### R Notebook

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#### Step 1 - Data Preparation

- Set environment
- Import data
- Remove extra white space, convert all letters to the lower case, remove stop words, removed empty words due to formatting errors, and remove punctuation.

### **Topic Modeling**

• LDA

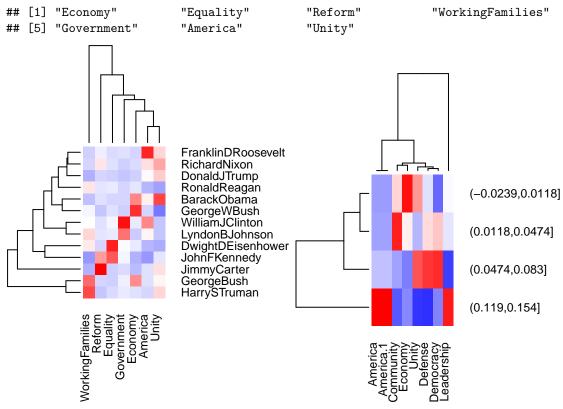
Extract the most likely terms for each topic or the most likely topics for each document.

```
##
##
                        7
                           8
                              9 10 11 12 13 14 15
              4
                5
                    6
              2 18
                           1
                              1
                                  1
                                     3
                                         2
##
          [,1]
                        [,2]
                                     [,3]
                                                  [,4]
                                                              [,5]
                                                                         [,6]
##
    [1,] "feder"
                        "emerg"
                                     "listen"
                                                  "effect"
                                                              "america"
                                                                         "found"
    [2,]
         "hungri"
                                                  "econom"
##
                        "enact"
                                     "substitut"
                                                             "live"
                                                                         "higher"
                                                                         "path"
##
    [3,] "tax"
                        "split"
                                     "quiet"
                                                  "north"
                                                              "god"
                                                             "promis"
##
    [4,] "spend"
                        "submit"
                                     "heard"
                                                  "benefit"
                                                                         "collaps"
                                                  "save"
                                                                         "girl"
##
    [5,] "administr"
                        "employ"
                                     "pain"
                                                              "dream"
##
    [6,] "arsenal"
                        "communic"
                                     "white"
                                                  "trade"
                                                              "build"
                                                                         "inhabit"
                        "1789"
    [7,] "west"
                                     "middl"
                                                  "inalien"
                                                             "last"
                                                                         "settl"
##
##
    [8,] "monument"
                        "afraid"
                                     "alarm"
                                                  "develop"
                                                             "courag"
                                                                         "claim"
    [9,] "slow"
                        "ancestor"
                                    "reap"
                                                  "major"
                                                              "say"
##
                                                                         "fascism"
   [10,] "commonplac"
                        "clean"
                                     "allegi"
                                                  "desir"
                                                             "share"
                                                                         "lend"
##
                                               [,10]
##
          [,7]
                     [,8]
                                   [,9]
                                                            [,11]
                                                                        [,12]
##
    [1,] "easi"
                     "sorrow"
                                   "mind"
                                               "ensur"
                                                            "pledg"
                                                                        "permit"
                                   "liber"
                                                            "far"
                                                                        "fix"
##
    [2,] "show"
                     "coven"
                                               "respons"
##
    [3,] "founder"
                     "mine"
                                   "charact"
                                               "brother"
                                                            "war"
                                                                        "militari"
    [4,] "ambit"
                     "short"
                                   "creed"
                                                                       "europ"
##
                                               "spring"
                                                            "side"
##
    [5,] "break"
                     "stranger"
                                   "fire"
                                               "role"
                                                            "light"
                                                                        "prison"
##
    [6,]
         "servic"
                     "lifetim"
                                   "meant"
                                               "abroad"
                                                            "mankind"
                                                                       "trial"
##
    [7,] "imper"
                     "second"
                                   "run"
                                               "choos"
                                                            "lie"
                                                                        "defens"
##
    [8,] "grand"
                     "battalion"
                                   "institut"
                                               "adversari"
                                                            "globe"
                                                                        "confer"
    [9,] "habit"
                     "deepen"
                                   "oppress"
                                               "poor"
                                                            "seek"
                                                                        "spoken"
##
                                                                       "symbol"
##
   [10,] "ride"
                     "candor"
                                   "defeat"
                                               "endless"
                                                            "perfect"
##
          [,13]
                      [,14]
                                     [,15]
    [1,] "reserv"
##
                      "throughout"
                                     "read"
##
    [2,] "easili"
                      "father"
                                     "potenti"
    [3,] "wise"
                      "bow"
##
                                     "heaven"
##
    [4,] "adequ"
                      "door"
                                     "saw"
    [5,] "incom"
                      "crime"
                                     "class"
    [6,] "loss"
                                     "driven"
##
                      "breez"
    [7,] "stricken" "birthright" "enlarg"
```

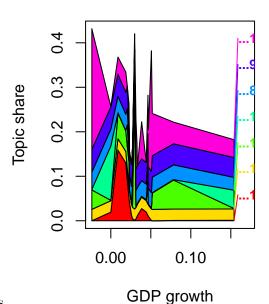
```
"21st"
    [8,] "tide"
                      "wow"
    [9,] "urg"
##
                      "magic"
                                     "20th"
   [10,] "kind"
##
                      "teacher"
                                     "flag"
                                                                      Topic 6
##
          Topic 1
                     Topic 2
                                 Topic 3
                                             Topic 4
                                                          Topic 5
##
    [1,] "believ"
                     "vision"
                                  "earth"
                                             "econom"
                                                          "will"
                                                                      "found"
##
    [2,] "weapon"
                     "given"
                                  "moment"
                                             "state"
                                                          "nation"
                                                                      "women"
##
    [3,] "let"
                     "remain"
                                  "good"
                                             "men"
                                                          "america"
                                                                      "oath"
##
    [4,] "system"
                     "congress"
                                 "protect"
                                             "democraci"
                                                          "peopl"
                                                                      "may"
    [5,] "tax"
                                  "job"
                                                          "world"
                                                                      "see"
##
                     "face"
                                             "unit"
                                                          "new"
##
    [6,] "begin"
                     "must"
                                  "whether"
                                             "believ"
                                                                      "declar"
    [7,] "limit"
                     "emerg"
                                  "oath"
                                             "creat"
                                                                      "deni"
##
                                                          "american"
##
    [8,] "much"
                     "honor"
                                  "voic"
                                             "nation"
                                                          "time"
                                                                      "happi"
##
    [9,] "well"
                     "arm"
                                  "wealth"
                                             "secur"
                                                          "govern"
                                                                      "hour"
   [10,] "feder"
                     "threaten"
                                 "capit"
                                             "program"
                                                          "must"
                                                                      "prosper"
   [11,] "reduc"
                     "uniti"
                                 "child"
                                             "save"
                                                          "great"
                                                                      "right"
##
                     "common"
                                  "crisi"
                                             "right"
                                                          "live"
                                                                      "victori"
##
   [12,] "struggl"
##
   [13,] "prayer"
                     "cost"
                                  "quiet"
                                             "trade"
                                                          "one"
                                                                      "equal"
   [14,] "support"
                     "hatr"
                                 "remain"
                                             "intern"
                                                          "work"
                                                                      "health"
   [15,] "economi"
                                                                      "mere"
                     "histor"
                                  "across"
                                             "realiz"
                                                          "everi"
##
##
          Topic 7
                      Topic 8
                                 Topic 9
                                             Topic 10
                                                        Topic 11 Topic 12
##
    [1,] "servic"
                      "man"
                                             "let"
                                                        "can"
                                                                  "free"
                                 "freedom"
##
    [2,] "less"
                      "without"
                                 "liberti"
                                                        "peac"
                                                                  "freedom"
                                             "respons"
##
    [3,] "civil"
                      "believ"
                                 "know"
                                             "better"
                                                        "world"
                                                                  "secur"
##
    [4,] "forc"
                      "possibl"
                                 "human"
                                             "peac"
                                                        "help"
                                                                  "men"
##
    [5,] "never"
                      "chang"
                                  "ideal"
                                             "spirit"
                                                        "nation"
                                                                  "must"
                                  "duti"
##
    [6,] "across"
                      "union"
                                             "home"
                                                        "peopl"
                                                                  "upon"
                                                        "shall"
##
    [7,] "care"
                      "uniti"
                                  "societi"
                                             "celebr"
                                                                  "hope"
##
    [8,] "polit"
                      "find"
                                  "word"
                                                                  "life"
                                             "commit"
                                                        "know"
    [9,] "common"
                      "mani"
                                 "caus"
                                             "respect"
                                                        "war"
                                                                  "may"
   [10,] "among"
                      "rest"
                                             "era"
##
                                  "carri"
                                                        "seek"
                                                                  "equal"
##
   [11,] "call"
                      "becom"
                                  "choic"
                                             "high"
                                                        "need"
                                                                  "common"
   [12,] "show"
                      "first"
                                             "other"
                                                                  "law"
##
                                 "mind"
                                                        "good"
   [13,] "knowledg"
                      "learn"
                                                        "ask"
                                                                  "principl"
                                  "stori"
                                             "proud"
   [14,] "beyond"
                      "destini"
                                 "accept"
                                             "role"
                                                        "meet"
                                                                  "rule"
##
   [15,] "founder"
                      "fear"
                                  "advanc"
                                             "abroad"
##
                                                        "power"
                                                                  "strength"
##
          Topic 13
                        Topic 14 Topic 15
##
    [1,] "upon"
                        "thank"
                                   "centuri'
##
    [2,] "measur"
                        "thing"
                                   "polit"
##
    [3,] "action"
                        "mean"
                                   "famili"
                        "friend"
##
    [4,] "spirit"
                                  "give"
##
    [5,] "constitut"
                        "father"
                                   "clear"
##
    [6,] "task"
                        "like"
                                   "class"
##
    [7,] "leadership"
                        "take"
                                   "stand"
                                   "take"
##
    [8,] "democraci"
                        "hard"
##
    [9,] "order"
                        "part"
                                   "terror"
                        "fact"
##
   [10,] "part"
                                   "assum"
                        "love"
##
   [11,] "purpos"
                                   "done"
   [12,] "mere"
                        "need"
                                   "enough"
                                   "hear"
   [13,] "restor"
                        "word"
                                   "power"
##
   [14,] "kind"
                        "hand"
## [15,] "line"
                        "vice"
                                   "read"
```

• Summarize Each Topic with One Word

#### • Clustering of topics



## **Topic Shifts**



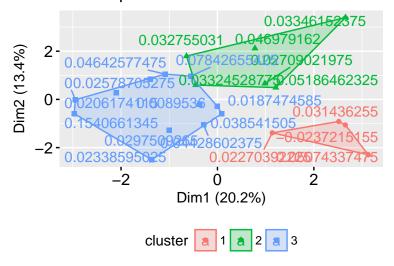
• How topics shift as economic condition changes

**##** [1] 0.05857093 0.11714186 0.17571279 0.23428373 0.29285466 0.35142559

## [7] 0.40999652

How much topics differ given different economic conditions

### Cluster plot



# Reference

- Text mining with tidytext.
- Basic Text Mining in R