

CIOs at UVA

Clown Computing © Est. 2018 L.L.C

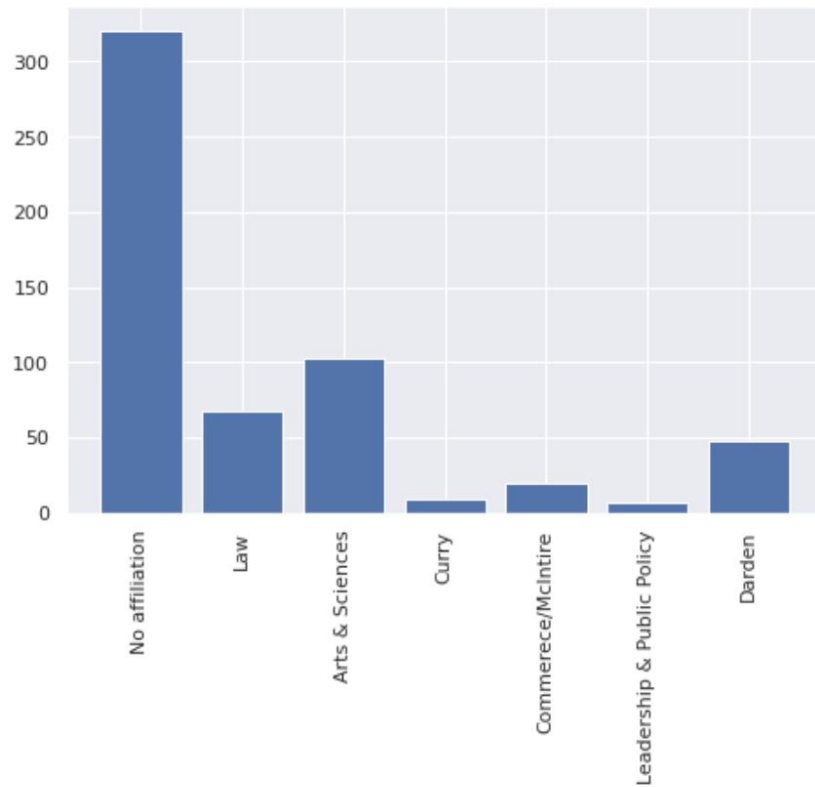
Introduction

Goal: Accurately **measure** and **predict** the engagement levels of UVa students within CIOs based on given student and CIO attributes.

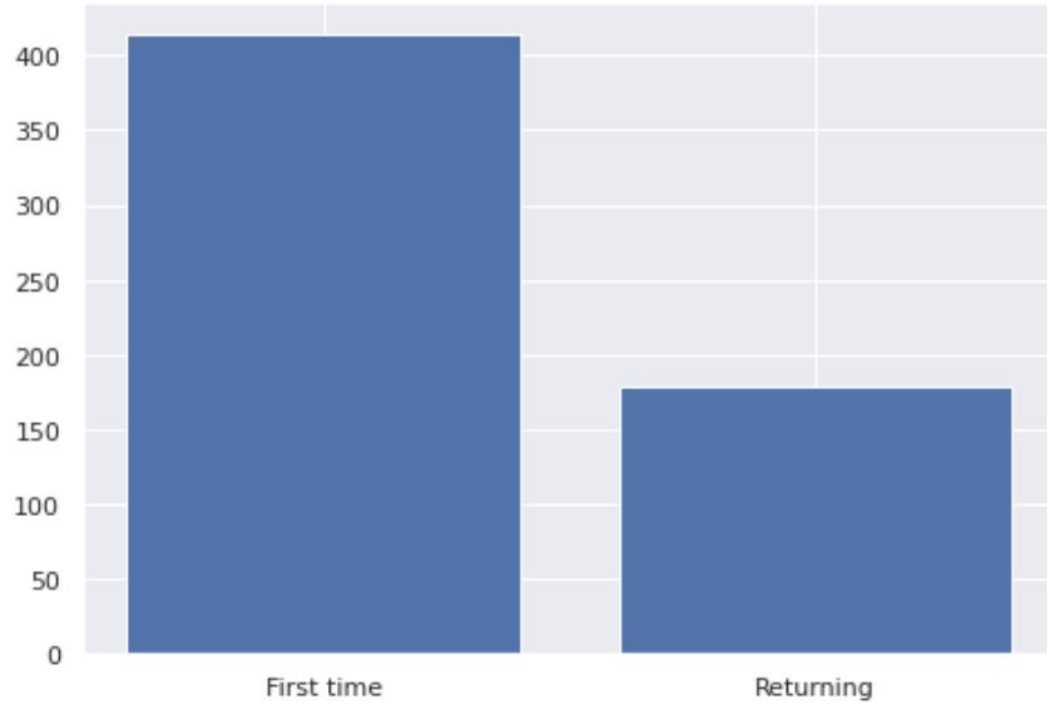
Data: Consisted of 34 columns, and 644 observations



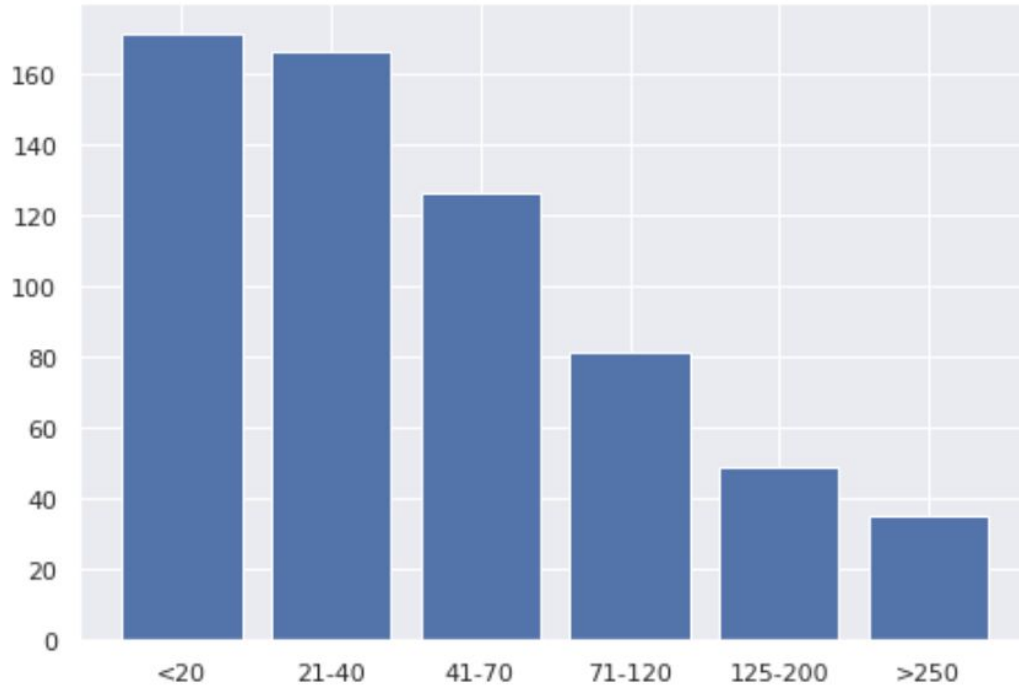
Affiliated School Distribution



First Time President Count



Distribution of Total Members





Cleaning

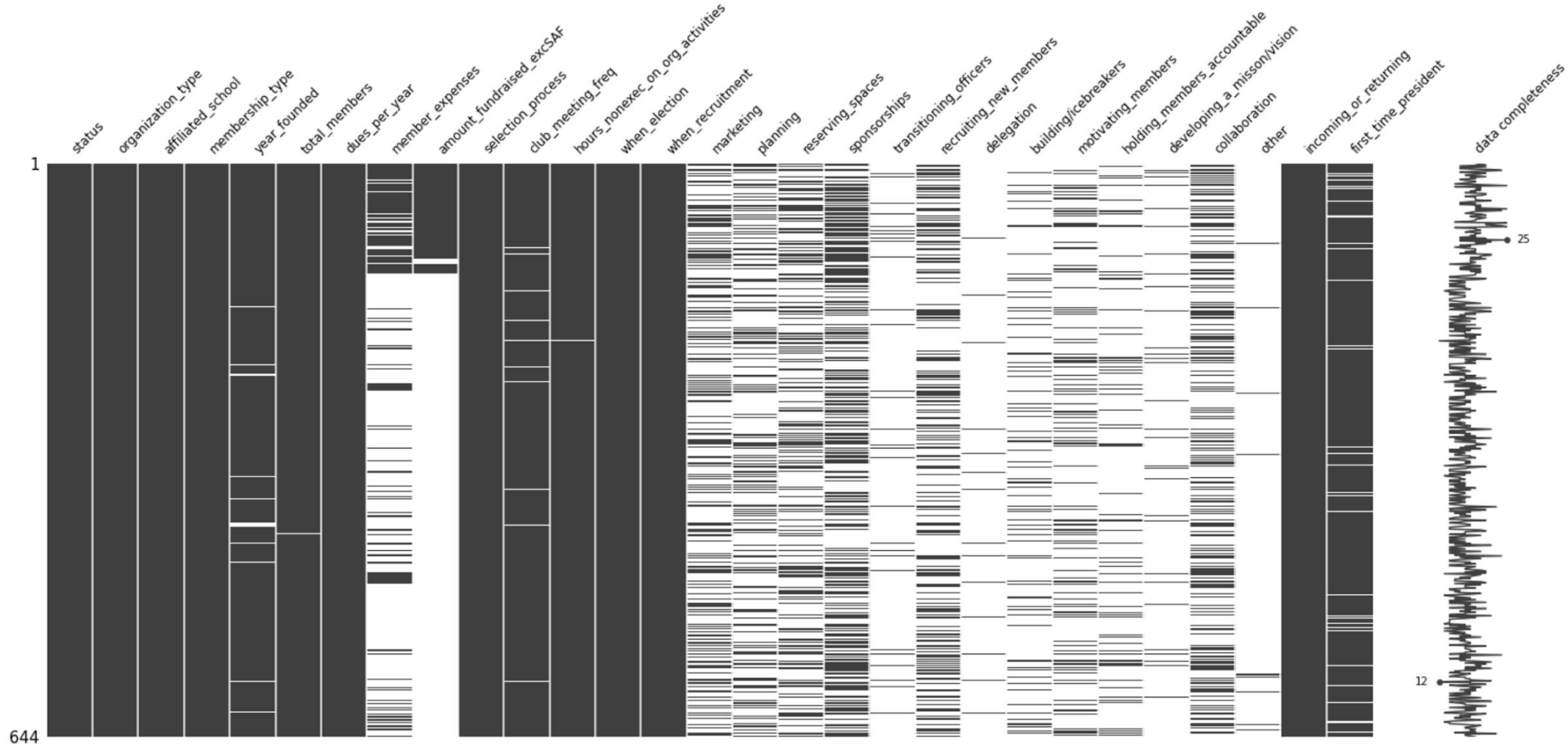
Cleaning

The data was not in a form where we could immediately do analysis

Old Data

	DateCreated	Status	OrganizationType	Name	ShortName	Affiliated School	Membership Type	Approximate year the organization was founded at UVA	Please list 3-5 Primary Events/Programs that your CIO hosts each year. If you do not have annual recurring events, please list some of the events/programs you hosted this past year.	Total number of Members (approximate)	Approximate membership dues per academic year (if zero, please write "zero")
0	4/20/20 17:37	Approved	Contracted Independent Organization	Virginia Homecomings	Homecomings	No affiliated schools	Predominantly Undergraduate Students	1995	#ERROR!	45	ze
1	4/23/20 21:42	Approved	Contracted Independent Organization	Sales and Trading Group at McIntire	STGM	Commerce (McIntire)	Predominantly Undergraduate Students	2010	Presentations from faculty, professionals and ...	60	Ze
2	4/24/20 13:52	Approved	Contracted Independent Organization	SpongeBob Club	NaN	No affiliated schools	Predominantly Undergraduate Students	2016	We have a recurring meeting every other week ...	50	ze
3	4/29/20 21:14	Approved	Contracted Independent Organization	Omega Chi Epsilon	OXE	Engineering	Predominantly Undergraduate Students	2005	1. Tutoring and other academic services2. Prof...	25	3
4	4/18/20 14:33	Approved	Contracted Independent Organization	Alpha Chi Sigma Co-ed Professional Chemistry F...	AXE	Arts and Sciences	Predominantly Undergraduate Students	1922	Hosting speakers for the chemistry department;...	30	\$20

<matplotlib.axes._subplots.AxesSubplot at 0x7f4e43c81d68>



Cleaning

Our aim was to do K-Means on the CIOs since a clear pattern could not be immediately identified in the dataset (if there was one).

- We renamed the columns to shorter names
- We dropped unnecessary columns like DateCreated and Name
- We used try-except routines to change the data that could easily be corrected with code, then exported the edited data frame to a csv and cleaned it more there
- Read the csv back in and prepared it for K-Means



Code Examples for Cleaning

```
#Changing the additional resources columns to dummies
use_ml["marketing"] = pd.get_dummies(use_ml["marketing"])
use_ml["planning"] = pd.get_dummies(use_ml["planning"])
use_ml["reserving_spaces"] = pd.get_dummies(use_ml["reserving_spaces"])
use_ml["sponsorships"] = pd.get_dummies(use_ml["sponsorships"])
use_ml["transitioning_officers"] = pd.get_dummies(use_ml["transitioning_officers"])
use_ml["recruiting_new_members"] = pd.get_dummies(use_ml["recruiting_new_members"])
use_ml["delegation"] = pd.get_dummies(use_ml["delegation"])
use_ml["building/icebreakers"] = pd.get_dummies(use_ml["building/icebreakers"])
use_ml["motivating_members"] = pd.get_dummies(use_ml["motivating_members"])
use_ml["holding_members_accountable"] = pd.get_dummies(use_ml["holding_members_accountable"])
use_ml["developing_a_mission/vision"] = pd.get_dummies(use_ml["developing_a_mission/vision"])
use_ml["collaboration"] = pd.get_dummies(use_ml["collaboration"])
use_ml["other"] = pd.get_dummies(use_ml["other"])
```

```
for i in use_ml["hours_nonexec_on_org_activities"]:
    try:
        use_ml["hours_nonexec_on_org_activities"].replace(i, int(i), inplace=True)
    except:
        try:
            updated = ""
            if i[2:5] in months:
                lower = months[i[2:5]]
                higher = i.strip(i[1:5])
                use_ml["hours_nonexec_on_org_activities"].replace(i, (int(lower) + int(higher)) / 2, inplace=True)
            elif i[3:6] in months:
                lower = months[i[3:6]]
                higher = i.strip(i[2:6])
                use_ml["hours_nonexec_on_org_activities"].replace(i, (int(lower) + int(higher)) / 2, inplace=True)
            else:
                try:
                    if i.lower() in change:
                        use_ml["hours_nonexec_on_org_activities"].replace(i, 0, inplace=True)
                    else:
                        print(i)
                except:
                    if str(i).lower() == "nan":
                        use_ml["hours_nonexec_on_org_activities"].replace(i, 0, inplace=True)
                    else:
                        print(i)
        except:
            print(i)
```

Cleaning

The cleaned dataset

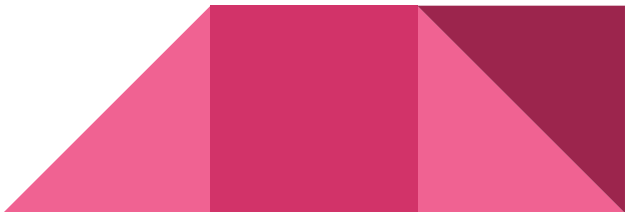
	organization_type	affiliated_school	membership_type	total_members	dues_per_year	member_expenses	amount_fundraised_excSAF	selection_process	club_meeting_freq	hours_n
0	Contracted Independent Organization	No affiliated schools	Predominantly Undergraduate Students	45.0	0	0	0	Neither	Weekly	
1	Contracted Independent Organization	Commerce (McIntire)	Predominantly Undergraduate Students	60.0	0	0	0	Neither	Weekly	
2	Contracted Independent Organization	No affiliated schools	Predominantly Undergraduate Students	50.0	0	0	0	Neither	Weekly	
3	Contracted Independent Organization	Engineering	Predominantly Undergraduate Students	25.0	30	0	0	Neither	Once or twice a semester	
4	Contracted Independent Organization	Arts and Sciences	Predominantly Undergraduate Students	30.0	200	0	0	Application	Weekly	
5	Contracted Independent Organization	No affiliated schools	Both Undergraduate and Graduate Students	80.0	6100	0	0	Neither	Weekly	
6	CIO - Law	Law	Predominantly Graduate Students	200.0	10	0	0	Neither	Monthly	

Clustering

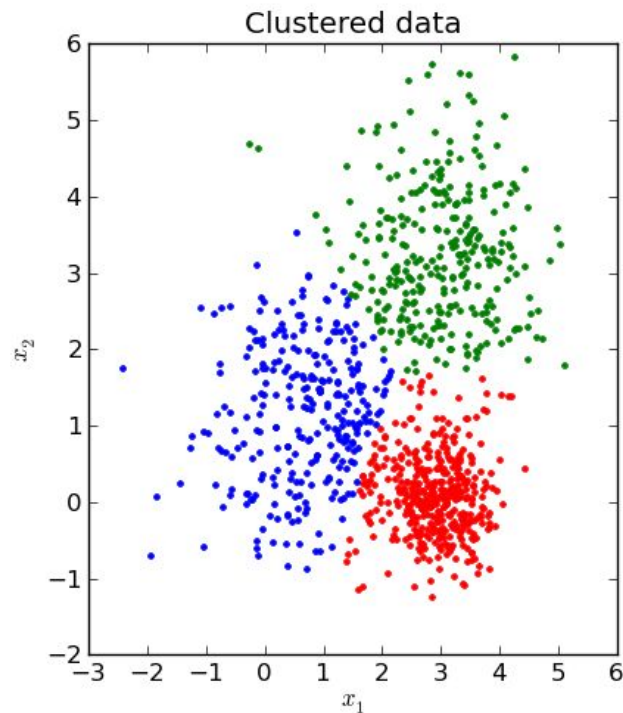
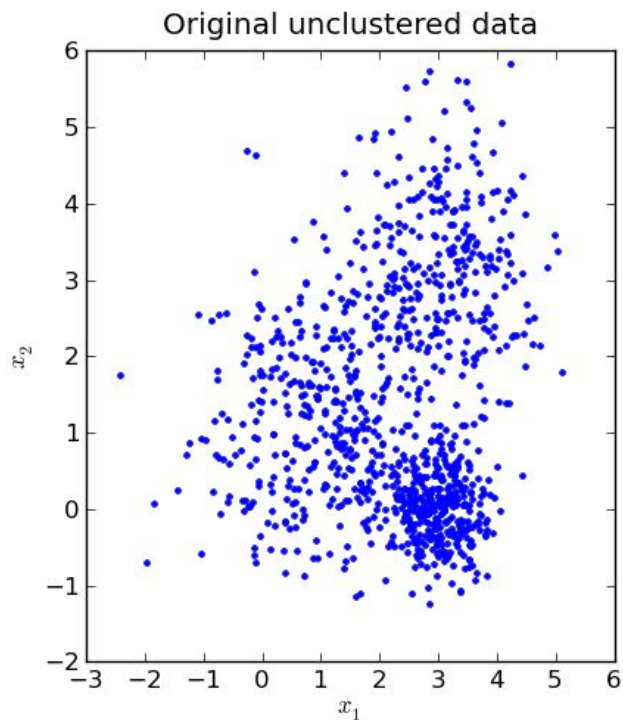
We aimed to find any kind of similarity between the CIOs by using K-Means to group the CIOs into four clusters.

The columns we ended up using for K-Means were

```
total_names = ["name", "organization_type", "affiliated_school", "membership_type", "total_members", "dues_per_year",  
               "member_expenses", "amount_fundraised_excSAF", "selection_process", "club_meeting_freq", "hours_nonexec_on_org_activities",  
               "when_election", "when_recruitment", "marketing", "planning", "reserving_spaces", "sponsorships", "transitioning_officers",  
               "recruiting_new_members", "delegation", "building/icebreakers", "motivating_members", "holding_members_accountable",  
               "developing_a_mission/vision", "collaboration", "other", "incoming_or_returning", "first_time_president"]
```



What is K-Means

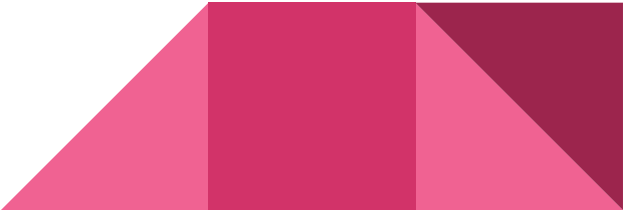
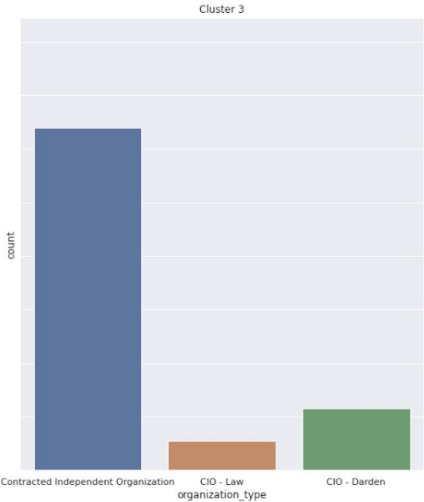
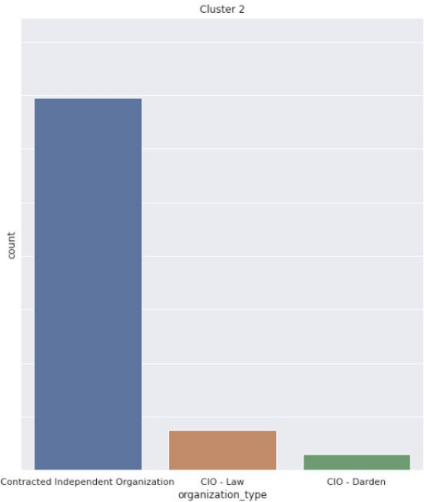
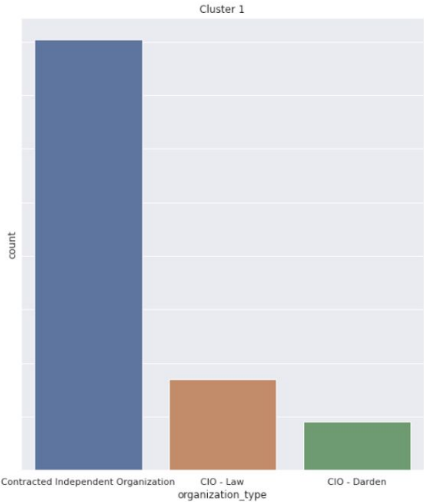
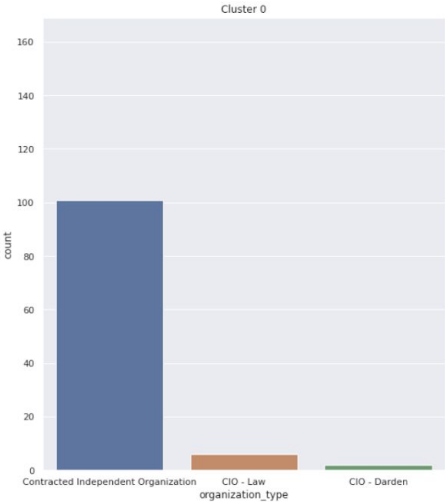




Visualizations

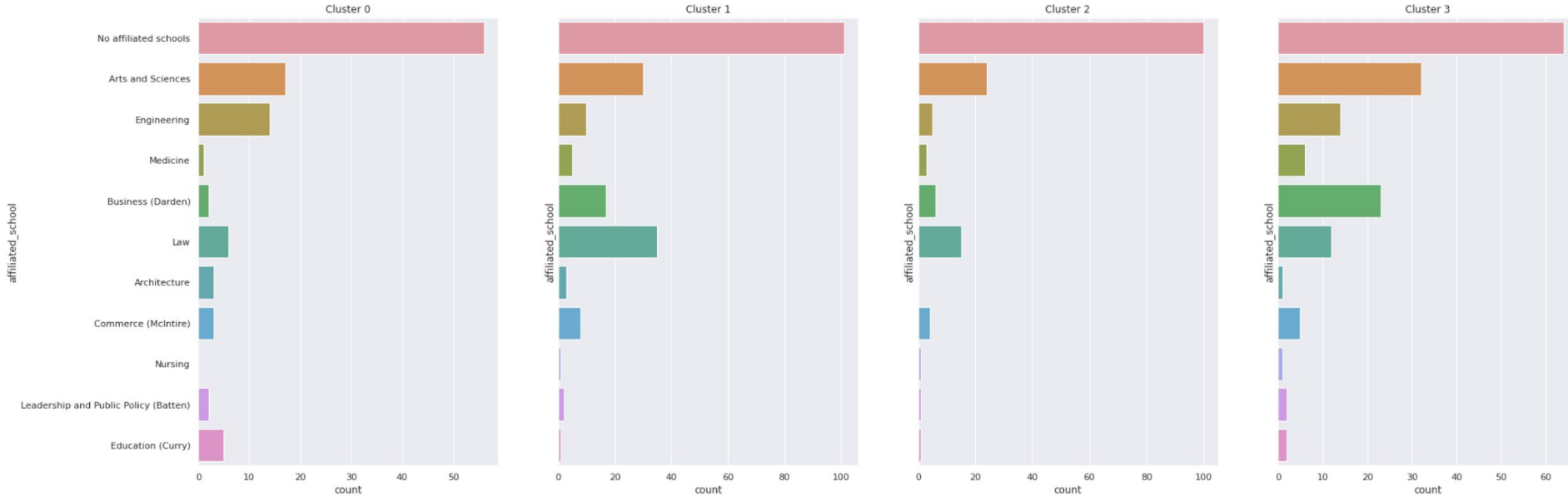
Organization Type

Comparisons



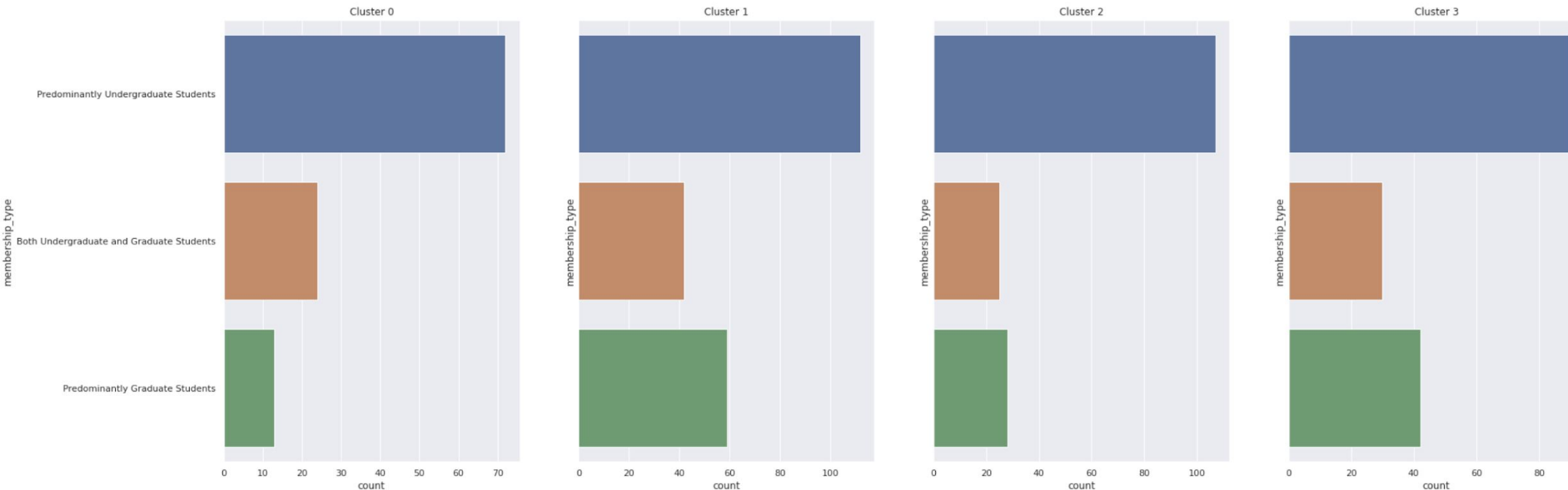
Affiliated School

Comparisons



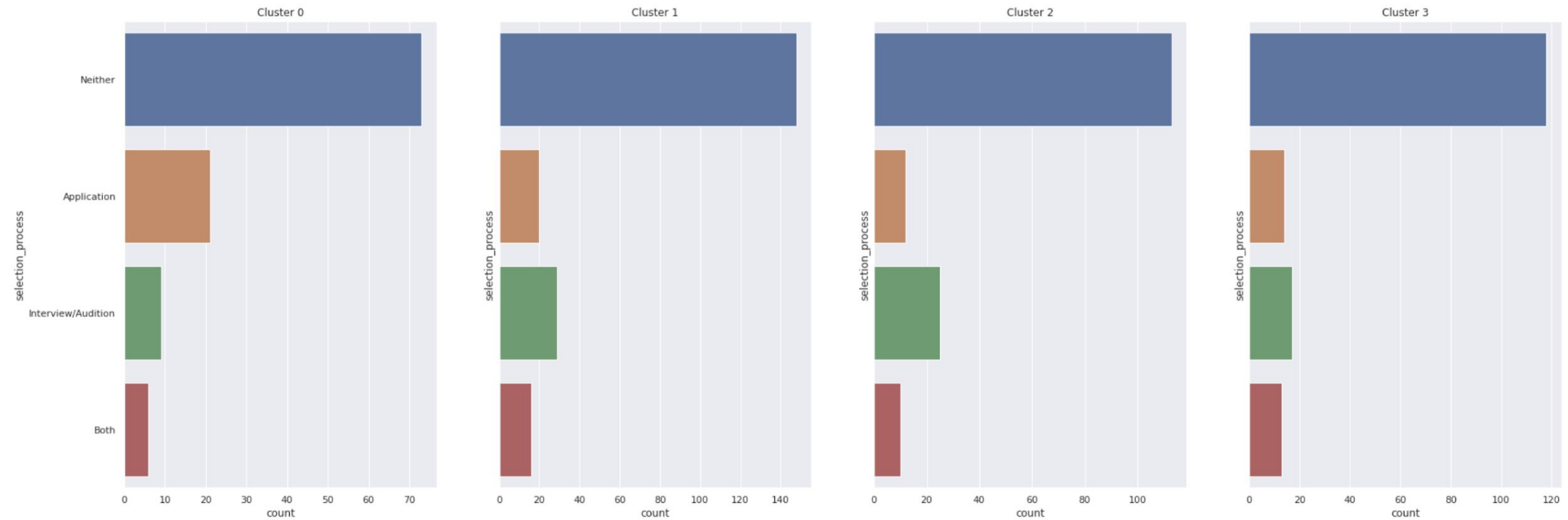
Membership Type

Comparisons



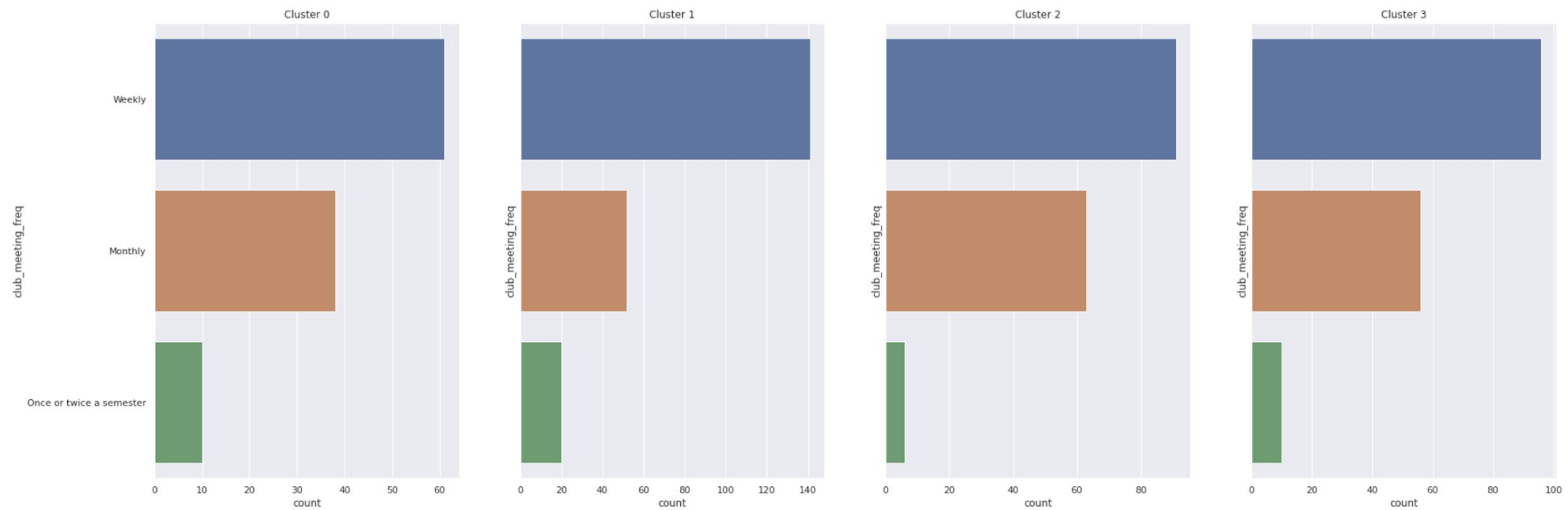
Selection Process

Comparisons



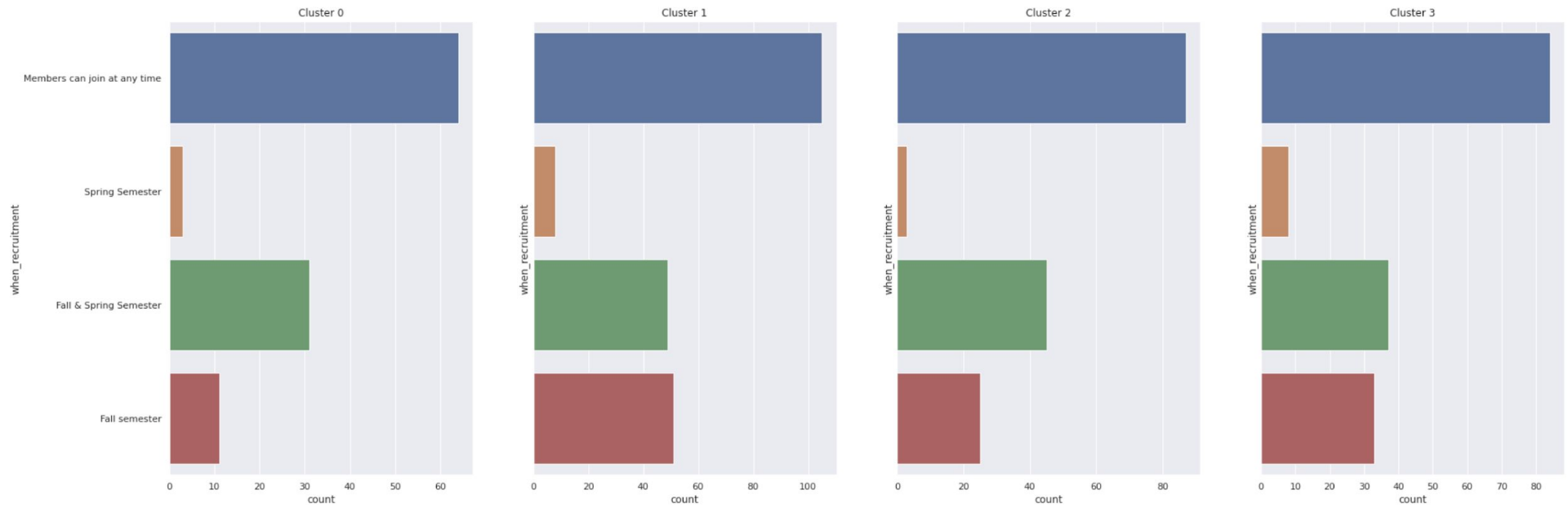
Club Meeting Frequency

Comparisons



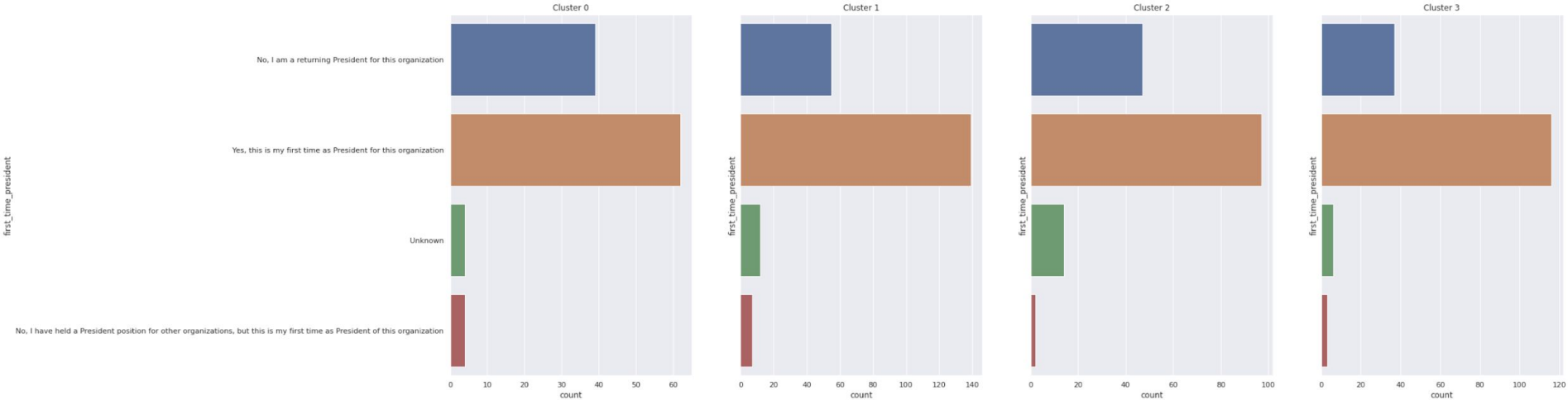
Recruitment start date

Comparisons



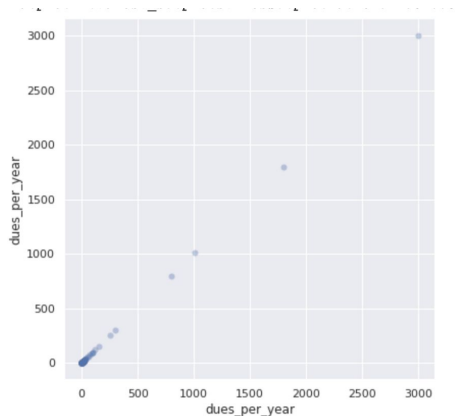
First Time President?

Comparisons



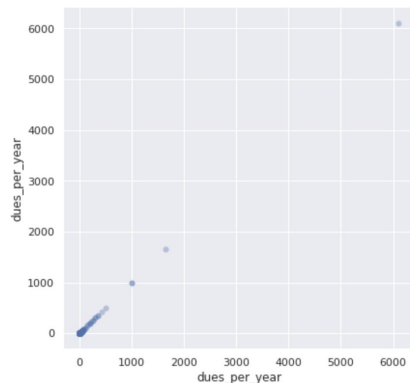
Dues Per Year

```
count    109.000000
mean      78.376147
std       353.196273
min        0.000000
25%        0.000000
50%        0.000000
75%       20.000000
max      3000.000000
Name: dues_per_year, dtype: float64
```



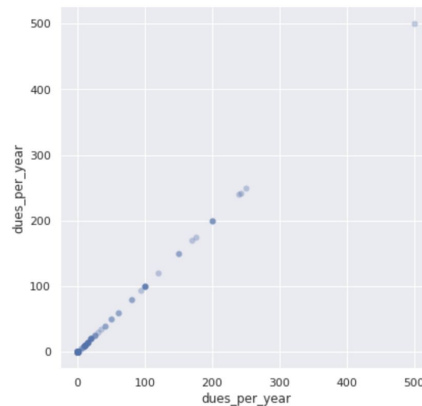
Cluster 0

```
count    213.000000
mean      73.154930
std       445.479347
min        0.000000
25%        0.000000
50%        0.000000
75%       20.000000
max      6100.000000
```



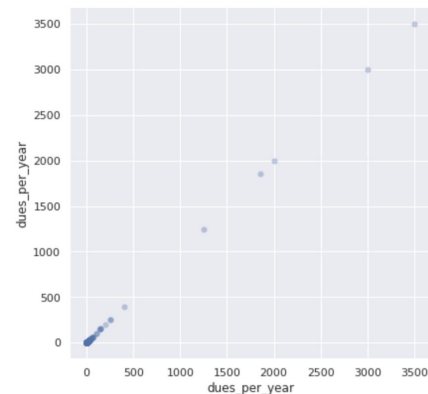
Cluster 1

```
count    160.000000
mean      26.187500
std       64.162254
min        0.000000
25%        0.000000
50%        0.000000
75%       15.000000
max       500.000000
```



Cluster 2

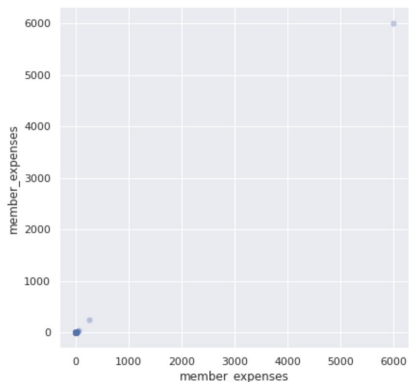
```
count    162.000000
mean      91.018519
std       427.367043
min        0.000000
25%        0.000000
50%        0.000000
75%       20.000000
max      3500.000000
```



Cluster 3

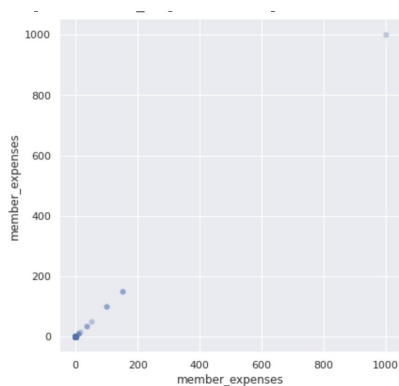
Member Expenses

count	109.000000
mean	58.715596
std	574.869310
min	0.000000
25%	0.000000
50%	0.000000
75%	0.000000
max	6000.000000



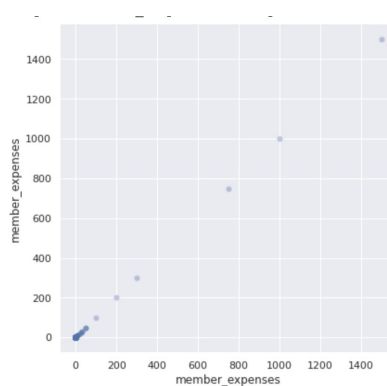
Cluster 0

count	213.000000
mean	7.816901
std	70.625903
min	0.000000
25%	0.000000
50%	0.000000
75%	0.000000
max	1000.000000



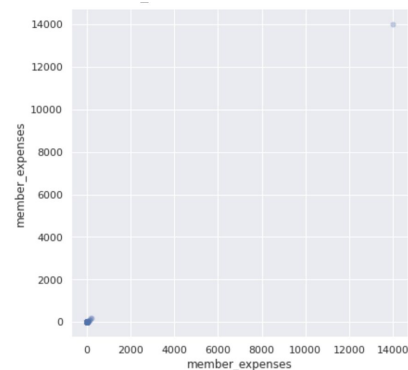
Cluster 1

count	160.000000
mean	26.406250
std	155.672786
min	0.000000
25%	0.000000
50%	0.000000
75%	0.000000
max	1500.000000



Cluster 2

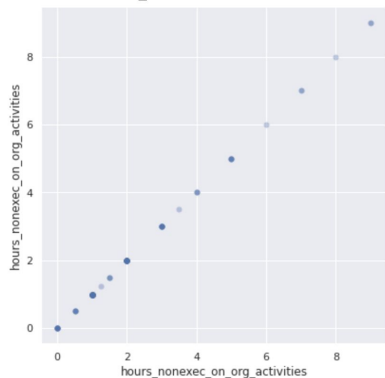
count	162.000000
mean	91.567901
std	1099.798422
min	0.000000
25%	0.000000
50%	0.000000
75%	0.000000
max	14000.000000



Cluster 3

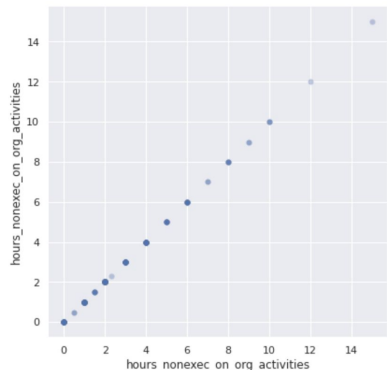
Hours on Non-Executive Organization Activities

count	109.000000
mean	1.942661
std	1.821818
min	0.000000
25%	1.000000
50%	1.000000
75%	2.000000
max	9.000000



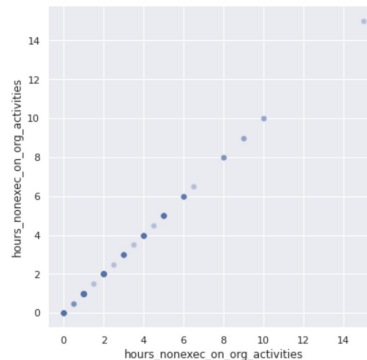
Cluster 0

count	213.000000
mean	2.541396
std	2.405446
min	0.000000
25%	1.000000
50%	2.000000
75%	3.000000
max	15.000000



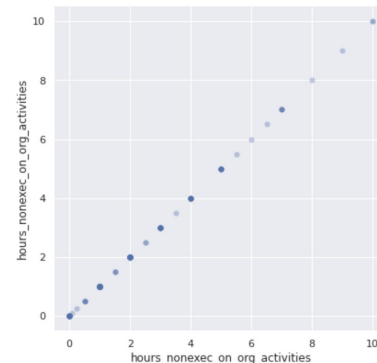
Cluster 1

count	160.000000
mean	2.481250
std	2.357837
min	0.000000
25%	1.000000
50%	2.000000
75%	4.000000
max	15.000000



Cluster 2

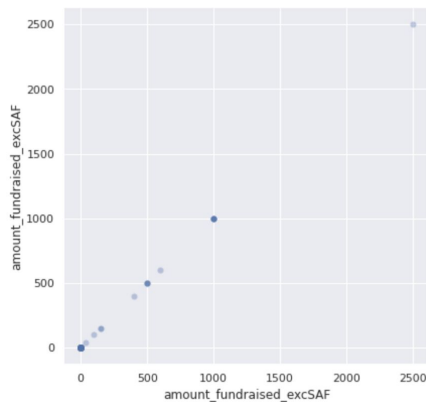
count	162.000000
mean	2.113272
std	1.997816
min	0.000000
25%	1.000000
50%	1.500000
75%	3.000000
max	10.000000



Cluster 3

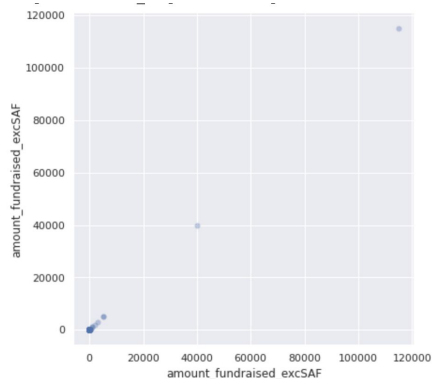
Amount Fundraised Except from SAF

count	109.000000
mean	109.541284
std	340.460977
min	0.000000
25%	0.000000
50%	0.000000
75%	0.000000
max	2500.000000



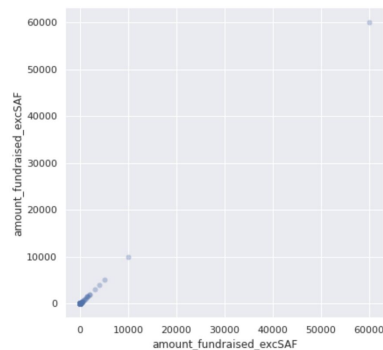
Cluster 0

count	213.000000
mean	814.464789
std	8341.080536
min	0.000000
25%	0.000000
50%	0.000000
75%	0.000000
max	115000.000000



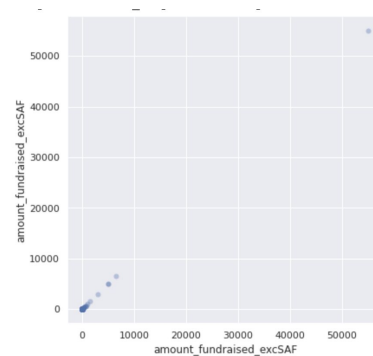
Cluster 1

count	160.000000
mean	615.800000
std	4830.087276
min	0.000000
25%	0.000000
50%	0.000000
75%	0.000000
max	60000.000000



Cluster 2

count	162.000000
mean	500.987654
std	4381.502934
min	0.000000
25%	0.000000
50%	0.000000
75%	0.000000
max	55000.000000



Cluster 3

Average Total Membership in Clubs for Each Cluster

Total Members in Clubs: 50363

Average Total Members Cluster 0: 75.46976777522936

Average Total Members Cluster 1: 93.08173415492958

Average Total Members Cluster 2: 50.757529296875

Average Total Members Cluster 3: 87.5925925925926





Insights

How many clubs are students involved with on average?

Student Population: Fall 2020

Undergraduate	Graduate	Total
17,314	8,328	25,642

	#Clubs
Total Predominantly Graduate Student Clubs Membership: 13,106	142
Total Predominantly Undergraduate Student Clubs Membership: 28,317	381
Total Both Undergrad and Grad Student Clubs Membership: 8,940	121

Grad Student Clubs = $13106 / 8328 = 1.57$ **clubs per grad student**

Undergrad Student Clubs = $28317 / 17314 = 1.64$ **clubs per undergrad student**

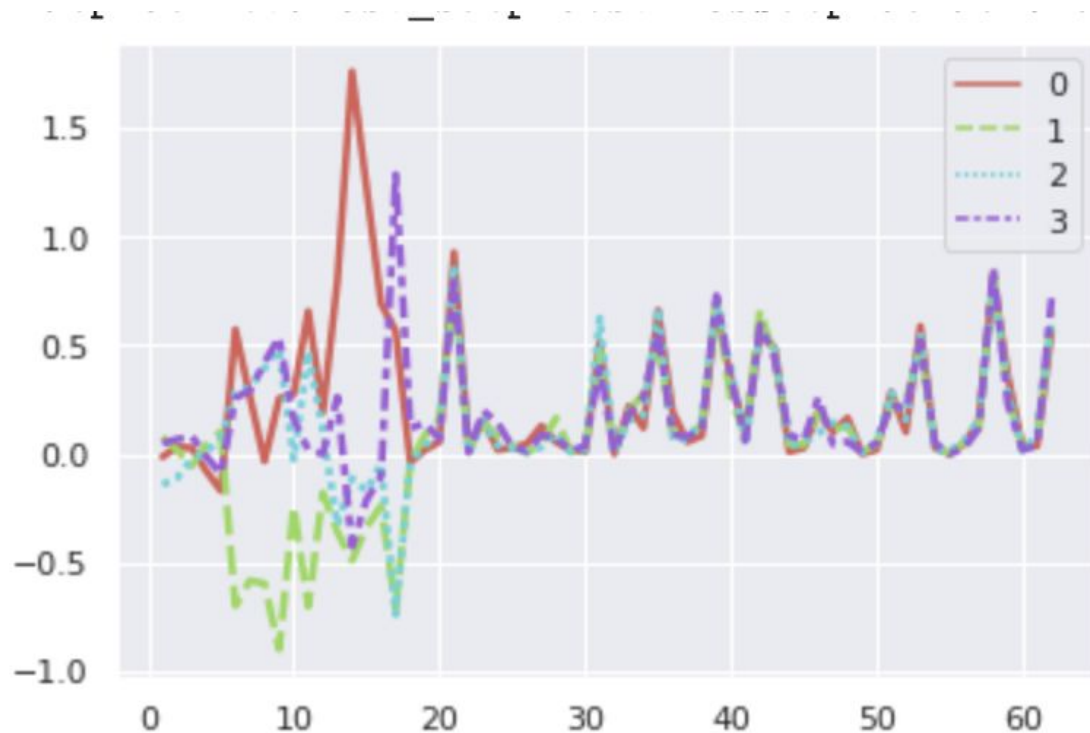
Assuming $\frac{2}{3}$ undergrad, $\frac{1}{3}$ grad makeup:

Grad Student Clubs = $(13106 + (\frac{1}{3} * 8940)) / 8328 = 1.93$ **clubs per grad student**

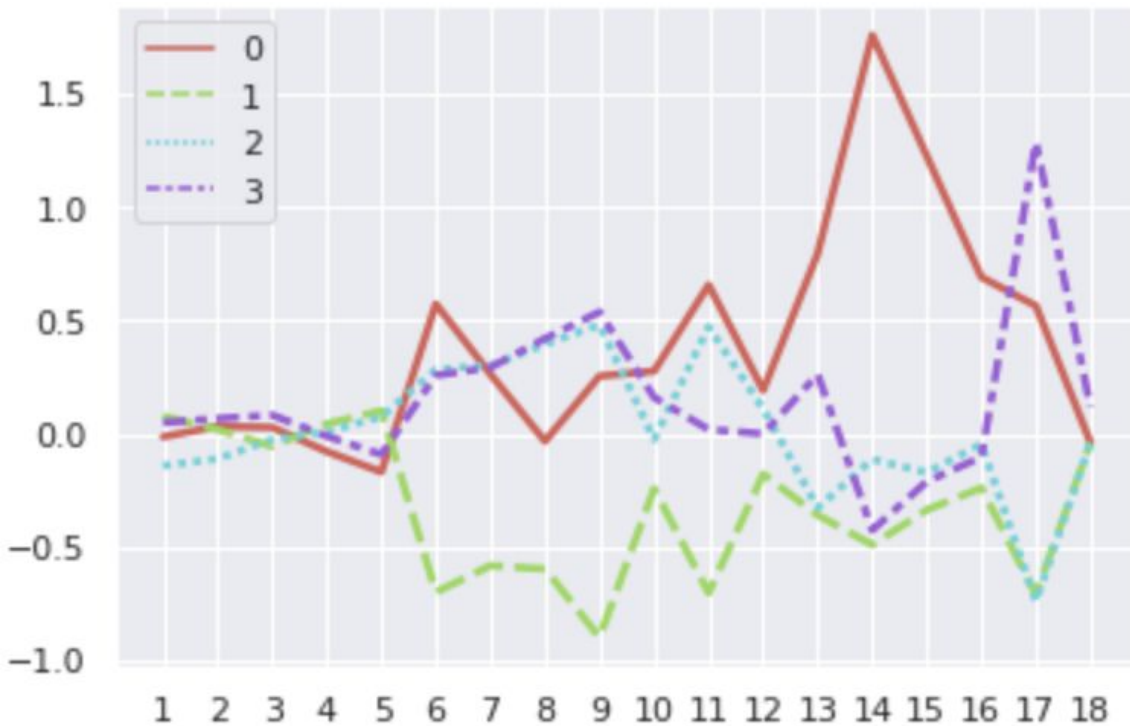
Undergrad Student Clubs = $(13106 + (\frac{2}{3} * 8940)) / 8328 = 1.98$ **clubs per undergrad student**

Overall Participation: **1.96 clubs per student**

Each Cluster's Normalized Mean For Each Feature



Organization Type: 19-21
Affiliated School: 22-32
Membership Type: 33-35
Selection Process: 36-39
Club Meeting Frequency: 40-42
When's the Election: 43-52
When's Recruiting: 53-56
Incoming or Returning Pres: 57-59
First-Time President: 60-62



```
{1: 'total_members',  
2: 'dues_per_year',  
3: 'member_expenses',  
4: 'amount_fundraised_excSAF',  
5: 'hours_nonexec_on_org_activities',  
6: 'marketing',  
7: 'planning',  
8: 'reserving_spaces',  
9: 'sponsorships',  
10: 'transitioning_officers',  
11: 'recruiting_new_members',  
12: 'delegation',  
13: 'building/icebreakers',  
14: 'motivating_members',  
15: 'holding_members_accountable',  
16: 'developing_a_mission/vision',  
17: 'collaboration',  
18: 'other'}
```

name	University
The Machine Learning Club at the University of...	Peer Advising Link
qMD	International Relations Organization at the Un...
Arts Grounds Guides	Chapter of the National Organization of Minori...
Greens to Grounds	Catholic Hoos at the University of Virginia
The Student Chapter of the American Chemical S...	Mind&Body at UVA
The Roosevelt Society	Virginia Journal of Law & Technology
Omicron Delta Kappa	Rise Together
Photography Club at UVA	The Monroe Society at UVA
My Sister's Keeper	Parkour Association
Doctors Without Borders at UVA	LabShorts

Omega Chi Epsilon	Outdoors Club at Darden
Washington Literary Society and Debating Union	Consulting Club at Darden
Virginia Law and Business Society at The Unive...	The University Fellowship at St. Paul's
Health Law Association at UVA	Law Christian Fellowship
College Diabetes Network at the University of ...	Amuse Bouche
undocUVA	Dream Corps International
Virginia Case Club	League of Legends at UVA
Virginia Law Democrats	The Wesley Foundation at UVA
University Democrats at UVA	Unsung People
The Lebanese Club at the University of Virgini...	Society for the Promotion of Indian Classical ...

Virginia Homecomings	Lutheran Campus Ministry
Sales and Trading Group at McIntire	Pulsar Observation Group at UVA
Afro-Latinx Student Organization	Shakespeare On the Lawn
Student Organization for Caribbean Awareness	The Fralin Student Docents at the University o...
180 Degrees Consulting at UVA	Fill The Hill
Men's Water Polo Club at the University of Vir...	Latter-day Saint Student Association
Student Virginia Education Association	Virginia Interfaith Coalition
Circle K International	Mock Trial at UVA Law
Japan Club	Smash At UVA
College Science Scholars Council	Chinese Christian Student Fellowship at UVA

SpongeBob Club	Astronomy Club at the University of Virginia
Alpha Chi Sigma Co-ed Professional Chemistry F...	Historical Simulation Society
Gizmologists	Latinx Leadership Coalition
Spikeball Club at the University of Virginia (...)	INCOSE at the University of Virginia
Shotokan Karate Club at The University of Virg...	Collegiate 100 Society of Virginia
One for the World at UVA	Young Americans for Freedom at UVA
Pakistani Students' Association	Virginia South Asian Law Students Association
Changing Health Attitudes & Actions to Recreat...	Muslim Students Association
Aerial Dance Club at UVA	National Society of Black Engineers at UVA
National Association for the Advancement of Co...	Virginia Motorsports

Cluster 0

name	
The Machine Learning Club at the University of...	University Peer Advising Link
qMD	International Relations Organization at the Un...
Arts Grounds Guides	Chapter of the National Organization of Minori...
Greens to Grounds	Catholic Hoos at the University of Virginia
The Student Chapter of the American Chemical S...	Mind&Body at UVA
The Roosevelt Society	Virginia Journal of Law & Technology
Omicron Delta Kappa	Rise Together
Photography Club at UVA	The Monroe Society at UVA
My Sister's Keeper	Parkour Association
Doctors Without Borders at UVA	LabShorts

Highest Features

- Motivating members
- Holding members accountable
- Developing mission/vision
- Recruiting new members
- Marketing



Cluster 1

Omega Chi Epsilon	Outdoors Club at Darden
Washington Literary Society and Debating Union	Consulting Club at Darden
Virginia Law and Business Society at The Unive...	The University Fellowship at St. Paul's
Health Law Association at UVA	Law Christian Fellowship
College Diabetes Network at the University of ...	Amuse Bouche
undocUVA	Dream Corps International
Virginia Case Club	League of Legends at UVA
Virginia Law Democrats	The Wesley Foundation at UVA
University Democrats at UVA	Unsung People
The Lebanese Club at the University of Virgini...	Society for the Promotion of Indian Classical ...

Highest Feature:

- Either well-off or inactive



Cluster 2

Virginia Homecomings	Lutheran Campus Ministry
Sales and Trading Group at McIntire	Pulsar Observation Group at UVA
Afro-Latinx Student Organization	Shakespeare On the Lawn
Student Organization for Caribbean Awareness	The Fralin Student Docents at the University o...
180 Degrees Consulting at UVA	Fill The Hill
Men's Water Polo Club at the University of Vir...	Latter-day Saint Student Association
Student Virginia Education Association	Virginia Interfaith Coalition
Circle K International	Mock Trial at UVA Law
Japan Club	Smash At UVa
College Science Scholars Council	Chinese Christian Student Fellowship at UVA

Highest Feature:

- Recruiting Members

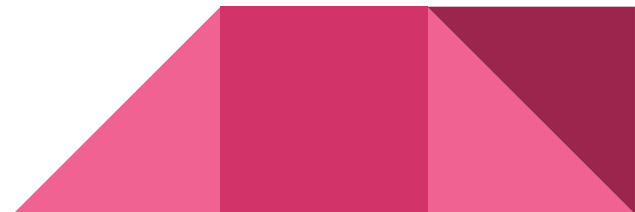


Cluster 3

SpongeBob Club	Astronomy Club at the University of Virginia
Alpha Chi Sigma Co-ed Professional Chemistry F...	Historical Simulation Society
Gizmologists	Latinx Leadership Coalition
Spikeball Club at the University of Virginia (...)	INCOSE at the University of Virginia
Shotokan Karate Club at The University of Virg...	Collegiate 100 Society of Virginia
One for the World at UVA	Young Americans for Freedom at UVA
Pakistani Students' Association	Virginia South Asian Law Students Association
Changing Health Attitudes & Actions to Recreat...	Muslim Students Association
Aerial Dance Club at UVA	National Society of Black Engineers at UVA
National Association for the Advancement of Co...	Virginia Motorsports

Highest Features:

- Collaboration
- building/icebreakers
- Sponsorships



Cluster 0:

- Motivating members
- Holding members accountable
- Developing mission/vision
- Recruiting new members
- Marketing

Cluster 2:

- Recruiting Members

Cluster 1:

- Either well-off or inactive

Cluster 3:

- Collaboration
- building/icebreakers
- Sponsorships

Clubs in Cluster 0 seem to want to grow and maintain members.

Clubs in Cluster 2 seem established, but want to grow.

Clubs in Cluster 3 seem to want additional resources on team-building activities. These clubs could be looking to engage members of their club. This could also mean that these clubs want to place more emphasis on inclusion.





Thank You!