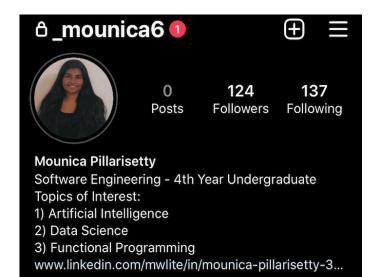


# Mitigating Inference Attacks on Social Networking Platforms

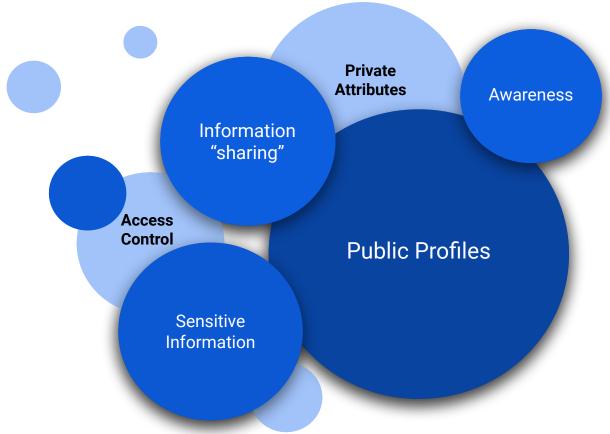
Mounica Pillarisetty
Sarah Lamonica
Shoana Sharma



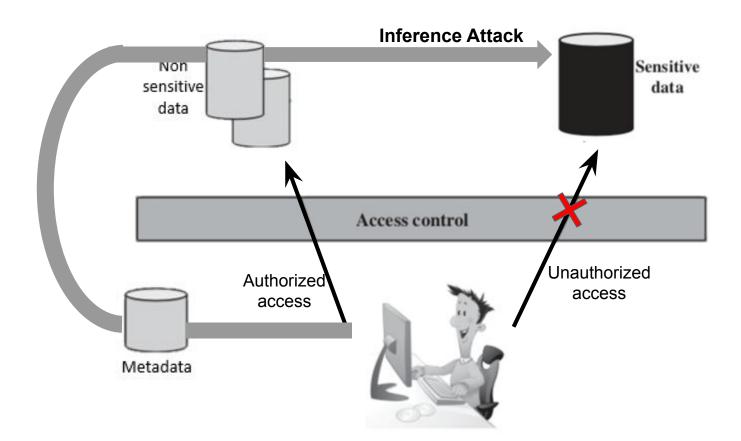




# **Our Motivation**



### Inference Attack



#### **Problem Statement**

To build a system that can support **confidentiality preservation** in social media datasets by **identifying** when sensitive information can be inferred from such data using predefined **security policies**.







# Objective

Provide users with insightful information about their social media data and the various sensitive information that is prone to an inference attack





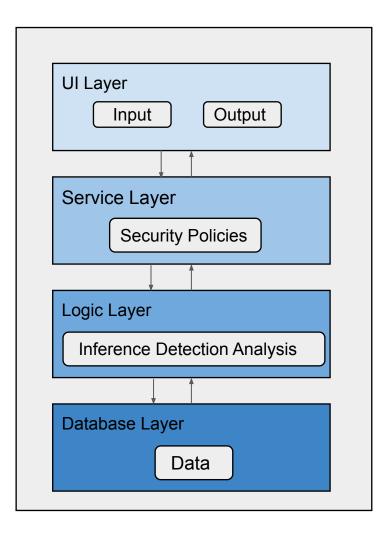
# Background



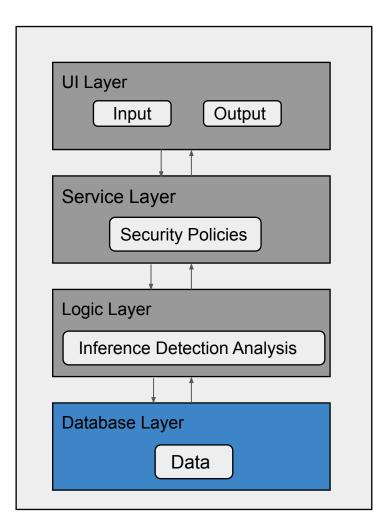
- Countermeasures:
  - Partitioning
  - Polyinstantiation

- Related Work:
  - Sina Weibo

# Layer Pattern



# Layer Pattern



#### **Data Collection**

Person data is collected through three social media sites:





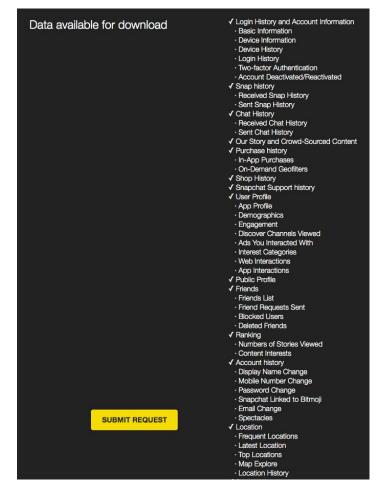


- Requested individually for each member
  - Enough data to conduct a thorough analysis



# Snapchat

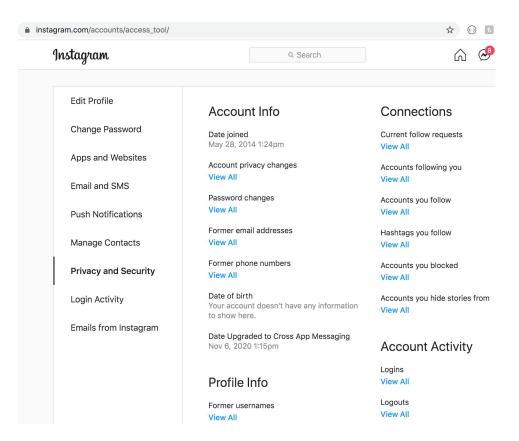
- Snap History
- Chat History
- User Profile
- Friends
- Location History



# Instagram



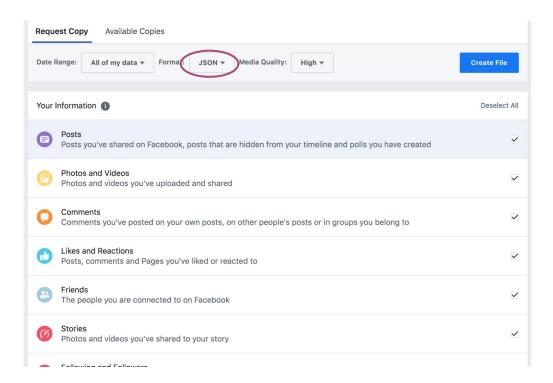
- Logins
- Logouts
- Accounts Following
- Messages



# f

# Facebook

- Location History
- Events
- Messages
- Friends
- Logins
- Logouts



# **Data Cleansing**

- Data type: Json files
  - Large file sets
- Created Scripts
  - Removes extra spaces
  - Same headers for all social media sites
    - Same queries can be utilised

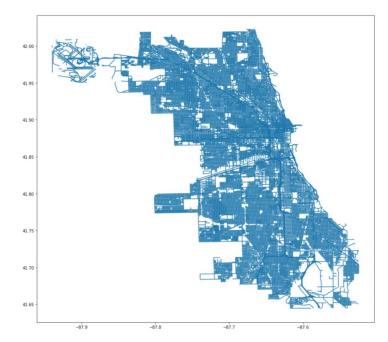
```
[{ "name": "NEM with WISE",
  "start timestamp": 1585693800.
  "end_timestamp": 1585704600
  "name": "Professional Online Portfolio Workshop",
  "start_timestamp": 1582038000,
  "end timestamp": 1582043400
  "name": "Hallow-Queen's Spook Fest",
  "start timestamp": 1572559200,
  "end_timestamp": 1572562800
  "name": "Movie Night",
  "start_timestamp": 1570230000,
  "end_timestamp": 1570237200
  "name": "Fall Meet N Greet",
  "start_timestamp": 1569513600,
  "end_timestamp": 1569524400
```

```
CREATE TABLE IF NOT EXISTS ', 'event_table', ' ', u'(start_timestamp VARCHAR(40), name VARCHAR(40)
 'INSERT INTO ', 'event_table', 'VALUES\n')
(1585693800, NEM with WISE, 1585704600),
(1582038000, Professional Online Portfolio Workshop, 1582043400),
(1572559200, Hallow-Oueen's Spook Fest, 1572562800).
(1570230000, Movie Night, 1570237200),
(1569513600, Fall Meet N Greet, 1569524400).
(1566680400, Lumiere Festival / Festival Lumiere, 1566698400),
(1565388000, The Great India Festival 2019, 1565578800),
(1563379200, Cinnaholic Day | $1 Old Skool Rolls, 1563393600),
(1551900600, Grand Opening, 1551913200),
(1544277600, Fall Cookies & Cram, 1544302800),
(1542841200, SCEsoc Tech Meetup, 1542852000),
(1541858400, 2018 Ottawa Pet Expo, 1541973600),
(1541806200, Ottawa's South Asian Semi-Formal 2018 (Sold Out), 1541830500),
(1541692800, United Way BeaverTails Event, 1541714400),
(1539266400, Jim Watson on the Sustainable Development Goals, 1539270000),
(1536181200, 5$ taco and Margaritas, 1541023200),
(1478638800, Final Season of America Begins!!!!, 0),
(1477962000, Glengarry Pumpkin Carving Competition, 0)
```

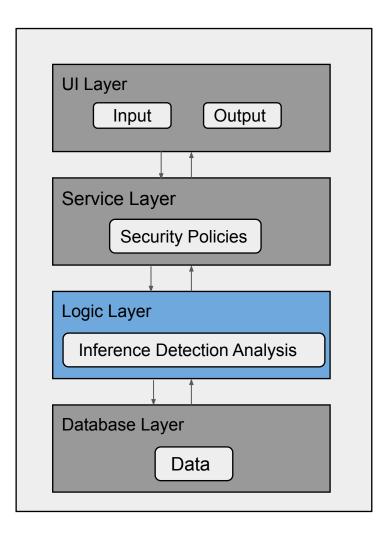
# Pandas

- Converts JSON data easily into a database
- Query the database
- Metrics
- Tabulate results





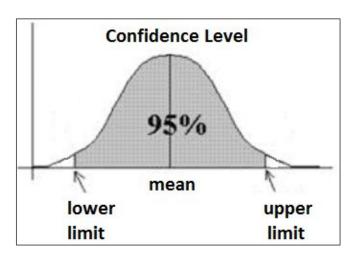
# Layer Pattern



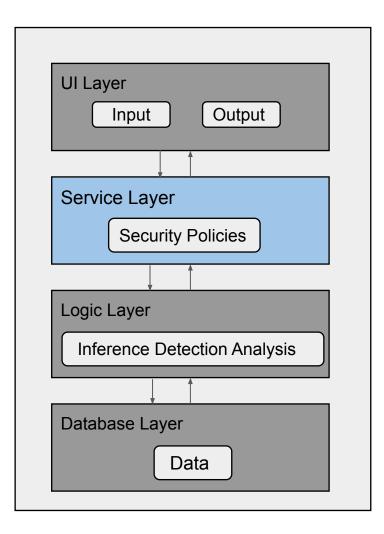
# Inference Detection Analysis

#### Metrics

- Confidence Intervals: Percentage based on the sample space for true mean
- Analysing Results through queries



# Layer Pattern



# Preliminary Research

- Top security questions
  - Research paper from University of Calgary
  - Google search
  - Personal experiences

- Location information
  - Longitude Latitude

#### **Ouestion Category** Relationships: E.g., "What is your maternal grandfather's first name?" Favourites: E.g., "What is your favourite hobby?" 2. Educational Experiences: E.g., "What is the name of the post secondary institution that you attended?" First-time Experiences: E.g., "What is the name of your 4. first employer?" Significant Persons in Significant Events: E.g., "What is the first name of the best man at your wedding?" Date of Significant Events: E.g., "When is your wedding anniversary?" Location of Significant Events: E.g., "What is the name of the hospital in which you were born?" Period-specific Information: E.g., "What is the first name of your favourite teacher in final year of high school?" 9. Other

# **Security Policies**

Security Policy	Queries
Common Security Question: The hometown of an individual is determined based on location during Christmas day	dataframe[dataframe['Time'].str.contains("12/25")]
Common Security Question: The hometown of an individual is determined based on location during Thanksgiving day	dataframe[dataframe['Time'].str.contains("10/12")]
The home address of an individual is determined based on most frequent location	dataframe['Latitude, Longitude'].value_counts().idxmax()
The work address of an individual is determined based on secondary most frequent location	dataframe['Latitude, Longitude'].value_counts().idxmax()
Common Security Question: The hobby of an individual is determined based on most common nouns used	[word for word, word_count in Counter(nouns).most_common(3)]
Special occasions are determined based on typical congratulatory conversation on important dates	[word for word, word_count in Counter(nouns).most_common(3)]
Common Security Question: The pet name of an individual is determined based on most common nouns used	[word for word, word_count in Counter(nouns).most_common(3)]
Relationships between individuals is determined based on nouns extracted from conversation	[word for word, word_count in Counter(nouns).most_common(3)]

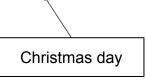
**Security Policy #1:** The <u>hometown</u> of an individual is determined based on location during <u>Christmas day</u>

#### Why is it deemed sensitive information?

- Common security question
  - Inferred family home
  - Inferred family relationship

#### **Query Representation:**

dataframe[dataframe['Time'].str.contains("12/25")]





**Security Policy #2:** The hometown of an individual is determined based on location during <u>Thanksgiving day</u>

#### Why is it deemed sensitive information?

- Common security question
  - Inferred Family home
  - Inferred Family relationship

#### **Query Representation:**

dataframe[dataframe['Time'].str.contains("10/12")]

Thanksgiving day for 2020



# **Security Policy #3:** The home address of an individual is determined based on <u>most frequent location</u>

#### Why is it deemed sensitive information?

- Inferred home address
  - Most data hits through location history

#### **Query Representation:**

dataframe['Latitude, Longitude'].value\_counts().idxmax()



**Security Policy #4:** The work address of an individual is determined based on <u>secondary most frequent location</u>

#### Why is it deemed sensitive information?

- Inferred from second most data hits of location history
- From 9 A.M. to 5 P.M.

#### **Query Representation:**

dataframe['Latitude, Longitude'].value\_counts().idxmax()



**Security Policy #5:** The <u>hobby</u> of an individual is determined based on most common nouns used

#### Why is it deemed sensitive information?

- Common security question
- Natural Language Processing:
  - Branch of artificial intelligence
  - Deals with the human computer interaction through natural language
  - Noun extraction

#### **Query Representation:**

[word for word, word\_count in Counter(nouns).most\_common(3)]



**Security Policy #6:** Special occasions are determined based on typical <u>congratulatory</u> <u>conversation</u> on important dates

#### Why is it deemed sensitive information?

- Common security question
- Natural Language Processing
  - Noun extraction
- Inferred birthdays of spouses, children or anniversaries

#### **Query Representation:**

[word for word, word\_count in Counter(nouns).most\_common(3)]



**Security Policy #7:** The pet name of an individual is determined based on most common nouns used

#### Why is it deemed sensitive information?

- Common security question
- Natural Language Processing

  O Noun Extraction
- Inferred pet name through conversation, liked pages or profile tags

#### **Query Representation:**

[word for word, word count in Counter(nouns).most common(3)]



**Security Policy #8:** Relationships between individuals is determined based on nouns extracted from conversation

#### Why is it deemed sensitive information?

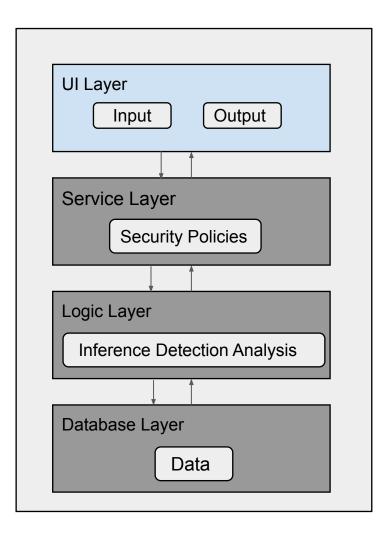
- Common security question
- Natural Language Processing
  - Noun Extraction
- Inferred through conversation, tagged profile, relationship status

#### **Query Representation:**

[word for word, word\_count in Counter(nouns).most\_common(3)]



# Layer Pattern



#### Interface

Step 1:

Welcome to the Inference Detection Application

See if your social media data is safe!

Step 2: Enter your file: "Data/location\_history.json" Input the name of the social media: "Snapchat"

# Analysis of Results

Security Policy	Result	Confidence (In %)
Common Security Questions: Home Address	45.354 ± 39.66 meters, -75.713 ± 39.66 meters	29.0381

- A result is shown to demonstrate to the user exactly what the program has found when they perform a query on the data set.
- A confidence value is shown as a percentage. It is a metric to demonstrate
  to the user how confident the system is in determining the result.
  - Confidence = (Accepted Value) / (Total Values) x 100
- Goal: Inform the user when unauthorized information can be inferred by unauthorized parties.

# Demo



### Demo Result #1

#### **Security Policy**

The home address of an individual is determined based on most frequent location

Security Policy	Result	Confidence (In %)
Home Address	45.354 ± 39.66 meters, -75.713 ± 39.66 meters	29.0381

Latitude	Longitude		
45.354	-75.713	Convert	
Example: 40.785091  Reverse geocoded addre	Example: -73.968285		
36 Argue Drive, Nepean ON K2E 6S1 Ottawa Nepean Ontario Canada			

# Demo Result #2

#### **Security Policy**

The work address of an individual is determined based on secondary most frequent location

Security Policy	Result	Confidence (In %)
Work Address	$45.355 \pm 39.66$ meters, $-75.712 \pm 39.66$ meters	28.1307

Latitude	Longitude		
45.355	-75.712	Convert	
Example: 40.785091  Reverse geocoded address	Example: -73.968285		
17 Argue Drive, Nepean ON K2E 6S2 Ottawa Nepean Ontario Canada			

#### Demo Result #3

#### **Security Policy**

Common Security Question: The hometown of an individual is determined based on location during Thanksgiving day

Security Policy	Result	Confidence (In %)
Common Security Ouestions: Childhood Home Address	$45.354 \pm 39.66$ meters. $-75.713 \pm 39.66$ meters	51.8519

Latitude	Longitude		
45.354	-75.713	Convert	
Example: 40.785091  Reverse geocoded addre	Example: -73.968285		
36 Argue Drive, Nepean ON K2E 6S1 Ottawa Nepean Ontario Canada			

# Natural Language Processing

- Common security questions addressed:
  - Favourite hobby or sport
  - Special occasions
- Natural Language Toolkit

```
Security Policy
                         Result
                                                           Confidence (In %)
                                                           43.6731
Common hobby/sport
                         Soccer
Special Occasion(s):
Security Policy
                         Result
                                                           Confidence (In %)
                         Harry Styles: October 12
Birthday
                                                           12.4656
Birthday
                         Mary James: April 23
                                                           27.0843
Anniversary
                         Jake Peralta: September 9
                                                           57.3659
```

# Testing & Validation

- Dummy database
  - Used for testing
- Testing with different datasets
  - 3 Distinct Users
- Multiple data points
  - More data points = More accurate results
- Confidence interval
  - Determine how confident the system is in determining the result

user_name	hobby	music	educational_institution	job_updates	brithdate	signification_events
Shoana	Swimming	Coldplay	Carleton University	NULL	Dec 25th, 1980	Graduated: May 2021
Shoana	Reading	One Republic	NULL	Stated Job: May 5th, 2021	NULL	NULL
Sarah	Soccer	Harry Styles	Carleton University	Stated Job: May 2nd, 2021	July 31, 1998	Graduated: May 2021
Mounica	Painting	NULL	Carleton University	Stated Job: May 2nd, 2021	April 6, 1998	Graduated: May 2021

login_IP	user_name	login_date
2620:0022:4000:1201:1175:57cc:f2de:8638	Shoana	oct 24, 2020
2620:0022:4000:1201:1ffc:4241:e6a0:0587	Mounica	sept 13, 2020
2620:0022:4000:1201:1ffc:4241:e6a0:0587	Sarah	dec 10, 2020
2620:0022:4000:1201:1175:57cc:f2de:8638	Shoana	oct 24, 2020
2620:0022:4000:1201:1ffc:4241:eff3:9502	Shoana	dec 10, 2020
2620:0022:4000:1201:1ffc:4241:eff3:9502	Mounica	sept 13, 2020
2620:0022:4000:1201:1ffc:4241:e6a0:0587	Mounica	sept 13, 2020
2620:0022:4000:1201:1ff5:57cc:f2de:8638	Sarah	oct 24, 2020
2620:0022:4000:1201:1ff5:57cc:f2de:8638	Shoana	sept 13, 2020
2607:fea8:5a80:0b9e:1d5b:f274:949e:4ac2	Sarah	dec 10, 2020
2620:0022:4000:1201:1ffc:4241:e6a0:0587	Mounica	oct 24, 2020
2607:fea8:5a80:0b9e:fd3d:f330:c653:4085	Shoana	oct 24, 2020

# Accomplishments

- A security policy
- Database model
- Command-line interface
- Queries designed to infer data
- Data parsing script to clean data
- Providing statistical metrics to the user

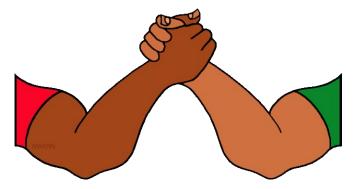


print("Hello, world!")



# Challenges

- Database selection (SQL vs. SQLite vs. Pandas Dataframe)
- User Interface Implementation (Web UI vs. Command Line Interface)
- Implementation of multiple data sets
  - Data consistency and Data cleansing
- Security Policy Development
- Automation



#### Future advancements

- Include publicly available data from user profiles
- Automate the runs
- Web Interface
- Association Rules Can we predict patterns?
- Scale to include more social media websites
- Scale to allow the user to input many different social media data files at the same time







### Conclusion

Provide users with insightful information about their social media data and the various sensitive information that is prone to an inference attack



