

A dark red L-shaped line, consisting of a horizontal segment at the top and a vertical segment on the left, framing the top-left corner of the title area.

Artificial Intelligence: Project 1

Context Aware Intelligent Tour Guide

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A dark red L-shaped line, consisting of a vertical segment on the right and a horizontal segment at the bottom, framing the bottom-right corner of the author list area.

Problem statement

- Lafayette College wants to upgrade their college tour procedure.
- Recommender system incorporates visitors academic, cultural and athletic interests
- Must address all use cases to provide users with relevant, personalized output itineraries.



Input

- Personal Information
- Academic, athletic and extracurricular interests
 - Selected from pool of predefined tags
- Tour interests
 - Class, club, professor, information session
- Tour details
 - Start time and location, end time, time flexibility
- Use buildings that were assigned to classes of a certain major to guess tags

Create your tour

Personal Information

Interests

Math Computer Science Dining English Biology Mechanical Engineering Physics Baseball Student Life

Tour Interests

☐ Attending a class or club ☐ Meeting with a professor ☐ Eating at a dining hall ☐ Visiting a dorm

Tour Details

I will be visiting on 09/06/2017

From 10am to 1pm

Groups as an average visitor

The algorithm does not differentiate between individuals and groups, however it is possible to simulate groups on the implementation side by

1. Averaging the interest tags over the group members by tag frequency
2. Forcing the same start and end time as well as start location of the tour when “visit as a group” is chosen

The algorithm will however ask for number of visitors per session to respect building capacity.

Dining English Biology

Mechanical Engineering Physics

Baseball Student Life

Tour Interests

☐ Attending a class or club

☐ Meeting with a professor

☐ Eating at a dining hall

☐ Visiting a dorm

Tour Details

I will be visiting on 09/06/2017

From 10am to 1pm

I am visiting with

+ Thanh Vu

+ Aggie Benichou

+ add more...

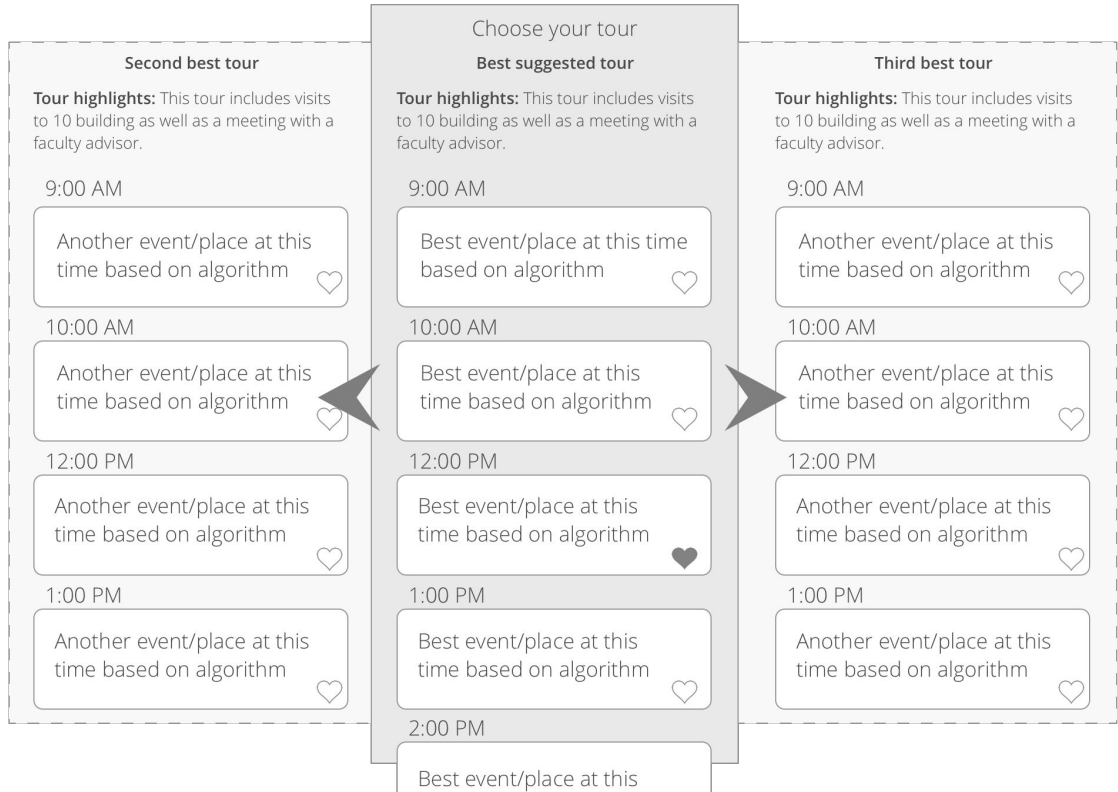
Knowledge

- Building/landmark/event
 - Name, use, location, capacity
 - Time schedule
 - Baseline time spent
 - Distance between buildings
- Expected weather
- User input



Output

- A list of itineraries:
 - Highlighted features
 - List of places/events
 - Reasons/Uses
 - Visual instructions
- Implicit feedback loop



Assumptions

- Tours will be generated as if for a single user
- User knows physical location of buildings
- Users walk approximately at the same speed
- User will be at stated location at stated time
- User spends expected time at each location



Constraints



- Starting location will be a node/location specified by user, must be known to system
- End location must be the same as the start location.
- At least one itinerary must be produced for all inputs
- Time span defined in the student's input will loosely constrain the length of the tour.
- Some buildings have restrictive access.

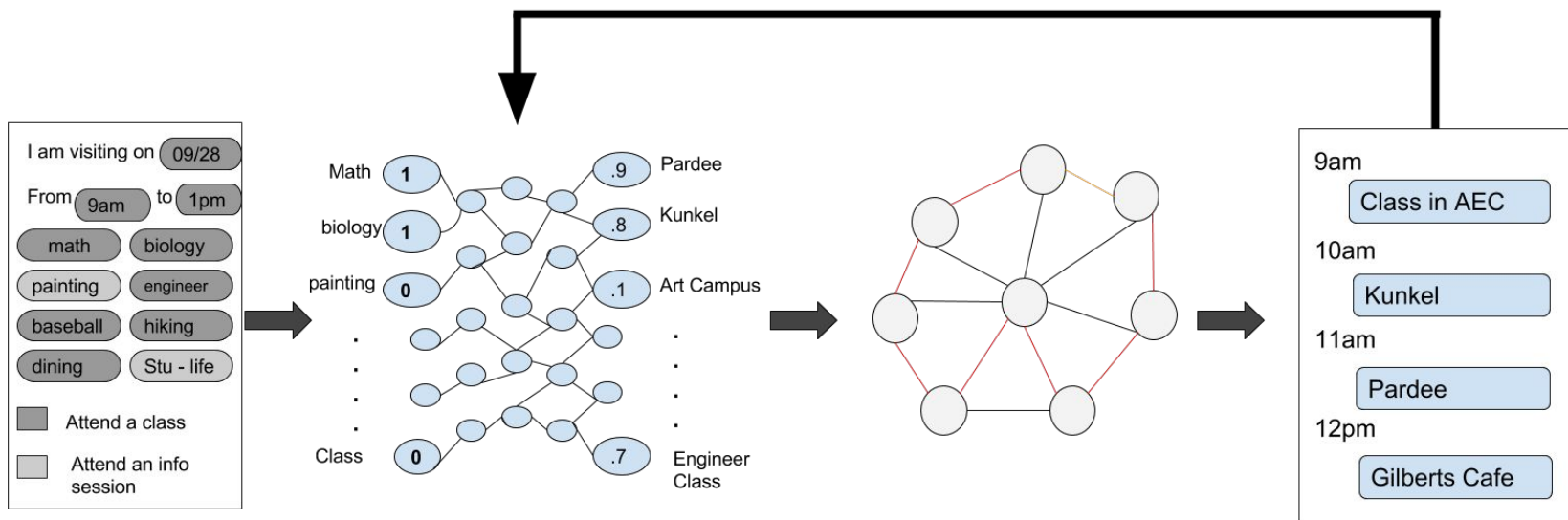
Evaluation criteria

- Use cases
 - How flexible is it? Extreme cases?
- Time
 - At different times of the day? Of different lengths?
- Interests
 - Meet the user's preferences? Promote interests for the school/ major(s)?
- Others
 - Building capacity? Scalability? Limitations?



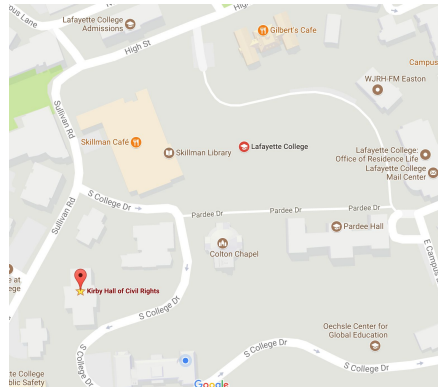
Solution - high level

- Pre-processing step + two AI subproblems:
 - Interest mapping and graph generation
 - Graph traversal and Itinerary generation



Preprocessing step

Knowledge discovery and Data parsing



Geotagged
Campus Map

Section Found														
Banner														
Section	CEN	Room	Days	Time	Cap	Act	Rem	WL	WL	WL	SL	SL	SL	Instructor
SR1	1004H	B00L	101	01	1	1,000	General Biology	WHP	09:00 am	09:00 am	09:00 am	09:00 am	09:00 am	09:00 am
SR1	1004H	B00L	101	02	1	1,000	General Biology	WHP	09:00 am	09:00 am	09:00 am	09:00 am	09:00 am	09:00 am
SR1	1004H	B00L	101	03	1	1,000	General Biology	WHP	09:00 am	09:00 am	09:00 am	09:00 am	09:00 am	09:00 am
SR1	1004H	B00L	233	01	1	1,000	Evolutionary Biology	WHP	11:00 am	11:00 am	11:00 am	11:00 am	11:00 am	11:00 am
SR1	1007H	B00L	245	01	1	0,000	Lab	WHP	01:00 pm	01:00 pm	01:00 pm	01:00 pm	01:00 pm	01:00 pm
SR1	1007H	B00L	251	01	1	1,000	Human Physiology	WHP	09:00 am	09:00 am	09:00 am	09:00 am	09:00 am	09:00 am
C	1008H	B00L	270	01	1	1,000	Special Topic	WHP	01:00 pm	01:00 pm	01:00 pm	01:00 pm	01:00 pm	01:00 pm
C	1009H	B00L	272	01	1	1,000	Conservation Biology	WHP	01:00 pm	01:00 pm	01:00 pm	01:00 pm	01:00 pm	01:00 pm
C	1009H	B00L	272	01	1	0,000	Lab	WHP	01:00 pm	01:00 pm	01:00 pm	01:00 pm	01:00 pm	01:00 pm
SR1	1008H	B00L	274	01	1	1,000	Basis to	WHP	09:00 am	09:00 am	09:00 am	09:00 am	09:00 am	09:00 am
SR1	1009H	B00L	274	01	1	0,000	Cell Physiology	WHP	09:00 am	09:00 am	09:00 am	09:00 am	09:00 am	09:00 am
C	1009H	B00L	314	01	1	1,000	Anatomy of Vision	WHP	10:00 am	10:00 am	10:00 am	10:00 am	10:00 am	10:00 am
SR1	1009H	B00L	332	01	1	1,000	Adv Aquatic Biology	WHP	11:00 am	11:00 am	11:00 am	11:00 am	11:00 am	11:00 am

Banner Course
Offering Schedule



Clubs & Sports
Meeting times and
locations

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Weather API

Faculty advisor
meetings and
visitor-related events

Pre-processing algorithm

Preprocessing step 1

Building a list of tagged buildings

Desired output:

Acopian = [Engineering, Science, ..]

Hugel = [Science, ..]

William's = [Painting, ..]

Farinon = [Dining, ..]

Preprocessing step 1

Building a list of tagged buildings

Source 1: Banner Course Offering Schedule

KUNKEL = {Biology, Science, ...}

Sections Found Biology																						
Select	CRN	Subj	Crse	Sec	Cmp	Cred	Title	Days	Time	Cap	Act	Rem	WL	WL	WL	XL	XL	XL	Instructor	Date (MM/DD)	Location	Attribute
													Cap	Act	Rem	XL	XL	XL				
NR	10049	BIOL	101	01	1	1.000	General Biology	MWF	09:00 am-09:50 am	60	48	12	99	0	99	0	0	0	Manuel D. Ospina-Giraldo (P)	08/28-12/18	KUNKEL 102	Natural Science Outcome
NR	10050	BIOL	101	02	1	1.000	General Biology	MWF	10:00 am-10:50 am	60	48	12	99	0	99	0	0	0	Manuel D. Ospina-Giraldo (P)	08/28-12/18	KUNKEL 102	Natural Science Outcome
NR	10051	BIOL	101	03	1	1.000	General Biology	MWF	11:00 am-11:50 am	56	42	14	99	0	99	0	0	0	Manuel D. Ospina-Giraldo (P)	08/28-12/18	KUNKEL 102	Natural Science Outcome
NR	10068	BIOL	235	01	1	1.000	Evolutionary Biology	MWF	11:00 am-11:50 am	24	23	1	99	0	99	0	0	0	Wayne S. Leibel (P)	08/28-12/18	KUNKEL 117	
NR	10072	BIOL	245L	01	1	0.000	Lab	M	01:10 pm-04:00 pm	12	9	3	12	0	12	0	0	0	Robert A. Kurt (P)	08/28-12/18	KUNKEL 301	
NR	10074	BIOL	251	01	1	1.000	Human Physiology	MWF	09:00 am-09:50 am	24	21	3	99	0	99	0	0	0	Michael W. Butler (P)	08/28-12/18	KUNKEL 117	

Preprocessing step 1

Building a list of tagged buildings

Source 1: Banner Course Offering Schedule

SIMON = {Economics, Social Science, ...}

Economics

Select	CRN	Subj	Crse	Sec	Cmp	Cred	Title	Days	Time	Cap	Act	Rem	WL	WL	WL	XL	XL	XL	Instructor	Date (MM/DD)	Location	Attribute
										Cap	Act	Rem	Cap	Act	Rem	Cap	Act	Rem				
C	10240	ECON	101	02	1	1.000	Principles	TR	01:15 pm-02:30 pm	35	37	-2	99	0	99	0	0	0	Rexford A. Ahene (P)	08/28-12/18	SIMON 125	Social Science Outcome
NR	10241	ECON	101	03	1	1.000	Principles	TR	08:00 am-09:15 am	35	33	2	99	0	99	0	0	0	Joaquin Gomez-Minambres (P)	08/28-12/18	SIMON 124	Social Science Outcome
NR	10242	ECON	101	04	1	1.000	Principles	TR	09:30 am-10:45 am	35	33	2	99	0	99	0	0	0	Joaquin Gomez-Minambres (P)	08/28-12/18	SIMON L3	Social Science Outcome
NR	10243	ECON	101	05	1	1.000	Principles	TR	01:15 pm-02:30 pm	35	33	2	99	0	99	0	0	0	Matthew F. Larsen (P)	08/28-12/18	SIMON L3	Social Science Outcome
NR	10244	ECON	101	06	1	1.000	Principles	MWF	09:00 am-09:50 am	35	29	6	99	0	99	0	0	0	Ute Schumacher (P)	08/28-12/18	SIMON L3	Social Science Outcome

Preprocessing step 1

Building a list of tagged buildings

Source 2: The Lafayette Directory, ex:
<https://directory.lafayette.edu/node/152>

Acopian Engineering Center

HOME - DIRECTORY - ACOPIAN ENGINEERING CENTER



The 90,000-square-foot Acopian Engineering Center includes laboratories designed specifically for student-faculty research, high-tech classrooms equipped with instructional technology, and student learning centers. It houses the entire Engineering Division's departments and programs, along with computer science.

Preprocessing step 1

Building a list of tagged buildings

Source 2: The Lafayette Directory, ex:
<https://directory.lafayette.edu/node/152>

Acopian Engineering Center

HOME - DIRECTORY - ACOPIAN ENGINEERING CENTER



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Word2Vec

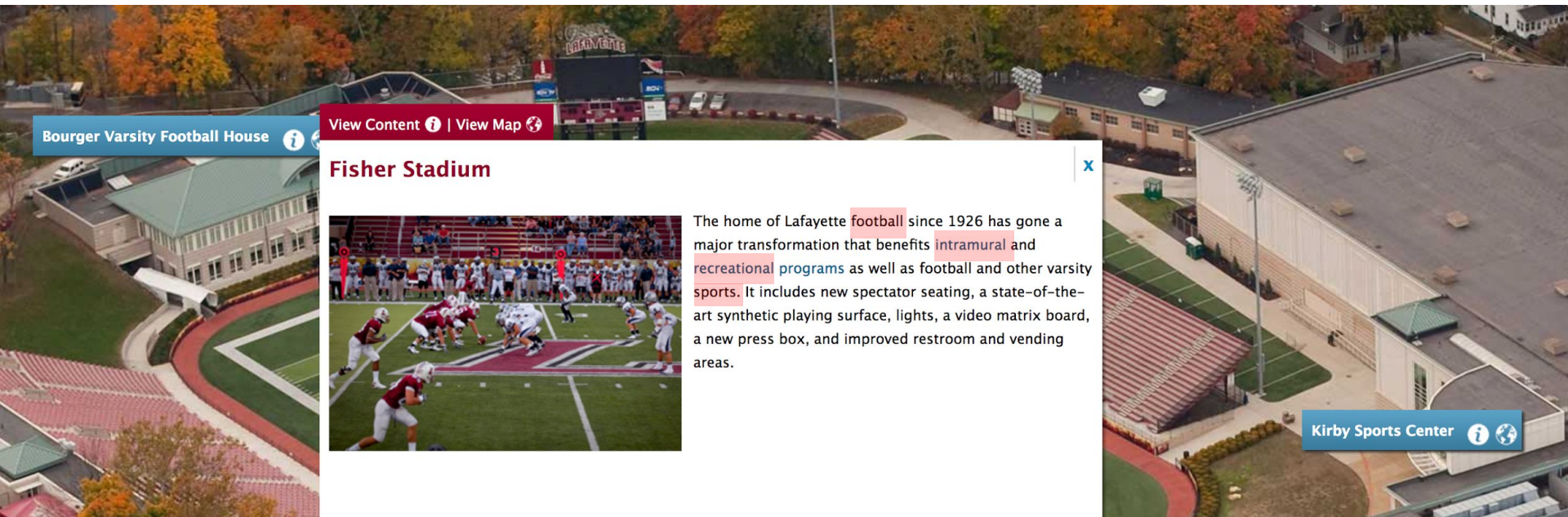


Acopian = {engineering, research, technology, computer science}

Preprocessing step 1

Building a list of tagged buildings

Source 3: virtualtour.lafayette.edu



View Content | View Map

Fisher Stadium

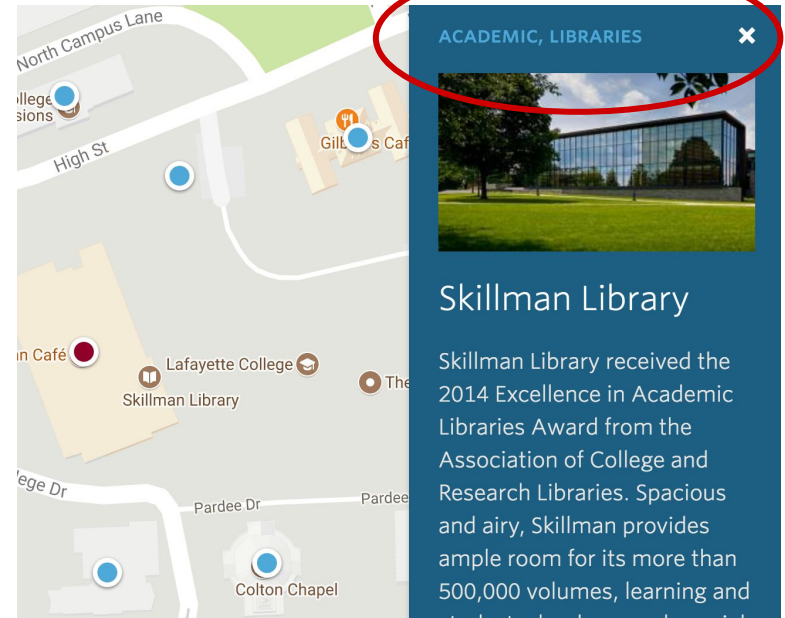
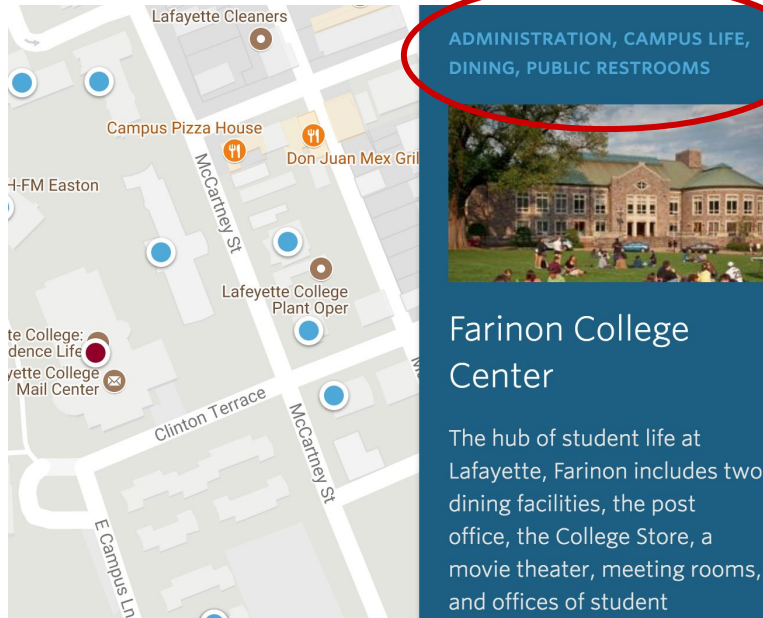


The home of Lafayette football since 1926 has gone a major transformation that benefits intramural and recreational programs as well as football and other varsity sports. It includes new spectator seating, a state-of-the-art synthetic playing surface, lights, a video matrix board, a new press box, and improved restroom and vending areas.

Preprocessing step 1

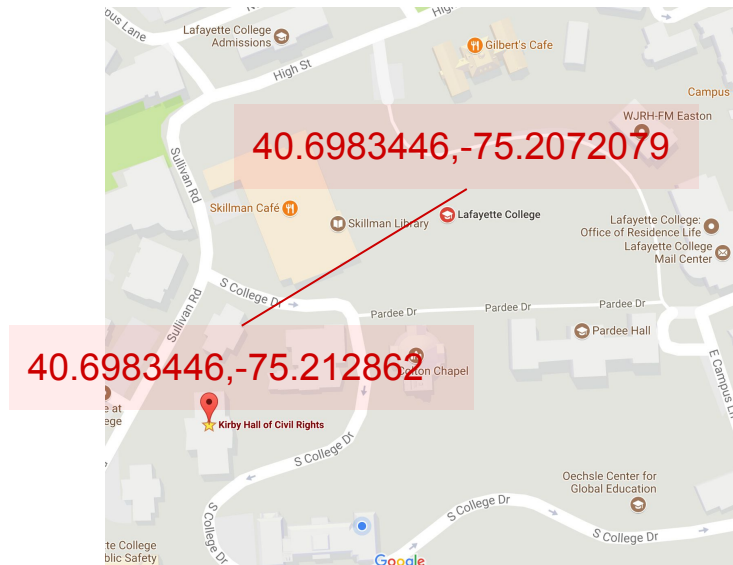
Building a list of tagged buildings

Source 4: campusmaps.lafayette.edu

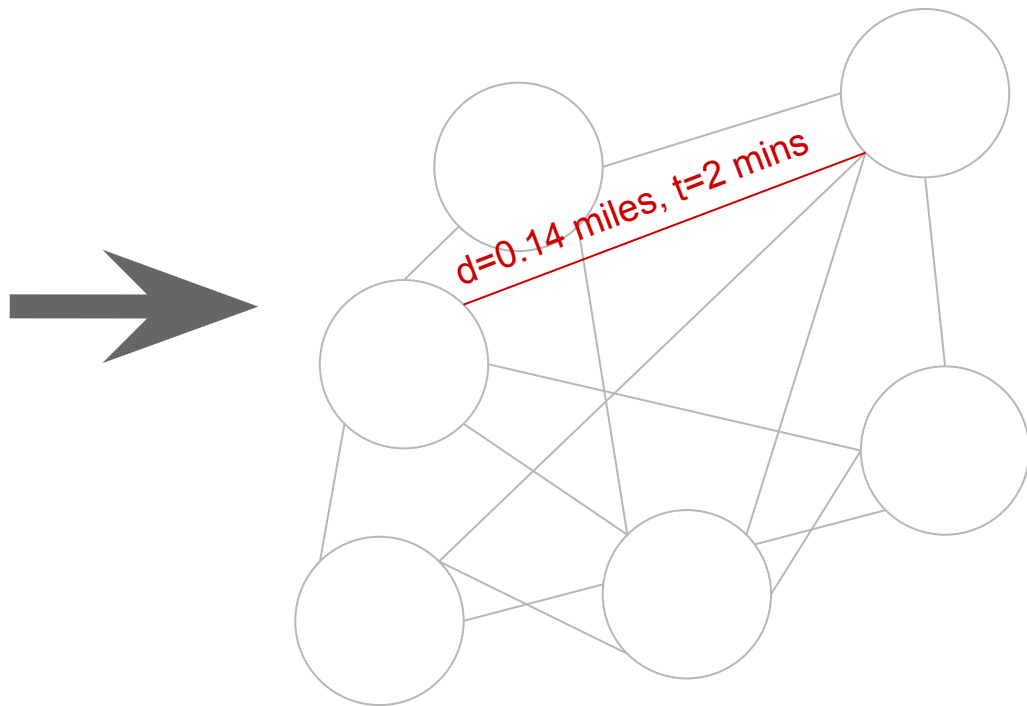


Preprocessing step 2

Building a fully connected graph of buildings



Geotagged Campus Map



First subproblem

Matching User Preference

- Neural Network inspired by Word2Vec (Mikolov et al.)

Input:

Engineering, Science, Math

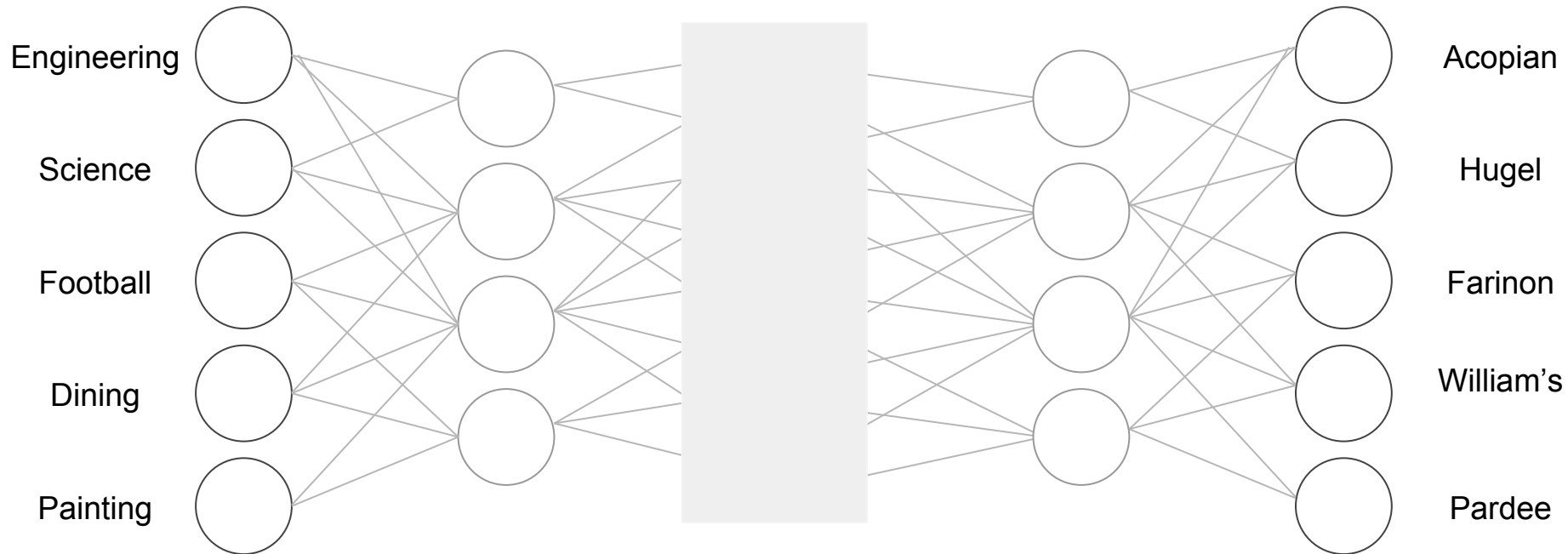
Output:

Acopian (.87), Hugel (.79), Oechsle (.56), ...

Input Layer

n hidden layers

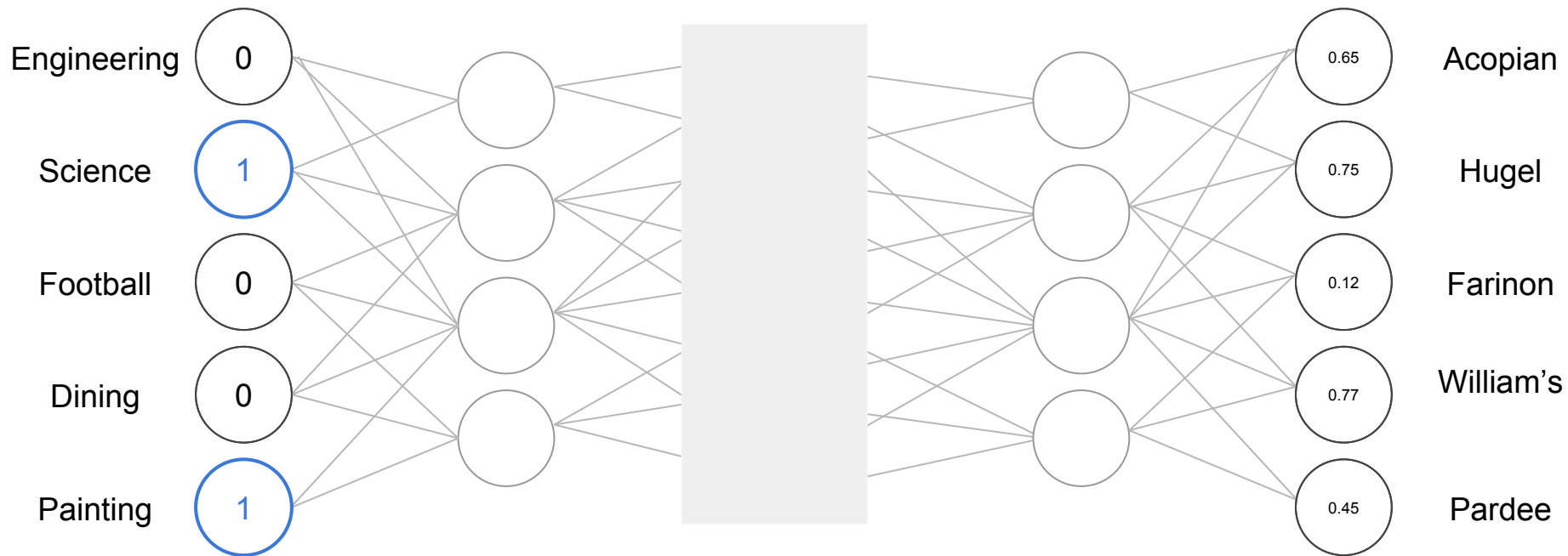
Output Layer



Input Layer

n hidden layers

Output Layer



Subproblem

Matching User Preference

Initial Training Dataset:

Acopian = [Engineering, Science, ..]

Hugel = [Science, ..]

William's = [Painting, ..]

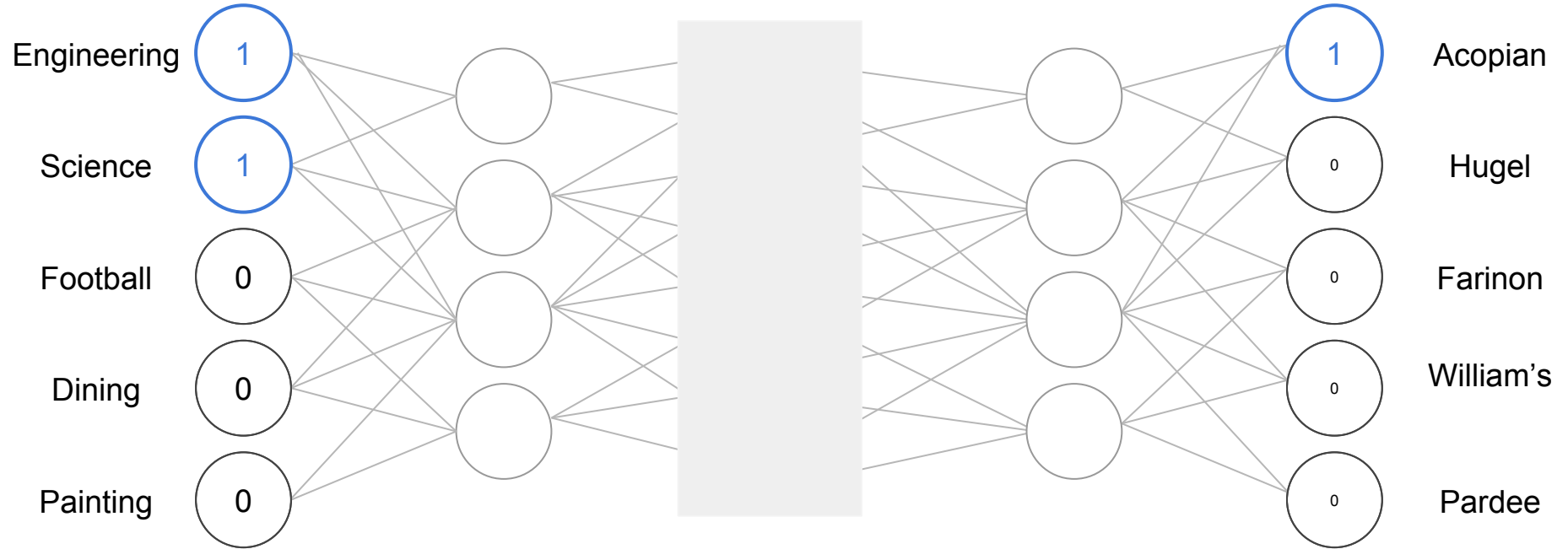
Farinon = [Dining, ..]

Training: Acopian = [Engineering, Science, ..]

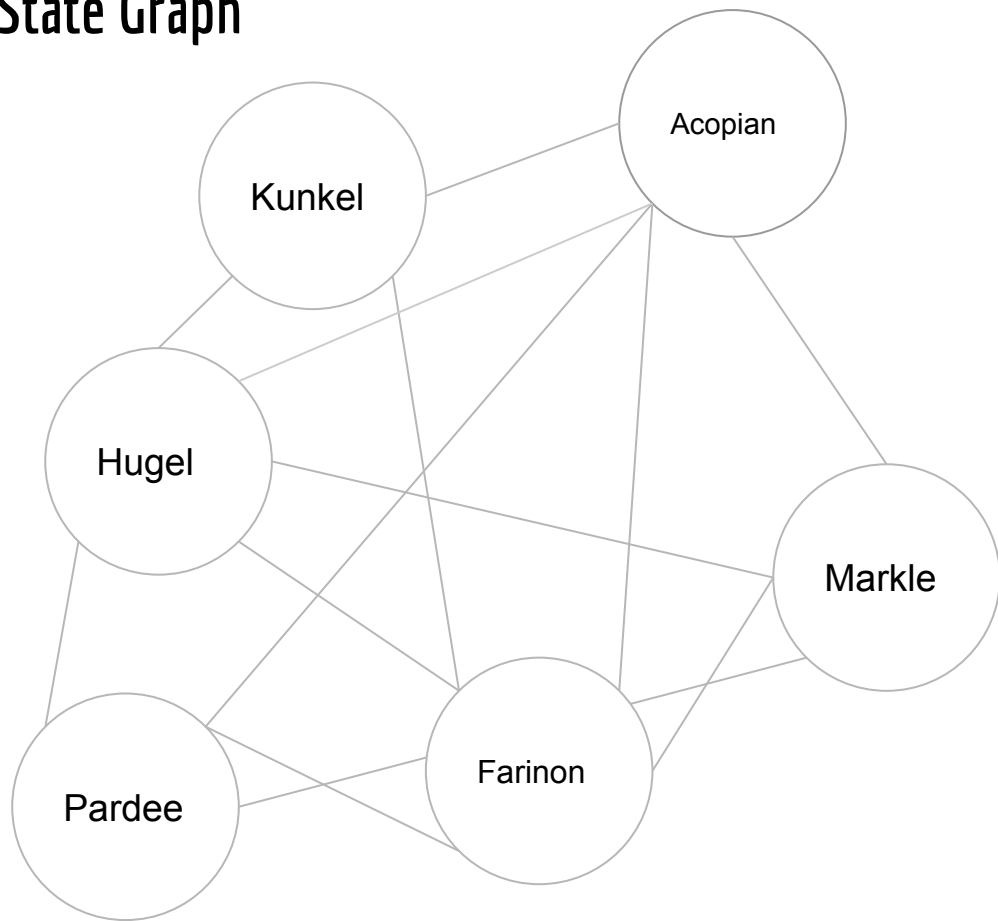
Input Layer

n hidden layers

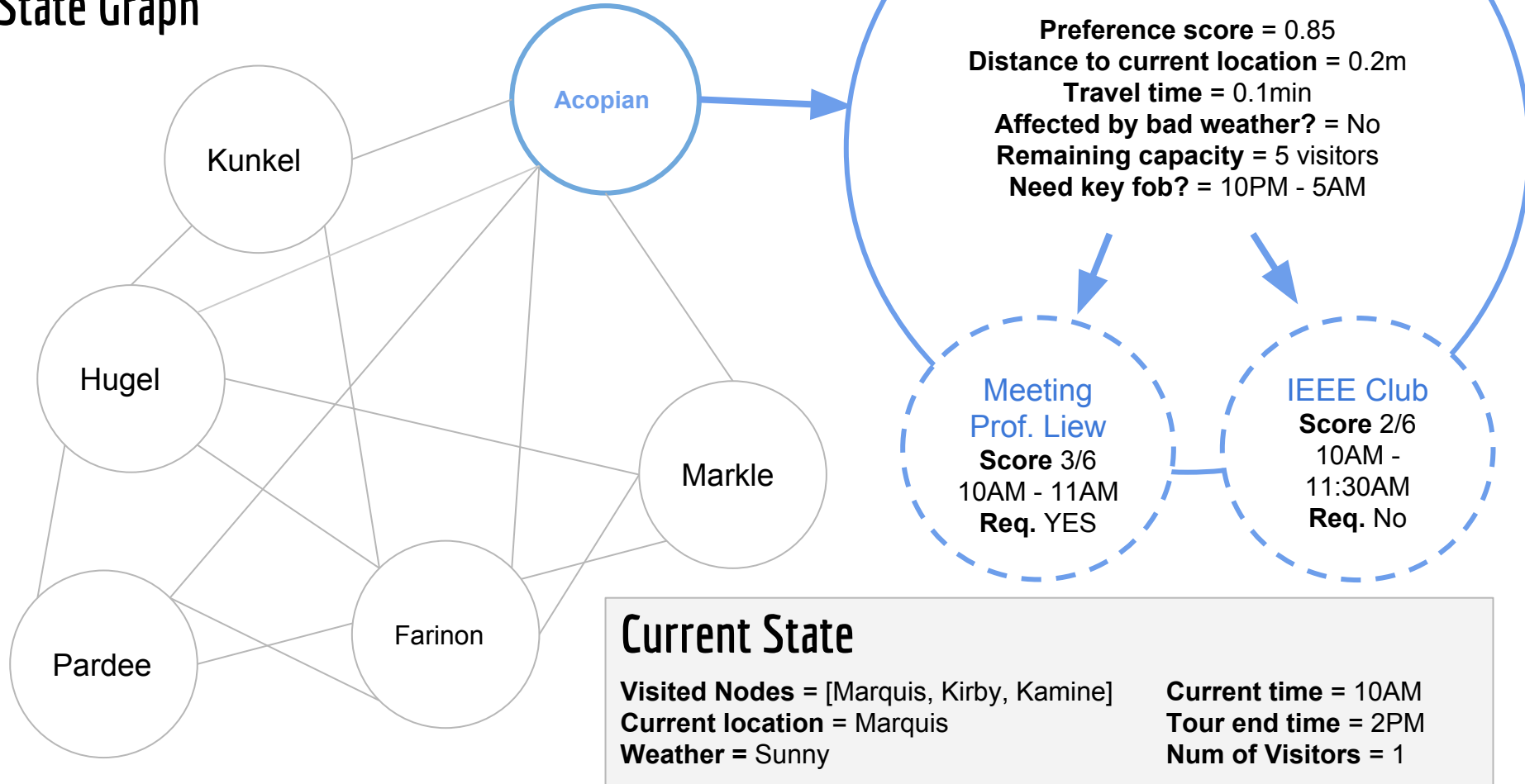
Output Layer



State Graph



State Graph



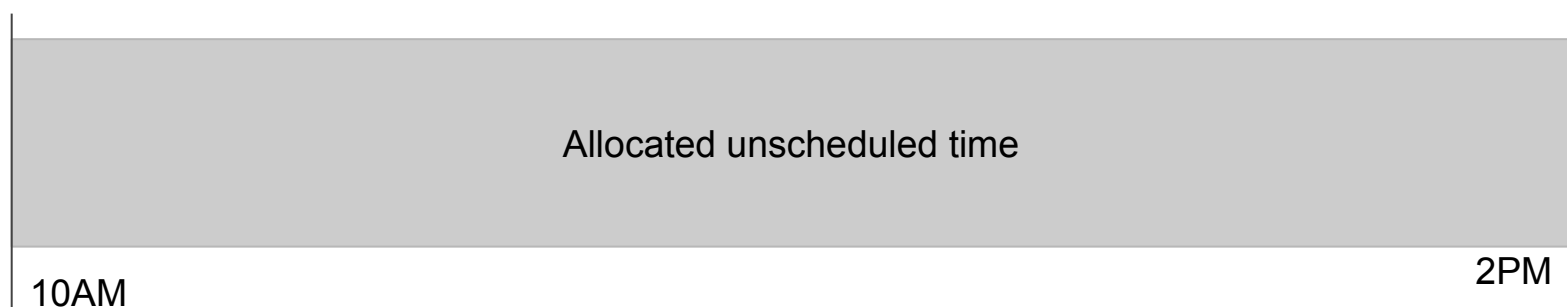
Main algorithm

Optimal Path Finding and Itinerary Generation

Automated Bee Colony Algorithm

Markle Hall

Sullivan Parking

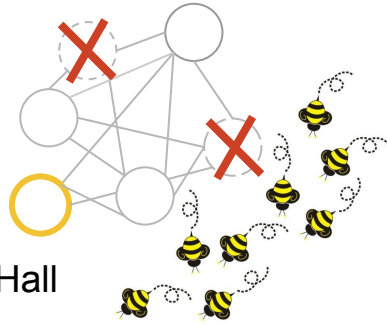


Main algorithm

Optimal Path Finding and Itinerary Generation

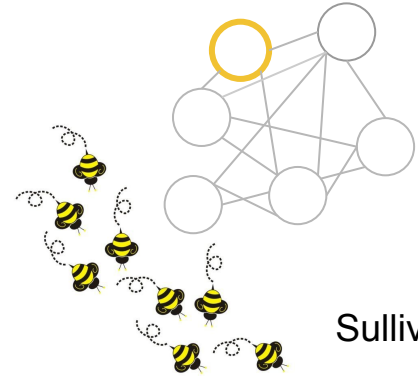
Automated Bee Colony Algorithm

Markle Hall



Allocated unscheduled time

Sullivan Parking



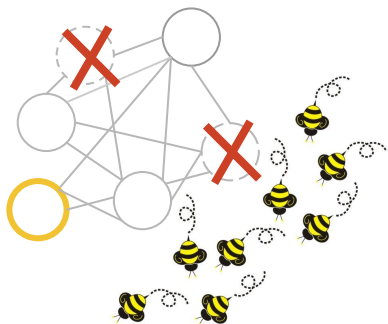
10AM

2PM

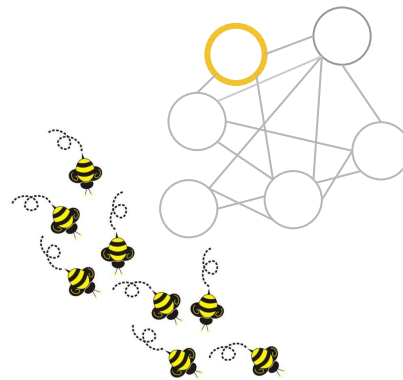
Main algorithm

Optimal Path Finding and Itinerary Generation

Automated Bee Colony Algorithm



Markle Hall



Sullivan Parking

Allocated unscheduled time

Meeting with
Prof. in
Acopian

Allocated unscheduled time

10AM

2PM

Goal test

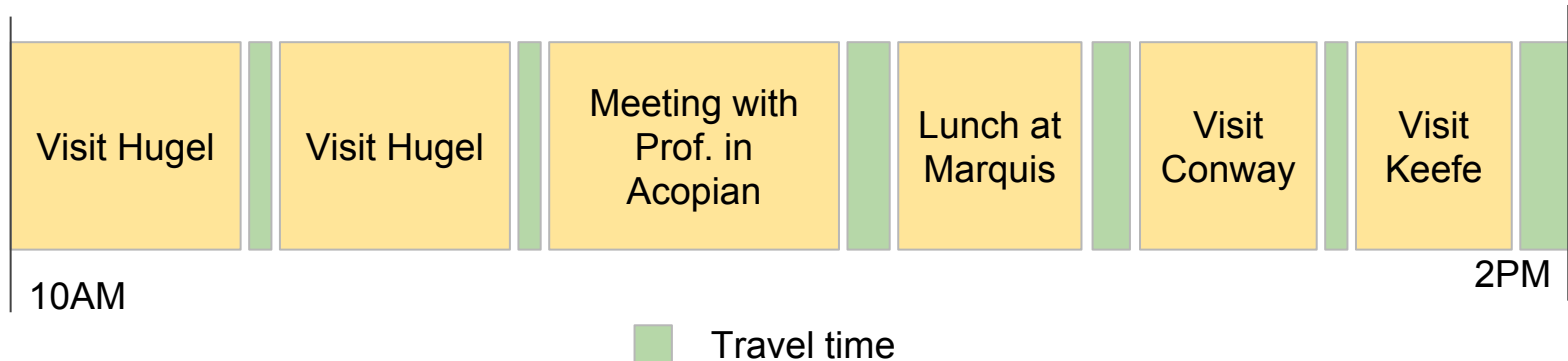
$(\forall t \in \text{FREE-TIME} : \text{AVAILABLE-NODES}(\text{STATE}_t) = \emptyset) \vee (\text{VISITED-NODES} = V)$

Evaluation Criteria

Total tour interest score = $\sum(\text{event scores}) - \text{unallocated time}$

Markle Hall

Sullivan Parking



Future work

- Biases in training?
 - Users may “like” newer buildings that do not necessarily match preference
 - Groups of students that are more likely to “like” their buildings?
 - Could UI affect data? Example: Would people default to choosing the first tour?
- Privacy concerns?
 - Algorithm uses real-time location based data
- Expansion?
 - Neural nets are easily portable and scalable

Questions?