## IBM Watson classifier

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Now, let's get a score for best-answering

```
##initialize; one row per img/transform
scored <- aggregate(data$corr,list(baseimg=data$baseimg,transform=data$transformation),length)</pre>
scored$bestanswer <- aggregate(data$bestanswer,list(baseimg=data$baseimg,transform=data$transformation)
scored$topresponse <- NA
scored$best <- NA
scored$any <- NA
for(row in 1:nrow(scored))
  set <- scored[row,]$transform</pre>
  img <- scored[row,]$baseimg</pre>
  tmp <- data[data$transformation==set &</pre>
             data$baseimg==img,]
  #print(tmp)
  ##tmp might not be in order.
  tmp <- tmp[order(-tmp$score),]</pre>
    ##pick the best answer; a correct one if possible
  highest.0 <- tmp[tmp$score==max(tmp$score),]
  ##if there are more than one, pick the correct one if possible.
  highest <-highest.0[which.max(highest.0$score+highest.0$corr),]
  scored$best[row] <- any(highest$corr)</pre>
  scored$any[row] <- any(tmp$corr)</pre>
  scored$topresponse[row] <- highest$Name[1]</pre>
}
error.tab <- table(scored$bestanswer,
      scored$topresponse
      )
response.tab <- table(data$bestanswer,data$Name)</pre>
for(i in 1:nrow(error.tab))
 print("----")
 print(row.names(error.tab)[i])
 sorted <- sort(error.tab[i,][error.tab[i,]>0],decreasing=T)
 print(sorted[sorted>0])
```

```
## [1] "-----
## [1] "AXE"
                    CUTLERY REDDISH BROWN COLOR
10 7
         AX
32
      GRAY COLOR IVORY COLOR ALABASTER COLOR
##
                     5
##
         5
  BOTTLE GREEN COLOR COAL BLACK COLOR LIGHT BROWN COLOR
                        4
##
   PALE YELLOW COLOR
                        TOOL
                                MICROORGANISM
##
##
                         3
   ULTRAMARINE COLOR ASH GREY COLOR
##
                                 BEIGE COLOR
                    1
##
        2
               EMERALD COLOR FLORIST SHOP
##
     COPPER COLOR
       1
                     1
                                   1
##
       GLOW TUBE GREENISHNESS COLOR
                                      HOOK
##
         1
                   1
                   KNIFE LEMON YELLOW COLOR
1
     INVERTEBRATE
1
         PANTILE PURPLE COLOR ROTIFER WORM
          1
                      1
##
         SHOVEL
                      UTENSIL
##
## [1] "-----
## [1] "FLASH"
   COAL BLACK COLOR ASH GREY COLOR BOTTLE GREEN COLOR
##
                  14
##
    EMERALD COLOR FLASHLIGHT MUSICAL INSTRUMENT
##
     6
                    5
     BLACK COLOR CHARCOAL COLOR ELECTRICAL DEVICE
##
                  4
TOOL
3
      GRAY COLOR
                              BLUE COLOR
##
       4
## GREENISHNESS COLOR
                     UTENSIL ALABASTER COLOR
                     2
    2
         CROSS DARK RED COLOR ELECTRIC BATTERY
##
                   1
                               1
          1
##
       FASTENER FLASHLIGHT BATTERY
                                FRAMEWORK
         1
                1
       GLOW TUBE IVORY COLOR
##
                                    LASER
##
        1
                    1
    MAROON COLOR NEON LAMP PURPLE COLOR
##
                     1
         1
##
                    SKYLIGHT ULTRAMARINE COLOR
##
           ROD
##
            1
## [1] "----"
## [1] "HAMMER"
          HAMMER
                   GRAY COLOR
##
                                        TOOL
##
                      13
           17
##
  COAL BLACK COLOR REDDISH ORANGE COLOR BOTTLE GREEN COLOR
       10
                     8
##
                 ASH GREY COLOR LEMON YELLOW COLOR
    CHARCOAL COLOR
##
##
                        3
```

## ##	PALE YELLOW COLOR 2	REDDISH BROWN COLOR 2	SAGE GREEN COLOR 2
## ##	ULTRAMARINE COLOR	ANIMAL 1	BEIGE COLOR
##	BLACK COLOR	DISCO	EMERALD COLOR
## ##	1 GREENISHNESS COLOR	1 INDIAN RED COLOR	1 LAMP
## ##	1 LIGHT BROWN COLOR	1 LINOCUT DESIGN	1 OPENER
##	1	1	1
##	SHOULDER HOLSTER	SPRAY GUN	SWIZZLE STICK
##	TOMALIALIZ	1	1
##	TOMAHAWK 1	WEAPON 1	
##	[1] "	"	
##	[1] "PLIER"		
##		COAL BLACK COLOR	ASH GREY COLOR
##	LEMON VELLOU COLOR	12 BLACK COLOR	9
##	LEMON YELLOW COLOR 9	BLACK CULUR 8	ULTRAMARINE COLOR
##	IVORY COLOR	GRAY COLOR	AZURE COLOR
##	5	4	3
##	CUTLERY	GREENISHNESS COLOR	CHARCOAL COLOR
##	DATE OF GGTGGODG	COAT HANGED	DDAETING INCEDIMENT
##	PAIR OF SCISSORS	COAT HANGER 1	DRAFTING INSTRUMENT 1
##	FRAMEWORK	HALTER (HORSE)	PAIR OF PLIERS
##	1	1	1
##	PURPLE COLOR	•	TINE (FORKED OBJECT)
##	1 WEAPON	1 WRENCH	1
##	WEAT ON	with the same of t	
##	[1] "	"	
##	[1] " [1] "SAW"	"	
## ##	[1] " [1] "SAW"	PRUNING SAW	TOOL
## ## ##	[1] " [1] "SAW" SAW 13	11	8
## ##	[1] " [1] "SAW"		
## ## ##	[1] " [1] "SAW" SAW 13	11 LEMON YELLOW COLOR	8 ALABASTER COLOR
## ## ## ## ##	[1] "	LEMON YELLOW COLOR 6 GREENISHNESS COLOR 4	8 ALABASTER COLOR 4 COAL BLACK COLOR 3
## ## ## ## ## ##	[1] "	11 LEMON YELLOW COLOR 6 GREENISHNESS COLOR 4 PURPLE COLOR	ALABASTER COLOR 4 COAL BLACK COLOR 3 REDDISH BROWN COLOR
## ## ## ## ## ##	[1] "	LEMON YELLOW COLOR 6 GREENISHNESS COLOR 4 PURPLE COLOR 3	ALABASTER COLOR 4 COAL BLACK COLOR 3 REDDISH BROWN COLOR 3
## ## ## ## ## ##	[1] "	11 LEMON YELLOW COLOR 6 GREENISHNESS COLOR 4 PURPLE COLOR	ALABASTER COLOR 4 COAL BLACK COLOR 3 REDDISH BROWN COLOR
## ## ## ## ## ##	[1] "	LEMON YELLOW COLOR 6 GREENISHNESS COLOR 4 PURPLE COLOR 3 PALE YELLOW COLOR	8 ALABASTER COLOR 4 COAL BLACK COLOR 3 REDDISH BROWN COLOR 3 ANGULAR DISTANCE
## ###################################	[1] "	11 LEMON YELLOW COLOR 6 GREENISHNESS COLOR 4 PURPLE COLOR 3 PALE YELLOW COLOR 2 AZURE COLOR	8 ALABASTER COLOR 4 COAL BLACK COLOR 3 REDDISH BROWN COLOR 3 ANGULAR DISTANCE 1 BOTTLE GREEN COLOR
## ## ## ## ## ## ## ##	[1] "	11 LEMON YELLOW COLOR 6 GREENISHNESS COLOR 4 PURPLE COLOR 3 PALE YELLOW COLOR 2 AZURE COLOR 1 COLD CATHODE	8 ALABASTER COLOR 4 COAL BLACK COLOR 3 REDDISH BROWN COLOR 3 ANGULAR DISTANCE 1 BOTTLE GREEN COLOR 1 CUTLERY
## ###################################	[1] "	11 LEMON YELLOW COLOR 6 GREENISHNESS COLOR 4 PURPLE COLOR 3 PALE YELLOW COLOR 2 AZURE COLOR	8 ALABASTER COLOR 4 COAL BLACK COLOR 3 REDDISH BROWN COLOR 3 ANGULAR DISTANCE 1 BOTTLE GREEN COLOR
## ## ## ## ## ## ## ##	[1] "	11 LEMON YELLOW COLOR 6 GREENISHNESS COLOR 4 PURPLE COLOR 3 PALE YELLOW COLOR 2 AZURE COLOR 1 COLD CATHODE	8 ALABASTER COLOR 4 COAL BLACK COLOR 3 REDDISH BROWN COLOR 3 ANGULAR DISTANCE 1 BOTTLE GREEN COLOR 1 CUTLERY 1
######################################	[1] "	11 LEMON YELLOW COLOR 6 GREENISHNESS COLOR 4 PURPLE COLOR 3 PALE YELLOW COLOR 2 AZURE COLOR 1 COLD CATHODE 1 FAN BELT 1 HAIR SLIDE	ALABASTER COLOR 4 COAL BLACK COLOR 3 REDDISH BROWN COLOR 3 ANGULAR DISTANCE 1 BOTTLE GREEN COLOR 1 CUTLERY 1 FIGURE 1 JADE GREEN COLOR
######################################	[1] "	11 LEMON YELLOW COLOR 6 GREENISHNESS COLOR 4 PURPLE COLOR 3 PALE YELLOW COLOR 2 AZURE COLOR 1 COLD CATHODE 1 FAN BELT 1 HAIR SLIDE	ALABASTER COLOR 4 COAL BLACK COLOR 3 REDDISH BROWN COLOR 3 ANGULAR DISTANCE 1 BOTTLE GREEN COLOR 1 CUTLERY 1 FIGURE 1 JADE GREEN COLOR
######################################	[1] "	11 LEMON YELLOW COLOR 6 GREENISHNESS COLOR 4 PURPLE COLOR 3 PALE YELLOW COLOR 2 AZURE COLOR 1 COLD CATHODE 1 FAN BELT 1 HAIR SLIDE	ALABASTER COLOR 4 COAL BLACK COLOR 3 REDDISH BROWN COLOR 3 ANGULAR DISTANCE 1 BOTTLE GREEN COLOR 1 CUTLERY 1 FIGURE 1 JADE GREEN COLOR

## ##	PANTILE 1	PERSON 1	SAGE GREEN COLOR
##	SQUARE	STABILIZER BAR	STEEL BLUE COLOR
##	1	1	1
## ##	SUPPORTING STRUCTURE 1	ULTRAMARINE COLOR 1	WALL BRACKET 1
##	WORM	WRENCH	-
##	1	1	
##	[1] "	"	
##	L-3	ASH GREY COLOR	TOOL
##	38	7	7
##		ULTRAMARINE COLOR	CUTLERY
##	4 FLORIST SHOP	4 FRAMEWORK	3 IVORY COLOR
##	3	3	3
##	PURPLE COLOR		COAL BLACK COLOR
##	3 JADE GREEN COLOR	LEMON YELLOW COLOR 1	2 MEDICAL INSTRUMENT
##	2	2	2
##	ALIZARINE RED COLOR	BEIGE COLOR	COOKIE CUTTER
##	1	1	1
##	ENVELOPE 1	FIGURE 1	FIRE TONGS 1
##	GREENISH BLUE COLOR	GREENISHNESS COLOR	HEDGE TRIMMER
##	1	1	1
##	INVERTEBRATE 1	MAROON COLOR 1	MICROORGANISM 1
##	PERSON	THINNING SHEARS	WEAPON
##	1	1	1
##	[1] "	"	
##	[1] "SCREW" TOOL	COAL BLACK COLOR	BOTTLE GREEN COLOR
##	35	11	4
##	GRAY COLOR	GREENISHNESS COLOR	INDIGO COLOR
##	4 SCREWDRIVER	4 ASH GREY COLOR	4 BLACK COLOR
## ##		-	BLACK CULUK
##	4	3	3
##	LEMON YELLOW COLOR	3 BRUSH	3 LAVENDER COLOR
	LEMON YELLOW COLOR	BRUSH 2	LAVENDER COLOR 2
##	LEMON YELLOW COLOR 3 ORANGE COLOR	BRUSH 2 TINE (FORKED OBJECT)	LAVENDER COLOR 2 BLUE COLOR
	LEMON YELLOW COLOR	BRUSH 2	LAVENDER COLOR 2
## ##	LEMON YELLOW COLOR 3 ORANGE COLOR 2	BRUSH 2 TINE (FORKED OBJECT) 2	LAVENDER COLOR 2 BLUE COLOR 1
## ## ## ##	LEMON YELLOW COLOR 3 ORANGE COLOR 2 CHARCOAL COLOR 1 FRAMEWORK	BRUSH 2 TINE (FORKED OBJECT) 2 CLARET RED COLOR 1 FURNITURE	LAVENDER COLOR 2 BLUE COLOR 1 EMERALD COLOR 1 IVORY COLOR
## ## ## ##	LEMON YELLOW COLOR 3 ORANGE COLOR 2 CHARCOAL COLOR 1	BRUSH 2 TINE (FORKED OBJECT) 2 CLARET RED COLOR 1	LAVENDER COLOR 2 BLUE COLOR 1 EMERALD COLOR 1
## ## ## ## ##	LEMON YELLOW COLOR  3 ORANGE COLOR 2 CHARCOAL COLOR 1 FRAMEWORK 1	BRUSH 2 TINE (FORKED OBJECT) 2 CLARET RED COLOR 1 FURNITURE 1	LAVENDER COLOR 2 BLUE COLOR 1 EMERALD COLOR 1 IVORY COLOR
## ## ## ## ## ##	LEMON YELLOW COLOR  3 ORANGE COLOR 2 CHARCOAL COLOR 1 FRAMEWORK 1 JADE GREEN COLOR 1 PADDLE (BOAT)	BRUSH 2 TINE (FORKED OBJECT) 2 CLARET RED COLOR 1 FURNITURE 1 KEYHOLE 1 PALE YELLOW COLOR	LAVENDER COLOR 2 BLUE COLOR 1 EMERALD COLOR 1 IVORY COLOR 1 MECHANICAL DEVICE 1 REDDISH ORANGE COLOR
## ## ## ## ## ## ##	LEMON YELLOW COLOR  3 ORANGE COLOR 2 CHARCOAL COLOR 1 FRAMEWORK 1 JADE GREEN COLOR 1 PADDLE (BOAT)	BRUSH 2 TINE (FORKED OBJECT) 2 CLARET RED COLOR 1 FURNITURE 1 KEYHOLE 1 PALE YELLOW COLOR	LAVENDER COLOR 2 BLUE COLOR 1 EMERALD COLOR 1 IVORY COLOR 1 MECHANICAL DEVICE 1 REDDISH ORANGE COLOR
## ## ## ## ## ##	LEMON YELLOW COLOR  3 ORANGE COLOR 2 CHARCOAL COLOR 1 FRAMEWORK 1 JADE GREEN COLOR 1 PADDLE (BOAT)	BRUSH 2 TINE (FORKED OBJECT) 2 CLARET RED COLOR 1 FURNITURE 1 KEYHOLE 1 PALE YELLOW COLOR	LAVENDER COLOR 2 BLUE COLOR 1 EMERALD COLOR 1 IVORY COLOR 1 MECHANICAL DEVICE 1 REDDISH ORANGE COLOR
## ## ## ## ## ## ##	LEMON YELLOW COLOR  3 ORANGE COLOR 2 CHARCOAL COLOR 1 FRAMEWORK 1 JADE GREEN COLOR 1 PADDLE (BOAT) 1 TRIANGLE	BRUSH 2 TINE (FORKED OBJECT) 2 CLARET RED COLOR 1 FURNITURE 1 KEYHOLE 1 PALE YELLOW COLOR 1 WEAPON	LAVENDER COLOR 2 BLUE COLOR 1 EMERALD COLOR 1 IVORY COLOR 1 MECHANICAL DEVICE 1 REDDISH ORANGE COLOR 1 WORM

```
## [1] "----"
## [1] "SHOVEL"
     SHOVEL COAL BLACK COLOR ASH GREY COLOR
                 20
                                       13
##
         26
       GRAY COLOR BOTTLE GREEN COLOR
##
                                       TOOL
##
        8
     BEIGE COLOR BLACK COLOR ALABASTER COLOR
                     3
       3
##
    EMERALD COLOR FASTENER CHARCOAL COLOR
##
       2
                      2
##
           CLAW
                  FLORIST SHOP
                                 HAND SHOVEL
                     1
            1
##
                              METAL DETECTOR
      IVORY COLOR JADE GREEN COLOR
## MUSICAL INSTRUMENT
                 STEEL BLUE COLOR ULTRAMARINE COLOR
      1
 [1] "----
##
## [1] "TAPE"
##
     TAPE MEASURE
                      IVORY COLOR ULTRAMARINE COLOR
        17
                        7
##
     ASH GREY COLOR LEMON YELLOW COLOR BOTTLE GREEN COLOR
##
##
    COAL BLACK COLOR MEASURING INSTRUMENT CHARCOAL COLOR
##
                        5
##
         5
        FRAMEWORK GRAY COLOR GREENISHNESS COLOR
##
                         3
                       GLOW TUBE
2
##
      EMERALD COLOR
                                    HEDGE TRIMMER
                    MICROORGANISM
2
      MAROON COLOR
                                     ORANGE COLOR
                                      ANIMAL
                  YELLOW COLOR
     SAGE GREEN COLOR
##
##
               2
                       2
                                          1
                     FLORIST SHOP GARDEN TOOL
       BLACK COLOR
##
                         1
##
               1
                        MAGNIFIER MICROPHONE BOOM
1 1
##
             KEY
##
              1
        MOUTHPIECE PALE YELLOW COLOR PLUMB LEVEL
##
          1
##
                         1
                 RADIOGRAM REDDISH PURPLE COLOR
  PURPLISH BLUE COLOR
            1
##
                         1
            STAMP
## [1] "-----
  [1] "WRENCH"
                  WRENCH
                                     GRAY COLOR
##
                    45
                        LEMON YELLOW COLOR
                    TOOL
##
##
                     5
           ASH GREY COLOR
                              BOTTLE GREEN COLOR
##
##
##
          COAL BLACK COLOR
                              GREENISHNESS COLOR
##
                   .3
##
              IVORY COLOR
                                       FIGURE
##
```

```
GREENISH BLUE COLOR
                                              REDDISH BROWN COLOR
##
##
                                                                  2
                             SWORD
                                                 ULTRAMARINE COLOR
##
##
                                 2
                                                                  2
##
                           UTENSIL
                                                   ALABASTER COLOR
##
                                                                  1
##
             ARABESQUE (ORNAMENT)
                                                          ARROWWORM
##
                                                                  1
##
                      BLACK COLOR
                                                         FRAMEWORK
##
                                  1
                                                                  1
##
                     PURPLE COLOR
                                                  SAGE GREEN COLOR
##
                                                                  1
  SQUEEGEE (CLEANING EQUIPMENT)
                                                           TRIANGLE
##
                                                                  1
```

Find score by transform:

```
print(aggregate(cbind(scored$best,scored$any),list(scored$transform),mean))
```

```
##
               Group.1
                           V1
                                ٧2
## 1
            Blur-Tools 0.400 0.56
## 2
              BW-Tools 0.100 0.52
## 3
         Charcol-Tools 0.160 0.30
## 4
            Edge-Tools 0.200 0.30
## 5
      Edge-White-Tools 0.060 0.22
## 6
            Frame-Blue 0.420 0.78
## 7
          Frame-Leaves 0.160 0.58
## 8
          Frame-Nature 0.000 0.04
## 9
            Frame-Wood 0.040 0.10
## 10
         Implode-Tools 0.080 0.24
## 11
         Masking-Tools 0.400 0.82
## 12
        Original-Tools 0.580 0.82
## 13
         Rainbow-Tools 0.080 0.30
## 14
                Resize 0.240 0.54
## 15
            Roll-Tools 0.500 0.80
## 16
              Rotation 0.420 0.76
           Shear-Tools 0.060 0.16
## 17
          Sketch-Tools 0.200 0.44
## 18
## 19
                Splice 0.100 0.26
            Wave-Tools 0.125 0.25
## 20
```