

## P3 analysis

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We first build several core data frames:

- **Tasks** lists the 11 tasks we studied and their IDs
- **Questions** lists the 27 questions, their IDs and the answer type they use
- **Responses** lists 407 total responses, broken out by task-resondant pairs, with questions as columns. These encompass responses from 37 unique individuals.

To evaluate the inter rater reliability, we compute Fleiss' Kappa

[illegible]

and Krippendorff's Alpha

[illegible]

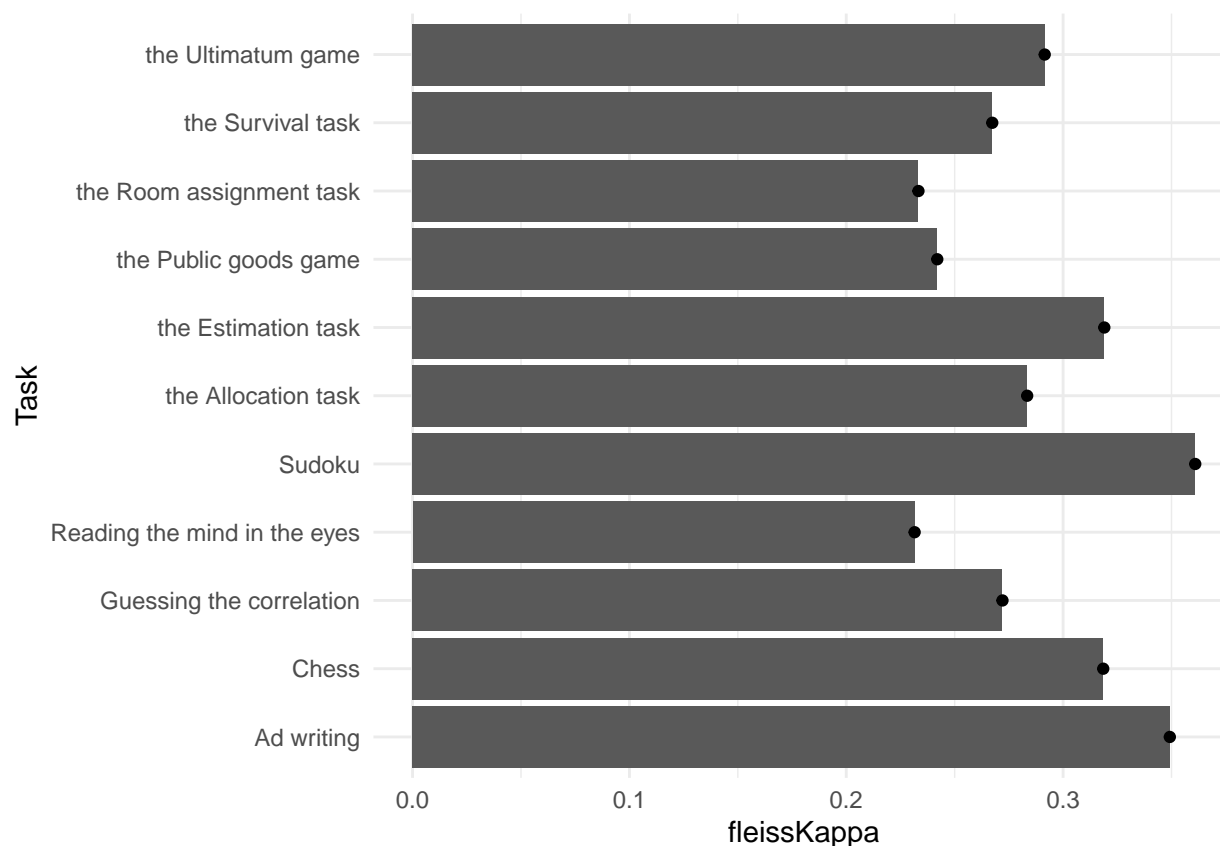
-0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03,  
-0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03, -0.03

for each task-question pair (a 26, 11 matrix, because one question was dropped due to being a free text response). However, this does not give us what we want as each position in these results is calculated from a 1 dimensional vector, which is not how these statistics are intended to be used. All this tells us is that

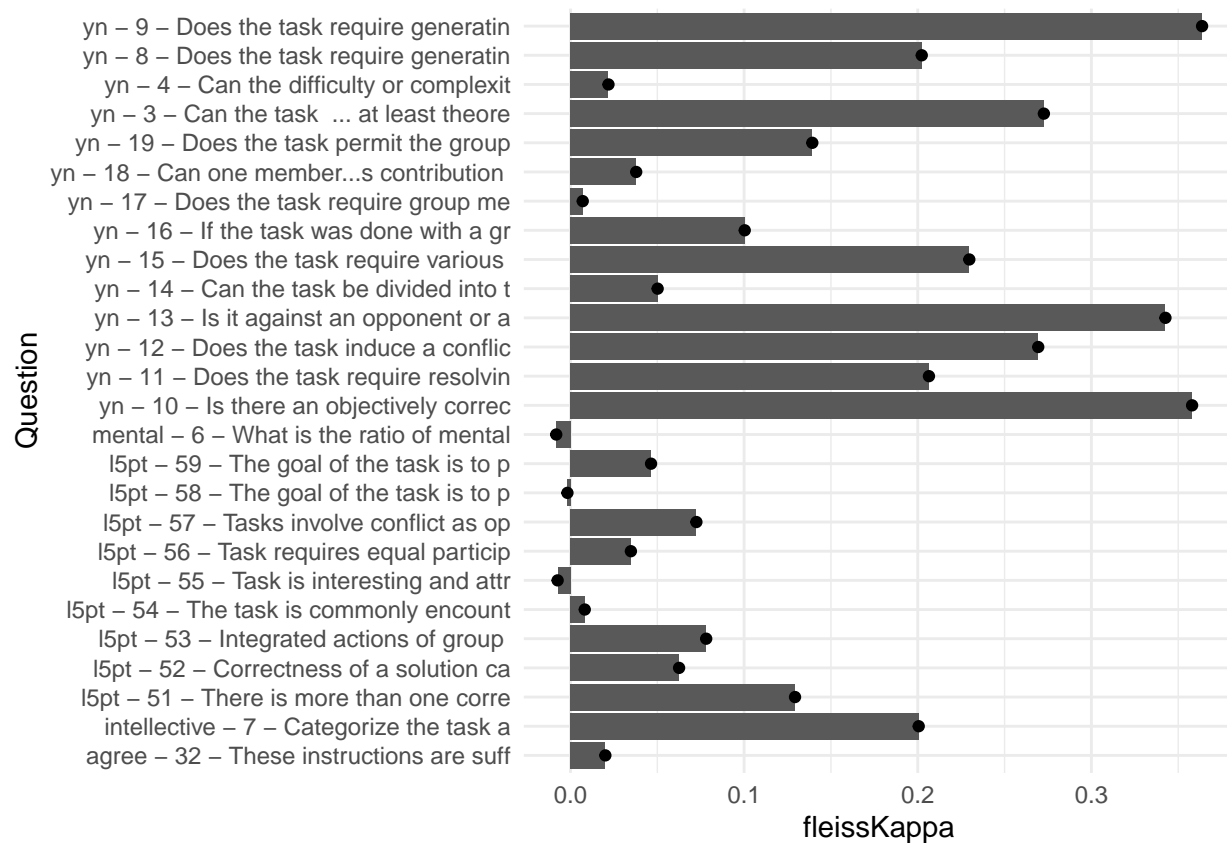
*Note that in Fleiss' Kappa, NA for a 1 dimensional vector is similar to 1, as in no variance across respondents. Krippendorff's Alpha does this correctly and shows 1 in those positions.*

So, we'd rather do this for subsets of the data, e.g. for each task, find the agreement across raters and questions, or for each question, find the agreement across raters and tasks, or even, for each rater, find the agreement across tasks and questions. In the next section, these assessments are performed.

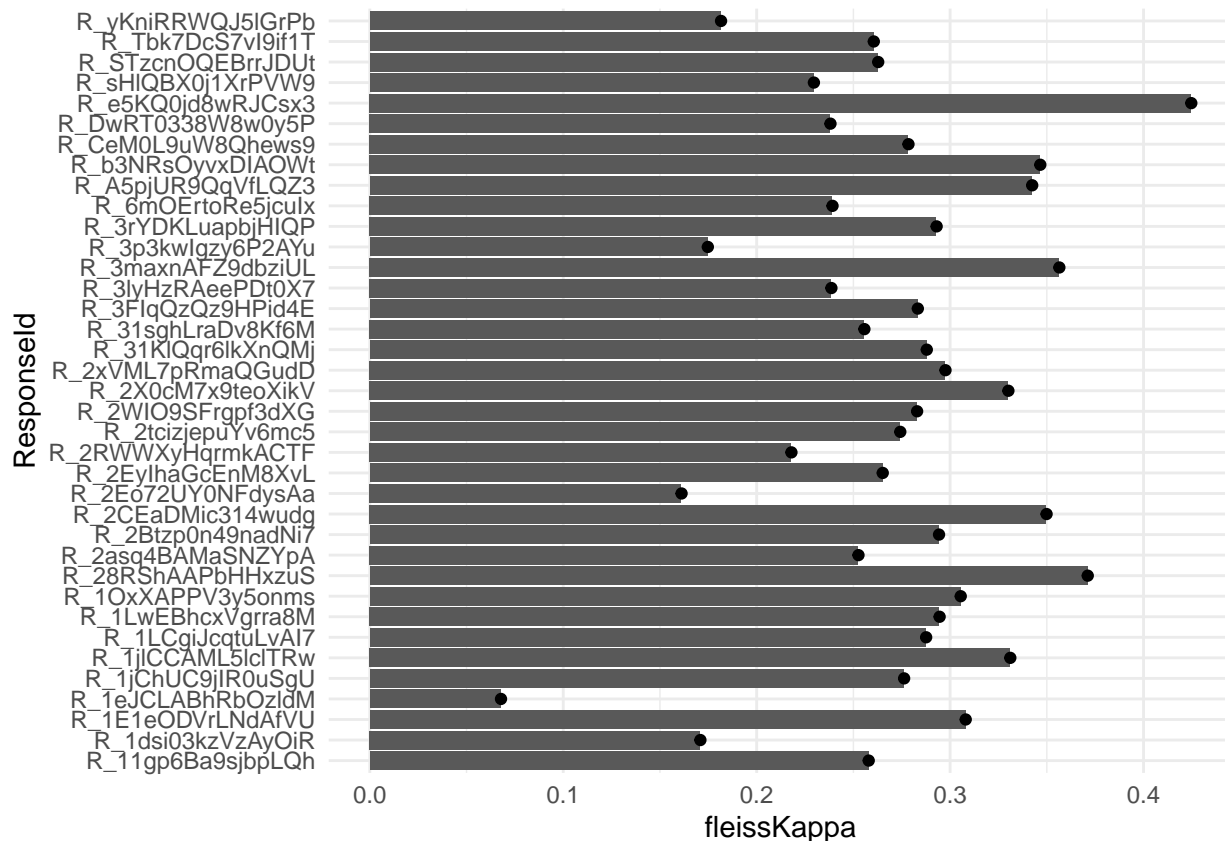
```
ggplot(perTaskAgreement,aes(Task,fleissKappa)) +
  geom_col() +
  geom_point(aes(x = perTaskAgreement$Task, y = perTaskAgreement$kripAlpha)) +
  coord_flip() +
  theme_minimal()
```



```
ggplot(perQuestionAgreement,aes(Question,fleissKappa)) +
  geom_col() +
  geom_point(aes(x = perQuestionAgreement$Question, y = perQuestionAgreement$kripAlpha)) +
  scale_x_discrete(labels=substring(perQuestionAgreement$Question,0,40)) +
  coord_flip() +
  theme_minimal()
```



```
ggplot(perRaterAgreement, aes(ResponseId, fleissKappa)) +
  geom_col() +
  geom_point(aes(x = perRaterAgreement$ResponseId, y = perRaterAgreement$kripAlpha)) +
  coord_flip() +
  theme_minimal()
```



*# Expanding the 'per question' design*

```
mine = kappam.fleiss(
  (responses %>% select(questionNames[26], Task, ResponseId) %>% spread(ResponseId, questionNames[26])),
  detail = TRUE)$detail

as.data.frame(mine) %>%
  filter(Var2 == "Kappa") %>%
  mutate(
    Task = Var1,
    fleissKappa = Freq
  )
```

##	Var1	Var2	Freq	Task
## 1	Ad writing	Kappa	-0.002	Ad writing
## 2	Chess	Kappa	-0.002	Chess
## 3	Guessing the correlation	Kappa	-0.002	Guessing the correlation
## 4	No	Kappa	0.376	No
## 5	Reading the mind in the eyes	Kappa	-0.002	Reading the mind in the eyes
## 6	Sudoku	Kappa	-0.002	Sudoku
## 7	the Allocation task	Kappa	-0.002	the Allocation task
## 8	the Estimation task	Kappa	-0.002	the Estimation task
## 9	the Public goods game	Kappa	-0.002	the Public goods game
## 10	the Room assignment task	Kappa	-0.002	the Room assignment task
## 11	the Survival task	Kappa	-0.002	the Survival task
## 12	the Ultimatum game	Kappa	-0.002	the Ultimatum game
## 13	Yes	Kappa	0.397	Yes
##	fleissKappa			

```
## 1      -0.002
## 2      -0.002
## 3      -0.002
## 4       0.376
## 5      -0.002
## 6      -0.002
## 7      -0.002
## 8      -0.002
## 9      -0.002
## 10     -0.002
## 11     -0.002
## 12     -0.002
## 13      0.397
```

```
# percentage of agreements for each question for each task - agreement at a random guess
ourMeasure <- responses %>%
  select(-ResponseId) %>%
  group_by(Task) %>%
  summarize_each(function(col) {
    agreement = mean((outer(col,col,function(x, y) as.integer(x==y)) %*% replicate(n(), 1)) / n())
    random = 1/nlevels(col) ** 2
    return(agreement - random)
  }) %>% gather(Question,Agreement,-Task)

ggplot(ourMeasure, aes(Task,Question,fill = Agreement)) +
  geom_tile() +
  geom_text(aes(label=paste(round(Agreement*100,0),"%",sep = ""),color=-Agreement),size=3) +
  scale_y_discrete(labels=substring(unique(ourMeasure$Question),0,20)) +
  scale_x_discrete(labels=substring(unique(ourMeasure$Task),0,10)) +
  theme(legend.position="none",axis.text.x = element_text(angle = 45, hjust = 1))
```

Question	yn – 9 – Does the ta	70%	41%	60%	56%	65%	25%	60%	56%	31%	36%	65%
	yn – 8 – Does the ta	28%	41%	33%	56%	25%	33%	52%	31%	29%	28%	28%
	yn – 4 – Can the dif	28%	25%	25%	33%	27%	31%	28%	36%	25%	26%	41%
	yn – 3 – Can the tas	52%	25%	56%	52%	65%	36%	38%	48%	26%	28%	56%
	yn – 19 – Does the t	65%	27%	25%	25%	29%	52%	33%	38%	29%	65%	28%
	yn – 18 – Can one me	41%	29%	28%	25%	33%	25%	36%	26%	38%	28%	31%
	yn – 17 – Does the t	33%	38%	26%	36%	33%	25%	28%	25%	25%	25%	31%
	yn – 16 – If the tas	29%	56%	29%	33%	38%	26%	41%	25%	25%	27%	28%
	yn – 15 – Does the t	52%	70%	29%	26%	36%	25%	28%	56%	33%	33%	52%
	yn – 14 – Can the ta	25%	36%	38%	52%	33%	28%	25%	28%	25%	25%	25%
	yn – 13 – Is it agai	56%	65%	48%	70%	75%	70%	56%	27%	52%	56%	25%
	yn – 12 – Does the t	31%	41%	56%	48%	65%	26%	56%	36%	41%	27%	48%
	yn – 11 – Does the t	41%	33%	38%	28%	65%	48%	25%	27%	26%	41%	31%
	yn – 10 – Is there a	56%	26%	70%	28%	65%	28%	56%	36%	28%	52%	28%
	mental – 6 – What is	51%	56%	63%	53%	64%	52%	59%	51%	50%	38%	60%
	l5pt – 59 – The goal	40%	51%	36%	19%	56%	31%	38%	22%	48%	30%	23%
	l5pt – 58 – The goal	25%	19%	20%	21%	19%	21%	18%	23%	17%	18%	25%
	l5pt – 57 – Tasks in	24%	38%	37%	27%	40%	24%	27%	17%	27%	22%	22%
	l5pt – 56 – Task req	25%	19%	18%	25%	28%	25%	20%	27%	23%	25%	22%
	l5pt – 55 – Task is	29%	25%	19%	23%	31%	30%	26%	31%	22%	26%	33%
	l5pt – 54 – The task	17%	23%	22%	21%	20%	23%	19%	20%	20%	21%	22%
	l5pt – 53 – Integrat	31%	17%	21%	24%	26%	30%	31%	29%	36%	31%	28%
	l5pt – 52 – Correctn	18%	25%	26%	23%	50%	19%	38%	20%	25%	21%	17%
	l5pt – 51 – There is	52%	28%	26%	26%	37%	38%	27%	25%	26%	27%	19%
	intellective – 7 – C	48%	31%	48%	20%	70%	39%	57%	36%	34%	27%	50%
	agree – 32 – These i	47%	31%	24%	37%	27%	28%	49%	29%	38%	39%	59%
		Ad writing	Chess	Guessing t	Reading th	Sudoku	the Alloc	the Estima	the Public	the Room a	the Surviv	the Ultima
		Task										