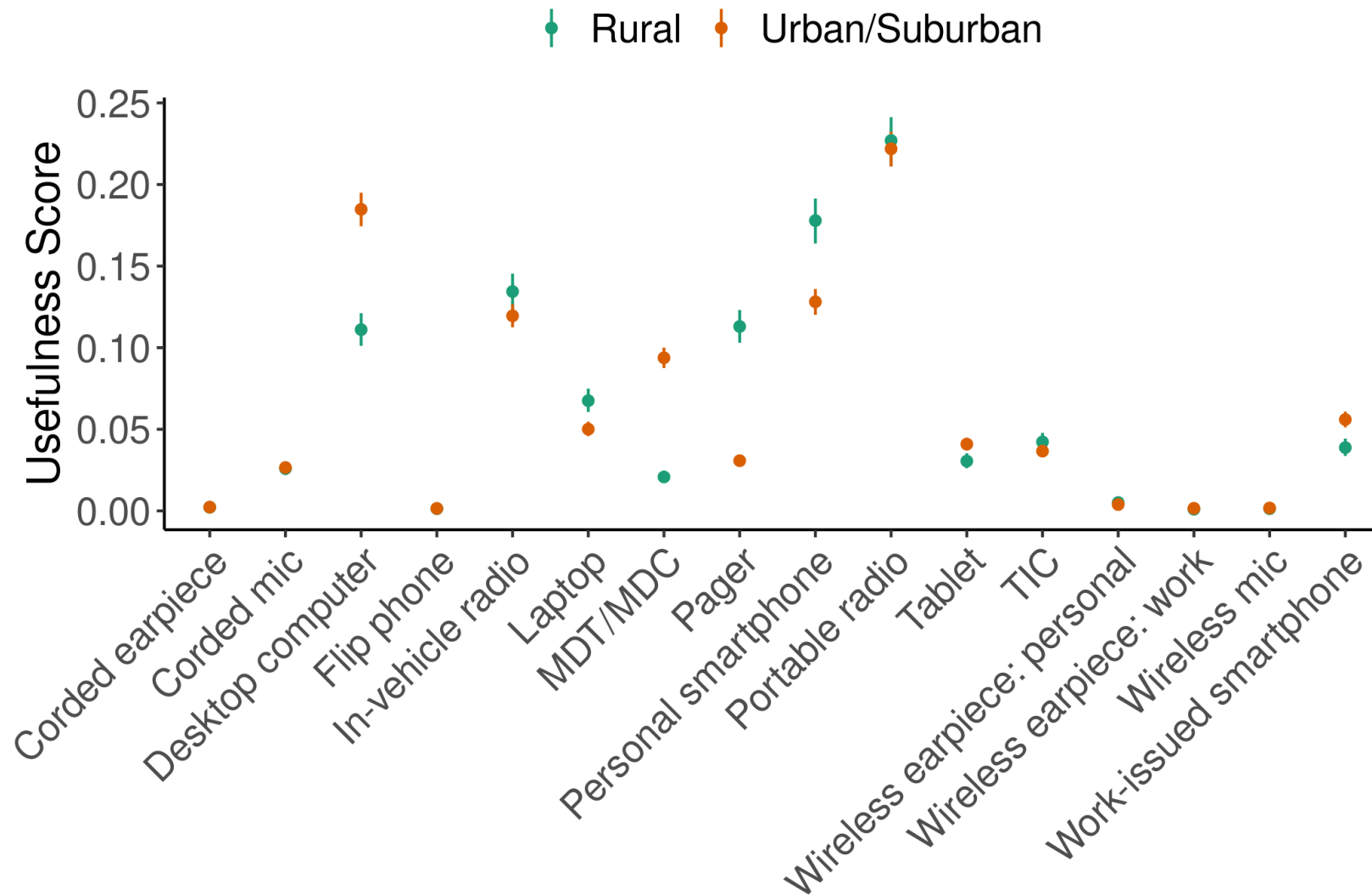
# Law Enforcement – Software – Roles



# Law Enforcement – Devices – Roles

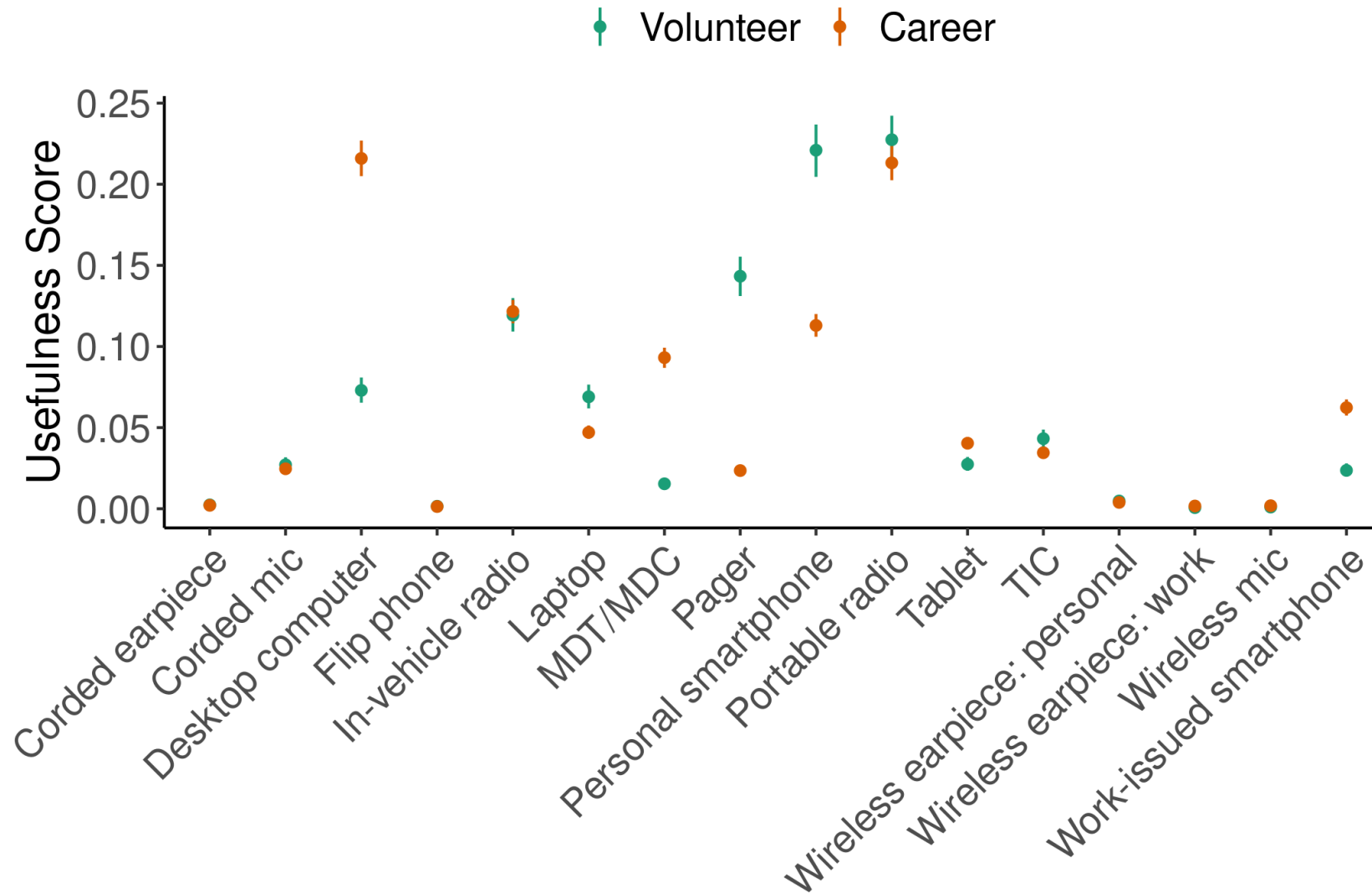


# Fire Service – Devices – Area





# Fire Service – Devices – Career Status



<https://nvlpubs.nist.gov/nistpubs/ir/2022/NIST.IR.8444.pdf>



**NIST Internal Report  
NIST IR 8444**

## **Voices of First Responders— Nationwide Public Safety Communication Survey Findings:**

*Statistical Analysis Results  
Phase 2, Volume 4*

Adam Pintar  
Kerriane Buchanan  
Yee-Yin Choong

This publication is available free of charge from:  
<https://doi.org/10.6028/NIST.IR.8444>

# R Software (Partial List)

R Package	Complete Rank	Partial Rank	Arbitrary Ties	Regression
PLMIX				
mlogit				
BayesMallows				
PlackettLuce				
StatRank				
pmr				
hyper2				

- Ranking data can be thought of as a sequence of choices
  - The most basic choice is between two alternatives
- Survey of first responder communication preferences and needs
  - More than 7,000 respondents
  - Communication Center & 9-1-1 Services, Emergency Medical Services, Fire Service, Law Enforcement
- Analysis of ranking data
  - Plackett-Luce model
  - Elucidate preference differences between subgroups
- Software for calculations
  - Variety of open source options
  - Base decision on needs