Two behavioral experiments revealing contextuality

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Overview

Introduction

• Contextuality-by-Default

2 Experiments

- Crowdsourcing experiment
- Psychophysical experiment

3 Closing remarks

Double-indexing

• The identity of a random variable is determined by its content, (the property it measures) and its context (conditions under which this property is measured): R_q^c

Introduction Contextuality-by-Default

Principles

• Within a context, random variables are jointly distributed.

 $(\mathtt{R}_{q}^{\textbf{c}}, \mathtt{R}_{q'}^{\textbf{c}}, \mathtt{R}_{q''}^{\textbf{c}})$

• Otherwise, they are *stochastically unrelated*.

Contextuality-by-Default

Introduction Contextuality-by-Default

R_1^1	\mathbb{R}^1_2	•		c ₁
•	R_2^2	R_{3}^{2}	•	c ₂
•		R_3^3	R_4^3	c ₃
R ₁ ⁴		•	R_4^4	c ₄
R_{1}^{5}		R_{3}^{5}	•	c_5
q1	q ₂	q ₃	q ₄	\mathcal{R}

Contextuality

A system of random variables is said to be *noncontextual* (with respect to multimaximality property) if R if it has a coupling S in which any two content-sharing random variables are equal to each other with the maximal possible propbability.

Otherwise R is said to be *contextual* (with respect to multimaximality).

- In CbD, for systems of categorical random variables, we use multimaximal couplings of sets of dichotomizations of their category values.
- For consistently connected systems, multimaximality reduces to identity couplings. Then we have the traditional understanding of contextuality.

Experiments

Crowdsourcing

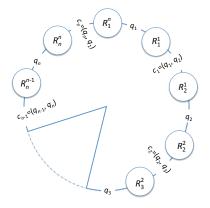
- Four randomly assigned conditions.
- Two choices:
 - One of a character from a given pair of characters,
 - and of a suitable characteristic of this character from a given pair of characteristics.

Psychophysical

- Joint identification of two stimuli locations.
- Five locations per stimulus.

Experiments

Cyclic system of random variables



R ₁ ¹	R_2^1		•	c1
•	R_{2}^{2}	R_{3}^{2}	•	c ₂
		R_3^3	R_4^3	c3
R ₁ ⁴			R_4^4	c ₄
q ₁	q ₂	q ₃	q ₄	R

Criterion for cyclic systems (Kujala & Dzhafarov, 2016)

A cyclic system of binary random variables taking values ± 1 is noncontextual if and only if

$$\max_{\text{odd }\#\text{ of }-'s} \sum_{i=1}^{n} \pm \left\langle \mathsf{R}^{i}_{i}\mathsf{R}^{i}_{i\oplus1}\right\rangle - \sum_{i=1}^{n} \left|\left\langle \mathsf{R}^{i\ominus1}_{i}\right\rangle - \left\langle \mathsf{R}^{i}_{i}\right\rangle\right| - n + 2 \leqslant \mathfrak{0},$$

where $\langle X \rangle$ denotes the expected value of X.

A necessary condition for noncontextuality of a system of categorical random variables

Criterion for cyclic systems

A necessary condition for noncontextuality of a system of categorical random variables (Dzhafarov, Cervantes, & Kujala, 2017)

Nominal dominance. If the system of all possible dichotomizations of a system of categorical random variables is noncontextual, then for each pair of categorical random variables in the same connection

$$\mathsf{Pr}\left[\mathsf{R}_{q}^{c}=x\right] < \mathsf{Pr}\left[\mathsf{R}_{q}^{c'}=x\right]$$

holds for no more than one value x.

Nominal dominance - Example

Let X, Y, Z have (marginal) distributions given by

	$\Pr(X = x)$	Pr(Y = y)	$\Pr(Z = z)$
1	.7	.1	.30
2	.1	.7	.30
3	.1	.1	.25
4	.1	.1	.05

Nominal dominance holds (mutually) for X and Y.

Nominal dominance - Example

Let X, Y, Z have (marginal) distributions given by

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3	.1	.1	.25
4	.1	.1	.05

Nominal dominance holds (mutually) for X and Y. It does not for Z and either X or Y.



The Snow Queen by Elena Ringo. Licensed under the CC Attribution 3.0 Unported license.

- Snow Queen is Beautiful and Evil.
- Gerda is Beautiful and Kind.
- The Troll is Unattractive and Evil.
- The Old Finn Woman is Unattractive and Kind.

Hans Christian Andersens The Snow Queen story involves the following characters with the following characteristics:

Snow Queen experiment

R_1^1	R ₂ ¹			$\mathbf{c}_1 = (\mathbf{q}_1, \mathbf{q}_2)$
	R ₂ ²	R_{3}^{2}		$\mathbf{c}_2 = (\mathbf{q}_2, \mathbf{q}_3)$
•	•	R_{3}^{3}	R ₄ ³	$\mathbf{c}_3 = (\mathbf{q}_3, \mathbf{q}_4)$
R_1^4	•	•	R_4^4	$\mathbf{c}_4 = (\mathbf{q}_1, \mathbf{q}_4)$
q 1	q ₂	q ₃	q_4	

Choices:

- Gerda / Troll q₁
- q₂ Beautiful / Unattractive
- q₃ Snow Queen / Old Finn woman
- q₄ Kind / Evil

	Character choice	Characteristic choice	N total (correct)
Context 1	∗ Gerda ∗ Troll	* Beautiful * Unattractive	447 (425)
Context 2	∗ Snow Queen ∗ Old Finn Woman	* Beautiful * Unattractive	446 (410)
Context 3	* Snow Queen * Old Finn Woman	∗ Kind ∗ Evil	453 (388)
Context 4	* Gerda * Troll	∗ Kind ∗ Evil	453 (429)

Beautiful	Ugly	Mar. Character	Context 4	Kind	Evil	Mar. Character
0.887	0	0.887	Gerda	0.841	0	0.841
0	0.113	0.113	Troll	0	0.159	0.159
0.887	0.113	1 (equality)	Mar. Characteristic	0.841	0.159	1 (equality)
Beautiful	Ugly	Mar. Character	Context 3	Kind	Evil	Mar. Character
0.837	0	0.837	Snow Queen	0	0.626	0.626
0	0.163	0.163	Old Finn woman	0.374	0	0.374
0.837	0.163	1 (equality)	Mar. Characteristic	0.374	0.627	0 (equality)
	0.887 0 0.887 Beautiful 0.837 0	0.887 0 0 0.113 0.887 0.113 Beautiful Ugly 0.837 0 0 0.163	0.887 0 0.887 0 0.113 0.113 0.887 0.113 1 (equality) Beautiful Ugly Mar. Character 0.837 0 0.837 0 0.163 0.163	0.887 0 0.887 Gerda 0 0.113 0.113 Troll 0.887 0.113 1 (equality) Mar. Characteristic Beautiful Ugly Mar. Character Context 3 0.837 0 0.837 Snow Queen 0 0.163 0.163 Old Finn woman	0.887 0 0.887 Gerda 0.841 0 0.113 0.113 Troll 0 0.887 0.113 1 (equality) Mar. Character 0.841 Beautiful Ugly Mar. Character 0.837 0 0.837 0 0.163 0.163 Old Finn woman 0.374	0.887 0 0.887 Gerda 0.841 0 0 0.113 0.113 0.159 0.887 0.159 0.887 0.113 1 (equality) Mar. Characteristic 0.841 0.159 Beautiful Ugly Mar. Character Context 3 Kind Evil 0.837 0 0.837 Snow Queen 0 0.626 0 0.163 0.163 Old Finn woman 0.374 0

Context 1	Beautiful	Ugly	Mar. Character	Context 4	Kind	Evil	Mar. Character
Gerda	0.887	0	0.887	Gerda	0.841	0	0.841
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Context 2	Beautiful	Ugly	Mar. Character	Context 3	Kind	Evil	Mar. Character
Context 2 Snow Queen	Beautiful 0.837	Ugly 0	Mar. Character 0.837	Context 3 Snow Queen	Kind 0	Evil 0.626	Mar. Character 0.626
		Ugly 0 0.163					

NOTE:

Prominently inconsistent connectedness ("signaling") — the main difficulty for contextuality analysis of behavioral/social data.

Context 1	Beautiful	Ugly	Mar. Character	Context 4	Kind	Evil	Mar. Character
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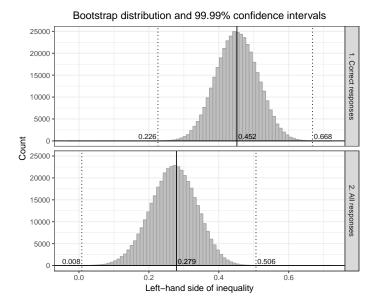
$$\max_{\text{odd }\#\text{ of }-\text{'s}} \sum_{i=1}^{n} \pm \left\langle \mathsf{R}^{i}_{i}\mathsf{R}^{i}_{i\oplus1}\right\rangle - \sum_{i=1}^{n} \left|\left\langle \mathsf{R}^{i\ominus1}_{i}\right\rangle - \left\langle \mathsf{R}^{i}_{i}\right\rangle\right| - n + 2 = 0.452 > 0$$

Beautiful	Ugly	Mar. Character	Context 4	Kind	Evil	Mar. Character
0.843	0.020	0.864	Gerda	0.797	0.035	0.832
0.029	0.107	0.136	Troll	0.018	0.150	0.168
0.872	0.128	0.951 (equality)	Mar. Characteristic	0.815	0.185	0.947 (equality)
Beautiful	Ugly	Mar. Character	Context 3	Kind	Evil	Mar. Character
0.769	0.011	0.780	Snow Queen	0.135	0.537	0.672
		0.000		0 000	0 000	
0.070	0.150	0.220	Old Finn woman	0.320	0.008	0.328
	0.843 0.029 0.872 Beautiful 0.769	0.843 0.020 0.029 0.107 0.872 0.128 Beautiful Ugly 0.769 0.011	0.843 0.020 0.864 0.029 0.107 0.136 0.872 0.128 0.951 (equality) Beautiful Ugly Mar. Character 0.769 0.011 0.780	0.843 0.020 0.864 Gerda 0.029 0.107 0.136 Troll 0.872 0.128 0.951 (equality) Mar. Characteristic Beautiful Ugly Mar. Character 0.769 0.011 0.780	0.843 0.020 0.864 Gerda 0.797 0.029 0.107 0.136 Troll 0.018 0.872 0.128 0.951 (equality) Mar. Characteristic 0.815 Beautiful Ugly Mar. Characteristic 0.815 0.769 0.011 0.780 Snow Queen 0.135	0.843 0.020 0.864 Gerda 0.797 0.035 0.029 0.107 0.136 Troll 0.018 0.150 0.872 0.128 0.951 (equality) Mar. Characteristic 0.815 0.185 Beautiful Ugly Mar. Characteristic Context 3 Kind Evil 0.769 0.011 0.780 Snow Queen 0.135 0.537

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Participants

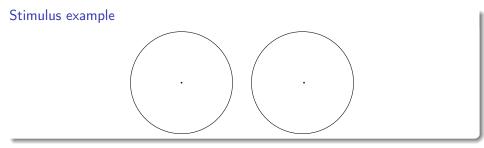
Three volunteers, one female and two males, graduate students at Purdue University, served as participants for the experiment

Procedure

- 20-23 sessions of about 30 min each.
- Approximately 380 trials per session.
- At least 8000 total trials.

Procedure

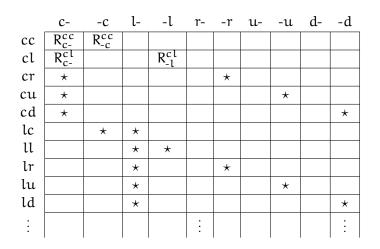
- 20 23 sessions of about 30 min each.
- Approximately 380 trials per session.
- At least 8000 total trials.
- Five locations in each circle:
 - Center
 - Left
 - Right
 - Up
 - Down



Properties (q_i) and contexts $c_j = (q_i, q_{i'})$:

			R	ght circ	le	
		(-c)	(-l)	(-r)	(-u)	(-d)
	Center (c-)	сс	cl	cr	cu	cd
	Left (l-)	lc	u	lr	lu	ld
Left circle	Right (r-)	rc	rl	rr	ru	rd
	Up (u-)	uc	ul	ur	นน	ud
	Down (d-)	dc	dl	dr	du	dd

For each of the contexts, each participant responded to at least 320 trials.



P1	Response to content c-						
Context	Center	Left	Right	Up	Down		
сс	0.335	0.497	0.000	0.162	0.006		
cl	0.231	0.631	0.000	0.137	0.000		
cr	0.403	0.415	0.000	0.156	0.026		
cd	0.276	0.554	0.000	0.153	0.017		
P3		Respons	se to con	tent -c			
Context	Center	Left	Right	Up	Down		
сс	0.634	0.149	0.015	0.188	0.015		
lc	0.700	0.104	0.039	0.151	0.006		
uc	0.699	0.134	0.021	0.137	0.009		
dc	0.618	0.137	0.009	0.230	0.006		

NOTE:

Inconsistent connectedness ("signaling") — the main difficulty for contextuality analysis of behavioral/social data.

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NOTE:

Nominal dominance for some pairs

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NOTE:

Nominal dominance for some pairs BUT not all of them.

• For each participant, the nominal dominance condition fails for at least one pair of content-sharing random variables.

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- Out of 100000 bootstrap resamples, in none of them, for none of the participants, was the condition satisfied.

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- Out of 100000 bootstrap resamples, in none of them, for none of the participants, was the condition satisfied.
- This means that the probability with which the observed violations of this necessary condition could occur by chance is smaller than 0.00021.

Closing remarks

 Based on the CbD analysis of many published experiments, it had been hypothesized that all behavioral systems are noncontextual (Dzhafarov, Kujala, Cervantes, Zhang, & Jones, 2016; Dzhafarov, Zhang, & Kujala, 2015).

Closing remarks

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- These experiments show this hypothesis to be false.
- We are now able to explore and find contextuality on human behavior (current work Basieva, Cervantes, Dzhafarov, & Khrennikov).

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