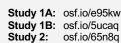


Limited Domain Structure for Conjunction Errors

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/e95kw /5ucag Office Hours

nyu.zoom.us/j/6375816959

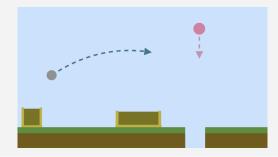
Question!

Do all conjunction fallacy errors share a common cognitive cause? Or do logically similar errors happen for different reasons in different cases?

Main Items

Physical Conjunction Fallacy (Cannonball & Sphere; C&S):

- Ludwin-Peery, E., Bramley, N., Davis, E., & Gureckis, T.G. (2019). Limits on the Use of Simulation in Physical Reasoning. Proceedings of the 41st Annual Conference of the Cognitive Science Society
- Ludwin-Peery, E., Bramley, N., Davis, E., & Gureckis, T.G. (accepted). Broken Physics: A Conjunction Fallacy Effect in Intuitive Physical Reasoning. *Psychological Science*



The full list of items is available at osf.io/652wh/wiki/Comparing%20C onjunction%20Errors%20Reference

Taxes: Please estimate the percent chance of each event below occurring from 0 to 100%. > A tax cut will be passed by Congress

A tax cut will be passed by Congress
 A tax cut will be passed by Congress
 between January 1st and March 31st, 2020
 and it will be supported by most

Bill: Bill is 34 years old. He is intelligent, but unimaginative, compulsive, and generally lifeless. In school, he was strong in mathematics but weak in social studies and humanities. Please estimate the percent chance of each statement below being true,

from 0 to 100%. Bill plays jazz for a hobby.
Bill is an accountant who plays jazz for a

Republicans.

hobby.

Peter: Peter is a junior in college who is training to run the mile in a regional meet. In his best race, earlier this season, Peter ran the mile in 4:06 min. Please estimate the percent chance

- of each event below occurring from 0 to 100%. > Peter will run the mile in under 4 min. > Peter will run the second half-mile under
- 1:55 min, and will complete the mile in under 4 min.

Health: A health survey was conducted in a representative sample of adult males in New York State of all ages and occupations. Mr. F. was included in the sample. He was selected by chance from the list of participants. Please estimate the percent chance of each statement below being true, from 0 to 100%.

 Mr. F. has had one or more heart attacks.
 Mr. F. has had one or more heart attacks and he is over 55 years old.

Dice: Consider a regular six-sided die with four green faces and two red faces. The die will be rolled 20 times and the sequence of greens (G) and reds (R) will be recorded. You are asked to select one sequence, from a set of three, and you will win a bet if the sequence you chose appears on successive rolls of the die. Please estimate the percent chance of each sequence occurring from 0 to 100%. > RGRR

> GRGRRR

Study 1A: Conjunction Errors (MTurk)

Table 1: Pearson Correlations Among Conjunction Errors in Study 1A

	C&S	Taxes	Bill	Peter	Health	Dice
C&S	-					
Taxes	-0.099	_				
Bill	0.006	-0.153	-			
Peter	-0.057	0.194	-0.023	_		
Health	0.022	0.120	-0.032	0.193	_	
Dice	0.201*	-0.310**	0.202*	-0.064	0.175	-
*, unadjusted $p < .05$						

**, unadjusted p < .01

Table 2: Chi-Square Tests of Relation Among Conjunction Errors in Study 1A

	C&S	Taxes	Bill	Peter	Health	Dice
C&S	-					
Taxes	0.007	-				
Bill	0.011	0.988	-			
Peter	0.000	2.459	0.044	-		
Health	1.132	12.971 ***	1.408	1.083	-	
Dice	0.347	0.178	6.253 *	0.096	0.399	_

Study 1B: Conjunction Errors (Undergraduate)

n = 100

n = 100

Table 3: Pearson Correlations Among Conjunction Errors in Study 1B

	C&S	Taxes	Bill	Peter	Health	Dice
C&S	-					
Taxes	-0.031	-				
Bill	0.106	0.055	-			
Peter	-0.184	0.202*	-0.122	_		
Health	0.138	-0.096	0.086	-0.051	-	
Dice	-0.014	-0.031	0.154	0.031	0.031	-
* unadjusted $n < 05$						

*, unadjusted p < .05

Table 4: Chi-Square Tests of Relation Among Conjunction Errors in Study $1{\rm B}$

	C&S	Taxes	Bill	Peter	Health	Dice
C&S	-					
Taxes	0.017	-				
Bill	0.079	1.217	_			
Peter	1.145	4.043 *	0.510	-		
Health	0.98	1.411	6.648 *	0.805	-	
Dice	3.428	3.143	1.612	0.409	0.000	_

*, unadjusted p < .05

Study 2: Close Comparison

n = 200

- Intentionally similar items. By comparing very similar problems, we can estimate a baseline of how correlated conjunction errors can be.
- Dropped the Peter problem.
- For each of the remaining questions, we included two new questions that were intended to closely match the original both in content and in structure.
- The full list of items is available at
 - osf.io/652wh/wiki/Comparing%20Conjunction%20Errors%20Reference/

	C&S	Taxes 1	Taxes 2	Taxes 3	Dice 1	Dice 2	Dice 3	Health 1	Health 2	Health 3	Bill 1	Bill 2	Bill 3
C&S													
Taxes 1	-0.049	-											
Taxes 2	-0.116	0.370 † \$	-										
Taxes 3	0.008	0.029	0.169 ‡	-									
Dice 1	-0.011	0.137	0.098	0.155	-								
Dice 2	-0.019	0.118	0.145	0.057	0.207 ‡	-							
Dice 3	-0.056	-0.034	0.092	0.058	0.061	0.242 † ‡	-						
Health 1	-0.017	0.244 † ‡	0.431 † ‡	0.335 † ‡	0.251 † ‡	0.150	0.113						
Health 2	-0.014	0.188 ±	0.402 † ±	0.328 † ‡	0.244 † ±	0.078	0.177 ±	0.706 † ±					
Health 3	-0.182	\$ 0.071	0.224 ±	0.365 † ‡	0.120	0.188 ±	0.186 ±	0.445 † ±	0.475 † ±				
Bill 1	0.035	0.125	0.167 ‡	0.228 ‡	0.111	0.328 † ‡	0.198 ‡	0.237 ‡	0.198 ‡	0.222 ‡			
Bill 2	0.089	0.069	0.080	0.111	-0.015	0.134	0.148	0.109	0.077	0.131	0.260 † ±		
Bill 3	-0.062	0.109	0.050	0.096	0.132	0.023	0.089	0.035	0.024	0.056	0.226 ±	0.141	
†, unadju	sted $p <$	0.00064 ; ‡, s			alse Discover	y Rate thresh	old						
†, unadju			Table 6:		ilse Discover e Tests of H	y Rate thresh Relation An	old 10ng Conj	unction Er	rors in Stu	dy 2			
	sted p < C&S	0.00064 ; ‡, s Taxes 1			alse Discover	y Rate thresh	old			dy 2	h 3 Bill 1		Bill 3
C&S	C&S		Table 6:	Chi-Squar	ilse Discover e Tests of H	y Rate thresh Relation An	old 10ng Conj	unction Er	rors in Stu	dy 2	h 3 Bill 1		
C&S Taxes 1	C&S 0.034	Taxes 1	Table 6:	Chi-Squar	ilse Discover e Tests of H	y Rate thresh Relation An	old 10ng Conj	unction Er	rors in Stu	dy 2	h 3 Bill 1		
C&S Taxes 1 Taxes 2	C&S - 0.034 1.252	Taxes 1 - 21.587 † ‡	Table 6: Taxes 2	Chi-Squar	ilse Discover e Tests of H	y Rate thresh Relation An	old 10ng Conj	unction Er	rors in Stu	dy 2	h 3 Bill 1		
C&S Taxes 1 Taxes 2 Taxes 3	C&S - 0.034 1.252 1.436	Taxes 1 - 21.587 † ‡ 2.446	Table 6: Taxes 2 - 9.064 ‡	Chi-Squar Taxes 3	ilse Discover e Tests of H	y Rate thresh Relation An	old 10ng Conj	unction Er	rors in Stu	dy 2	h 3 Bill l		
C&S Taxes 1 Taxes 2 Taxes 3 Dice 1	C&S - 0.034 1.252 1.436 0.017	Taxes 1 - 21.587 † ‡ 2.446 1.905	Table 6: Taxes 2 - 9.064 ‡ 5.767 ‡	Chi-Squar Taxes 3	ulse Discover re Tests of F Dice 1	y Rate thresh Relation An	old 10ng Conj	unction Er	rors in Stu	dy 2	h 3 Bill 1		
C&S Taxes 1 Taxes 2 Taxes 3 Dice 1 Dice 2	C&S - 0.034 1.252 1.436 0.017 0.110	Taxes 1 - 21.587 † ‡ 2.446 1.905 2.987	Table 6: Taxes 2 - 9.064 ‡ 5.767 ‡ 10.624 ‡	Chi-Squar Taxes 3 0.000 5.832 ‡	e Tests of F Dice 1 - 29.470 † ‡	y Rate thresh Relation An Dice 2	old 10ng Conj	unction Er	rors in Stu	dy 2	h 3 Bill 1		
C&S Taxes 1 Taxes 2 Taxes 3 Dice 1 Dice 2 Dice 3	C&S - 0.034 1.252 1.436 0.017 0.110 0.583	Taxes 1 	Table 6: Taxes 2 - 9.064 ‡ 5.767 ‡ 10.624 ‡ 4.746	Chi-Squar Taxes 3 - 0.000 5.832 ‡ 5.219	e Tests of F Dice 1 - 29.470 † ‡ 18.807 † ‡	y Rate thresh Relation An Dice 2	old nong Conj Dice 3	unction Er	rors in Stu	dy 2	h 3 Bill 1		
C&S Taxes 1 Taxes 2 Taxes 3 Dice 1 Dice 2 Dice 3 Health 1	C&S - 0.034 1.252 1.436 0.017 0.110 0.583 0.001	Taxes 1 	Table 6: Taxes 2 - 9.064 ‡ 5.767 ‡ 10.624 ‡ 4.746 32.897 † ‡	Chi-Squar Taxes 3 - 0.000 5.832 ‡ 5.219 8.898 ‡	- 29.470 † ‡ 18.807 † ‡ 2.249	y Rate thresh Relation An Dice 2	old nong Conj Dice 3 - 2.712	unction Er Health 1	rors in Stu Health	dy 2	h 3 Bill 1		
C&S Taxes 1 Taxes 2 Taxes 3 Dice 1 Dice 2 Dice 3 Health 1 Health 2	C&S 0.034 1.252 1.436 0.017 0.110 0.583 0.001 1.722	Taxes 1 - 21.587 † ‡ 2.446 1.905 2.987 0.000 13.055 † ‡ 3.383	Table 6: Taxes 2 - 9.064 ‡ 5.767 ‡ 10.624 ‡ 4.746 32.897 † ‡ 23.217 † ‡	Chi-Squar Taxes 3 0.000 5.832 ‡ 5.219 8.898 ‡ 11.500 ‡	- 29.470 † ‡ 18.807 † ‡ 2.249 6.477 ‡	y Rate thresh Relation An Dice 2 - 28.432 † ‡ 9.384 ‡ 7.668 ‡	old nong Conj Dice 3 - 2.712 12.448 † 1	unction Er Health 1	rors in Stu Health	dy 2 2 Healt	h 3 Bill I		
C&S Taxes 1 Taxes 2 Taxes 3 Dice 1 Dice 2 Dice 2 Dice 3 Health 1 Health 2 Health 3	C&S - 0.034 1.252 1.436 0.017 0.110 0.583 0.001 1.722 1.446	Taxes 1 21.587 † ‡ 2.446 1.905 2.987 0.000 13.055 † ‡ 3.383 9.224 ‡	Table 6: Taxes 2 - 9.064 ‡ 5.767 ‡ 10.624 ‡ 4.746 32.897 † ‡ 23.217 † ‡ 31.034 † ‡	Chi-Squar Taxes 3 - 0.000 5.832 \$ 5.219 8.898 \$ 11.500 \$ 6.764 \$	- 29.470 † ‡ 18.807 † ‡ 2.249 6.477 ‡ 0.963	y Rate thresh Relation An Dice 2 - 28.432 † ‡ 9.384 ‡ 7.668 ‡ 4.567	- 2.712 12.448 † 1 8.365	unction Er Health 1 - - - 74.647 † 53.681 †	rors in Stu Health	dy 2 2 Healt †‡ -			
C&S Taxes 1 Taxes 2 Taxes 3 Dice 1 Dice 2 Dice 2 Dice 3 Health 1 Health 2 Health 3 Bill 1	C&S - 0.034 1.252 1.436 0.017 0.110 0.583 0.001 1.722 1.446 0.485	Taxes 1 21.587 † ‡ 2.446 1.905 2.987 0.000 13.055 † ‡ 3.383 9.224 ‡ 2.483	Table 6: Taxes 2 9.064 ‡ 5.767 ‡ 10.624 ‡ 4.746 32.897 † ‡ 23.217 † ‡ 31.034 † ‡ 11.770 ‡	Chi-Squar Taxes 3 - 0.000 5.832 ‡ 5.219 8.898 ‡ 11.500 ‡ 6.764 ‡ 3.219	e Tests of F Dice 1 	y Rate thresh Relation An Dice 2 - 28.432 † ‡ 9.384 ‡ 7.668 ‡ 4.567 19.316 † ‡	- 2.712 12.448 † 4 8.365 7.201 ‡		rors in Stu Health	dy 2 2 Healt † ‡ - 10.42	9\$ -	Bill 2	
†, unadju C&S Taxes 1 Taxes 2 Taxes 3 Dice 1 Dice 2 Dice 1 Dice 2 Dice 1 Health 1 Health 2 Health 3 Bill 1 Bill 3	C&S - 0.034 1.252 1.436 0.017 0.110 0.583 0.001 1.722 1.446	Taxes 1 21.587 † ‡ 2.446 1.905 2.987 0.000 13.055 † ‡ 3.383 9.224 ‡	Table 6: Taxes 2 - 9.064 ‡ 5.767 ‡ 10.624 ‡ 4.746 32.897 † ‡ 23.217 † ‡ 31.034 † ‡	Chi-Squar Taxes 3 - 0.000 5.832 \$ 5.219 8.898 \$ 11.500 \$ 6.764 \$	- 29.470 † ‡ 18.807 † ‡ 2.249 6.477 ‡ 0.963	y Rate thresh Relation An Dice 2 - 28.432 † ‡ 9.384 ‡ 7.668 ‡ 4.567	- 2.712 12.448 † 1 8.365	unction Er Health 1 - - - 74.647 † 53.681 †	rors in Stu Health	dy 2 2 Healt †‡ -	9 ‡ - ; 2.541	Bill 2	

Table 7: Factor Analysis of Conjunction Errors in Study 2

One-Factor	Solution	Two-Facto	Two-Factor Solution				
	Factor 1		Factor 1	Factor 2			
C&S	-	C&S	-	-			
Taxes 1	0.30	Taxes 1	-	-			
Taxes 2	0.51	Taxes 2	0.48	-			
Taxes 3	0.44	Taxes 3	0.34	-			
Dice 1	0.31	Dice 1	-	-			
Dice 2	-	Dice 2	-	0.50			
Dice 3	-	Dice 3	-	0.36			
Health 1	0.78	Health 1	0.87	-			
Health 2	0.75	Health 2	0.89	-			
Health 3	0.58	Health 3	0.47	-			
Bill 1	0.40	Bill 1	-	0.73			
Bill 2	-	Bill 2	-	0.42			
Bill 3	-	Bill 3	-	0.32			

Rotation Method: Promax

Factor loadings of absolute value less than 0.30 not shown.