DATA MINING MIDTERM PROJECT

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Programming language: Python

How to run the file: python project.py datasetname.csv minimum_support(in decimal) minimum_confidence(in decimal)

Dataset:

transaction1.csv

```
shrimp, eggs, salmon, mango, chicken
chicken, eggs, mango
turkey, shrimp, mango, chicken
turkey, salmon, eggs
eggs, mango, salmon
chicken, salmon
turkey, chicken, mango, eggs
shirmp, salmon, eggs, turkey, mango
eggs, shrimp
shrimp, chicken, turkey
shrimp, mango
turkey, chicken, salmon, mango
salmon, chicken, eggs
chicken, eggs, turkey, shrimp, mango
shrimp, turkey, mango, eggs
eggs, chicken
shrimp, chicken, salmon
turkey, eggs, mango
chicken, salmon, turkey, eggs
chicken, shrimp
```

transaction2.csv

```
spaghetti, meatballs, lemon, fries, cookies
fries, meatballs, lemon
burger, fries, cookies
cookies, lemon, fries, meatballs
cookies, fries, meatballs
spaghetti, fries, burger, cookies, lemon
meatballs, fries, cookies
cookies, fries, spaghetti
spaghetti, lemon, cookies, meatballs
cookies, meatballs
spaghetti, meatballs, fries
spaghetti, burger, lemon
fries, cookies, burger
burger, fries
cookies, meatballs
fries, meatballs, cookies, lemon,
burger, cookies, meatballs, fries
cookies, spaghetti
fries, burger, cookies
cookies, lemon, spaghetti
```

transaction3.csv

apple, potato, banana, avocado, strawberry banana, strawberry, avocado, apple, yams yams, apple, avocado, apple, avocado, yams, strawberry yams, potato, banana yams, banana, strawberry avocado, banana, strawberry, apple strawberry, potato, banana, apple yams, apple, banana banana, strawberry, banana, yams avocado, strawberry, yams, avocado, yams, strawberry, apple apple, yams, banana, avocado strawberry, yams, potato banana, yams, strawberry, potato yamss, apple, banana, strawberry strawberry, potato, banana, potato avocado, banana, yams, apple banana, yams, strawberry yams, banana, apple, avocado

transaction4.csv

cake, sausages, tea, oil oil, tea, bread, sausages, cake wine ,bread, cake, oil oil, wine, bread, tea, cake, sausages cake, tea, oil, wine tea, bread, sausages, oil, cake wine, bread, oil, sausages, cake cake, bread, tea, wine oil, tea, pasta, sausages bread, cake, tea, wine tea, cake, bread, wine, sausages wine, oil, cake, sausages wine, cake, oil cake, oil, bread, sausages oil, bread, sausages bread, sausages, cake wine, oil, cake, sausages, cake, oil, tea, sausages, tea, oil, sausages, cake, bread oil, sausages, bread, wine, tea

transaction5.csv

```
chocolate, pasta, honey, water, tomato, cheese
cheese, honey, water, chocolate
water, honey, cheese, tomato, chocolate
water, honey, pasta, cheese, tomato
honey, tomato, cheese
chocolate, cheese, pasta, water, tomato
pasta, cheese, water, chocolate, honey
pasta, water, honey, cheese
water, honey, cheese
pasta, chocolate, water
honey, chocolate, tomato
water, cheese, pasta, honey
cheese, tomato, pasta
chocolate, pasta, honey
chocolate, cheese, honey, tomato
cheese, chocolate, honey
pasta, water, cheese, tomato, chocolate, honey
honey, cheese, chocolate, tomato
water, honey, pasta
honey, water, tomato, pasta
```

all_items.csv

shrimp, eggs, salmon, turkey, mango, chicken, burger, meatballs, cookies, spaghetti, fri es, lemon, apple, banana, yams, strawberry, potato, chocolate, pasta, water, cheese, hone y, tomato, bread, wine, oil, tea, cake, sausages

This dataset contains all the 30 items.

CODE:

```
import sys
import time

filename=sys.argv[1]  #The first argument is the filename
min_support=float(sys.argv[2])  #The second argument is the minimum support
min_confidence =float(sys.argv[3])  #The third argument is the minimum
confidence

with open("all_items.csv") as f:
    Brute_items = f.read().replace("\n", "").split(",")
    Brute_items.sort()

filedata=open(filename, "r")
```

```
data=filedata.readlines()
data=[1.replace("\n","").split(",") for 1 in data]
print("----")
print("
        INPUT DATA")
print("----")
for t in data:
   print(t)
class Brute:
   def init (self,Brute left,Brute right,Brute all):
      self.Brute left = list(Brute left)
      self.Brute left.sort()
      self.Brute right = list(Brute right)
      self.Brute right.sort()
      self.Brute_all =Brute_all
   def str (self):
      return ",".join(self.Brute left)+" => "+",".join(self.Brute right)
def Brute generate k(items, k):
   if k == 1:
      return [[x] for x in items]
   all res = []
   for i in range(len(items)-(k-1)):
      for sub in Brute generate k(items[i+1:], k-1):
          tmp = [items[i]]
          tmp.extend(sub)
          all res.append(tmp)
   return all res
def Brute scan(db, s):
   count = 0
   for t in db:
      if set(s).issubset(t):
          count += 1
   return count
print("----")
print("
       Start of Brute force")
print("----")
B start time = time.time()
B_frequent = []
B_support = {}
for k in range(1, len(Brute_items)+1):
   B current = []
   for comb in Brute generate k(Brute items, k):
      count = Brute scan(data, comb)
      if count/len(data) >= min support:
```

```
B support[frozenset(comb)] = count/len(data)
          B current.append(comb)
   if len(B current) == 0:
       break
   B frequent.append(B current)
all rule = set()
Brute all result = []
for k freq in B frequent:
   if len(k freq) == 0:
       continue
   if len(k freq[0]) < 2:
       continue
   for freq in k freq:
       for i in range(1, len(freq)):
          for left in Brute_generate_k(freq, i):
              tmp = freq.copy()
              right = [x for x in tmp if x not in left]
              all rule.add(Brute(left, right, freq))
for rule in all rule:
   Brute confidence = B support[frozenset(rule.Brute all)] /
B support[frozenset(rule.Brute left)]
   if Brute confidence >= min confidence:
       Brute all result.append([rule, B support[frozenset(rule.Brute all)],
Brute confidence])
Brute all result.sort(key=lambda x: str(x[0]))
B end time = time.time()
print("----")
           RULES SUPPORT CONFIDENCE: ")
print("
print("----")
for r in Brute_all_result:
   print(r[0], r[1], r[2])
print("----")
          RUNNING TIME FOR BRUTE FORCE")
print("
print("----")
print(str(B end time - B start time) + "s")
class Apriori:
   def init (self,Apriori left,apriori right,apriori all):
       self.Apriori left=list(Apriori left)
       self.Apriori_left.sort()
       self.apriori_right=list(apriori_right)
       self.apriori_right.sort()
       self.apriori all=apriori all
   def str (self):
       return ",".join(self.Apriori left)+" =>
"+",".join(self.apriori right)
def Apriori generating sub rule(fs,r,result,support):
   r size=len(r[0])
   t size=len(fs)
```

```
if t_size-r_size>0:
       r=Apriori_generate_items(r)
       new r=[]
       for i in r:
           l=fs-i
           if(len(1) == 0):
               continue
           confidence=support[fs]/support[1]
           if(confidence>=min confidence):
               result.append([Apriori(1,i,fs),support[fs],confidence])
               new r.append(i)
       if(len(new r)>1):
           Apriori generating sub rule(fs,new r,result,support)
def Apriori_generate_items(dk):
   res=[]
   for i in range(len(dk)):
       for j in range(i+1,len(dk)):
           l,r=dk[i],dk[j]
           ll,rr=list(l),list(r)
           ll.sort()
           rr.sort()
           if ll[:len(1)-1] == rr[:len(r)-1]:
               res.append(1 | r)
   return res
def Apriori scan(data,f1):
   count = {s:0 for s in f1}
   for i in data:
       for freqset in f1:
           if(freqset.issubset(i)):
               count[freqset]+=1
   n=len(data)
   return{freqset: support/n for freqset, support in count.items() if
support/n>=min support}
#Start for Apriori alogorithm
print("----")
print("
                    Start of Apriori")
print("----")
start_time = time.time()
support={}
item=[[]]
dk=[[]]
f1=set()
for i in data:
   for items in i:
       f1.add(frozenset([items]))
item.append(f1)
count=Apriori scan(data,f1)
dk.append(list(count.keys()))
```

```
support.update(count)
t=1
while len(dk[t]) > 0:
   item.append(Apriori generate items(dk[t]))
   count=Apriori scan(data,item[t+1])
   support.update(count)
   dk.append(list(count.keys()))
   t+=1
#generation of the rules
result=[]
for i in range(2,len(dk)):
   if(len(dk[i])==0):
       break
   frequent_set=dk[i]
   for fs in frequent set:
       for r in [frozenset([x]) for x in fs]:
           confidence=support[fs]/support[1]
           if confidence>=min confidence:
              result.append([Apriori(1,r,fs),support[fs],confidence])
   if(len(frequent set[0])!=2):
       for fs in frequent set:
           r=[frozenset([x]) for x in fs]
          Apriori_generating_sub_rule(fs,r,result,support)
result.sort(key=lambda x: str(x[0]))
end time=time.time()
for k in result:
   print(k[0],k[1],k[2])
print("----")
              RUNNING TIME FOR APRIORI")
print("
print("-----")
print(str(end_time - start_time) + "s")
```

For Dataset 1

INPUT:

```
G:\NJIT\Fall2020\Data Mining\Midterm_project>python project.py transaction1.csv 0.2 0.5

INPUT DATA

['shrimp', 'eggs', 'salmon', 'mango', 'chicken']
['chicken', 'eggs', 'mango']
['turkey', 'shrimp', 'mango', 'chicken']
['turkey', 'salmon', 'eggs']
['eggs', 'mango', 'salmon']
['chicken', 'salmon']
['turkey', 'chicken', 'mango', 'eggs']
['shirmp', 'salmon', 'eggs', 'turkey', 'mango']
['eggs', 'shrimp']
['shrimp', 'mango']
['turkey', 'chicken', 'turkey']
['shrimp', 'mango']
['turkey', 'chicken', 'eggs']
['chicken', 'eggs', 'turkey', 'shrimp', 'mango']
['shrimp', 'turkey', 'mango', 'eggs']
['shrimp', 'turkey', 'mango', 'eggs']
['eggs', 'chicken']
['shrimp', 'chicken', 'salmon']
['turkey', 'eggs', 'mango']
['chicken', 'salmon', 'turkey', 'eggs']
['chicken', 'salmon', 'turkey', 'eggs']
['chicken', 'salmon', 'turkey', 'eggs']
['chicken', 'shrimp']
```

OUTPUT:

Brute Force Method:

```
C:\Windows\System32\cmd.exe
         Start of Brute force
           RULES SUPPORT CONFIDENCE:
chicken => eggs 0.35 0.5384615384615384
chicken,eggs => mango 0.2 0.5714285714285715
eggs => mango 0.35 0.5833333333333334
eggs => turkey 0.3 0.5
mango => eggs 0.35 0.6363636363636362
mango => turkey 0.3 0.545454545454545454
salmon => chicken 0.3 0.6666666666666666
salmon => eggs 0.25 0.55555555555555
turkev => mango 0.3 0.666666666666666
           RUNNING TIME FOR BRUTE FORCE
0.21046876907348633s
```

Apriori Method:

```
C:\Windows\System32\cmd.exe
                Start of Apriori
chicken => eggs 0.35 0.5384615384615384
chicken,eggs => mango 0.2 0.5714285714285715
chicken,mango => eggs 0.2 0.66666666666666666
chicken, mango => turkey 0.2 0.666666666666667
eggs => mango 0.35 0.5833333333333334
eggs => turkey 0.3 0.5
eggs,mango => chicken 0.2 0.5714285714285715
eggs,mango => turkey 0.2 0.5714285714285715
eggs,turkey => mango 0.2 0.6666666666666667
mango => chicken 0.3 0.5454545454545454
mango => eggs 0.35 0.6363636363636362
mango => turkey 0.3 0.5454545454545454
mango,turkey => chicken 0.2 0.6666666666666667
mango,turkey => eggs 0.2 0.666666666666666
salmon => chicken 0.3 0.666666666666666
salmon => eggs 0.25 0.55555555555556
shrimp => chicken 0.3 0.666666666666666
shrimp => mango 0.25 0.55555555555556
turkey => chicken 0.3 0.666666666666666
turkey => eggs 0.3 0.6666666666666666
turkey => mango 0.3 0.666666666666666
                  RUNNING TIME FOR APRIORI
0.05
G:\NJIT\Fall2020\Data Mining\Midterm_project>
```

Brute Force takes approximately 0.2 seconds longer than Apriori to execute.

For Dataset 2 INPUT:

```
G:\NJIT\Fall2020\Data Mining\Midterm_project>python project.py transaction2.csv 0.3 0.7

INPUT DATA

['spaghetti', 'meatballs', 'lemon', 'fries', 'cookies']
['fries', 'meatballs', 'lemon']
['burger', 'fries', 'cookies']
['cookies', 'lemon', 'fries', 'meatballs']
['sookies', 'fries', 'meatballs']
['spaghetti', 'fries', 'burger', 'cookies', 'lemon']
['meatballs', 'fries', 'spaghetti']
['cookies', 'fries', 'spaghetti']
['spaghetti', 'lemon', 'cookies', 'meatballs']
['cookies', 'meatballs']
['spaghetti', 'meatballs', 'fries']
['spaghetti', 'burger', 'lemon']
['fries', 'cookies', 'burger']
['burger', 'fries']
['cookies', 'meatballs', 'cookies', 'lemon', ']
['burger', 'meatballs', 'cookies', 'lemon', ']
['burger', 'cookies', 'meatballs', 'fries']
['cookies', 'spaghetti']
['fries', 'burger', 'cookies']
['cookies', 'lemon', 'spaghetti']
```

OUTPUT:

Brute Force Method and Apriori Method:

Brute Force takes approximately 0.05 seconds longer than Apriori to execute.

For Dataset 3 INPUT:

```
G:\NJIT\Fall2020\Data Mining\Midterm_project>python project.py transaction3.csv 0.2 0.7

INPUT DATA

['apple', 'potato', 'banana', 'avocado', 'strawberry']
['banana', 'strawberry', 'avocado', 'apple', 'yams']
['yams', 'apple', 'avocado', ']
['yams', 'potato', 'banana']
['yams', 'banana', 'strawberry']
['yams', 'banana', 'strawberry']
['yams', 'banana', 'strawberry', 'apple']
['yams', 'apple', 'banana']
['yams', 'apple', 'banana']
['avocado', 'strawberry', 'yams', ']
['avocado', 'strawberry', 'yams', ']
['avocado', 'yams', 'strawberry', 'apple']
['apple', 'yams', 'strawberry', 'potato']
['strawberry', 'yams', 'potato']
['strawberry', 'yams', 'strawberry', 'potato']
['strawberry', 'potato', 'banana', 'strawberry']
['strawberry', 'potato', 'banana', 'potato']
['avocado', 'banana', 'yams', 'apple']
['yams', 'banana', 'yams', 'strawberry']
['yams', 'banana', 'strawberry']
['yams', 'banana', 'strawberry']
['yams', 'banana', 'strawberry']
```

OUTPUT:

Brute Force Method:

```
Start of Brute force

RULES SUPPORT CONFIDENCE:

apple => banana 0.45 0.75
apple, strawberry => banana 0.25 0.7142857142857143
banana, potato => strawberry 0.2 0.8
potato => banana 0.25 0.8333333333334
potato => strawberry 0.25 0.83333333333334
potato, strawberry => banana 0.2 0.8
strawberry => banana 0.2 0.8
strawberry => banana 0.5 0.7142857142857143

RUNNING TIME FOR BRUTE FORCE
```

Apriori Method:

```
C:\Windows\System32\cmd.exe
                  Start of Apriori
apple => avocado 0.45 0.75
apple => banana 0.45 0.75
apple,avocado => yams 0.35 0.777777777777777
apple,banana,yams => avocado 0.2 0.8
avocado => apple,yams 0.35 0.7
avocado => yams 0.4 0.8
avocado,banana => apple 0.3 1.0
avocado,banana,yams => apple 0.2 1.0
avocado,strawberry => apple 0.25 0.83333333333333333
avocado,yams => apple 0.35 0.8749999999999999
banana,potato => strawberry 0.2 0.8
potato => banana 0.25 0.8333333333333333
potato => strawberry 0.25 0.8333333333333334
potato,strawberry => banana 0.2 0.8
strawberry => banana 0.5 0.7142857142857143
                    RUNNING TIME FOR APRIORI
0.002991914749145508s
G:\NJIT\Fall2020\Data Mining\Midterm_project>
```

Brute Force takes approximately 0.3 seconds longer than Apriori to execute.

For Dataset 4

INPUT:

```
G:\NJIT\Fall2020\Data Mining\Midterm_project>python project.py transaction4.csv 0.4 0.7

INPUT DATA

['cake', 'sausages', 'tea', 'oil']
['oil', 'tea', 'bread', 'sausages', 'cake']
['wine', 'bread', 'cake', 'oil']
['oil', 'wine', 'bread', 'tea', 'cake', 'sausages']
['tea', 'bread', 'sausages', 'oil', 'cake']
['wine', 'bread', 'sausages', 'oil', 'cake']
['wine', 'bread', 'ine', 'sausages', 'cake']
['oil', 'tea', 'pasta', 'sausages', 'cake']
['oil', 'tea', 'pasta', 'sausages']
['bread', 'cake', 'tea', 'wine']
['tea', 'cake', 'bread', 'wine', 'sausages']
['wine', 'oil', 'cake', 'sausages']
['oil', 'bread', 'sausages']
['oil', 'bread', 'sausages']
['oil', 'bread', 'sausages', ']
['cake', 'oil', 'cake', 'sausages', ']
['cake', 'oil', 'sausages', 'cake', 'bread']
['oil', 'sausages', 'cake', 'bread', 'wine', 'tea']
```

OUTPUT:

Brute Force Method:

```
C:\Windows\System32\cmd.exe
            Start of Brute force
              RULES SUPPORT CONFIDENCE:
bread => cake 0.55 0.8461538461538461
bread => sausages 0.5 0.7692307692307692
bread,cake => sausages 0.4 0.72727272727273
bread,oil => sausages 0.4 0.888888888888888
bread,sausages => cake 0.4 0.8
bread,sausages => oil 0.4 0.8
cake => oil 0.65 0.7647058823529412
cake => sausages 0.6 0.7058823529411765
cake,oil => sausages 0.5 0.7692307692307692
cake,sausages => oil 0.5 0.8333333333333334
oil => cake 0.65 0.8125
oil => sausages 0.65 0.8125
oil,sausages => cake 0.5 0.7692307692307692
oil,tea => sausages 0.4 0.8888888888888888
tea => oil 0.45 0.75
tea => sausages 0.45 0.75
wine => cake 0.45 0.9
              RUNNING TIME FOR BRUTE FORCE
0.610377311706543s
```

Apriori Method:

```
C:\Windows\System32\cmd.exe
                Start of Apriori
bread => cake 0.55 0.8461538461538461
bread => sausages 0.5 0.7692307692307692
bread,cake => sausages 0.4 0.72727272727273
bread,oil => sausages 0.4 0.888888888888888
bread, sausages => cake 0.4 0.8
bread, sausages => oil 0.4 0.8
cake => oil 0.65 0.7647058823529412
cake => sausages 0.6 0.7058823529411765
cake,oil => sausages 0.5 0.7692307692307692
cake,sausages => oil 0.5 0.8333333333333334
oil => cake 0.65 0.8125
oil => sausages 0.65 0.8125
oil,sausages => cake 0.5 0.7692307692307692
oil,tea => sausages 0.4 0.888888888888888
sausages,tea => oil 0.4 0.888888888888888
tea => cake 0.5 0.83333333333333334
tea => oil 0.45 0.75
tea => sausages 0.45 0.75
wine => cake 0.45 0.9
                  RUNNING TIME FOR APRIORI
0.0019979476928710938s
G:\NJIT\Fall2020\Data Mining\Midterm_project>
```

Brute Force takes approximately 0.5 seconds longer than Apriori to execute.

For Dataset 5 INPUT:

```
C:\Windows\System32\cmd.exe

G:\N]IT\Fall2020\Data Mining\Midterm_project>python project.py transaction5.csv 0.3 0.7

INPUT DATA

['chocolate', 'pasta', 'honey', 'water', 'tomato', 'cheese']
['water', 'honey', 'water', 'chocolate']
['water', 'honey', 'pasta', 'cheese', 'tomato']
['honey', 'tomato', 'cheese']
['chocolate', 'cheese', 'pasta', 'water', 'tomato']
['pasta', 'cheese', 'water', 'chocolate', 'honey']
['pasta', 'water', 'honey', 'cheese']
['water', 'honey', 'cheese']
['pasta', 'chocolate', 'water']
['honey', 'chocolate', 'tomato']
['water', 'cheese', 'pasta', 'honey']
['chocolate', 'pasta', 'honey']
['chocolate', 'cheese', 'honey', 'tomato']
['cheese', 'chocolate', 'honey', 'chocolate', 'honey']
['choese', 'cheese', 'chocolate', 'tomato', 'chocolate', 'honey']
['honey', 'cheese', 'chocolate', 'tomato', 'chocolate', 'honey']
['water', 'honey', 'pasta']
['honey', 'cheese', 'chocolate', 'tomato']
['water', 'honey', 'pasta']
['honey', 'water', 'tomato', 'pasta']
```

OUTPUT:

Brute Force Method

```
C:\Windows\System32\cmd.exe
             Start of Brute force
                RULES SUPPORT CONFIDENCE:
cheese => honey 0.65 0.8666666666666667
cheese,chocolate => honey 0.4 0.8888888888888888
cheese,honey,pasta => water 0.3 1.0
cheese,pasta => honey 0.3 0.7499999999999999
cheese,pasta,water => honey 0.3 0.8571428571428572
cheese,tomato => honey 0.35 0.777777777777777
cheese, water => honey 0.45 0.9
cheese,water => pasta 0.35 0.7
chocolate => cheese 0.45 0.75
chocolate => honey 0.5 0.83333333333333334
chocolate, honey => cheese 0.4 0.8
chocolate,tomato => cheese 0.3 0.8571428571428572
chocolate, tomato => honey 0.3 0.8571428571428572
chocolate,water => cheese 0.3 0.8571428571428572
honey => cheese 0.65 0.7647058823529412
honey,pasta => water 0.4 0.888888888888888
honey,pasta,water => cheese 0.3 0.7499999999999999
honey,tomato => cheese 0.35 0.777777777777777
honey, water => cheese 0.45 0.8181818181818181
honey,water => pasta 0.4 0.7272727272727273
pasta => honey 0.45 0.75
pasta => water 0.5 0.8333333333333333
pasta,water => cheese 0.35 0.7
pasta,water => honey 0.4 0.8
tomató => cheese 0.45 0.81818181818181
```

pasta,water => honey 0.4 0.8 tomato => cheese 0.45 0.81818181818181 tomato => honey 0.45 0.8181818181818181 tomato => honey 0.45 0.8181818181818181 water => cheese 0.5 0.7692307692307692 water => honey 0.55 0.8461538461538461 water => pasta 0.5 0.7692307692307692 RUNNING TIME FOR BRUTE FORCE 2.610051155090332s

Apriori Method

```
C:\Windows\System32\cmd.exe
               Start of Apriori
cheese => honey 0.65 0.866666666666667
cheese, chocolate => honey 0.4 0.8888888888888888
cheese,honey,pasta => water 0.3 1.0
cheese,pasta => honey 0.3 0.749999999999999
cheese,pasta => honey,water 0.3 0.749999999999999
cheese,pasta => water 0.35 0.874999999999999
cheese,water => pasta 0.35 0.7
chocolate => cheese 0.45 0.75
chocolate => honey 0.5 0.8333333333333334
chocolate, honey => cheese 0.4 0.8
chocolate,tomato => cheese 0.3 0.8571428571428572
chocolate,tomato => honey 0.3 0.8571428571428572
chocolate,water => cheese 0.3 0.8571428571428572
honey => cheese 0.65 0.7647058823529412
honey,pasta => water 0.4 0.8888888888888888
honey,pasta,water => cheese 0.3 0.749999999999999
honey,water => pasta 0.4 0.72727272727273
pasta => honey 0.45 0.75
pasta => water 0.5 0.8333333333333333
,
pasta,water => cheese 0.35 0.7
pasta,water => honey 0.4 0.8
tomato => cheese 0.45 0.81818181818181
tomato => honey 0.45 0.81818181818181
water => cheese 0.5 0.7692307692307692
water => honey 0.55 0.8461538461538461
```

```
C:\Windows\System32\cmd.exe
honey,water => cheese 0.45 0.818181818181818181
honey,water => pasta 0.4 0.72727272727273
pasta => honey 0.45 0.75
pasta => water 0.5 0.83333333333334
pasta,water => cheese 0.35 0.7
pasta,water => honey 0.4 0.8
tomato => cheese 0.45 0.818181818181818181
tomato => cheese 0.45 0.8181818181818181
water => cheese 0.5 0.7692307692307692
water => honey 0.55 0.8461538461538461
water => pasta 0.5 0.7692307692307692

RUNNING TIME FOR APRIORI

0.0009968280792236328s
```

Brute Force takes approximately 2 seconds longer than Apriori to execute.