# **Co-Curricular Technology Pathways E-Advisor**

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## Introduction

#### Problem

 Students at Duke University have an overwhelming amount of co-curricular opportunities, so it can be difficult for students to determine which activities or resources align best with their interests



### Solution

 Work with Duke O.I.T. to develop an "e-advisor" that recommends students a list of co-curricular programs based on their previous involvement

## **Data Collection**

#### **Ideal Data**

- Descriptions and characteristics of each co-curricular
- Students' co-curricular "pathways"
  - A record of programs, clubs, and resources that students utilize in throughout their Duke career

### Tag Words

- Created 55 tag words by reading the description of technology-related co-curriculars
- Web-scraped Duke Groups using these tag words to find relevant co-curricular activities
  - Used this data to determine which programs were associated with certain tags

### **Student Data**

- Unable to obtain data directly from organizations, so instead collected data from willing Data+ participants
- Intend to collect more student participation data using our R Shiny website (see slide 3)

## **Our Recommendation Algorithm**

- ◆ **Objective** → to provide *useful* and *personalized* recommendations to Duke undergraduate students
  - > Useful recommendations would be co-curriculars that are similar to ones the user has already participated in
  - Personalized recommendations would be co-curriculars that students similar to the user have participated in
  - Combined content-based (75%) and collaborative (25%) filtering to create a hybrid recommendation algorithm
    - As more students contribute to our data set, we intend to weigh collaborative filtering more heavily

## **Content-Based Filtering**

 Uses tag words to find programs similar to the user's co-curriculars

	Tag #1	Tag #2	Tag #3	Tag #4
Program #1	1	0	0	1
Program #2	1	1	1	0
Program #3	1	0	0	0
Program #4	0	0	1	1
Program #5	0	1	0	1

- Performs TF-IDF calculations on binary matrix of tag words and programs
  - Gives less weight to programs that have many tag words
  - Gives less weight to tag words that are applied more frequently to many different programs
- Ranks the activities from most recommended to least recommended, excluding activities in which the user has already participated

## Collaborative Filtering

 Uses student data to compare the user's co-curriculars to other students' participation

	Student #1	Student #2	Student #3	Student #4
Program #1	0	1	1	0
Program #2	1	1	0	0
Program #3	0	1	0	0
Program #4	0	0	1	0
Program #5	1	1	1	1

 Calculates programs' cosine similarities based on student data to compare them "

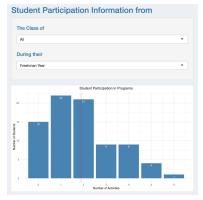
$$similarity = \cos(\theta) = \frac{A \cdot B}{\|A\| \|B\|} = \frac{\sum_{i=1}^{n} A_i B_i}{\sqrt{\sum_{i=1}^{n} A_i^2} \sqrt{\sum_{i=1}^{n} B_i^2}}$$

- Uses similarity scores and student participation history to determine an overall score for each student and program combination
- Ranks activities by their overall score, excluding activities in which the student has already participated

## **R** Shiny Web Application

Please select up to 3 majors. If you are unsure, simply select "Undeclared".
*Major(s)
Statistical Science
Computer Science
Please type the year in which you will graduate from Duke.
*Graduation Year
2019 💌
$\frown$
Submit

\*Requires Duke Login and Co-Lab OAuth User Profile: Stores the user information associated with the Duke account



**Statistics:** Displays the average number of co-curriculars for each grade and class year

#### Co-Curricular Recommender



**Recommend:** Retrieves the user information and gives recommendations

Class		Major	
Al	•	Computer Science	-
Show 10 \$ entries Search:	Show 10 * entries Search:	antries Search:	
Activity 0	Frequency 0	Activity 0	Frequenc
Data+	53	Data+	
Bass Connections	27	HackDuke	
DataFest	13	Duke Machine Learning	
HackDuke	11	Bass Connections	
Duke Engage	10	DataFest	
Duke Machine Learning	10	Duke Splash	
Duke Splash	10	Institute of Electrical and Electronics Engineers -	
Duke Undergraduate Research Society	7	Duke Student Branch (IEEE)	
Females Excelling More in Math, Engineering, and	7	Blueprint	
		Females Excelling More in Math, Engineering, and Science (FEMMES)	
Science (FEMMES)			

Statistics: Lists the most popular co-curriculars by major and class year

#### Try the app with your Duke account here!

## Future Work

- Improve our recommendation algorithm
  - Ask organizations to self-select tags
  - Collect data from students through the website
- Incorporate student "pathways" in the system
- Implement a rating system for recommendations
- Add more co-curriculars, including non-tech activities, to our database



## **Contact Us**

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