

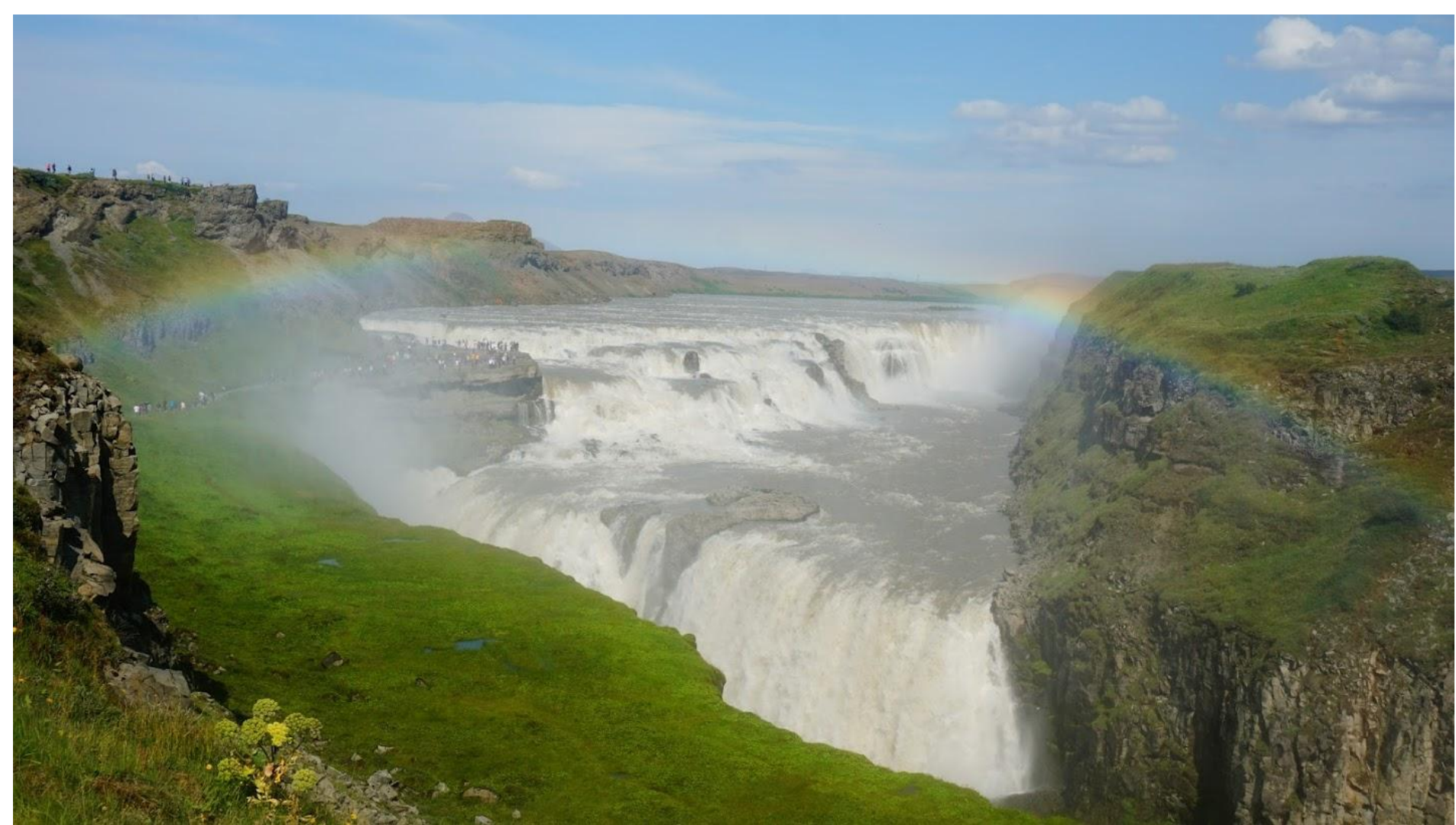
# CSC 369: Distributed Computing

Alex Dekhtyar

April 17

Day 6: The Algebra Of Data Transformations Part II

```
db.collection.aggregate()
```



# Housekeeping

- Lab 2:
  - Submit from unix1-2-3-4-5
  - **handin dekhtyar lab02 <files>**
- **Lab 3:**
- **Lab 4: Python application, teams of 2.**

# Recall from last class

```
{name:"Alex",  
  teaches:["CSC 369", "DATA 452"],  
  department:"CSSE",  
  enrollments:[28,20],  
  position: "professor",  
  office:{building:14, room:210}  
}
```

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

Q2: Report a list of instructors for each "CSC", "CPE" and "DATA" course. For each instructor, list name and department.

**Decomposition into atomic operations in "Generalized" Data Algebra**

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

**Keep only CSSE instructors**



**Remove unnecessary data**



**Find the total enrollment for each CSSE instructor and number of sections taught**



**Find the largest total enrollment for a CSSE instructor**



**Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment**

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

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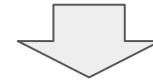
**Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment**

Q2: Report a list of instructors for each "CSC", "CPE" and "DATA" course. For each instructor, list name and department.

**Deconstruct "teaches" arrays, create one object per instructor-course pairing**



**Keep information about only "CSC", "CPE", and "DATA" courses.**



**Remove unnecessary data**



**For each course, combine instructors teaching it into a list**



**Sort?**

Express using these operations....

## Relational Algebra

**Selection**

**Projection**

**Set Operations**

**Join**

**Grouping/Aggregation**

**Sort**

## Generalized Algebra

Filtering

Projection/Transformation

Join

Grouping/Aggregation

Sort

# Very Tersely

**Filtering**

**Given a condition - keep only objects that satisfy it**

**Projection  
Transformation**

**Modify the contents of its object based solely on what's in the object itself**

**Grouping**

**Break collection into groups, each representing objects with same values of some keys**

**Aggregation**

**Compute an aggregate value over a set of objects**

**Join**

**Combine objects from two different collections based on matches in values of some keys**

**Sort**

**Return objects in a specific order**



... and a few more

**Ungrouping**  
**Unwinding**

**Opposite of grouping - build an object for each element of an array**

**Limit**

**Return a specific number of documents**

**Skip**

**Return documents after skipping a specified number**

**Sample**

**Return a random sample of documents**

**Let's use our intuition**

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

**Keep only CSSE instructors**



**Remove unnecessary data**



**Find the total enrollment for each CSSE instructor and number of sections taught**



**Find the largest total enrollment for a CSSE instructor**



**Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment**

**Exercise Time!!**

File posted to  
Slack/chat.

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

**Keep only CSSE instructors**



**Remove unnecessary data**



**Find the total enrollment for each CSSE instructor and number of sections taught**



**Find the largest total enrollment for a CSSE instructor**



**Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment**

**Filtering**

**Projection**

**Projection**

**Aggregation**

**Aggregation**

**Projection**

**Filtering**

Q2: Report a list of instructors for each “CSC”, “CPE” and “DATA” course. For each instructor, list name and department.

**Deconstruct “teaches” arrays, create one object per instructor-course pairing**



**Keep information about only “CSC”, “CPE”, and “DATA” courses.**



**Remove unnecessary data**



**For each course, combine instructors teaching it into a list**



**Sort?**

**Exercise Time!!**

Q2: Report a list of instructors for each “CSC”, “CPE” and “DATA” course. For each instructor, list name and department.

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**Keep information about only “CSC”, “CPE”, and “DATA” courses.**



**Remove unnecessary data**



**For each course, combine instructors teaching it into a list**



**Sort?**

**Unwinding**

**Filtering**

**Projection**

**Grouping**

**Sort**

Now, let's learn all this for real...

```
db.collection.aggregate(<aggregation  
                           pipeline>)
```





Now, let's learn all this for real...

```
db.collection.aggregate({$operation:{<doc>}},  
                        {$operation:{<doc>}},  
                        .../  
                        })
```

**In Lecture:** basic ideas

**In Lab:** all the syntax you can handle

# \$operation

Filtering

**\$match**

**\$redact**

Projection

**\$project**

**\$set**

**\$unset**

**\$addField**

**\$replaceRoot**

Aggregation

**\$group**

**\$bucket**

Grouping

**\$bucketAuto**

Sort

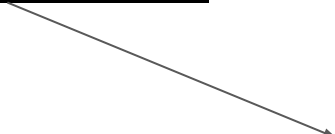
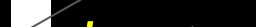
**\$sort**

**\$sortByCount**

Join

**\$lookup**

**\$graphLookup**



# \$operation

Filtering

\$match

Projection

\$project

Aggregation

\$group

Grouping

Sort

\$sort

Join

\$lookup

# \$operation

Filtering

`$match`

`$unwind`

Unwinding

Projection

`$project`

`$limit`

Limit

Aggregation

`$group`

`$skip`

Skip

Grouping

`$sample`

Sample

Sort

`$sort`

Join

`$lookup`

# Let's Learn By Doing

Query 2 first (it is simpler)

Query 1 second (it has **layers**)

Q2: Report a list of instructors for each “CSC”, “CPE” and “DATA” course. For each instructor, list name and department.

Deconstruct “teaches” arrays, create one object per instructor-course pairing



Keep information about only “CSC”, “CPE”, and “DATA” courses.



Remove unnecessary data



For each course, combine instructors teaching it into a list



**Sort?**

Unwinding

Filtering

Projection

Grouping

Sort

Q2: Report a list of instructors for each "CSC", "CPE" and "DATA" course. For each instructor, list name and department.

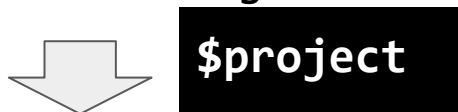
Deconstruct "teaches" arrays, create one object per instructor-course pairing



Keep information about only "CSC", "CPE", and "DATA" courses.



Remove unnecessary data



For each course, combine instructors teaching it into a list



Sort?



Q2: Report a list of instructors for each “CSC”, “CPE” and “DATA” course. For each instructor, list name and department.

**Deconstruct “teaches” arrays, create one object per instructor-course pairing**



**Keep information about only “CSC”, “CPE”, and “DATA” courses.**



**Remove unnecessary data**



**For each course, combine instructors teaching it into a list**



**Sort?**





Q2: Report a list of instructors for each "CSC", "CPE" and "DATA" course. For each instructor, list name and department.

Deconstruct "teaches" arrays, create one object per instructor-course pairing



`$unwind`

`{ $unwind: "$teaches" }`

Keep information about only "CSC", "CPE", and "DATA" courses.



`$match`

Remove unnecessary data



`$project`

For each course, combine instructors teaching it into a list



`$group`

Sort?

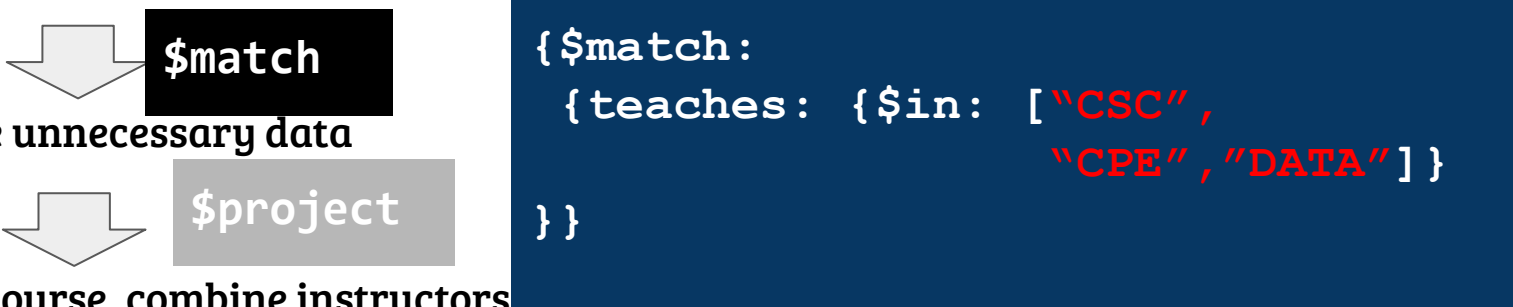
`$sort`

Q2: Report a list of instructors for each "CSC", "CPE" and "DATA" course. For each instructor, list name and department.

Deconstruct "teaches" arrays, create one object per instructor-course pairing



Keep information about only "CSC", "CPE", and "DATA" courses.



For each course, combine instructors teaching it into a list

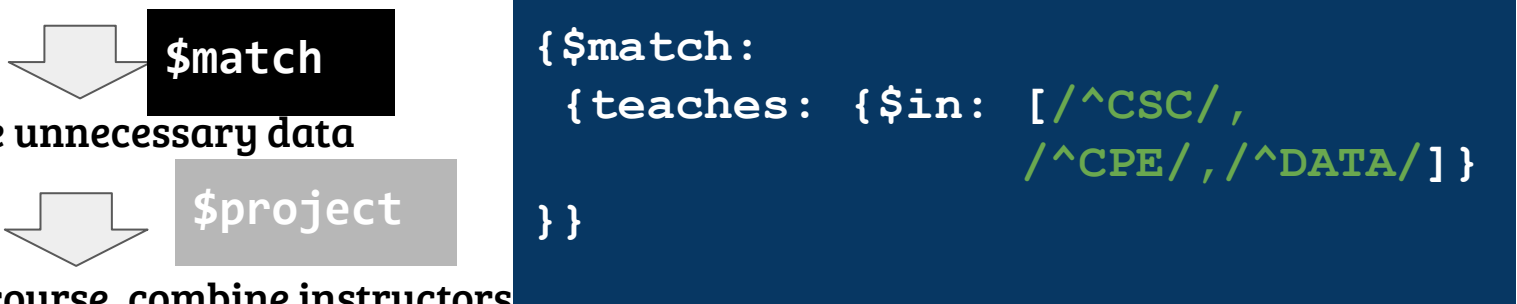


Q2: Report a list of instructors for each "CSC", "CPE" and "DATA" course. For each instructor, list name and department.

Deconstruct "teaches" arrays, create one object per instructor-course pairing



Keep information about only "CSC", "CPE", and "DATA" courses.



Remove unnecessary data



For each course, combine instructors teaching it into a list



Sort?



**Regular Expressions!!!**

Q2: Report a list of instructors for each "CSC", "CPE" and "DATA" course. For each instructor, list name and department.

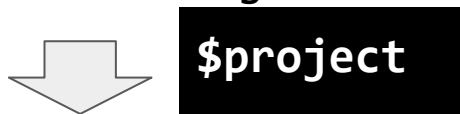
Deconstruct "teaches" arrays, create one object per instructor-course pairing



Keep information about only "CSC", "CPE", and "DATA" courses.



Remove unnecessary data



For each course, combine instructors teaching it into a list



Sort?



```
{ $unwind: "$teaches" }
```

```
{ $match: { teaches: { $in: [ /^CSC/, /^CPE/, /^DATA/ ] } } }
```

```
{ "name" : "Alex",  
  "teaches" : "CSC 369",  
  "department" : "CSSE",  
  "enrollments" : [28,20],  
  "position" : "professor",  
  "office" : { "building" : 14,  
               "room" : 210 }  
}
```

Q2: Report a list of instructors for each "CSC", "CPE" and "DATA" course. For each instructor, list name and department.

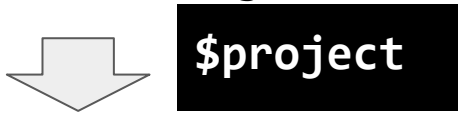
Deconstruct "teaches" arrays, create one object per instructor-course pairing



Keep information about only "CSC", "CPE", and "DATA" courses.



Remove unnecessary data



For each course, combine instructors teaching it into a list



```
{ $unwind: "$teaches" }
```

```
{ $match: { teaches: { $in: [ /^CSC/, /^CPE/, /^DATA/ ] } } }
```

```
{ $project: { _id: 0, Name: 1, department: 1, course: "$teaches" } }
```

```
"office" : { "building" : 14, "room" : 210 }
```

Q2: Report a list of instructors for each "CSC", "CPE" and "DATA" course. For each instructor, list name and department.

Deconstruct "teaches" arrays, create one object per instructor-course pairing



Keep information about only "CSC", "CPE", and "DATA" courses.



Remove unnecessary data



For each course, combine instructors teaching it into a list



```
{ $unwind: "$teaches" }
```

```
{ $match: { teaches: { $in: [ /^CSC/, /^CPE/, /^DATA/ ] } } }
```

```
{ $project: { _id: 0, Name: 1, department: 1, course: "$teaches" } }
```

```
{ $group: { _id: "$course", instructors: { $push: { name: "$name", department: "$department" } } }
```

Q2: Report a list of instructors for each "CSC", "CPE" and "DATA" course. For each instructor, list name and department.

Deconstruct "teaches" arrays, create one object per instructor-course pairing



Keep information about only "CSC", "CPE", and "DATA" courses.



Remove unnecessary data



For each course, combine instructors teaching it into a list



Sort?



```
{ $unwind: "$teaches" }
```

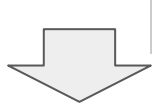
```
{ $match:
  { teaches: { $in: [ /^CSC/,
                    /^CPE/,
                    /^DATA/ ] } } }
```

```
{ $project: { _id: 0,
              Name: 1, department: 1,
              course: "$teaches" } }
```

```
{ $group: { _id: "$course",
            instructors: { $push: {
                          name: "$name",
                          department: "$department" } }
          }
  { $project: { _id: 0, instructors: 1,
              $course: "$_id" } }
```

Q2: Report a list of instructors for each "CSC", "CPE" and "DATA" course. For each instructor, list name and department.

Deconstruct "teaches" arrays, create one object per instructor-course pairing



`$unwind`

Keep information about only "CSC", "CPE", and "DATA" courses.



`$match`

Remove unnecessary data



`$project`

For each course, combine instructors teaching it into a list



`$group`

Sort?

`$sort`

```
{ $unwind: "$teaches" }
```

```
{ $match: { teaches: { $in: [ /^CSC/, /^CPE/, /^DATA/ ] } } }
```

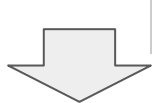
```
{ $project: { _id: 0, Name: 1, department: 1, course: "$teaches" } }
```

```
{ $group: { _id: "$course", instructors: { $push: { name: "$name", department: "$department" } } } }  
{ $project: { _id: 0, instructors: 1, $course: "$_id" } }
```



Q2: Report a list of instructors for each "CSC", "CPE" and "DATA" course. For each instructor, list name and department.

Deconstruct "teaches" arrays, create one object per instructor-course pairing



`$unwind`

Keep information about only "CSC", "CPE", and "DATA" courses.



`$match`

Remove unnecessary data



`$project`

For each course, combine instructors teaching it into a list



`$group`

Sort?

`$sort`

```
{ $unwind: "$teaches" }
```

```
{ $match: { teaches: { $in: [ /^CSC/, /^CPE/, /^DATA/ ] } } }
```

```
{ $project: { _id: 0, Name: 1, department: 1, course: "$teaches" } }
```

```
{ $group: { _id: "$course", instructors: { $push: { name: "$name", department: "$department" } } } } { $project: { _id: 0, instructors: 1, $course: "$_id" } }
```

```
{ $sort: { course: 1 } }
```

```
db.spring.aggregate(  
  {$unwind:"$teaches"},  
  {$match: {teaches: {$in: [/^CSC/, /^CPE/, /^DATA/]}  
    }},  
  {$project: {_id:0,  
    name:1, department:1,  
    course:"$teaches"}  
},  
  {$group: {_id:"$course",  
    instructors: {$push: {name:"$name",  
      department:"$department"}  
    }}  
},  
  {$project: {_id:0, instructors:1,  
    course:"$_id"}},  
  {$sort: {course:1}}  
)
```

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

**Keep only CSSE instructors**



**Remove unnecessary data**



**Find the total enrollment for each CSSE instructor and number of sections taught**



**Find the largest total enrollment for a CSSE instructor**



**Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment**

**Filtering**

**Projection**

**Projection**

**Aggregation**

**Aggregation**

**Projection**

**Filtering**

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

**Keep only CSSE instructors**



**\$match**

**Remove unnecessary data**



**\$project**

**Find the total enrollment for each CSSE instructor and number of sections taught**



**\$project**

**Find the largest total enrollment for a CSSE instructor**



**\$group**

**Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment**

**\$match**

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

**Keep only CSSE instructors**



`$match`

```
{ $match: { department: "CSSE" } }
```

**Remove unnecessary data**



`$project`

*Same as for db.collection.find()*

**Find the total enrollment for each CSSE instructor and number of sections taught**



`$project`

**Find the largest total enrollment for a CSSE instructor**



`$group`

**Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment**

`$match`

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

```
{ $match: { department: "CSSE" } }
```

**Keep only CSSE instructors**



```
$match
```

**Remove unnecessary data**



```
$project
```

**Find the total enrollment for each CSSE instructor and number of sections taught**



```
$project
```

**Find the largest total enrollment for a CSSE instructor**



```
$group
```

**Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment**

```
$match
```

```
{ $project: { ... } }
```

```
{ name: "Alex",  
  teaches: ["CSC 369", "DATA 452"],  
  department: "CSSE",  
  enrollments: [28, 20],  
  position: "professor",  
  office: { building: 14, room: 210 }  
}
```

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

```
{ $match: { department: "CSSE" } }
```

**Keep only CSSE instructors**



```
$match
```

**Remove unnecessary data**



```
$project
```

**Find the total enrollment for each CSSE instructor and number of sections taught**



```
$project
```

**Find the largest total enrollment for a CSSE instructor**



```
$group
```

**Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment**

```
$match
```

```
{ $project: { _id: 0, name: 1, enrollments: 1 } }
```

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

Keep only CSSE instructors



```
$match
```

```
{ $match: { department: "CSSE" } }  
  
{ $project: { _id: 0, name: 1, enrollments: 1 } }
```

Remove unnecessary data



```
$project
```

```
{ $project: { name: 1, enrollments: { $sum: "$enrollments" } } }
```

Find the total enrollment for each CSSE instructor and number of sections taught



```
$project
```

Find the largest total enrollment for a CSSE instructor



```
$group
```

Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment

```
$match
```

```
{ "name" : "Alex", "enrollments" : [ 28, 20 ] }
```

**28+20**



Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

Keep only CSSE instructors



```
{ $match: { department: "CSSE" } }  
  
{ $project: { _id: 0, name: 1, enrollments: 1 } }
```

Remove unnecessary data



```
{ $project: { name: 1, enrollments: { $sum: "$enrollments" } }
```

Find the total enrollment for each CSSE instructor and number of sections taught



Find the largest total enrollment for a CSSE instructor



Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment



```
{ "name" : "Alex", "enrollments" : 48 }  
"Kirsten", "enrollments" : 108 }  
}
```

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

Keep only CSSE instructors



```
{ $match: { department: "CSSE" } }
{ $project: { _id: 0, name: 1, enrollments: 1 } }
}
```

Remove unnecessary data



```
{ $project: { name: 1, enrollments: { $sum: "$enrollments" } } }
```

Find the total enrollment for each CSSE instructor and number of sections taught



```
{ $group: { _id: "1" mEnr: { $max: "$enrollments" } } }
```

Find the largest total enrollment for a CSSE instructor



Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment



```
{ "name": "Alex", "enrollments": 48 }
{ "name": "Kirsten", "enrollments": 108 }
}
```

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

Keep only CSSE instructors



`$match`

```
{ $match: { department: "CSSE" } }
{ $project: { _id: 0, name: 1,
              enrollments: 1 }
}
```

Remove unnecessary data



`$project`

```
{ $project: { name: 1,
              enrollments: { $sum: "$enrollments" }
            }
}
```

Find the total enrollment for each CSSE instructor and number of sections taught



`$project`

```
{ $group: { _id: "1"
            data: { $push: { name: "$name",
                             enr: "$enrollments" } },
            mEnr: { $max: "$enrollments" }
          }
}
```

Find the largest total enrollment for a CSSE instructor



`$group`

Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment

`$match`

```
}
  "nts" : 108
}
```

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

Keep only CSSE instructors



`$match`

```
{ $match: { department: "CSSE" } }
```

```
{ $project: { _id: 0, name: 1, enrollments: 1 } }
```

Remove unnecessary data



`$project`

```
{ $project: { name: 1, enrollments: { $sum: "$enrollments" } }
```

Find the total enrollment for each CSSE instructor and number of sections taught



`$project`

```
{ $group: { _id: "1" data: { $push: { name: "$name", enr: "$enrollments" } }, mEnr: { $max: "$enrollments" } },
```

Find the largest total enrollment for a CSSE instructor



`$group`

```
{ $unwind: "$data" }
```

Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment

`$match`

```
}  
  "enrollments": 108  
}
```

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

Keep only CSSE instructors



```
{ $match: { department: "CSSE" } }
```

Remove unnecessary data



```
{ $project: { _id: 0, name: 1, enrollments: 1 } }
```

Find the total enrollment for each CSSE instructor and number of sections taught



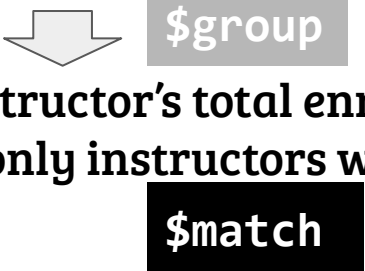
```
{ $project: { name: 1, enrollments: { $sum: "$enrollments" } } }
```

Find the largest total enrollment for each instructor



```
{ $group: { _id: "1" data: { $push: { name: "$name", enr: "$enrollments" } }, mEnr: { $max: "$enrollments" } }, { $unwind: "$data" }
```

Compare each instructor's total enrollment to the largest; keep only instructors with largest enrollment



```
{ $match: { maxEnrollment: "$data.enrollments" } }
```

\$match

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

Keep only CSSE instructors



```
{ $match: { department: "CSSE" } }
```

Remove unnecessary data



```
{ $project: { _id: 0, name: 1, enrollments: 1 } }
```

Find the total enrollment for each CSSE instructor and number of sections taught



```
{ $project: { name: 1, enrollments: { $sum: "$enrollments" } } }
```

Find the largest total enrollment for each instructor



```
{ $group: { _id: "1" data: { $push: { name: "$name", enr: "$enrollments" } }, mEnr: { $max: "$enrollments" } }, { $unwind: "$data" }
```

Compare each instructor's total enrollment; keep only instructors with the largest enrollment



```
{ $match: { maxEnrollment: "$data.enrollments" } }
```

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

Keep only CSSE instructors



`$match`

```
{ $match: { department: "CSSE" } }
```

```
{ $project: { _id: 0, name: 1, enrollments: 1 } }
```

Remove unnecessary data

```
{ $project: { name: 1, enrollments: { $sum: "$enrollments" } } }
```

Find the instructor with the highest enrollment

```
{ $project: { diff: { $subtract: [ "$maxEnrollment", "$data.enrollments" ] } }
```

Find the instructor with the highest enrollment

```
{ $match: { maxEnrollment: "$data.enrollments" } }
```

Compare the largest enrollment

`$match`

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

Keep only CSSE instructors



`$match`

```
{ $match: { department: "CSSE" } }
```

```
{ $project: { _id: 0, name: 1, enrollments: 1 } }
```

Remove unnecessary data

```
{ $project: { name: 1, enrollments: { $sum: "$enrollments" } } }
```

Find the instructor

```
{ $project: { diff: { $subtract: [ "$maxEnrollment", "$data.enrollments" ] }, _id: 0, name: "$data.name", enrollments: "$data.enrollments" } }
{ $match: { maxEnrollment: "$data.enrollments" } }
$match
```

Find the instructor

Compare the largest enrollment

`$match`



Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

Keep only CSSE instructors



`$match`

```
{ $match: { department: "CSSE" } }
```

```
{ $project: { _id: 0, name: 1, enrollments: 1 } }
```

```
{ $project: { name: 1, enrollments: { $sum: "$enrollments" } } }
```

Remove unnecessary data

```
{ $project: { diff: { $subtract: [ "$maxEnrollment", "$data.enrollments" ] }, _id: 0, name: "$data.name", enrollments: "$data.enrollments" } }
```

Find the instructor

Find the instructor

Compare the largest enrollment

`$match`

Q1: Find all CSSE faculty with highest total enrollments, report name, number of sections taught, total enrollment

Keep only CSSE instructors



`$match`

```
{ $match: { department: "CSSE" } }
```

```
{ $project: { _id: 0, name: 1, enrollments: 1 } }
```

```
{ $project: { name: 1, enrollments: { $sum: "$enrollments" } } }
```

Remove unnecessary data

```
{ $project: { diff: { $subtract: [ "$maxEnrollment", "$data.enrollments" ] }, _id: 0, name: "$data.name", enrollments: "$data.enrollments" } }
{ $match: { diff: 0 } }
{ $project: { diff: 0 } }
```

Find the instructor

Find the instructor

Compare the largest enrollment

`$match`

```
db.spring.aggregate (
  {$match: {department:"CSSE"}},
  {$project: {_id:0, name:1, enrollments:1}           //cleaning
  },
  {$project: {name:1,                                //transformation
              enrollments: {$sum: "$enrollments"}}
  },
  {$group: { _id:"1",
             maxEnrollment: {$max: "$enrollments"},
             data: {$push: {name: "$name", enrollments: "$enrollments"}}
           }
  },
  {$unwind: "$data"},
  {$project: {_id:0,
              diff: {$subtract: ["$maxEnrollment", "$data.enrollments"]},
              name: "$data.name",
              enrollments: "$data.enrollments"
            }
  },
  {$match: {diff:0}},
  {$project: {diff:0}}
)
```