# Math 377 Project Solution

Professor Bradley Warner Section M2A Monday, June 08, 2015

**Documentation: None** 

# Introduction

This project will guide you through a small research project. We will be building a simple probability based spell checker in R. The objectives of this project are:

- 1. Read and summarize a research paper
- 2. Find and experiment with existing functions in R
- 3. Find existing code and psuedo code
- 4. Acquire appropriate materials
- 5. Implement in R
- 6. Test and validate

To complete this project you will need to run the 32-bit version of R in RStudio. That is because the qdap package has the capability to open interactive windows, widgets. This relies on RJava and thus our, USAFA, 32-bit java. We will not use the interactive windows in the package, which require Rjava, but the package will not load if our versions of java does not match our version of R.

Authorized Resources: Anyone and anything.

Points: 75

Due: Lesson 38 at close of business

# **Deliverables**

You must use reproducible research by creating an RMarkdown file where your compiled code and data is visible to the reader. You start by opening a new R Markdown file. You should have the following elements:

Title

Name

Section

Documentation

You will complete each of the sections below. You will turn in an html file with your section and name as the title. So for example, I would turn in T2Warner.html. You will submit the document to Assignment Dropbox folder on our course website.

# Components

1. (5 pts) Research the history of spell checkers using Wikipedia. Briefly, one paragraph, summarize your reading.

## Solution

Grading: 5 - Reads well and discusses: 4 - Minor issues, 3- OK, 2 - Weak.

Sample solution:

Research on spell checkers started in the late 1950s. They originally started as stand alone products but then moved into word processing applications and eventually most computer application that require writing, such as web browsers and blogs. The spell checkers usually have a dictionary, in English the optimum appears to be around 90,000 words, and words are compared with this dictionary one at a time. This means that context is not accounted for in most spell checkers. The next stage is to account for the context in a spell checker.

2. (10pts) The package qdap in R has a spell checker. Load the package and use it in your RMarkdown file to get the spelling of the following using the function check spelling and the default options.

```
c("Robots are evl creatres and derv exterimanitation.", "tes")
```

Notice that word desr is probably deserve but it did not appear in the list of suggestions. This is because deserve is too far away from derv. Run the following command:

```
adist("derv", "deserve")
```

Now change the appropriate option in check\_spelling to get deserve as a suggestion.

# Solution

3 pts

```
check_spelling(c("Robots are evl creatres and derv exterimanitation.","tes"))
```

```
##
     row word.no not.found
                                   suggestion
                                                  more.suggestions
## 1 1
         3
                 evl
                                   evil
                                                  ev, evils, elva, e, eel, ell, erl, esl, eva, eve, evy
## 2 1
         4
                 creatres
                                   creatures
                                                  creates, create, creature, cremates, creators, cerates
## 3 1
         6
                 derv
                                                  derive, de, dear, deer, dere, derk, derm, deva, devi,
                                   dev
## 4 1
         7
                 exterimanitation exterminations experimentation, experimentations, electrification, ex
## 5 2
                                                  tees, tegs, test, ties, tyes, teas, tens, tess, tews,
         1
                 tes
                                   teds
```

adist("derv", "deserve")

```
## [,1]
## [1,] 3
```

5 pts

2 pts

```
check_spelling(c("Robots are evl creatres and derv exterimanitation.", "tes"), range=3)
```

```
##
     row word.no not.found
                                   suggestion
                                                 more.suggestions
## 1 1
                                                 ev, evils, evilly, ervils, evelyn, evenly, eviler, evol
         3
                 evl
                                   evil
## 2 1
         4
                                                 creates, creators, cremates, create, creature, cerates,
                 creatres
                                   creatures
## 3 1
         6
                 derv
                                                 derive, derived, dervish, decurve, deprave, deprive, de
                                   dev
## 4 1
         7
                 exterimanitation extermination exterminations, experimentation, exterminating, experim
## 5 2
                                                 tegs, tess, test, ties, toes, tyes, teds, tees, tens, t
                                   teas
```

3. (10 pts) 10 pts - Correct, 8 pts - Wrong but code looks reasonable, 5 pts - Some code but can't figure out what is wrong, 2 pts - Some effort

Read in the entire document, Journal of a Soldier, and report the 10th most common word and its probability of occurrence.

# Solution

```
test sample2<-readLines("~/Classes/Math 377/Fall 2015/Project/Journal of a Soldier.txt")
test_sample2<-paste(test_sample2,collapse=" ")</pre>
test sample2<-tolower(test sample2)</pre>
test_sample2<-strsplit(test_sample2, "[^a-z]+")</pre>
test sample2<-unlist(test sample2)</pre>
probs_of_word2<-sort(prop.table(table(test_sample2)),decreasing=TRUE)</pre>
freq word2<-names(sort(prop.table(table(test sample2)), decreasing = TRUE))</pre>
head(probs_of_word2, n=10)
## test sample2
##
          the
                        of
                                  and
                                                t.o
                                                            we
## 0.06641952 0.03131724 0.02976175 0.02888030 0.02226946 0.02193244
                       in
                                  was
## 0.01799186 0.01765484 0.01436238 0.01280689
4. (10pts)
```

Write a function called, my\_spell\_checker that takes as input the character vector, the vector of sorted words, your dictionary, and an option for distance with a default of 2. In your code, you need to account for the issue that you might not find a word that is within the range. In that case, your code should return the original word. Read in the entire file Journal of a Soldier, I call it freq\_word in my example below, and run your function on the following:

# Solution

```
my_spell_checker("off",freq_word) 2 pts
my_spell_checker("tha",freq_word) 1 pt
my_spell_checker("drvvve",freq_word) 2 pts
my spell checker("you're", freq word) 2 pts
my_spell_checker("hgkdjurhc",freq_word) 1 pt
my_spell_checker("hgkdjurhc",freq_word,range=6) 2 pts
my_spell_checker<-function(word,sorted_words,range=2){</pre>
    ans<-sorted_words[adist(word,sorted_words)<=min(adist(word,sorted_words),range)][1]
    if(is.na(ans))ans<-word
   return(ans)
}
my_spell_checker("off",freq_word2)
## [1] "off"
my_spell_checker("tha",freq_word2)
## [1] "the"
my_spell_checker("drvvve",freq_word2)
## [1] "drove"
```

```
my_spell_checker("you're",freq_word2)
## [1] "your"
my_spell_checker("hgkdjurhc",freq_word2)
## [1] "hgkdjurhc"
my_spell_checker("hgkdjurhc",freq_word2,range=6)
## [1] "hour"
5. (15pts)
My function below as an example
p_of_w_given_c < -(1/1.5)*((1/3)^(seq(1:20)-1))
my_suggestions<-function(word,prob_words,cond_probs,my_range=2,n=3){
    dist1<-adist(word,names(prob_words))</pre>
    temp1<-min(dist1,my_range)</pre>
    if(temp1==0)return(word)
    ans<-names(prob_words)[dist1<=temp1][1]</pre>
    if(is.na(ans)){
        ans<-word
        return(ans)}
    ans_temp<-numeric(0)</pre>
    for(i in 1:my_range){
        ans_temp<-c(ans_temp,prob_words[dist1==i]*cond_probs[i])</pre>
    ans<-sort(ans_temp,decreasing=TRUE)</pre>
    min_n<-min(length(ans),n)</pre>
    return(ans[1:min_n])
}
my_suggestions("akk",probs_of_word2,p_of_w_given_c,2,3)
           and
## 0.006613722 0.004873876 0.001832024
my_suggestions("akk",probs_of_word2,p_of_w_given_c,2,5)
##
           and
                                                              all
## 0.006613722 0.004873876 0.001832024 0.001520926 0.001111889
my_suggestions("akk",probs_of_word2,p_of_w_given_c,3,5)
           and
                        the
## 0.006613722 0.004919964 0.004873876 0.002319796 0.002139282
```

```
my_suggestions("the",probs_of_word2,p_of_w_given_c,2,3)
## [1] "the"
my_suggestions("thethethethethethethethe",probs_of_word2,p_of_w_given_c,2,3)
## [1] "thethethethethethe"
my_suggestions("bradley",probs_of_word2,p_of_w_given_c,2,3)
          badly
## 1.152216e-05
Solution
Points are 2, 2, 3, 3, 2, 3
my_suggestions("off",probs_of_word2,p_of_w_given_c,2,3)
## [1] "off"
my_suggestions("tha",probs_of_word2,p_of_w_given_c,2,3)
## 0.044279677 0.006417846 0.004873876
my_suggestions("drvvve",probs_of_word2,p_of_w_given_c,2,3)
##
          drove
                       drive
## 6.913299e-05 5.761082e-06
my_suggestions("you're",probs_of_word2,p_of_w_given_c,2,3)
##
           your
## 0.0002650098
my_suggestions("hgkdjurhc",probs_of_word2,p_of_w_given_c,2,3)
## [1] "hgkdjurhc"
my_suggestions("hgkdjurhc",probs_of_word2,p_of_w_given_c,6,3)
           hour
                       hours
                                  hundred
## 1.493614e-06 7.112447e-07 3.556224e-07
```

- 6. The last thing we need to do is validate the spell checker. This is what Professor Norvig did in the final phase. We will only do an abbreviated evaluation.
- a. (10 pts) First read into R Professor Norvig's big.txt document, on the course website, and process it as we did above for the Journal of a Soldier. We want to use this bigger document to improve the accuracy. Use the new word frequency table in your spell checker from part 4 on the following words:

```
off
tha
drvvve
you're
hgkdjurhc
           (with default settings)
           (with range=6)
hgkdjurhc
test_sample3<-readLines("~/Classes/Math 377/Fall 2015/Project/big.txt")
test_sample3<-paste(test_sample3,collapse=" ")</pre>
test_sample3<-tolower(test_sample3)</pre>
test sample3<-strsplit(test sample3, "[^a-z]+")
test_sample3<-unlist(test_sample3)</pre>
probs_of_word3<-sort(prop.table(table(test_sample3)),decreasing=TRUE)</pre>
freq_word3<-names(sort(prop.table(table(test_sample3)), decreasing = TRUE))</pre>
head(probs_of_word3,n=10)
## test_sample3
##
                         of
                                                   to
## 0.072406664 0.036212380 0.034663458 0.026025867 0.019949606 0.019139860
## 0.011320157 0.011219731 0.010323129 0.009663571
```

### Solution

1 pt each and 5 pts for last one.

```
my_spell_checker("off",freq_word3)

## [1] "off"

my_spell_checker("tha",freq_word3)

## [1] "the"

my_spell_checker("drvvve",freq_word3)

## [1] "drove"

my_spell_checker("you're",freq_word3)

## [1] "your"
```

```
my_spell_checker("hgkdjurhc",freq_word3)
## [1] "hgkdjurhc"
my_spell_checker("hgkdjurhc",freq_word3,range=6)
## [1] "duroc"
The last one is interesting, I want to explore
my_suggestions("hgkdjurhc",probs_of_word3,p_of_w_given_c,5,3)
##
          duroc
                     honduras
## 1.489291e-08 7.446453e-09
my_suggestions("hgkdjurhc",probs_of_word3,p_of_w_given_c,6,3)
##
        hundred
```

So there are still some problems with the spell checker. But we will proceed any way.

hour

b. (10pts) There is a file on the course website called test\_data.txt that contains only up through the letter d of Professor Norvig's test data. The first few lines are below.

```
'access': 'acess'
'accessing': 'accesing'
'accommodation': 'accomodation acommodation acomodation'
```

hours

## 5.684126e-07 4.120371e-07 3.896977e-07

The correct spelling is before the colon and the incorrect is after. Read the data in and create a vector of common misspelled words. This is not an easy matter. This is good practice because in analysis getting data into your computer in a clean and efficient manner is difficult. You may want to use functions such as gsub, strsplit, and unlist to split the data apart. You want to also remove leading and trailing blank spaces. You want to vectors, the first has the answers and the second has the common misspellings. For the three lines above your answer vector would be

```
access
accessing
accommodation
accommodation
accommodation
and your example vector would be
acess
accesing
accomodation
acommodation
acomodation
```

The two vectors should have length 48. Print out the 53rd through the 70th value of each vector. Make sure you include your code to clean the data.

```
test_data<-readLines("~/Classes/Math 377/Fall 2015/Project/test_data.txt")
#test_data<-paste(test_data,collapse=" ")</pre>
test_data<-gsub("'","",test_data)</pre>
test_data<-strsplit(test_data,":")</pre>
test_data<-unlist(test_data)</pre>
answers<-test_data[seq(1,95,by=2)]
examples<-test_data[seq(2,96,by=2)]
#Remove leading blank space
examples<-gsub("^ ","",examples)</pre>
examples<-gsub("\\s+$","",examples)</pre>
num_of_words<-numeric(0)</pre>
for(i in 1:length(examples)){
    res<-gregexpr(" ",examples[i])[[1]]</pre>
    if(res[1]==-1)temp=0
    else temp=length(res)
    temp<-temp+1
    num_of_words<-c(num_of_words,temp)</pre>
}
final_ex<-unlist(strsplit(examples," "))</pre>
final_ans<-rep(answers,num_of_words)</pre>
final_ex[53:70]
                         "conciderable" "contempted"
## [1] "concider"
                                                         "contende"
## [5] "contended"
                        "contentid"
                                         "cartains"
                                                         "certans"
## [9] "courtens"
                        "cuaritains"
                                         "curtans"
                                                         "curtians"
## [13] "curtions"
                        "descide"
                                         "descided"
                                                         "definately"
## [17] "difinately"
                        "defenition"
final_ans[53:70]
## [1] "consider"
                         "considerable" "contented"
                                                         "contented"
## [5] "contented"
                        "contented"
                                         "curtains"
                                                         "curtains"
## [9] "curtains"
                        "curtains"
                                         "curtains"
                                                         "curtains"
## [13] "curtains"
                         "decide"
                                         "decided"
                                                         "definitely"
## [17] "definitely"
                         "definition"
Solution
```

```
cbind(final_ans,final_ex)[53:70,]
```

```
##
         final_ans
                        final_ex
## [1,] "consider"
                        "concider"
## [2,] "considerable" "conciderable"
## [3,] "contented"
                        "contempted"
## [4,] "contented"
                        "contende"
## [5,] "contented"
                        "contended"
## [6,] "contented"
                        "contentid"
## [7,] "curtains"
                        "cartains"
## [8,] "curtains"
                        "certans"
## [9,] "curtains"
                        "courtens"
```

```
## [10,] "curtains"
                         "cuaritains"
## [11,] "curtains"
                         "curtans"
## [12,] "curtains"
                         "curtians"
## [13,] "curtains"
                         "curtions"
## [14,] "decide"
                         "descide"
## [15,] "decided"
                         "descided"
## [16,] "definitely"
                         "definately"
## [17,] "definitely"
                         "difinately"
## [18,] "definition"
                         "defenition"
```

c. (5 pts) After cleaning your data, run the data through your function my\_spell\_checker and compare with the correct answer, this is easier if you use the sapply function. Report your error rate. For the example above you would want to check each of the accommodation misspellings against the correct spelling and report.

# Solution

```
sapply(final_ex,my_spell_checker,sorted_words=freq_word3)
```

```
##
                                                       accomodation
                  acess
                                     accesing
##
               "access"
                                   "acceding"
                                                    "accommodation"
##
                                                              acount
           acommodation
                                  acomodation
##
       "accommodation"
                              "accommodation"
                                                             "count"
##
                 adress
                                         adres
                                                         addresable
##
                "dress"
                                       "acres"
                                                       "addresable"
##
                aranged
                                    arrainged
                                                          arragment
             "arranged"
                                   "arranged"
##
                                                      "arrangement"
##
               articals
                                          annt
                                                                anut
##
             "articles"
                                        "anna"
                                                               "nut"
##
                   arnt
                                    auxillary
                                                             avaible
##
                 "aunt"
                                   "axillary"
                                                        "available"
##
                                         afful
                 awfall
                                                           basicaly
                                       "awful"
##
                 "wall"
                                                        "basically"
##
               begining
                                      benifit
                                                           benifits
##
            "beginning"
                                    "benefit"
                                                          "benefits"
##
               beetween
                                      bicycal
                                                             bycicle
##
              "between"
                                                           "bicycle"
                                    "bicycle"
##
                bycycle
                                      biscits
                                                           biscutes
##
              "bicycle"
                                   "biscuits"
                                                          "disputes"
##
                                                           buiscits
                biscuts
                                     bisquits
##
             "biscuits"
                                   "biscuits"
                                                          "biscuits"
##
               buiscuts
                                         biult
                                                                 cak
                                         "but"
                                                               "can"
##
             "biscuits"
##
                 carrer
                                     cemetary
                                                           semetary
##
               "career"
                                   "cemetery"
                                                        "secretary"
               centraly
##
                                      cirtain
                                                          chalenges
              "central"
                                    "certain"
                                                       "challenges"
##
##
              chalenges
                                                           chaphter
                                        chaper
           "challenges"
##
                                    "chapter"
                                                           "chapter"
##
                chaptur
                                        choise
                                                             chosing
              "chapter"
                                     "choose"
                                                           "closing"
##
```

```
##
              clearical
                                     comittee
                                                           compair
             "clerical"
                                 "committee"
##
                                                         "company"
##
              completly
                                    concider
                                                      conciderable
##
           "completely"
                                  "consider"
                                                    "considerable"
##
             contenpted
                                     contende
                                                         contended
##
            "contented"
                                  "contended"
                                                       "contended"
##
              contentid
                                    cartains
                                                           certans
            "contented"
                                  "captains"
                                                        "certains"
##
##
               courtens
                                  cuaritains
                                                           curtans
##
             "countess"
                                  "curtains"
                                                        "curtains"
##
               curtians
                                    curtions
                                                           descide
##
               "curtis"
                                  "portions"
                                                          "decide"
##
               descided
                                  definately
                                                        difinately
##
                                                      "definitely"
              "decided"
                                "definitely"
##
             defenition
                                 defenitions
                                                       discription
           "definition"
                               "definitions"
##
                                                     "description"
##
               desicate
                                   dessicate
                                                        dessiccate
##
             "delicate"
                                  "delicate"
                                                      "dessiccate"
##
     diagrammaticaally
                                    diffrent
                                                            dirven
   "diagrammaticaally"
##
                                  "different"
                                                           "given"
```

my\_guess<-sapply(final\_ex,my\_spell\_checker,sorted\_words=freq\_word3)
final\_ans==my\_guess</pre>

##	acess	accesing	accomodation	acommodation
##	TRUE	FALSE	TRUE	TRUE
##	acomodation	acount	adress	adres
##	TRUE	FALSE	FALSE	FALSE
##	addresable	aranged	arrainged	arragment
##	FALSE	TRUE	TRUE	TRUE
##	articals	annt	anut	arnt
##	TRUE	FALSE	FALSE	TRUE
##	auxillary	avaible	awfall	afful
##	FALSE	TRUE	FALSE	TRUE
##	basicaly	begining	benifit	benifits
##	TRUE	TRUE	TRUE	TRUE
##	beetween	bicycal	bycicle	bycycle
##	TRUE	TRUE	TRUE	TRUE
##	biscits	biscutes	biscuts	bisquits
##	TRUE	FALSE	TRUE	TRUE
##	buiscits	buiscuts	biult	cak
##	TRUE	TRUE	FALSE	FALSE
##	carrer	cemetary	semetary	centraly
##	TRUE	TRUE	FALSE	FALSE
##	cirtain	chalenges	chalenges	chaper
##	TRUE	TRUE	TRUE	TRUE
##	chaphter	chaptur	choise	chosing
##	TRUE	TRUE	FALSE	FALSE
##	clearical	comittee	compair	completly
##	TRUE	TRUE	FALSE	TRUE
##	concider	conciderable	contenpted	contende
##	TRUE	TRUE	TRUE	FALSE
##	contended	contentid	cartains	certans
##	FALSE	TRUE	FALSE	FALSE

```
##
           courtens
                            cuaritains
                                                 curtans
                                                                  curtians
##
              FALSE
                                  TRUE
                                                    TRUE
                                                                     FALSE
##
                              descide
                                                               definately
            curtions
                                                descided
##
              FALSE
                                  TRUE
                                                    TRUE
                                                                      TRUE
##
          difinately
                            defenition
                                             defenitions
                                                               discription
                                  TRUE
##
               TRUE
                                                    TRUE
                                                                      TRUE
##
           desicate
                            dessicate
                                              dessiccate diagrammaticaally
                                 FALSE
##
              FALSE
                                                   FALSE
                                                                     FALSE
            diffrent
                                dirven
##
##
               TRUE
                                FALSE
```

```
sum(final_ans!=my_guess)/length(final_ans)
```

## [1] 0.3717949

```
sum(final_ans==my_guess)/length(final_ans)
```

## [1] 0.6282051