experimental design for linguists - pt 3

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PHILIP HOFMEISTER UNIVERSITY OF ESSEX

Acceptability Judgments

Numerous ways of eliciting 'grammaticality' judgments



Numerous ways of eliciting 'grammaticality' judgments

Binary judgments (YES/NO)



- Numerous ways of eliciting 'grammaticality' judgments
 - Binary judgments (YES/NO)
 - Forced choice



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 - Likert scales (1-5 / 1-7 / etc.)



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 - Magnitude Estimation



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 - Magnitude Estimation
 - Thermometer Judgments



- Numerous ways of eliciting 'grammaticality' judgments
 - Binary judgments (YES/NO)
 - Forced choice
 - Likert scales (1-5 / 1-7 / etc.)
 - Magnitude Estimation
 - Thermometer Judgments
 - Speeded vs. non-speeded



- Which method to use?
- What instructions to use?
- How to analyze and treat the data?



INSTRUCTIONS

- Instructions should be in the simplest language possible and should lack any technical jargon
 - e.g. grammatical, noun, verb, phrase, semantics, syntax



Please read each sentence, then answer the question immediately following, and rate the sentence for naturalness on a scale of 1 to 7, 1 being extremely unnatural and 7 being extremely natural. Assign higher numbers to sentences you find more natural, and lower numbers to sentences you find less natural.

SAMPLE INSTRUCTIONS



Please read each sentence, then answer the question immediately following, and rate the sentence for naturalness on a scale of 1 to 7, 1 being extremely unnatural and 7 being extremely natural. Assign higher numbers to sentences you find more natural, and lower numbers to sentences you find less natural.

SAMPLE INSTRUCTIONS

We are interested in how natural you think the structure of the sentences below sound, not how plausible the meanings are. For example, "The man bit the dog" describes something less likely to happen than "The dog bit the man", but both are natural English sentences---there's nothing identifiably wrong with either sentence. So you should give them the same rating. You should provide ratings that match up with what would sound natural to you in a conversation or in reading a text, but you should NOT rely on what grammar books may have said is the right way to talk. There are no right or wrong ratings . . . we are exclusively interested in what your opinion is.





INSTRUCTIONS

- It's still not well-understood what participants are basing their ratings on
 - Participants perform similarly when asked to judge on the basis of meaningfulness vs. grammaticality (Maclay & Sleator 1960)
 - Syntactic well-formedness & interpretability are deeply intertwined



FORCED CHOICE TASKS

- Which of these is better?
 - Which book did who write?
 - What did who write?



- Magnitude Estimation
 - Adapted from psychophysics research (Stevens 1975)

$$=$$
?



BILITY

Magnitude Estimation

Adapted from psychophysics research (Stevens 1975)

Gail seems to Gail like No one likes fishing fishing

$$= 10$$



JUDGMENTS

Magnitude Estimation

Adapted from psychophysics research (Stevens 1975)

Gail seems to Gail like No one likes fishing fishing

$$= 10$$

$$= 30$$



- Magnitude Estimation
 - Potential advantages
 - larger space of judgments
 - gradience in judgments
 - each item can receive a unique score



- Magnitude Estimation
 - Participants don't use magnitudes
 - Instructions are ignored or participants are incapable of following them in linguistic judgment tasks
 - Featherston (2008): there is no zero point as in psychophysics



THERMOMETER JUDGMENTS (FEATHERSTON 2009)

Judgments made on a linear scale with respect to 2 reference points

- The way that the project was approaching to the deadline everyone wondered. = 20
- The architect told his assistant to bring the new plans to the foreman's office. = 30



- Any difference between different acceptability measures?
 - Weskott & Fanselow (2011)
 - . . . dass der Mönch dem Jäger geholfen hat
 - that the monk-NOM the hunter-DAT helped AUX
 - . . . dass dem Jäger der Mönch geholfen hat.
 - that the hunter-DAT the monk-NOM helped AUX



- Weskott & Fanselow (2011): no notable differences between binary judgments, npoint judgments, and ME
 - Same participants rated the same items using binary judgments & ME or n-point & ME methods

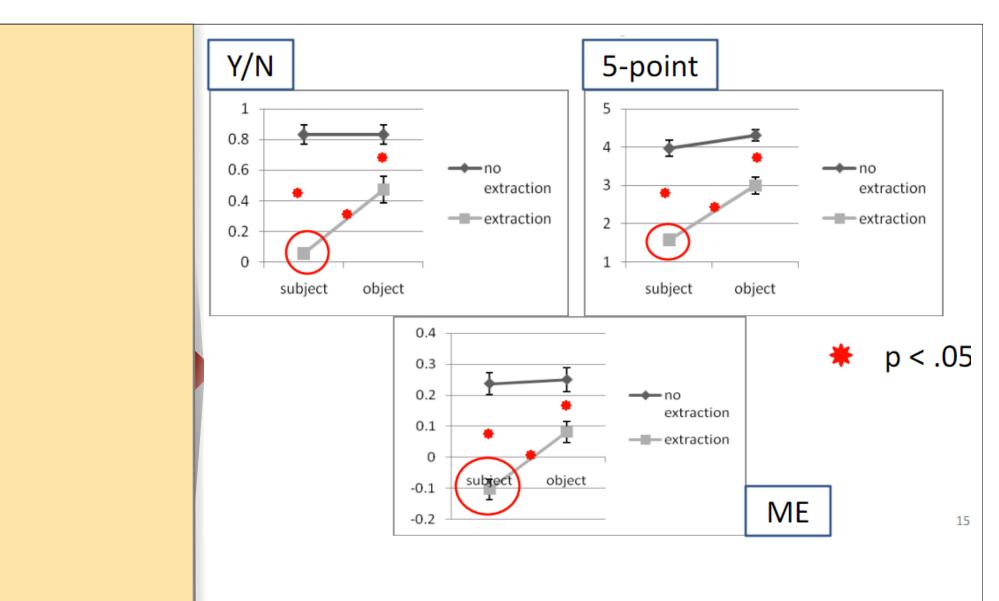


FUKUDA, MICHEL, BEECHER, & GOODALL (2010)

- What do you think [pictures of ___] will be on the website?
- What do you think the website will post [pictures of ___]?
- Do you think the pictures of the new car will be on the website?
- Do you think the website will post pictures of the new car?

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- In many circumstances, it is likely true that there is little difference across methods
 - Do results hold with a large # of predicted contrasts?
 - ME creates unnecessary noise due to task demands
 - Other technical issues with ME (Sprouse 2011)

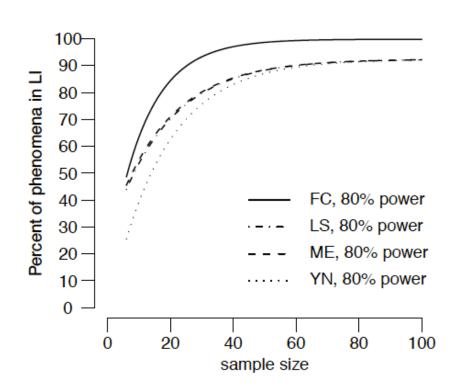


COMPARING METHODS

- What have studies to date established?
 - Significant differences between a small
 # of conditions are as detectable with
 methods that use a small scale
 - Effect sizes may even be *larger* with closed scale paradigms



COMPARING METHODS



- Note, if the question is: what methodology will maximize chances of finding an effect
 - Then, forced choice will be the best because it's design coerces participants to find a difference



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COMPARING METHODS

- Let's say you find a significant effect with a YES/NO design but not Thermometer Judgments
 - Does this mean YN tasks are better?



COMPARING METHODS

- In determining what's the 'best' methodology, the better question seems to be:
 - What's the most informative & predictive method?



ANALYZING JUDGWENTS

Experimental 'best practice' in judgment tasks is not well-established



ANALYZING JUDGWENTS

- When should participants and data points be excluded?
- How should materials be presented?
- How should ordinal scale data be treated?



PARTICIPANT & OUTLIER REMOVAL

- Easy cases
 - Participants with no variation in judgments, e.g. all judgments = 4
 - Participants with significant L2 exposure (unless that's what's being investigated)
 - Participants who cannot answer a majority of comprehension Qs correctly



PARTICIPANT & OUTLIER REWOVAL

- Z-scores can also be used to remove outliers, e.g. > 2.5 SDs
 - Exercise caution
 - Removal of extreme outliers can reduce differences between conditions
 - Remove outliers for each condition, not for the entire dataset



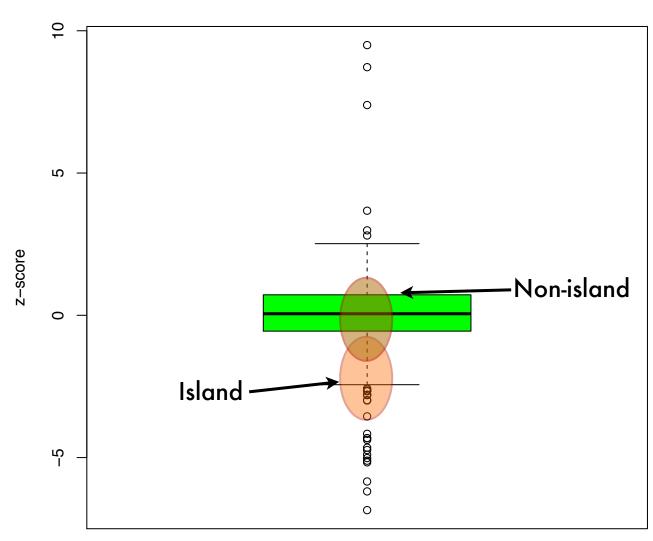
PARTICIPANT & OUTLIER REWOVAL

- I saw who Emma doubted the report that we had captured in the nationwide FBI manhunt.
- I saw who Emma doubted that we had captured in the nationwide FBI manhunt.



Boxplot of z-scores



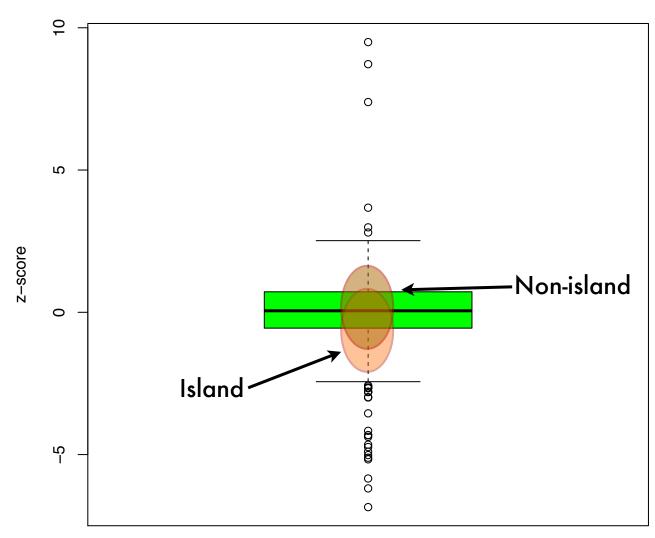






Boxplot of z-scores









Many formal acceptability experiments present sentences in their entirety and allow participants unlimited time to rate the sentences



Excessive time for introspective allows for more and more orthogonal factors to interfere with judgments



- Alternative: Present words or sentences for a fixed period of time
 - Equalizes study time across participants



66

FAST OR SLOW? (SCHUTZE 1996) Obviously, if our goal is to examine the online processing of grammaticality, its effects on parsing, and so forth, then first reactions will be most useful. But if it is the status of the sentence that concerns us, it is not clear which should be preferred.

"



FAST OR SLOW?

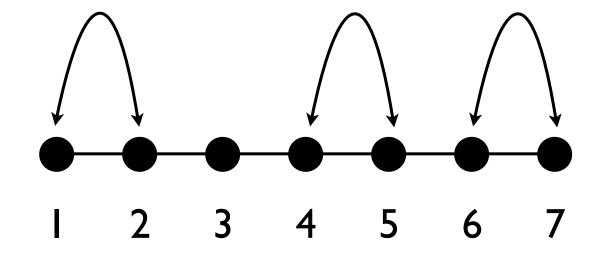
If you believe that performance factors can obscure competence factors, then time-limited judgments are undesirable



- Acceptability surveys often lack any assessment of understanding
 - Where possible, comprehension Qs provide a minimal check on reading for understanding



ORDINAL SCALE DATA

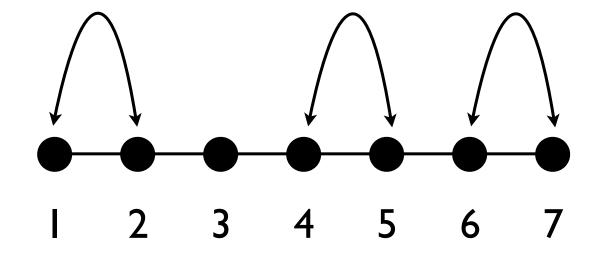


Is the distance between 1 & 2 the same as the distance between 4 & 5?

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ORDINAL SCALE DATA

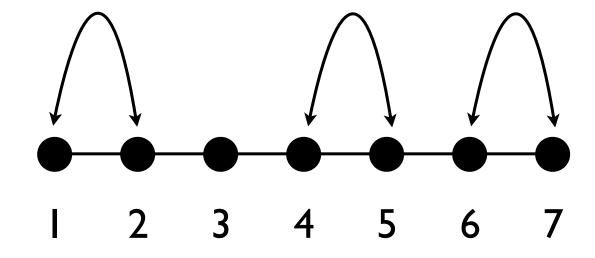


Most statistical methods for equation modeling assume that data are continuous

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ORDINAL SCALE DATA



Stepwise logistic regression, weighted least squares, PROBIT regression

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- Methodologies like ME & TJ produce linear data that is more suitable to standard statistical tests (like ANOVAs)
- YES/NO tasks can also be analyzed with well-understood methods (e.g. logistic regression)



CONCLUSION

- Much remains to be known about the judgment process and thus what the best way of eliciting and analyzing judgments is
 - But there is a considerable body of evidence to consult now . . .



RECOMMENDED RESOURCES

- Hill (1961)
- Chapman (1974)
- Greenbaum (1977)
- Chraudron (1983)
- Nagata (1988)
- Schuetze (1996)
- Cowart (1997)
- Dabrowska (2010)

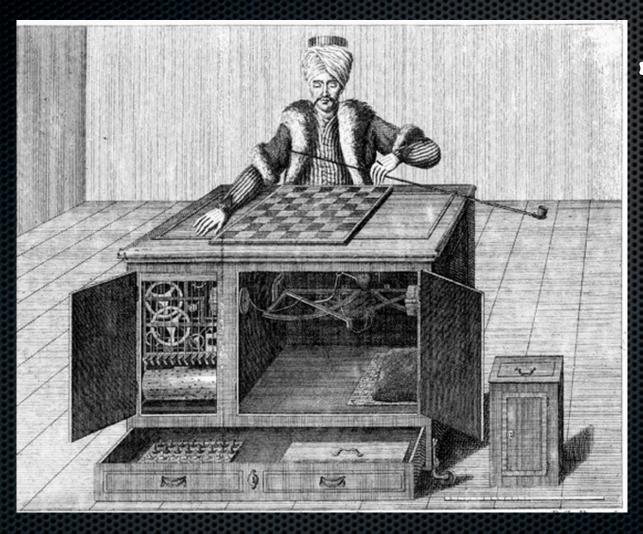


COLLECTING JUDGMENTS UIA MECHANICAL TURK

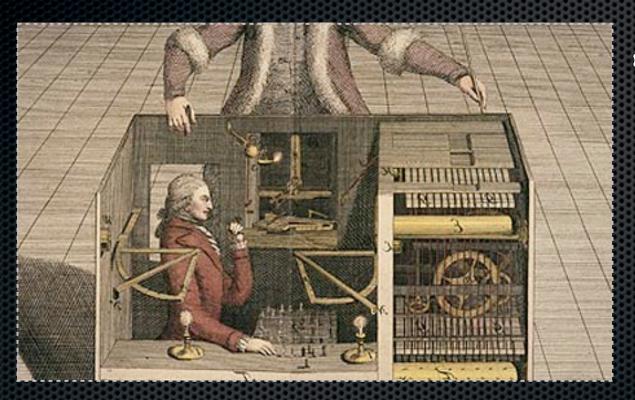


Rather, the main argument for the methodological status quo has always been that the benefits of formal experimentation are not (yet) offset by the decrease in convenience. [Myers 2009:418]





Amazon's Mechanical Turk is a crowdsourcing forum that allows for quick, reliable, and easy collection of judgment data



Primarily developed as a means for eliciting human feedback where computerbaed methods are inefficient/ unreliable.

- Some terminology
 - Requestor: individual/organization requesting workers to complete a task (HIT)
 - Worker: anonymous individual who completes task
 - HIT: Human Intelligence Task = Job

■ How does it work?

- How does it work?
 - A requestor posts a HIT

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 - Specifies geographical restrictions, worker qualifications, e.g. 95% approval, pay rate

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 - A requestor posts a HIT
 - Specifies geographical restrictions, worker qualifications, e.g. 95% approval, pay rate
 - Workers accept job, submit work
 - MT stores data and provides spreadsheet output
 - Requestor approves work quality & pays worker

Advantages

- Advantages
 - Speed = 60-80 English-speaking subjects/hour

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- Advantages
 - Speed = 60-80 English-speaking subjects/hour
 - Cost-effective = To complete a 100 item survey, prices of \$1-\$3/hr are normal
 - Reliable = At least 3 independent research teams have confirmed that it produces results similar to laboratory investigations (Frank et al 2010; Munro et al 2010; Sprouse 2011)

- Disadvantages:
 - Still new, in beta mode
 - Somewhat restricted pool of participants; repeat participants are a danger
 - Cheating is possible if you're not careful
 - Mechanical Turk output is disorganized (but there's a solution)

- What do you need to get started?
 - An item file
 - turkolizer available for free @ tedlab.mit.edu/ software/turkolizer.py
 - turk-template-changer.py (optional)
 - a computer with a command prompt, e.g. Terminal (Mac), CygWin (Windows), etc.

ITEM FILES

- Item files contain your experimental materials and any fillers/distractors
 - It's simple: write your items in a word processor with the following format
 - # # experiment-name item_number condition_name
 - Target Sentence
 - Comprehension Question (Optional)

SAMPLE ITEM

exex 9 extract noextra

Kenneth finally revealed which President he overheard a nasty remark about earlier while on the subway. ? Did Kenneth hear the remark on the subway? Yes

exex 9 extract_extra

Kenneth finally revealed which President he overheard a nasty remark earlier about while on the subway. ? Did Kenneth hear the remark on the subway? Yes

exex 9 noextract_extra

Kenneth finally revealed that he overheard a nasty remark about the President earlier while on the subway.

? Did Kenneth hear the remark on the subway? Yes

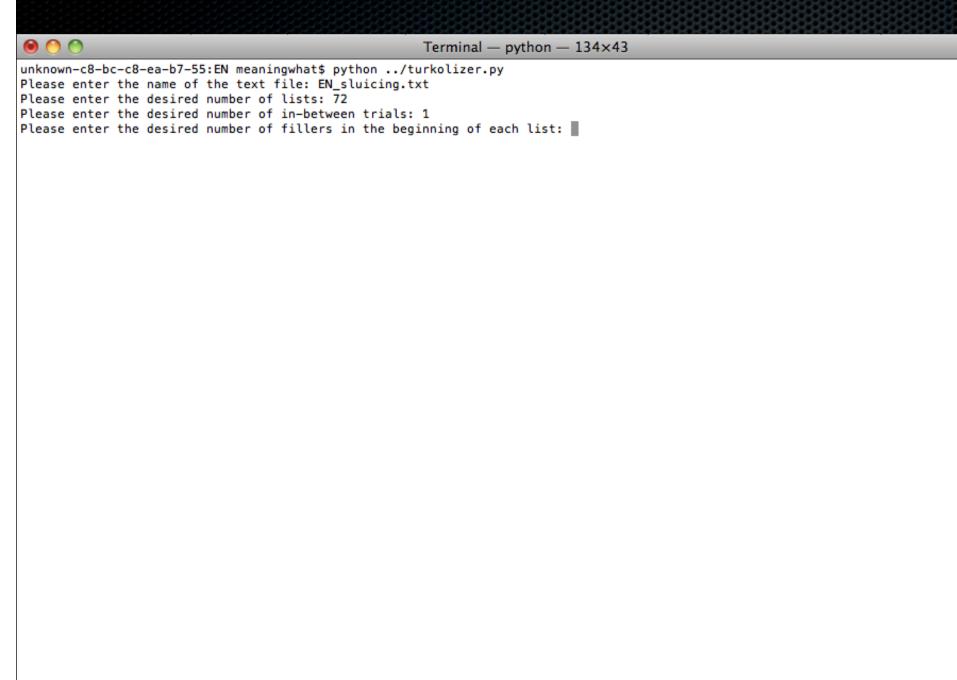
exex 9 noextract_noextra

Kenneth finally revealed that he overheard a nasty remark earlier about the President while on the subway.

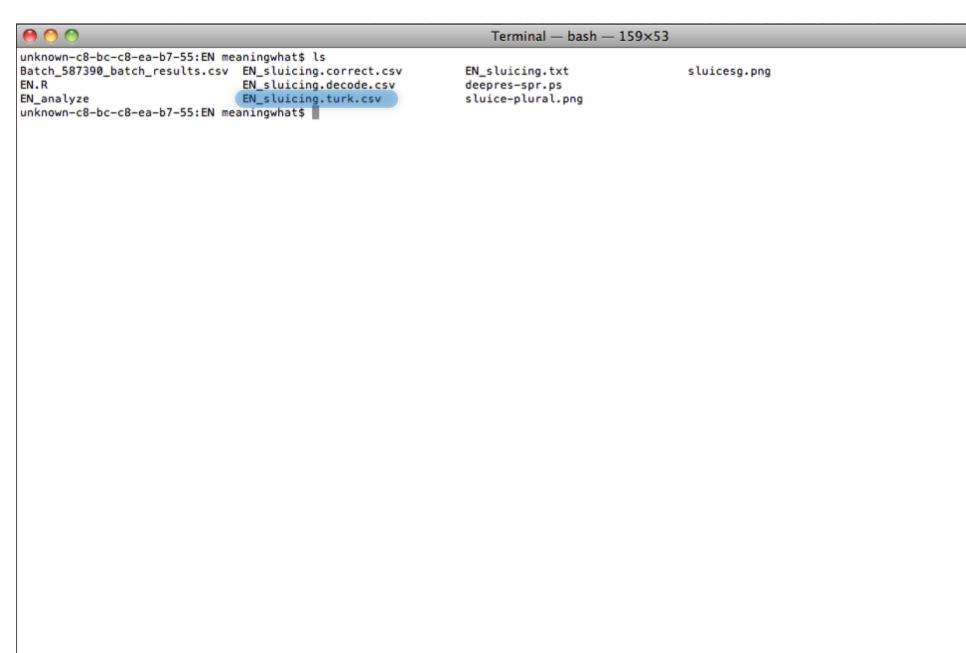
? Did Kenneth hear the remark on the subway? Yes

TURKOLIZER

- Software developed at TedLab @ MIT
- Takes your item file and turns into the format that Mechanical Turk needs
- Let's see an example



```
Terminal — bash — 159 \times 53
          - 36 trials
          - number of questions: 1
          - conditions:
['MC', 'MM', 'RC']
Experiment: cat-sluc
          - 6 items
          - 1 conditions
          - 6 trials
          - number of questions: 1
          - conditions:
['x']
Experiment: mult-sluc
          - 3 items
          - 1 conditions
          - 3 trials
          - number of questions: 1
          - conditions:
['x']
Experiment: PE
          - 5 items
          - 1 conditions
          - 5 trials
          - number of questions: 1
          - conditions:
['x']
Experiment: w-o-sluc
          - 4 items
          - 1 conditions
          - 4 trials
          - number of questions: 1
          - conditions:
['x']
Performing a check of the parameters...
Creating a latin square...
Creating LCM ( 3 ) lists...
Creating 72 lists...
Randomizing each list...
Creating two csv files...
----- DONE! -----
unknown-c8-bc-c8-ea-b7-55:EN meaningwhat$
```



MT STEPS

- 1) Select a template
- 2) Upload input data to template
- 3) Preview and publish
- 4) Download data



Design HIT Templates

Welcome! You can edit one of your existing templates. Visit the Help Center or read the User Guide for help.

Your HIT Templates						
HIT Template Name	<u>HIT Title</u>	Creation Date ▼				
Judge English Sentences for Naturalness	A Survey About the Naturalness of English Sentences See an example	September 21, 2011	Edit Copy template Delete Layout ID			
Judge the Naturalness of English Sentences	A Survey About the Naturalness of English Sentences See an example	August 26, 2011	Edit Copy template Delete Layout ID			
Judge Naturalness of English Sentences	A Survey About the Naturalness of English Sentences See an example	July 20, 2011	Edit Copy template Delete Layout ID			

Or, you can create a new HIT template by starting from one of the sample templates:

Sample HIT Templates					
HIT Template Name	HIT Title				
Basic Open-ended Question	Answer a Simple Question See an example	Start with this template			
Blank Template	Default Title See an example	Start with this template			



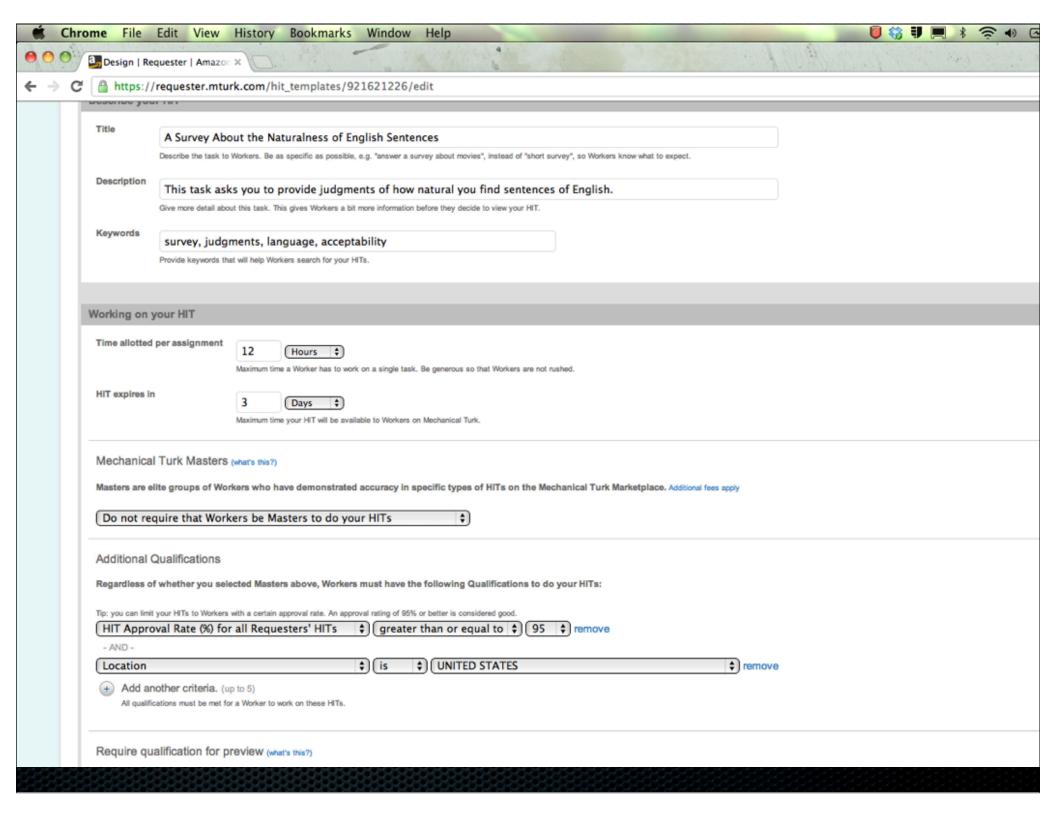
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Sample HIT Templates					
HIT Template Name	HIT Title				
Basic Open-ended Question	Answer a Simple Question See an example	Start with this template			
Blank Template	Default Title See an example	Start with this template			



TEMPLATES

- An acceptability template is already available @ http://tedlab.mit.edu/software/tedlab-turksurvey1.html
- Simply copy and past the template in to a blank template, modifying the number of items as you need (template has 150 items)

Edit HIT Template

∩ 1(Extremely unnatural)

0.4

-5

 \bigcirc 6

Use the HTML editor below to design the layout of your HIT. This layout is common for all of the HITs created with this template. You can define variables for data that will vary from HIT to HIT (Learn more). 1) Enter Properties Design Layout Template Name: Judge English Sentences for Nat This name is not displayed to Workers. Frame Height 400 Height in pixels of the frame your HIT will be displayed in to Workers. Adjust the height appropriately to minimize scrolling for Workers. - Font Format You are participating in a study being performed by scientists at the University of Tuebingen, Germany. This study has the name "EXEX_Sep21". Please do not complete this HIT if you have already completed a HIT with the same study name information. What country are you from? OUSA OCanada OUK OAustralia / New Zealand OIndia OOther Is English your first language?

Yes

No Please read each sentence, then answer the question immediately following, and rate the sentence for naturalness on a scale of 1 to 7, 1 being extremely unnatural and 7 being extremely natural. Assign higher numbers to sentences you find more natural, and lower numbers to sentences you find less natural. Please note that there is a correct answer for each question. Because some Mechanical Turk users answer questions randomly, we will reject users with error rates of 25% or larger. Consequently, if you cannot answer 75% of the questions correctly, please do not fill out the survey. Note: Please read the sentence before answering the question and giving the rating! We are interested in how natural you think the structure of the sentences below sound, not how plausible the meanings are. For example, "The man bit the dog" describes something less likely to happen than "The dog bit the man", but both are natural English sentences---there's nothing identifiably wrong with either sentence. So you should give them the same rating. You should provide ratings that match up with what would sound natural to you in a conversation or in reading a text, but you should NOT rely on what grammar books may have said is the right way to talk. There are no right or wrong ratings . . . we are exclusively interested in what your opinion is. Sentence: \${trial_1} Question: \${question_1_1} \bigcirc No Sentence rating:

Save Preview and Finish

Sentence: \${trial_1}						
Question: \${question_1_1}						
⊖Yes ⊝No						
Sentence rating:	⊖ 2	O 3	O 4	⊕ 5	○ 6	
Sentence: \${trial_2}						
Question: \${question_1_2}						
⊖Yes ⊝No						
Sentence rating:						
1(Extremely unnatural)	○ 2	⊕ 3	⊖ 4	⊝ 5	○ 6	→ 7(Extremely natural)
Sentence: \${trial_3}						
Question: \${question_1_3}						
⊖Yes ⊝No						
Sentence rating:						
1(Extremely unnatural)	○ 2	○ 3	O 4	○ 5	○ 6	
	1818181818181818	8888888		84848484	\$55555555555	

PUBLISH

- You can make as many templates as you want for different experiment types
- Once you've got your template ready, it's time to merge the template with your items

amazonmechanical turk REQUESTER

Home Design Publish Manage Developer Help

Create HITs individually

Select HIT Template

1 Select HIT Template Upload Input Data Preview Confirm an

All of the HITs in a batch will use the same HIT template. The HIT template describes the layout and properties of the HITs.

Your HIT Templates							
	HIT Template Name	HIT Title	Creation Da	ate ▼			
Select	Judge English Sentences for Naturalness	A Survey About the Naturalness of English Sentences See an example	September 21, 2011	12:39 PM			
Select	Judge the Naturalness of English Sentences	A Survey About the Naturalness of English Sentences See an example	August 26, 2011	7:13 AM			
Select	Judge Naturalness of English Sentences	A Survey About the Naturalness of English Sentences See an example	July 20, 2011	5:59 AM			

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Upload Input Data

Select HIT Template Upload Input Data Preview Confirm and Publish

Choose a .cvs file with the variables you specified in your HIT Template ("Judge English Sentences for Naturalness") (learn more).

```
Your file's column headers need to include: trial_1, question_1_1, trial_2, question_1_2, trial_3, question_1_3, trial_4, question_1_4, trial_5, question_1_5, trial_6, question_1_6, trial_7, question_1_7, trial_8, question_1_8, trial_9, question_1_9, trial_10, question_1_10, trial_11, question_1_11, trial_12, question_1_12, trial_13, question_1_13, trial_14, question_1_14, trial_15, question_1_15, trial_16, question_1_16, trial_17, question_1_17, trial_18, question_1_18, trial_19, question_1_19, trial_20, question_1_20, trial_21, question_1_21, trial_22, question_1_22, trial_23, question_1_23, trial_24, question_1_24, trial_25, question_1_25, trial_26, question_1_26, trial_27, question_1_27, trial_28, question_1_28, trial_29, question_1_29, trial_30, question_1_30, trial_31, question_1_31, trial_32, question_1_32, trial_33, question_1_33, trial_34, question_1_34, trial_35, question_1_35, trial_36, question_1_36, trial_37, question_1_37, trial_38, question_1_38, trial_39, question_1_39, trial_40, question_1_40, trial_41, question_1_41, trial_42, question_1_42, trial_43, question_1_43, trial_44, question_1_44, trial_45, question_1_45, trial_46, question_1_46, trial_47, question_1_47, trial_48, question_1_48, trial_49, question_1_49, trial_50, question_1_50, trial_51, question_1_51, trial_52, question_1_52, trial_53, question_1_53, trial_54, question_1_54, trial_60, trial_61, question_1_61, trial_62, question_1_62, trial_63, question_1_63, trial_64, question_1_64, trial_65, question_1_65, trial_66, question_1_66, trial_67, question_1_70, trial_71, question_1_71, trial_72, question_1_72, trial_73, question_1_73, trial_74, question_1_74, trial_75, question_1_75, trial_76, question_1_76, trial_77, question_1_77, trial_78, question_1_78
```

Judge English Sentences for Naturalness

Locate a New File

Choose File No file chosen

Upload

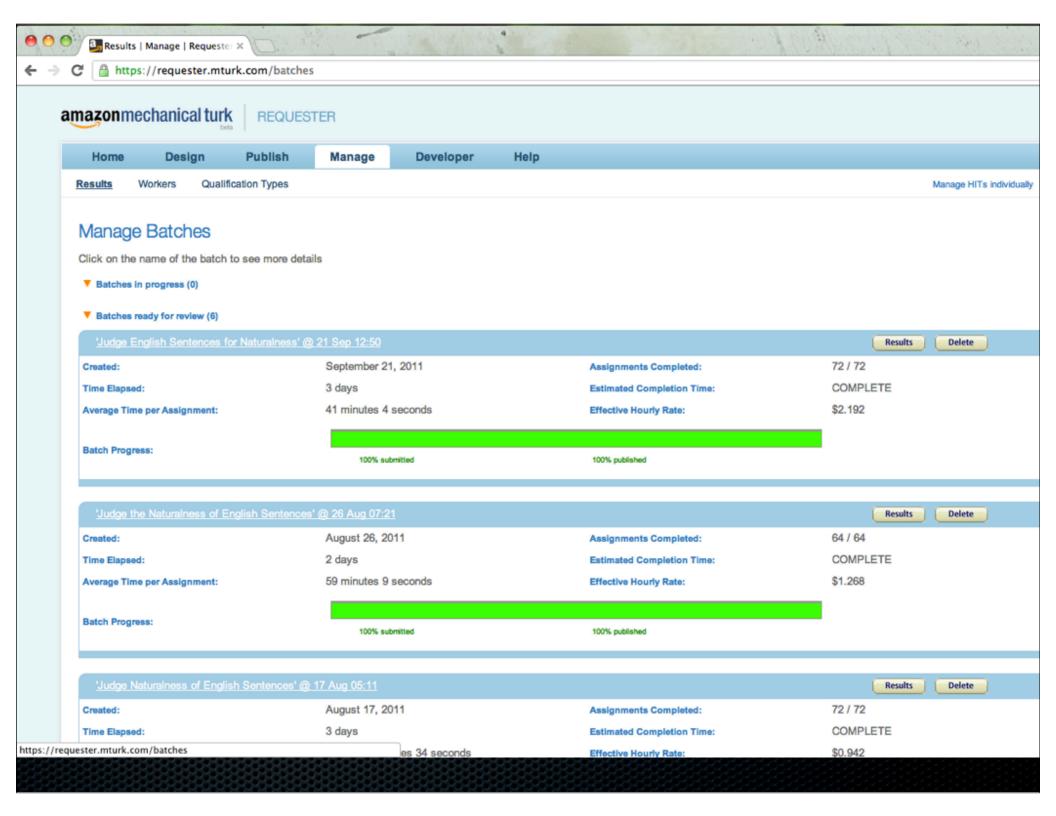
Download a sample of the input file for this HIT template

Or Choose an Existing File

Your Existing Files							
	File Name Input Lines Creation Date ▼						
Select	extract-extrapose.turk.csv	72	September 21, 2011	12:48 PM PDT	Delete		
Select	caps-context.turk.csv	64	August 26, 2011	7:14 AM PDT	Delete		
Select	in-situ-items.turk.csv	72	August 17, 2011	4:49 AM PDT	Delete		
Select	extractionPP-items.turk.csv	24	August 15, 2011	8:35 AM PDT	Delete		
Select	ppdist_resump.turk.csv	60	July 20, 2011	6:29 AM PDT	Delete		

Back

Sentence: We read which univ						
Question: Did the evidence sp	ecify admission rate	s for the best universit	ties?			
⊖Yes ⊝No						
Sentence rating:						
○ 1(Extremely unnatural)	⊕ 2	⊙ 3	⊕ 4	⊙ 5	⊙ 6	○ 7(Extremely natural)
Sentence: Hundreds of people	turned up at the hou	use of a state minister	demanding a solution	to the problem.		
Question: Were citizens hound	ding government off	icials at state building	s?			
⊙Yes ⊙No						
Sentence rating:						
○ 1(Extremely unnatural)	⊕ 2	⊕ 3	○ 4	⊝ 5	⊝ 6	○ 7(Extremely natural)
1888888888	888888	X888888				3333333333 3333333
						3333333333 33333333



MANAGING RESULTS

- MT delivers the results in a rather unwieldy format
 - Each row contains the values from each worker/ HIT
 - For statistical analysis, you want each judgment on its row
- Results can be re-organized in SPSS/R/Matlab
- tedlab-turk-survey1-format.R does this for you

MANAGING WORKERS

- You must approve your workers' performance for them to get paid
 - Don't decline to pay unless the participant really ignored the instructions or cheated
 - MT workers track who pays and who doesn't (they even have a union!)

BEYOND JUDGMENTS

- Of course, MT can be used for more than just eliciting acceptability judgments
- It can be used for
 - Sociolinguistic surveys
 - Forced-choice tasks
 - Elicitation/completion tasks
 - Self-paced reading

CONCLUSION

- Gathering linguistic data is now easier than ever given technological and crowd-sourcing advances
- Costs are now considerably less, and you need increasingly fewer technical skills to implement experiments
- Experimental data allows for quantitative and statistical analyses that elude traditional methods

... UNFORTUNATELY

Because MT is in beta mode, you or a colleague unfortunately need a US credit card at the moment to be a requestor

RESOURCES

 http://tedlab.mit.edu/tedlab_website/ researchpapers/
 Gibson et al 2011 LLCO_mturk.pdf For Christ's sake, stop!