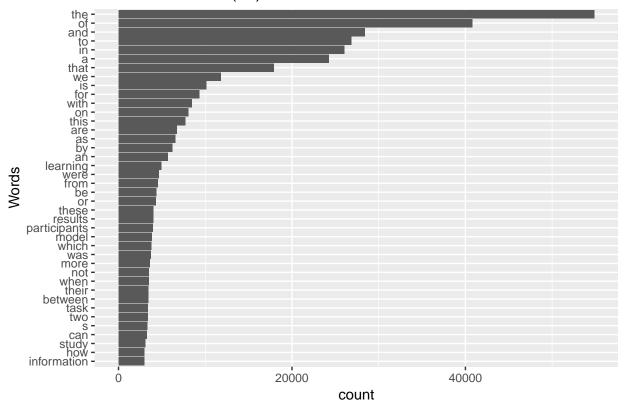
CogSci Word Counts

Lauren Oey 11/24/2018

Unfiltered Word Frequency Across All Abstracts

```
words %>%
  group_by(lowerword) %>%
  summarise(count = n()) %>%
  arrange(desc(count)) %>%
  head(40) %>%
  ggplot(aes(x=reorder(lowerword,count), y=count)) +
  geom_bar(stat="identity") +
  ggtitle("Raw Word Count (All)") +
  scale_x_discrete("Words") +
  coord_flip()
```

Raw Word Count (All)



```
ggsave("graphs/rawWordCount.png")
```

```
## Saving 6.5 x 4.5 in image
```

Gets Lemma & POS Info using CleanNLP; Removes Function Words (e.g. determiners, prepositions)

First time running, you need to run this to extract the lemma/POS info from CleanNLP ## This takes awhile, so it's better to save the CSV file and read in the file for future use

```
#cnlp_init_udpipe()
#obj <- cnlp_annotate(df$abstract, as_strings = TRUE, doc_ids=df$title)
#obj_token <- cnlp_get_token(obj)
#write.csv(obj_token, "token_info.csv")
obj_token <- read.csv("token_info.csv")

## Filters out most POS, keeping nouns, verbs, adjectives, proper nouns, adverbs, numbers,
## and INTJ, which is kind of a mix of multiple things

obj_token_cleaned <- obj_token %>%
    filter(upos %in% c("NOUN", "VERB", "ADJ", "PROPN", "ADV", "NUM", "INTJ")) %>%
    mutate(title = id) %>%
    select("title", "word", "lemma")

write.csv(obj_token_cleaned, "token_info_cleaned.csv")
```

Joined CogSci Data + CleanNLP File (added lemma information)

```
words_full <- inner_join(words, unique(obj_token_cleaned), by=c("title","word")) %>%
    mutate(lowerlemma = tolower(lemma))
```

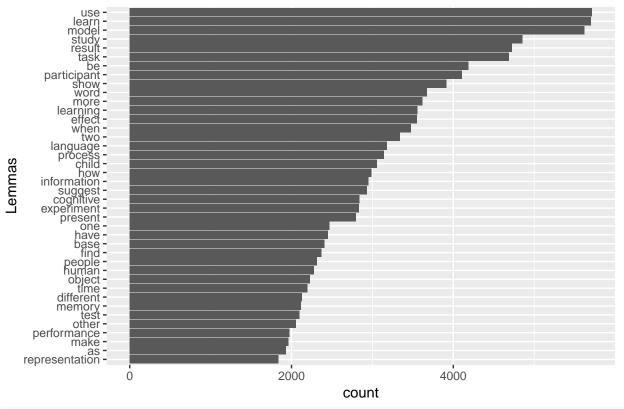
```
## Warning: Column `title` joining character vector and factor, coercing into
## character vector
## Warning: Column `word` joining character vector and factor, coercing into
## character vector
```

```
wc_overall <- words_full %>%
  group_by(lowerlemma) %>%
  summarise(count = n()) %>%
  arrange(desc(count))
write.csv(wc_overall, "wc_overall.csv")

ggplot(head(wc_overall, 40), aes(x=reorder(lowerlemma,count), y=count)) +
  geom_bar(stat="identity") +
  ggtitle("Lemma Count") +
  scale_x_discrete("Lemmas") +
  coord_flip()
```

Lemma Count

Lemma Word Count

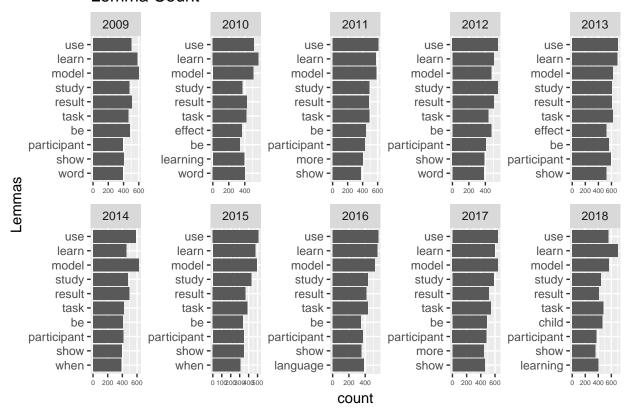


```
ggsave("graphs/overallPopWords.png")
```

```
## Saving 6.5 x 4.5 in image
wc_byYear <- words_full %>%
   group_by(year,lowerlemma) %>%
   summarise(count = n()) %>%
   arrange(year,desc(count))
write.csv(wc_byYear, "wc_byYear.csv")
```

```
wc_byYear %>%
  group_by(year) %>%
  top_n(10,count) %>%
  ggplot(aes(x=reorder(lowerlemma,count), y=count)) +
  geom_bar(stat="identity") +
  ggtitle("Lemma Count") +
  scale_x_discrete("Lemmas") +
  coord_flip() +
  facet_wrap(~year, nrow=2, scales="free") +
  theme(axis.text.x=element_text(size=5))
```

Lemma Count



ggsave("graphs/wordsByYear.png")

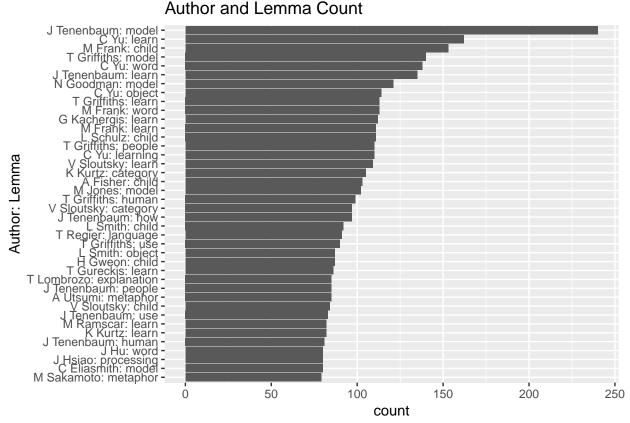
```
## Saving 6.5 x 4.5 in image
wc_byTitle <- words_full %>%
   group_by(year,title,lowerlemma) %>%
   summarise(count = n()) %>%
   arrange(year,title,desc(count))
kable(head(wc_byTitle, 20))
```

year	title	lowerlemma	count
2009	'If only' counterfactuals and the exceptionality effect	exceptional	6
2009	'If only' counterfactuals and the exceptionality effect	outcome	6
2009	'If only' counterfactuals and the exceptionality effect	alternative	5
2009	'If only' counterfactuals and the exceptionality effect	lead	5
2009	'If only' counterfactuals and the exceptionality effect	when	4

```
lowerlemma
       title
year
                                                                                  count
2009
       'If only' counterfactuals and the exceptionality effect
                                                                action
2009
       'If only' counterfactuals and the exceptionality effect
                                                                better
                                                                                      3
2009
       'If only' counterfactuals and the exceptionality effect
                                                                change
                                                                                      3
                                                                                      3
2009
       'If only' counterfactuals and the exceptionality effect
                                                                counterfactual
2009
       'If only' counterfactuals and the exceptionality effect
                                                                effect
                                                                                      3
2009
       'If only' counterfactuals and the exceptionality effect
                                                                                      3
                                                                only
                                                                                      2
2009
       'If only' counterfactuals and the exceptionality effect
                                                                also
                                                                                      2
       'If only' counterfactuals and the exceptionality effect
2009
                                                                experiment
                                                                                       2
       'If only' counterfactuals and the exceptionality effect
2009
                                                                experiments
                                                                                       2
       'If only' counterfactuals and the exceptionality effect
2009
                                                                not
                                                                                       2
2009
       'If only' counterfactuals and the exceptionality effect
                                                                reverse
                                                                                       2
2009
       'If only' counterfactuals and the exceptionality effect
                                                                show
2009
       'If only' counterfactuals and the exceptionality effect
                                                                usual
                                                                                       2
       'If only' counterfactuals and the exceptionality effect
                                                                                      1
2009
                                                                1
2009
       'If only' counterfactuals and the exceptionality effect
                                                                2
                                                                                      1
```

```
write.csv(wc_byTitle, "wc_byTitle.csv")
byAuthor <- words full %>%
  mutate(authors=stri trans general(authors, "latin-ascii"),
         author=str_replace_all(authors, ",$", ""),
         author=str replace all(author, c(".*\n"="", " *\((.*?\))"="", " "=" ")),
         author=str_replace_all(author, " & ", ", "),
         author=strsplit(author, ", ")) %>%
  unnest(author) %>%
  filter(!grepl("University|Institute|Center|Centre|Centro|School|Department|Dept|Unit|Hospital|\\d",
                author)) %>%
  mutate(author=trimws(author),
         authorWord = word(author, -1),
         authorAbbr = paste(substring(author,1,1), word(author, -1)))
wc byAuthor <- byAuthor %>%
  group_by(authorAbbr, lowerlemma) %>%
  summarise(count = n()) %>%
  arrange(desc(count),authorAbbr)
write.csv(wc_byAuthor, "wc_byAuthor.csv")
wc byAuthor %>%
  mutate(authorLemma = paste(authorAbbr, lowerlemma, sep=": ")) %>%
  arrange(desc(count), authorAbbr) %>%
  head(40) %>%
  ggplot(aes(x=reorder(authorLemma,count), y=count)) +
  geom_bar(stat="identity") +
  ggtitle("Author and Lemma Count") +
  scale_x_discrete("Author: Lemma") +
  coord_flip()
```

Author and Lemma Count



```
ggsave("graphs/AuthorWords.png")
```

```
## Saving 6.5 \times 4.5 in image
```

```
leaders <- byAuthor %>%
  select("year", "authorAbbr", "title") %>%
  unique() %>%
  group_by(year, authorAbbr) %>%
  summarise(totalPapers = n()) %>%
  top_n(3, totalPapers)
leaders %>% arrange(year,desc(totalPapers)) %>%
  kable(caption="Top 3 Authors w/ Most Papers by Year")
```

Table 2: Top 3 Authors w/ Most Papers by Year

year	authorAbbr	totalPapers
2009	T Griffiths	11
2009	J Tenenbaum	10
2009	M Lee	9
2010	L Smith	10
2010	J Tenenbaum	8
2010	T Griffiths	8
2011	T Griffiths	9
2011	W Fu	8
2011	E Krahmer	7
2011	G Storms	7
2011	J Tenenbaum	7
2011	R Dale	7

year	${\bf author Abbr}$	totalPapers
2011	R Goldstone	7
2012	T Griffiths	12
2012	J Tenenbaum	11
2012	R Saxe	9
2013	R Dale	12
2013	C Eliasmith	8
2013	M Frank	8
2014	J Hu	11
2014	J Tenenbaum	11
2014	L Schulz	10
2014	N Goodman	10
2015	J Tenenbaum	15
2015	N Goodman	11
2015	M Richardson	10
2016	M Frank	12
2016	J Tenenbaum	10
2016	N Goodman	10
2017	J Tenenbaum	15
2017	T Griffiths	15
2017	K Smith	11
2018	J Tenenbaum	18
2018	T Griffiths	11
2018	M Frank	9

```
## Approximately corresponds to top 3 authors by number of papers published
byAuthor %>%
    group_by(year, authorAbbr) %>%
    summarise(total = n()) %>%
    top_n(3, total) %>%
    arrange(year, desc(total)) %>%
    kable(caption="Top 3 Authors w/ Most Abstract Words by Year")
```

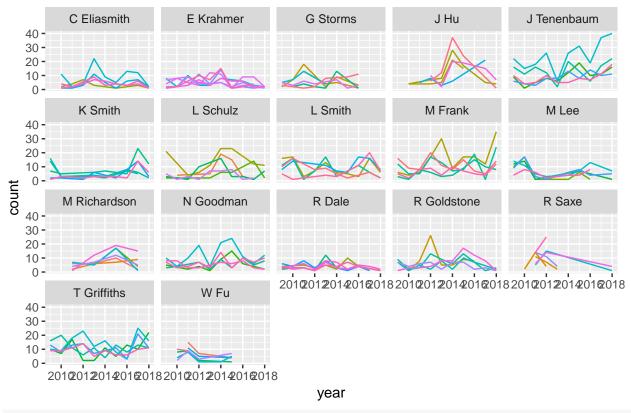
Table 3: Top 3 Authors w/ Most Abstract Words by Year

year	author Abbr	total
2009	T Griffiths	920
2009	J Tenenbaum	849
2009	L Boroditsky	811
2010	L Smith	874
2010	M Lee	754
2010	R Shiffrin	687
2011	W Fu	736
2011	T Griffiths	730
2011	J Tenenbaum	642
2012	J Tenenbaum	1082
2012	T Griffiths	965
2012	R Saxe	891
2013	R Dale	1075
2013	I McLaren	914
2013	R Goldstone	712
2014	J Hu	1256

2014 H Chen 1058 2014 J Tenenbaum 997 2015 J Tenenbaum 1277 2015 N Goodman 925 2015 M Richardson 914 2016 M Frank 968 2016 J Tenenbaum 874 2016 C Yu 777 2017 T Griffiths 1292 2017 J Tenenbaum 1280 2017 K Smith 921 2018 J Tenenbaum 1651 2018 T Griffiths 1067			
2014 J Tenenbaum 997 2015 J Tenenbaum 1277 2015 N Goodman 925 2015 M Richardson 914 2016 M Frank 968 2016 J Tenenbaum 874 2016 C Yu 777 2017 T Griffiths 1292 2017 J Tenenbaum 1280 2017 K Smith 921 2018 J Tenenbaum 1651 2018 T Griffiths 1067	year	${\bf author Abbr}$	total
2015 J Tenenbaum 1277 2015 N Goodman 925 2015 M Richardson 914 2016 M Frank 968 2016 J Tenenbaum 874 2016 C Yu 777 2017 T Griffiths 1292 2017 J Tenenbaum 1280 2017 K Smith 921 2018 J Tenenbaum 1651 2018 T Griffiths 1067	2014	H Chen	1059
2015 N Goodman 925 2015 M Richardson 914 2016 M Frank 968 2016 J Tenenbaum 874 2016 C Yu 777 2017 T Griffiths 1292 2017 J Tenenbaum 1280 2018 J Tenenbaum 1651 2018 T Griffiths 1067	2014	J Tenenbaum	997
2015 M Richardson 914 2016 M Frank 968 2016 J Tenenbaum 874 2016 C Yu 777 2017 T Griffiths 1292 2017 J Tenenbaum 1280 2017 K Smith 921 2018 J Tenenbaum 1651 2018 T Griffiths 1067	2015	J Tenenbaum	1277
2016 M Frank 968 2016 J Tenenbaum 874 2016 C Yu 777 2017 T Griffiths 1292 2017 J Tenenbaum 1280 2017 K Smith 921 2018 J Tenenbaum 1651 2018 T Griffiths 1067	2015	N Goodman	925
2016 J Tenenbaum 874 2016 C Yu 777 2017 T Griffiths 1292 2017 J Tenenbaum 1280 2017 K Smith 921 2018 J Tenenbaum 1651 2018 T Griffiths 1067	2015	M Richardson	914
2016 C Yu 777 2017 T Griffiths 1292 2017 J Tenenbaum 1280 2017 K Smith 921 2018 J Tenenbaum 1651 2018 T Griffiths 1067	2016	M Frank	968
2017 T Griffiths 1292 2017 J Tenenbaum 1280 2017 K Smith 921 2018 J Tenenbaum 1651 2018 T Griffiths 1067	2016	J Tenenbaum	874
2017 J Tenenbaum 1280 2017 K Smith 921 2018 J Tenenbaum 1651 2018 T Griffiths 1067	2016	C Yu	777
2017 K Smith 921 2018 J Tenenbaum 1651 2018 T Griffiths 1067	2017	T Griffiths	1292
2018 J Tenenbaum 1651 2018 T Griffiths 1067	2017	J Tenenbaum	1280
2018 T Griffiths 1067	2017	K Smith	921
	2018	J Tenenbaum	1651
2018 M Frank 990	2018	T Griffiths	1067
	2018	M Frank	990

```
leaderFaveWords <- byAuthor %>%
  filter(authorAbbr %in% leaders$authorAbbr) %>%
  group_by(authorAbbr, lowerlemma) %>%
  summarise(count = n()) %>%
  top_n(5, count) %>%
  mutate(authorWord = paste(authorAbbr, lowerlemma, sep="_")) %>%
  arrange(authorAbbr, desc(count))
wc_byAuthorYear <- byAuthor %>%
  group_by(year, authorAbbr, lowerlemma) %>%
  summarise(count = n()) %>%
  arrange(year, authorAbbr,desc(count))
write.csv(wc_byAuthorYear, "wc_byAuthorYear.csv")
wc byAuthorYear %>%
  filter(authorAbbr %in% unique(leaderFaveWords$authorAbbr)) %>%
  mutate(authorWord=paste(authorAbbr, lowerlemma, sep="_")) %>%
  filter(authorWord %in% unique(leaderFaveWords$authorWord)) %>%
  ggplot(aes(x=year, y=count, colour=lowerlemma)) +
  geom_line(stat="identity") +
  ggtitle("Trends in Leader's Most Popular Words") +
  facet_wrap(~authorAbbr) +
  guides(colour=FALSE)
```

Trends in Leader's Most Popular Words



ggsave("graphs/leaderPopWords.png")

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