### CSE 587 Data Intensive Computing

### Project 2

# Parallel Processing Using Hadoop Map Reduce

Falguni Bharadwaj - 50163471 Malavika Reddy Tappeta - 50169248

#### Introduction:

We have designed 20 questions which help in analyzing the dataset and whose answers give some details that will make class scheduling easier for next semesters. We used one mapper & reducer to solve each question.

Question 1: What is the total seating capacity of each building semester wise?

Fall 2014/Jacobs	/373
Fall 2014/Jarvis	/91
Fall 2014/Kapoor	/748
Fall 2014/Ketter	/40
Fall 2014/Kimbal	/456
Fall 2014/Knox /1262	, 450
Fall 2014/Lockwd	/40
Fall 2014/Math /153	,
Fall 2014/Mrc /50	
Fall 2014/Norton	/603
Fall 2014/Nsc /1809	
Fall 2014/Obrian	/1063
Fall 2014/0ff /0	
Fall 2014/Park /601	
Fall 2014/Parker	/134
Fall 2014/R25 /0	
Fall 2014/Rchmnd	/6
Fall 2014/Roswll	/0
Fall 2014/Rpblsc	/0
Fall 2014/Rsrch/20	
Fall 2014/SIM /0	
Fall 2014/Scien/0	
Fall 2014/Shrmn/91	
Fall 2014/Shrmna	/1
Fall 2014/Slee /672	150
Fall 2014/Spldng	/68
Fall 2014/Squire	/138
Fall 2014/Studen	/43
Fall 2014/Talbrt	/314
Fall 2014/Wende/322	/162
Fall 2014/Wilksn Fall 2015/Abbott	/12
Fall 2015/Ach_A/41	/12
Fall 2015/Alfier	/242
Fall 2015/Allen/50	/242
Fall 2015/Alumni	/465
Fall 2015/Anders	/30
Fall 2015/Baird/466	,50
Fall 2015/Baldy/1273	
Fall 2015/Bell /204	
Fall 2015/Bioed/161	
Fall 2015/Biores	/88
Fall 2015/Bonner	/1
Fall 2015/C-V /0	
Fall 2015/Capen/338	
Fall 2015/Cary /116	
Fall 2015/Cell /0	
Fall 2015/Cfa /1302	

For this problem, the mapper splits building from room number. Room number passes as value (along with total capacity) and building as key. Output of mapper is <Key = Semester / Building Name, Value = Room Number / Total Capacity> where "/" is being used as a separator. Thus in reducer, if a room number is being repeated, its capacity is taken only once and added with others from same building. Thus final output contains total capacity of each building. Output of reducer is <Key = Semester/ Building Name, Value = /Total Capacity>.

From the output we can see that some buildings have a lot of lecture halls like "Nsc", "Baldy", "Obrian" whereas some hardly have classrooms like "Ketter" or "Allen". So more classes will be scheduled in these buildings. We can also observe that some are reserved for "Rsrch" and have no lecture halls. National Sciences Complex Nsc has the largest seating capacity of more than 1800 seats.

#### Question 2:

#### Which course has maximum number of students each semester?

For this question, our Mapper output was of the form <Key = Semester Year, Value = (Course Name, Total Students enrolled)>. The reducer split the value in terms of total number of students enrolled and for each semester it calculated maximum value of total students. If there are more than one course with the same number of students as the maximum number, then they are appended to the value field of the reducer. The final output of the reducer has <Key = Semester Year, Value = (Course Name, Maximum Students>. Following is a sample output where as we can see for Fall 1931, maximum students according to the dataset provided is 1 for courses "Writing 1", "Intro. to Philosophy", "Economics Topic" etc. Hence the output has the courses separated by a "/" followed by the maximum number of students for these courses at the end. Some courses like Fall 1963 has only one course with maximum students which is Introductory Psychology.

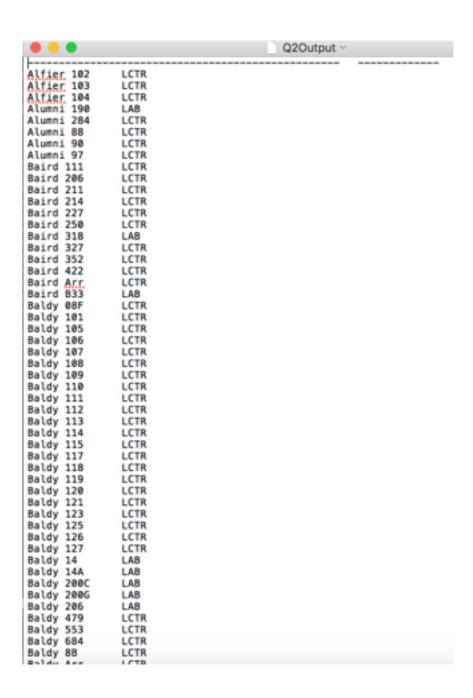
Looking at the output we can infer that in the early years from around 1971-1998, "Introductory Psychology" was a popular course choice. Earlier than that "Writing 1" had the most number of students. In the recent years "Corporation Finance" has become more popular and has maximum students of around 500 for the past couple of years. Another popular course over the summer is "Gross Human Anatomy" with around 150-200 students every year. We can say that in earlier years courses like "Writing 1" were more popular but recently science and management courses have started being in demand. We also realize from the data that maximum number of students in the earlier years used to be extremely less compared to recent years. For example, maximum number of students for Fall 1955 were 7 whereas for Fall 2014 were 574. So we can say that number of students attending university has drastically increased over the decades. On an average, "Introductory Psychology" seems like a popular choice for students throughout the years.

```
Q1 Output -
Fall 1931
Fall 1932
                                     Writing 1 / Intro to Philosophy / Economics Topic / Introductory Psychology / Hygiene / Elem French 1st Semester,1
                                    Structure of Amer Society / Psychology Topic / Designer Genes,1
Independent Study / Economics Topic / Psychology Topic / Juvenile Justice / GOV Topic / Bus Grg & Policy,1
Fall 1933
                                    Prin. Of Marketing.1
Fall 1941
 Fall 1945
                                     Special Studies Art / Brain: Molecules-Memory / Special Studies PE / Writing 1 / Special Studies Art / General Chemistry /
Special Studies Art / Special Studies Art / Mathematics Topic / Special Studies Art / Biological Sciences Topic / Special Studies Art / Mathematics Topic / Special Studies Art / Biological Sciences Topic / Special Studies Art / French Topic / French Topic / General Chemistry, 1
Tail 1946 Structural Development / General Chemistry / Morizons of the Sciences / Introductory Psychology / Special Studies Art / Intelligence of Chemistry / Special Studies Art / Special Studies Pt / Special Studies Art / Spec
Fall 1947
Fall 1948
                                    Writing 1,2
History Topic / Philosophy Topic / ED Topic / ED Topic / Special Studies TUT / Intro to Philosophy / Writing 1 / Introductory
Psychology / Intro Computer & His Bach / ED Topic / Intro to Macroeconomics / ED Topic / Women Writers / International Finance / ED Topic
Intro Linear Algebra / History Topic / Physics Topic / Basic Analysis / ED Topic / Fin State Anal / Hist & Cult Of Lat Amer / Structure of
 Amer Society, 1
Fall 1949
                                    ED Topic / Writing 1 / Public Economics / US History / Intro to Philosophy / Local Goyt / Physical Education / Sociology of
 Families / Prop & Casualty Ins II / ED Topic / Mathematics Topic / Brain: Molecules-Memory / ED Topic / Intro to Macroeconomics /
Introduction to History, 1
Fall 1958
Fall 1951
                                    Music Topic / ED Topic,2
                                    Writing 1.4
 Fall 1952
                                     Philosophy Topic / Introduction to History / US History,2
                                    Writing 1,5
General Chemistry / Writing 1,3
Fall 1953
 Fall 1954
                                    Writing 1,7
Writing 1 / General Chemistry / Philosophy Topic,3
Fall 1955
 Fall 1956
Fall 1957
                                    Writing 1.5
                                    Introductory Psychology,5
Writing 1,13
Writing 1,19
Writing 1,20
Fall 1959
Fall 1968
Fall 1961
Fall
Fall
                                     Introductory Psychology,38
Fall.
          1964
                                    Writing 1,35
Writing 1,56
Fall
                                    Introductory Psychology,48
Writing 1,48
Writing 1,63
Fall 1966
Fall
           1967
Fall 1968
Fall 1969
                                     Introduction to Socialogy, 32
Fall 1978
                                     Introduction to Sociology, 42
                                    Introductory Psychology,56
Introductory Psychology,51
Fall 1971
Fall 1972
Fall 1973
                                    Introductory Psychology,63
Introduction to Sociology,56
Introductory Psychology,71
            1974
Fall
           1975
 Fall 1976
Fall 1977
                                    Introductory Psychology,76
Introductory Psychology,74
                                                                                                                                                                                                                                                                                   TextEdit
                                    Introductory Psychology,79
Introductory Psychology,91
```

#### Question 3:

#### Which rooms were used for lectures and which were used for labs or otherwise reserved?

We use the new tsv dataset for this problem. So the description contains whether the room is used for lab or lecture. In this, our output is of the form <Key = Room Number, Value = Description>. The output gives us a very clear idea of which rooms are Labs and which are Lecture Halls. This information can be further used to schedule extra lab sessions of extra lectures for next semesters. We noticed that not every building has a Lab in it whereas buildings like Baldy & Bioed had more than 4 Labs. We also noticed some halls like Farber 180 or Kimbal 720 which were "Reserved".



Question 4: Which day was busiest each semester?

• • •	
Fall 2014/F	1063
Fall 2014/H	5
Fall 2014/M	1621
Fall 2014/R	1454
Fall 2014/S	26
Fall 2014/T	1484
Fall 2014/W	1640
Fall 2015/	4666
Fall 2015/F	1084
Fall 2015/H	6
Fall 2015/M	1544
Fall 2015/R	1449
Fall 2015/S	34
Fall 2015/T	1519
Fall 2015/W	1593
Fall 2016/	4727
Fall 2016/F	1129
Fall 2016/H	6
Fall 2016/M	1566
Fall 2016/R	1494
Fall 2016/S	28
Fall 2016/T	1540
Fall 2016/W	1628
Spring 1994/	3499
Spring 1994/F	727
Spring 1994/M	1195
Spring 1994/R	1170
Spring 1994/S	17
Spring 1994/T	1239
Spring 1994/W	1263
Spring 1995/	3538
Spring 1995/F	741
Spring 1995/M	1210
Spring 1995/R	1184
Spring 1995/S	16
Spring 1995/T	1247
Spring 1995/W	1268
Spring 1996/	3447
Spring 1996/F	786
Spring 1996/M	1216
Spring 1996/R	1153
Spring 1996/S	15
Spring 1996/T	1236
Spring 1996/W	1228
Spring 1997/	3514
Spring 1997/F	717
Spring 1997/M	1246
Spring 1997/R	
Spiring rassiving	1184
	1184 16
Spring 1997/S Spring 1997/T	

For this problem, in the mapper function we have split each combination of days to individual days (for ex. MWF as M,W,F) and then we passed it to reducer which collected how many times each day was being passed (sum of values of each day which corresponds to how many courses were scheduled each day). The output shows how busy each day was every semester in terms of hours. We infer from the data that generally Monday, Tuesday, Wednesday and Thursday have similar values and Friday has lesser than them. Saturday and Sunday on the other hand hardly have classes.

Wednesday being in the middle of the week seems to be the busiest day for the overall data.

# Question 5: Which building has the largest seat utilization?

• • •	Q5Output ~
Fall 2014/Talbrt	seats utilization/in percentage/70%
	seats/220/314
	tilization/in percentage/75%
Fall 2014/Wendeseats/2	
Fall 2014/Wilksn	seats utilization/in percentage/48%
Fall 2014/Wilksn	seats/78/162
Fall 2015/Abbott Fall 2015/Abbott	seats utilization/in percentage/0%
Fall 2015/Abbott	seats/0/12
Fall 2015/Ach Aseats u	tilization/in percentage/51%
Fall 2015/Ach_Aseats/2	21/41
Fall 2015/Alfier	seats utilization/in percentage/68% seats/165/242
Fall 2015/Alfier	seats/165/242
Fall 2015/Allenseats u	rtilization/in percentage/0%
Fall 2015/Allenseats/0	/50
Fall 2015/Alumni	seats utilization/in percentage/44%
Fall 2015/Alumni	seats/208/465
Fall 2015/Anders	seats utilization/in percentage/20%
Fall 2015/Anders	seats utilization/in percentage/44% seats/208/465 seats utilization/in percentage/20% seats/6/30
Fall 2015/Bairdseats u	rtilization/in percentage/22%
Fall 2015/Bairdseats/1	
	tilization/in percentage/59%
Fall 2015/Baldyseats/7	
	tilization/in percentage/69%
Fall 2015/Bell seats/1	
	tilization/in percentage/75%
Fall 2015/Bioedseats/1	
Fall 2015/Blores	seats utilization/in percentage/27%
Fall 2015/Blores	seats/24/88 seats utilization/in percentage/1900%
Fall 2015/Bonner	seats utilization/in percentage/1900%
	seats/19/1
Fall 2015/C-V seats/3	rtilization/in percentage/66%
Fall 2015/Capenseats/2	
Eall 2015/Cary coate	tilization/in percentage/39%
Fall 2015/Cary seats/4	
Fall 2015/Cell seats/1	
Fall 2015/Cfa seats	tilization/in percentage/24%
Fall 2015/Cfa seats/3	28/1382
	tilization/in percentage/102%
Fall 2015/Clarkseats/4	
	seats utilization/in percentage/65%
	seats/663/1011
Fall 2015/Coe seats/9	1/0
	tilization/in percentage/67%
Fall 2015/Cookeseats/4	
Fall 2015/Crltnseats/8	
	seats utilization/in percentage/50%
Fall 2015/Crosby	seats/312/614

For this problem, the mapper is sending total capacity of room along with number of students enrolled for that course to reducer. Then reducer is calculating seat utilization and displaying percentage along with the actual values. Output of mapper is <Key = Semester/Building Name, Value = Room Number/ Number of enrolled students/total capacity off room> where "/" is used as a separator. The output of dataset shows mostly buildings are not used to their full capacity but sometimes maybe due to error in dataset, number of students enrolled is greater than room capacity and results in more than 100% seat utilization. Also seat utilization is not an accurate indicator of capacity of each building. For example, Bonner Hall has 1900% seat utilization in Fall 2015 and Baldy hall has 75% but still

number of seats in Bonner Hall is just 1 whereas it is 1273 in Baldy Hall.

# Question 6: Which rooms were used to their full capacity?

```
Q14Output ~
Summer 2013/Lapen 255
                        seats/10/8
                        room utilized to full capacity/600%
Summer 2013/Cary 44
Summer 2013/Cary 44
                        seats/6/1
Summer 2013/Frnczk 304 room utilized to full capacity/966%
Summer 2013/Frnczk 304 seats/116/12
Summer 2013/Furnas 309 room utilized to full capacity/180%
Summer 2013/Furnas 309 seats/27/15
Summer 2014/Alumni 144 room utilized to full capacity/175%
Summer 2014/Alumni 144 seats/7/4
Summer 2014/Alumni 190 room utilized to full capacity/111%
Summer 2014/Alumni 190 seats/20/18
Summer 2014/Baldy 476 room utilized to full capacity/107%
Summer 2014/Baldy 476 seats/15/14
Summer 2014/Bell 209
                        room utilized to full capacity/416%
Summer 2014/Bell 209
                        seats/25/6
Summer 2014/Bioed 235 room utilized to full capacity/700%
Summer 2014/Bioed 235 seats/84/12
Summer 2014/Bloed 333 room utilized to full capacity/270%
Summer 2014/Bloed 333 seats/130/48
Summer 2014/Cary 44
                        room utilized to full capacity/800%
Summer 2014/Cary 44
                        seats/8/1
Summer 2014/Cfa 229
                        room utilized to full capacity/200%
Summer 2014/Cfa 229
                        seats/2/1
Summer 2014/Clemen 1025
                                room utilized to full capacity/450%
Summer 2014/Clemen 1025
                                seats/9/2
Summer 2014/Frnczk 304 room utilized to full capacity/671%
Summer 2014/Frnczk 304 seats/94/14
Summer 2015/Bell 209
                        room utilized to full capacity/1025%
Summer 2015/Bell 209
                        seats/41/4
Summer 2015/Bioed 235
                        room utilized to full capacity/400%
Summer 2015/Bioed 235 seats/48/12
Summer 2015/Bloed 333 room utilized to full capacity/277%
Summer 2015/Bioed 333 seats/133/48
                        room utilized to full capacity/400%
Summer 2015/Cary 44
Summer 2015/Cary 44
                        seats/4/1
Summer 2015/Davis 338A room utilized to full capacity/150%
Summer 2015/Davis 338A seats/36/24
Summer 2015/Farber 270D
                                room utilized to full capacity/133%
Summer 2015/Farber 270D
                                seats/4/3
Summer 2015/Frnczk 304 room utilized to full capacity/664%
Summer 2015/Frnczk 304 seats/93/14
Summer 2015/Frnczk 341 room utilized to full capacity/505%
Summer 2015/Frnczk 341 seats/101/20
Summer 2015/Wende 402 room utilized to full capacity/110%
Summer 2015/Wende 402
                        seats/88/80
Summer 2015/Wende B08 room utilized to full capacity/225%
Summer 2015/Wende B08 seats/27/12
Summer 2016/Bioed 333 room utilized to full capacity/166%
Summer 2016/Bioed 333
                        seats/80/48
Summer 2016/Frnczk 304 room utilized to full capacity/135%
```

For this problem, the mapper sends each room as key to reducer and reducer calculates if the room is being used to its full capacity. Output of mapper is <Key = Semester/Hall Room Number, Value = Number of Students enrolled/ Total Number of seats> where "/" is being used as a separator. Output of reducer is two rows: one with number of students enrolled and total capacity of room, and second with percentage value of room used. This is a good indicator of which room is over utilized. We can see that in recent years, rooms from Bioed, Frnczk Hall etc are being fully used. Using this information to re assign rooms for courses with higher number of students is also a good idea.

#### Question 7:

#### Which courses had least enrollment?

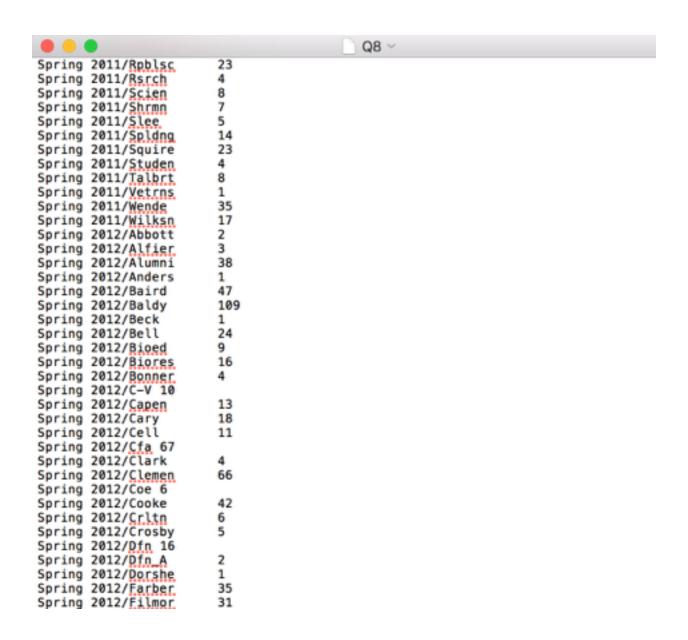
The output shows Key as each semester and Value as all the courses with minimum enrollment of students. As we can see usually every semester has some courses where only 1 student has enrolled. As we go through the output we also notice that there are many courses which have 0 students. This is a good indication of which courses are least popular.

```
Pall 1932 Writing 1 / Intro to Philosophy / Economics Topic / Introductory Psychology / Mygiene / Elem French 1st Semester, 1
Fall 1932 Structure of Amer Society / Psychology Topic / Designer Genes, 1
Fall 1933 Structure of Amer Society / Psychology Topic / Designer Genes, 1
Fall 1933 Per Soleton, 10 / Economics Topic / Psychology Topic / Duvenite Justice / GOV Topic / Bus Org & Policy, 1
Fall 1945 Pris. Of Marksting, 1
Fall 1945 Special Studies Art / Brains Molecules-Memory / Special Studies Pér / Mitting 1 / Special Studies Art / General Chemistry / Special Studies Art / French Topic / French Topic / General Chemistry / Special Studies Art / French Topic / French Topic / General Chemistry / Special Studies Art / French Topic / French Topic / General Chemistry / Special Studies Art / Special Studies Art / French Topic / General Chemistry / Special Studies Art / French Topic / French Topic / General Chemistry / French Topic / General Chemistry / Special Studies Art / Special Studies Art / French Topic / General Chemistry / French Topic / General Studies Art / Special Studies Art / Sp
```

#### Question 8:

#### How many rooms are there in each building?

The following output shows how many rooms were used for classes for every building each semester. This will give a good idea about which building can fit more students. From the data we see that Baldy has the most number of rooms whereas "Anders" & "BUTLER" Halls have only one room for courses, which might mean that they are administrative buildings or library etc.



#### Question 9:

#### Over the years how many different rooms has each course been taught in?

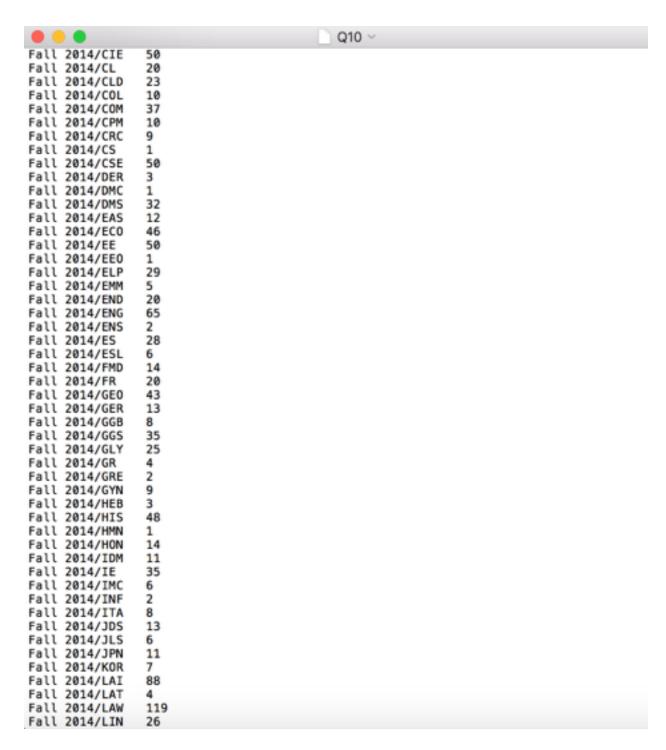
For this problem, the mapper output is <Key = Course Name, Value = Room Number> The reducer adds all the rooms where the course has been taught and returns that as the value. As seen below from the sample output gives a good account of where each course has been taken. This can help in reassigning rooms for coming semesters. If there is a time clash it can be moved to one of it's previous rooms by easily looking at these values. From the output we can infer that most Accounting course classes happen at Jacobs Hall, Adv Physical Anthropology takes place at Spldng Building and so on. Using this data we can also infer if some building is specific to a department or not. For example since allDental classes happen at Squire we can say that Squire is the Dental department building.

```
018
                                                                                                                                                                                                                    / / Kimbal 111 / Kimbal 111 / Cary 134 / Kimbal 111 / Cary 134 / Kimbal 821 / Cary 245
      Adv. Conc. Acute Care Nursa
    Adv. Conv. and Comp // Bell 139 / Cooke 127A / Baldy 684 / Clemen 102 / Baldy 115 / Baldy 684 / Clemen 215 / Clemen 107 / Baldy 115 / Clemen 202
107 // Baldy 115 / Clemen 202
Adv. Convers. 6 Composit // Clemen 201
Adv. Convers. 6 Composit // Clemen 201
Adv. Corp Finance // Alfier 104 / Nsc 216 / Nsc 220 / Park 250 / Jacobs 112 / Hoch 114 / Clemen 120 / Fraczk
422 / Knox 14 / Capen 10 / Nsc 216 / Jacobs 110 / Knox 14 / Knox 14 / Nsc 210 / Nsc 205 / Clemen 322 / Knox 04 / Knox
04 / Jacobs 110 / Knox 04 / Knox 110 / Jacobs 110 / Alfier 104 / Knox 04 / Jacobs 112 / Nsc 218 / Knox 14 / Knox 14 /
Nsc 210 / Jacobs 122 / Jacobs 110 / Hoch 114 / Alfier 103 / Nsc 222 / Alfier 102 / Alfier 103 / Knox 14 /
Jacobs 110 / Jacobs 110 / Nsc 228 / Nsc 228 / Knox 104 / Jacobs 110 / Knox 104 / Jacobs 110 / Clemen 322 / Capen 262 / Hoch 114 / Capen 262 / Nsc 228 / Talbit 212 / Jacobs 110 / Jacobs 110 / Sacobs 110 / Clemen 322 / Knox 004 / Knox 100 / Alfier 100 / Jacobs 110 / Jacobs 110 / Alfier 100 / Alfier 100 / Jacobs 110 / Knox 004 / Knox 004 / Knox 100 / Alfier 100 / Jacobs 110 / Alfier 100 / Jacobs 110 / Knox 004 / Knox 100 / Alfier 100 / Jacobs 110 / Sacobs 110 / Sacobs 110 / Knox 004 / Knox 100 / Alfier 100 / Jacobs 110 / Sacobs 110 / Jacobs 110 / Jaco
 Adv. Corp Tax
                                                                                                                 / / Obrian 786
    Adv DNP Clinical Prac I
ACC / Off Ca Acc
      Adv DNP Clinical Prac II
                                                                                                                                                                                                                    / / Off Ca Arr / Off Ca
      Arr / Off Ca Arr
       Adv Design in Ceramics
                                                                                                                                                               / / Harrim 255 / Filmor 120 / Filmor 120 / Filmor 120 / Harrim 255 / Filmor 120 / Harrim 255 /
    filmor 120 / Filmor 120 / Filmor 120 / Harrim 255 / Filmor 120 / Harrim 255 / Filmor 120 / Filmo
       Obrian 214 / Park 258 / Park 241
  Seriam 214 / Park 250 / Park 241
Adv. Digital Arts Prod  // Cfa 244 / Cfa 244 / Cfa 244 / Cfa 242 / Cfa 244 / Cfa 246 / Cfa 242 / Cfa 244 / Cfa 24
```

#### Question 10:

#### How many courses does each department have?

For this problem the output of mapper is <Key = Semester/Department, Value = Course>. Reducer calculates how many courses are there in a department and its output is <Key = Semester/Department, Value = Number of Courses>. This is a good measure to see if any new courses are being offered compared to previous years. We can see that for Fall 2014, DMS department offered 32 courses, EE offered 50 courses while management offered 16 courses. There was a decrease of 5 in the number of courses offered by CSE department in 2013 vs. 2014.



### Question 11: What are the total number of courses offered each semester?

Fall_1931	6
Fall_1932	3
Fall_1933	6
Fall_1939	1
Fall_1941	1
Fall_1945	4
Fall_1946	9
Fall_1947	9
Fall_1948	9
Fall_1949	15
Fall_1950	22
Fall_1951	35
Fall_1952	10
Fall_1953	10
Fall_1954	24
Fall_1955	56
Fall_1956	36
Fall_1957 Fall 1958	72
Fall_1958 Fall 1959	38 25
Fall_1960	52
Fall_1961	66
Fall_1962	37
Fall_1963	28
Fall_1964	47
Fall_1965	57
Fall_1966	102
Fall_1967	214
Fall_1968	155
Fall 1969	168
Fall_1970	108
Fall_1971	164
Fall_1972	159
Fall_1973	74
Fall_1974	151
Fall_1975	107
Fall_1976	158
Fall_1977	163
Fall_1978	49
Fall_1979	8
Fall_1980	71
Fall_1981	8
Fall_1982	245
Fall_1983	151
Fall_1984	151
Fall_1985	169
Fall_1986 Fall_1987	10 178
Fall_1988	32
Fall 1989	166
Fall_1990	21
Fall 1991	187
F-11 4003	22

In this problem we start by creating the key for each row of data in the 'Semester\_Year' format by using the second field of the data. Next, we assign the Course Id of each row as the value and this <key,value> pair is the output of the mapper. In the reducer we keep a string 's' which contains the course ids. For every <key,value> pair we first check if the value is already present in the 's', if it isn't then we increment the counter by 1. This way we are only counting for courses with unique course ids. At the end we append a check value to the result so that for the next round in the reducer it directly prints the output.

In the output we have the semester and number of unique courses offered for that semester. From the output we can infer that the number of courses offered were lesser in the earlier years.

### Question 12: Which hall is used the most each semester?

Fall_1993	Clemen
Fall 1994	Clemen
Fall_1995	Clemen
Fall 1996	Clemen
Fall_1997	Clemen
Fall 1998	Clemen
Fall_1999	Baldy
Fall_2000	Baldy
Fall 2001	Baldy
Fall_2002	Baldy
Fall_2003	Baldy
Fall_2004	Baldy
Fall_2005	Baldy
Fall_2006	Baldy
Fall_2007	Baldy
Fall_2008	Clemen
Fall_2009	Clemen
Fall_2010	Baldy
Fall_2011	Baldy
Fall_2012	Baldy
Fall_2013	Clemen
Fall_2014	Park
Fall_2015	Park
Fall_2016	Park
Spring_1994	Clemen
Spring_1995	Clemen
Spring_1996	Clemen
Spring_1997	Clemen
Spring_1998	Clemen
Spring_1999	Clemen
Spring_2000	Clemen
Spring_2001	Clemen
Spring_2002	Clemen
Spring_2003	Baldy
Spring_2004	Baldy
Spring_2005	Clemen
Spring_2006	Clemen
Spring_2007	Clemen
Spring_2008	Clemen
Spring_2009	Clemen
Spring_2010	Clemen
Spring_2011	Clemen
Spring_2012	Baldy
Spring_2013	Baldy
Spring_2014	Baldy
Spring_2015	Baldy
Spring_2016	Baldy
Summer_1994	Clemen
Summer_1995 Summer_1996	Clemen
Summer_1996 Summer_1997	Nsc Nsc
Summer_1998 Summer_1999	Clemen
Summer_1999	Clemen
Summer_2001	Clemen
Summer_2002	Clemen
Summer_2003	Baldy
Sunner_2004	Baldy
Summer_2005	Baldy
Summer_2006	Baldy
C 3007	Dald.

For this problem also we create <key, value > pairs where key contains 'Semester\_Year' and value contains the name of the hall in each row. We check if the field for the hall name contains 'Unknown' or 'Arr Arr', if so we ignore rows containing these values. In the reducer we make use of a hashmap. The key in the hashmap is the name of the hall and the value is the number of times it appears in the data for each semester. For each <key,value> pair the reducer first checks if the the value is already present in the hash map, if so it increments the value of the hashmap for that key by 1. If it is not present then it adds a key to the hashmap where key is the hall name and the value is set to 1. Next, we use Collections.max() and look for the highest value in the hashmap and set max to it. Then we iterate over the hash map and look for values equal to max value and print out the key wherever we find the match.

The output contains the semester and the name of the hall that is used the most in that semester. If there is more than one hall then all are mentioned like in the case of semester Winter\_2017 we get Math and Cary as the halls used the most in this semester. From the output we can see that Clemen and Baldy seem the most popular halls and this could be because there are more classrooms in these halls.

#### Question 13:

#### Which courses are offered in both fall and spring semester each year?

Here, we first create <key,value> pairs where key contains the year and value is in the format 'Semester-CourseId' and this is the output of the mapper. In the reducer for each <key,value> pair we first split the value by using the separator "-" . We keep two local strings, one for fall and one for spring. To these we keep adding the unique course id present in the value. We check if any of the split strings contain the string 'fall' or 'spring'. If it contains fall then we check if that course id is present in the local string spring , if it is then we add this course id to the global string 's' and then append the course id to fall. If it contains spring then we check if that course id is present in the local string fall , if it is then we add this course id to the global string 's' and then append the course id to spring. Finally, after all the values are iterated over the key is set to the year and value is set to the string 's' and this is written. We also append a check value to the value so that when it reached the second round of iteration it is written to the output file.

The output contains the year and the list of courses that are offered in both fall and spring semester that year. In the output we can see that the number of common courses increases over the years. Some years don't have any courses in common.

### Question 14: What is the total enrollment in each semester?

Fall_1931	6
Fall_1932	3
Fall_1933	6
Fall_1939	1
Fall_1941	1
Fall_1945	15
Fall_1946	15
Fall_1947	27
Fall_1948	23
Fall_1949	15
Fall_1950	24
Fall_1951	48
Fall_1952	45
Fall_1953	58
Fall_1954	46
Fall_1955	79
Fall_1956	75
Fall_1957 Fall_1958	97
Fall_1958 Fall_1959	85 165
Fall_1960	239
Fall_1960 Fall_1961	303
Fall_1962	375
Fall_1962 Fall_1963	648
Fall_1964	812
Fall_1965	1043
Fall_1966	1127
Fall 1967	1224
Fall_1967 Fall_1968	1518
Fall_1969	1584
Fall_1970	1957
	2112
Fall_1971 Fall_1972 Fall_1973 Fall_1974	2484
Fall 1973	2735
Fall_1974	3003
Fall_1975	3387
Fall_1976	3335
Fall_1977	3777
Fall_1978 Fall_1979	4297
Fall_1979	5068
Fall_1980	5965
Fall_1981	6664
Fall_1982 Fall_1983 Fall_1984	7296
Fall_1983	8634
Fall_1984	11459
Fall_1985	13679
Fall_1986 Fall_1987	17384
	21430
Fall_1988	28978
Fall_1989	38402
Fall_1990	53947
Fall_1991	70861

For this problem we create <key,value> pairs where the key is in the 'Semester\_year' format and the value is the total enrollment in each course/row for that semester. This is the output of the mapper. In the reducer for each <key,value> pair we take the value and covert it to an integer value(we send it as Text from mapper to reducer) using Integer.parseInt() and this value is added to an integer variable 'sum'. At the end we do a write operation for <key,value> pair where key is the 'Semester\_year' and value is the sum(converted to Text). We also append a check value to the value so that when it reached the second round of iteration it is written to the output file.

The output file contains the Semester and the total enrollment next to it. From the output we can infer that the total enrollment is less in the earlier years and increases over the years. This is also due to the fact that the number of courses offered increased over the years.

#### Question 15: What was the busiest part of the day during exams in each semester?

Fall_2011	Morning
Fall_2012	Afternoon
Fall_2013	Afternoon
Fall_2014	Afternoon
Fall_2015	Afternoon
Spring_2012	Afternoon
Spring_2013	Evening
Spring_2014	Evening
Spring_2015	
Spring 2016	Evening

In this problem we create <key,value> pairs for each row where key is set to the 'Semester\_Year' and value is set to the start time of the exam. What we do here is we split the start time using the separator ":" and the first part of the string is set as the value and sent to the reducer. This is the output of the mapper. In the reducer for each value we get the integer value using Integer.parseInt() and then check for three conditions. If the value is less than 12 then we increment the counter of morning. Otherwise, if the value is greater than 12 but less than 16 then we increment the counter of afternoon. Otherwise if the value is grater than 16 then we increment the counter of evening. Next, we check which of morning, afternoon and evening is the highest and accordingly set the value to morning/afternoon/evening, indicating that that part of the day is the busiest. We do a write operation with key set to 'Semester\_Year' and value set to morning/ afternoon/evening depending on which has the highest count. We also append a check value to the value so that when it reached the second round of iteration it is written to the output file.

In the output file we have the semester and the part of the day that is the busiest in that semester. From the results we can see that over the years exams take place more often in the afternoon then other parts of the days and morning are relatively free.

# Question 16: What is the most popular course in each semester?

```
Fall_1993
Fall_1994
Fall_1995
              Intro to Pharmacology
              Intensive English Program
              Intensive English Program
Fall_1996
              Intensive English Program
Fall_1997
              Intensive English Program
Fall 1998
              Intensive English Program
Fall_1999
              Intensive English Program
Fall_2000
              Intensive English Program
Fall_2001
              Intensive English Program
Fall_2002
Fall_2003
              Intensive English Program
              Productn & Operatns Mont
Fall_2004
              Intensive English Program
Fall_2005
Fall_2006
              Community Serv Internship
              Practicum
Fall_2007
              Principles Public Hlth
Fall_2008
Fall_2009
              Independent Study
              Independent Study
Fall_2010
              Dynamics of Leadership
Fall_2011
Fall_2012
              Eval Res Evid I
              Discovery Seminar Program
Tx Plan & Cases 3
Fall 2013
Fall_2014
Fall_2015
              Tx Plan & Cases 3
              Undergrad Supery Teach
Fall_2016
Spring_1994
              Exercise Physiology
              Exercise Physiology
Spring_1995
Spring_1996
              Medical Biophysics
Spring_1997
              Professional Problems
Spring_1998
              Neuroscience II
Spring_1999
              Neuroscience 2
              Community Sery Internship
Spring_2000
Spring_2001
              Community Serv Internship
Spring_2002
              Community Serv Internship
Spring_2003
              Community Serv Internship
Spring_2004
              Community Serv Internship
Spring_2005
              Community Serv Internship
Spring_2006
              Human Anatomy
Spring_2007
              Env Dsn Workshop 2
Spring_2008
              School Media Ctr Prac
Spring 2009
              Independent Study
Spring_2010
              Independent Study
Spring_2011
              Internship in Communication
Spring 2012
              Internship in Communication
Spring_2013
              Internship in Communication
Spring_2014
              Tx Plan & Cases 2
Spring_2015
              Tx Plan & Cases
Spring_2016
              Internship
Summer_1994
Summer_1995
              Cad Applications
              Intro PT Evaluation Techs
Summer_1996
              Psychological Statistics
Summer_1997
              Social Problems
Summer_1998
              Introduction to Sociology
```

Here, we set the <key, value > pair for each row by setting the key to the 'Semester\_Year' and the value is a a concatenation of the course name and the percentage of enrollment. We calculate (enrollement/total capacity)\*100 for each row where the total capacity is not equal to 0 and this is concatenated with the course id and set as the value. This is the output of the mapper. In the reducer we keep an integer variable max which is initially set to 0 and then for each <key,value > pair the value is split using the separator "-" and the second part of the string is converted to integer and compared to the max value and if it is greater than max is set to the greater value and a global variable 'sub' is set to the first part of the split string which the course name. When all the values of the same key are iterated the final values of max contains the maximum percentage of enrollment and 'sub' contains the subject associated with that value. We do a write operation using these <key,value> pairs. We also append a check value to the value so that when it reached the second round of iteration it is written to the output file.

The output file contains the Semester and the course most popular in that semester. From the output we can infer that Intensive English Program was a highly preferred course in fall semester as it turned out to be the most popular for nine consecutive years and for spring and summer semester Community Serv Internship is the most popular.

# Question 17: What was the least busy part of the day during exams in each semester?

Fall_2011	Evening
Fall_2012	Evening
Fall_2013	Evening
Fall_2014	Evening
Fall_2015	Morning
Spring_2012	Morning
Spring_2013	Morning
Spring_2014	Morning
Spring_2015	Morning
Spring 2016	Morning

In this problem we create <key,value> pairs for each row where key is set to the 'Semester\_Year' and value is set to the start time of the exam. What we do here is we split the start time using the separator ":" and the first part of the string is set as the value and sent to the reducer. This is the output of the mapper. In the reducer for each value we get the integer value using Integer.parseInt() and then check for three conditions. If the value is less than 12 then we increment the counter of morning. Otherwise, if the value is greater than 12 but less than 16 then we increment the counter of afternoon. Otherwise if the value is grater than 16 then we increment the counter of evening. Next, we check which of morning, afternoon and evening is the least and accordingly set the value to morning/afternoon/evening, indicating that that part of the day is the least busy. We do a write operation with key set to 'Semester Year' and value set to morning/afternoon/evening depending on which has the least count. We also append a check value to the value so that when it reached the second round of iteration it is written to the output file.

In the output file we have the semester and the part of the day that is the least busy in that semester. From the results we can see that in the past few years mornings are free as compared to afternoons and evenings so there can be more exams scheduled in the morning so there is even distribution and this might give more time gap between two exams.

#### Question 18: Each year between fall and spring which semester has higher enrollment?

1914	Fall & Spring-0
1931	Fall-6
1932	Spring-6
1933	Fall & Spring-6
1934	Spring-6
1939	Fall-1
1941	Fall-1
1942	Spring-1
1945	Fall-15
1946	Fall-15
1947	Fall-27
1948	Fall-23
1949	Spring-22
1950	Fall-24
1951	Fall-48
1952	Spring-52
1953	Fall-58
1954	Spring-56
1955	Fall-79
1956	Spring-77
1957	Fall-97
1958	Spring-101
1959	Fall-165
1960	Fall-239
1961	Fall-303
1962	Fall-376
1963 1964	Fall-649 Fall-812
1965	Fall-1043
1966	Fall-1127
1967	Fall-1224
1968	Fall-1518
1969	Fall-1584
1970	Fall-1957
1971	Fall-2112
1972	Fall-2484
1973	Fall-2735
1974	Fall-3003
1975	Fall-3387
1976	Fall-3335
1977	Fall-3777
1978	Fall-4297
1979	Fall-5068
1980	Fall-5966
1981	Fall-6664
1982	Fall-7296
1983	Fall-8634
1984	Fall-11461
1985 1986	Fall-13679 Fall-17385
1987	Fall-21430
1988	Fall-28979

In this problem we set the <key,value> pairs in the mapper as <year, semester\_enrollment> where semester is either fall or spring. This is the output of the mapper. In the reducer for each <key,value> pair we check if the value contains fall or spring. We split the value using the separator "-". If the first string contains fall then we convert the enrollment to integer and add its value to local variable fall and if the first string contains spring then we convert the enrollment to integer and add its value to local variable spring. Next we check for which value is greater between fall and spring and set the value to that semester and its total enrollment value and perform write operation for this <key,value> pair. We also append a check value to the value so that when it reached the second round of iteration it is written to the output file.

In the output file we have year and the semester that has highest enrollment along with the value of enrollment. In some cases we see that the enrollment is 0 and in some cases we find that Fall and Spring have the same enrollment. It is also observed that enrollment increases over the years and is 0 for the year 2017 as we still haven't entered this year.

#### Question 19:

#### Which is the most used classroom in each semester during exams?

In this problem we set <key,value> pairs as <Semester\_year, classnumber> and this is the output of the mapper. In the reducer for each reducer we keep a hash map which stores the classnumber and a counter for each classnumber. For each new <key,value> pairs we check if the key is already present in the hash map, if so we increment the value of the corresponding key in the hashmap by 1. If it is not present we add it to the hashmap and set its value to 1.

Next, we find the maximum value among all the values of the hashmap and then search for the keys that have the maximum value and add those keys to a string 's'. This string is set as the value and the semester and the key and write operation is done. We also append a check value to the value so that when it reached the second round of iteration it is written to the output file.

In the output file we have the semester and the classrooms used the most in that semester.

```
Fall_2011 34539 28371 31767

Fall_2012 29372 23678 23971 19009 11521 20058 14536 10000 23911 22052 19927 17488 19901 21119

Fall_2012 3858 17906 18798 10486 22312 11061 13456 23748 15499 17793 20000 15873 23539 23591

Fall_2014 1540 13740 14706 18798 10487 22937 21154 22387 24008 24377 13488 13372 13295 16187 25588 17199

Fall_2014 1540 13474 17401 24095 22525 21853 33344 16575 16399 20124 24044 16822 12928

Spring_2012 12008 15521 12009 22225 21853 33544 16575 16309 20124 24044 16822 12928

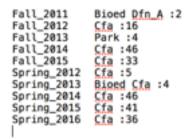
Spring_2013 13087 22748 13889 20001 15233 12004 15579 11564 13270 11008 10037 15871 11601 14889 14891 12014

Spring_2014 14521 12973 13410 24345 13884 11759 14622 11802 14539 15414 11709 14627 11700 11700 12014

Spring_2015 15409 15109 14555 18723 23424 15113 13166 11660 18309 21476 21477 14285 11809 11779 14287 23475

Spring_2016 21882 14054 14056 23314 13667 14042 23750 11530 13640 24057 14315 10107 11569 23998 17620 11331 23926 11709
```

#### Question 20: Which building uses the most labs each semester during exams?



For this problem we set the <key,value> pair. Key is the term where as for value we check if the facility type is 'LAB', if it is then we set the value to the building name. If not we ignore that case. This is the output of the mapper. In the reducer we keep a hashmap whose key is the building name and the value is a counter for each building. For each <key,value> pair we check if the value i.e. the building is present in the hashmap, if it is present then we increment the value of that key by 1 and if it is not present then we add that building to the hashmap. Next, we find the highest value in the hashmap and find the keys that have this value and append those keys to the string 's'. Finally we do a write operation on the initial key(Semester\_year) and value('s').

We also append a check value to the value so that when it reached the second round of iteration it is written to the output file.

In the output file we have the semester and the names of the buildings that have the most labs during exams. If two or more buildings have the same number of labs, we mention all. From the output we observe that Cfa building has the most labs.

#### **Conclusion:**

Hence thesis questions give some useful insights about the dataset.