

# A Comparative Analysis of European City Police Presence on Twitter

Master Thesis Defense

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## INTRODUCTION

# Research Questions:

RQ1: What characterizes the **Twitter usage practices** of European city police departments, and how do these practices differ among cities in various countries?

RQ2: Are there identifiable **patterns** or differences in how city police departments and city residents tweet about **police-related matters** across different European cities?



## RELATED WORK

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1

### Social Media in Policing

- **General dynamics of police Twitter usage**

*"What Are the Police Doing on Twitter? Social Media, the Police and the Public"*

*"Twitter for city police department information sharing "*

- **Data analysis and visualisation**

*"Analyzing and Visualizing Government-Citizen Interactions on Twitter to Support Public Policy-Making"*

*"Examining Government-Citizen Interactions on Twitter Using Visual and Sentiment Analysis"*

- **Relationship between police action and public sentiment and engagement**

*"Measuring Police Performance: Public Attitudes Expressed in Twitter"*

*"To Serve and to Tweet: An Examination of Police-Related Twitter Activity in Toronto"*

*"The police on Twitter: image management, community build- ing, and implications for policing in Canada"*

*"Examining Negative Online Social Reaction to Police Use of Force: The George Floyd and Jacob Blake Events"*

- **Specific aspects of police work on social media**

*"#Missing to #Found: Exploring police Twitter use for missing persons investigations"*

*"Improving Police Social Media Use Practices"*

- **Facebook**

*"Examining Police Agencies' Dialogic Accounting Practices in Facebook Conversations"*

*"Working with communities on social media Varieties in the use of Facebook and Twitter by local police"*

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### Twitter in European Policing

- **Sweden**

*"The Use of Twitter by Police Officers in Urban and Rural Contexts in Sweden"*

- **Netherland**

*"Police message diffusion on Twitter: analysing the reach of social media communications"*

- **Germany**

*"Do organizational differences matter for the use of social media by public organizations? A computational analysis of the way the German police use Twitter for external communication"*

*"The role of emotions for citizen engagement via social media – A study of police departments using twitter"*

- **UK**

*"Social Media and the Police: Tweeting Practices of British Police Forces during the August 2011 Riots"*

*"An Analysis of UK Policing En- gagement via Social Media"*

- **Cross countries**

*"Machine Translation, Sentiment Analysis, Text Similarity, Topic Modelling, and Tweets: Understanding Social Media Usage Among Police and Gendarmerie Organizations"*





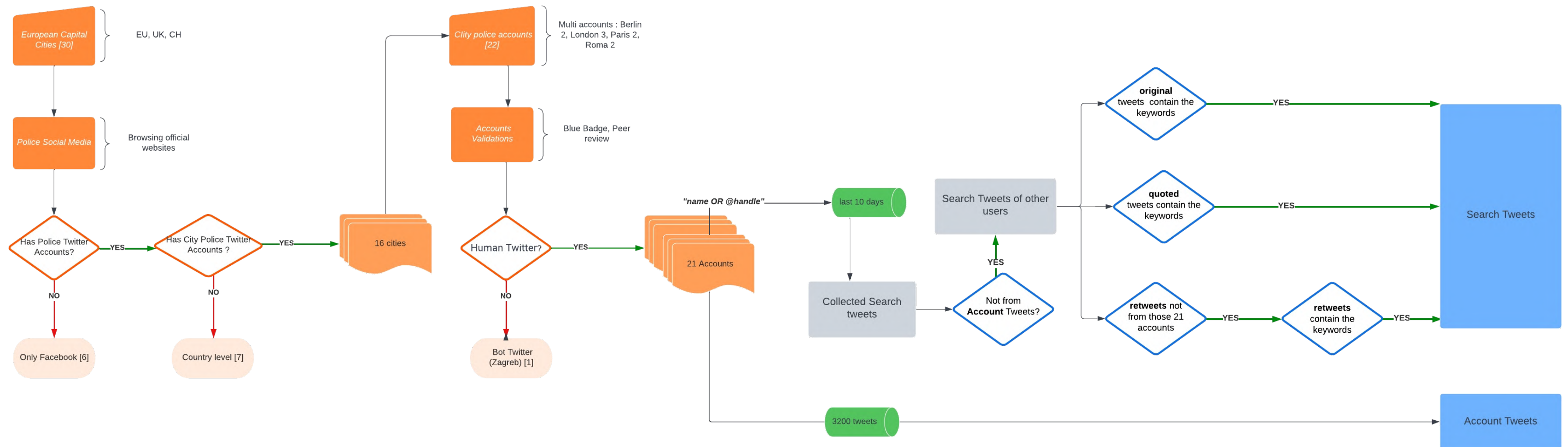
# DATA COLLECTING - COLLECTING PROCESS

## INCLUSION CIRTERIUM

EU capital cities UK Switzerland

## COLLECTED TWEETS

Account tweets + Search tweets

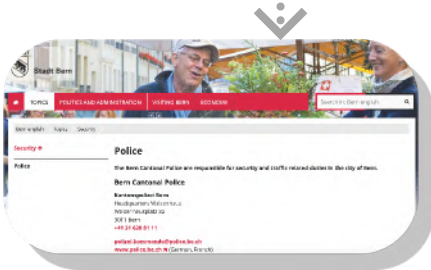




# DATA COLLECTING - ABOUT CITY POLICE ACCOUNTS

## SELECTED ACCOUNTS

City	Account Name	Handle
Amsterdam	Politie Eenheid Amsterdam	@POL_Amsterdam
Berlin-1	Polizei Berlin Einsatz	@PolizeiBerlin_E
Berlin-2	Polizei Berlin	@polizeiberlin
Bern	Kantonspolizei Bern	@PoliceBern <sup>a</sup>
Copenhagen	Københavns Politi	@KobenhavnPoliti
Helsinki	Helsingin poliisi	@HelsinkiPoliisi
Lisbon	Comando Metropolitano de Lisboa	@psplisboa @PSPCOMETLIS <sup>b</sup>
London-1	City of London Police	@CityPolice
London-2	Metropolitan Police	@metpoliceuk
London-3	Met Contact Centre	@MetCC
Madrid	Policía Municipal de Madrid	@policiademadrid
Oslo	OPS Politiet Oslo	@oslopolitio
Paris-1	Police Municipale de Paris	@PMdeParis
Paris-2	Préfecture de Police	@prefpolice
Prague	Městská policie Praha	@MP_Praha
Riga	Rīgas pašvaldības policija	@RigasPP
Rome-1	Polizia Roma Capitale	@PLRomaCapitale
Rome-2	Questura Di Roma	@QuesturaDiRoma
Stockholm	Polisen Stockholm	@polisen_sthlm
Vienna	POLIZEI WIEN	@LPDWien
Warsaw	Policja Warszawa	@Policja_KSP



## ACCOUNTS BIOGRAPHY

### Report Crime Info

**Politie Eenheid Amsterdam**  
@POL\_Amsterdam

Politie Eenheid Amsterdam | Omgeving Amsterdam, Amstelveen, Diemen, Uithoorn | Voor het melden van incidenten belt u 0900-8844. Bij spoed belt u 112.

Translated from Dutch by Google

Police Unit Amsterdam | Area Amsterdam, Amstelveen, Diemen, Uithoorn | To report incidents, call 0900-8844. In case of emergency, call 112.

**Københavns Politi**  
@KobenhavnPoliti

Vi kan ikke garantere svar her. Find svar på [politi.dk](#) eller ring 114. Akut hjælp: ring 112. Web-anmeld: [politi.dk/anmeld](#). Vi bruger [#politidk](#)

**Helsingin poliisi**  
@HelsinkiPoliisi

Helsingin poliisin virallinen Twitter-tili | Polisen i Helsingfors officiella Twitterkonto | The Official Twitter account of Helsinki Police.

### Emergencies Info

**City of London Police**  
@CityPolice

We are the police force for the City of London 'Square Mile'. Please don't report crime here; call 101 or 999 in an emergency. Not monitored 24/7.

**Metropolitan Police**  
@metpoliceuk

London's Metropolitan Police Service.

Please do not report crime here. Call 101, tweet [@MetCC](#) or visit our website. In an emergency always call 999

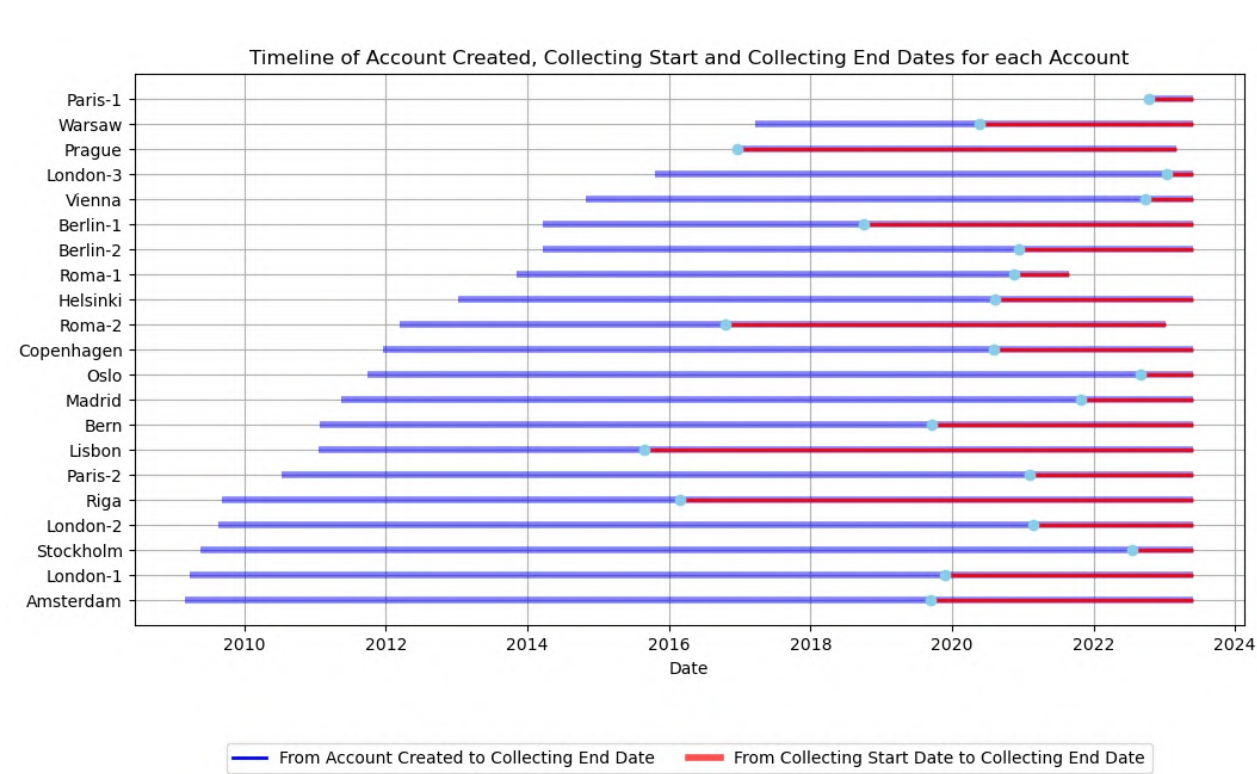
**Met Contact Centre**  
@MetCC

London's Metropolitan Police Service Contact Centre (MetCC). We are available for non-emergency enquiries 24/7/365. In an emergency, always dial 999.



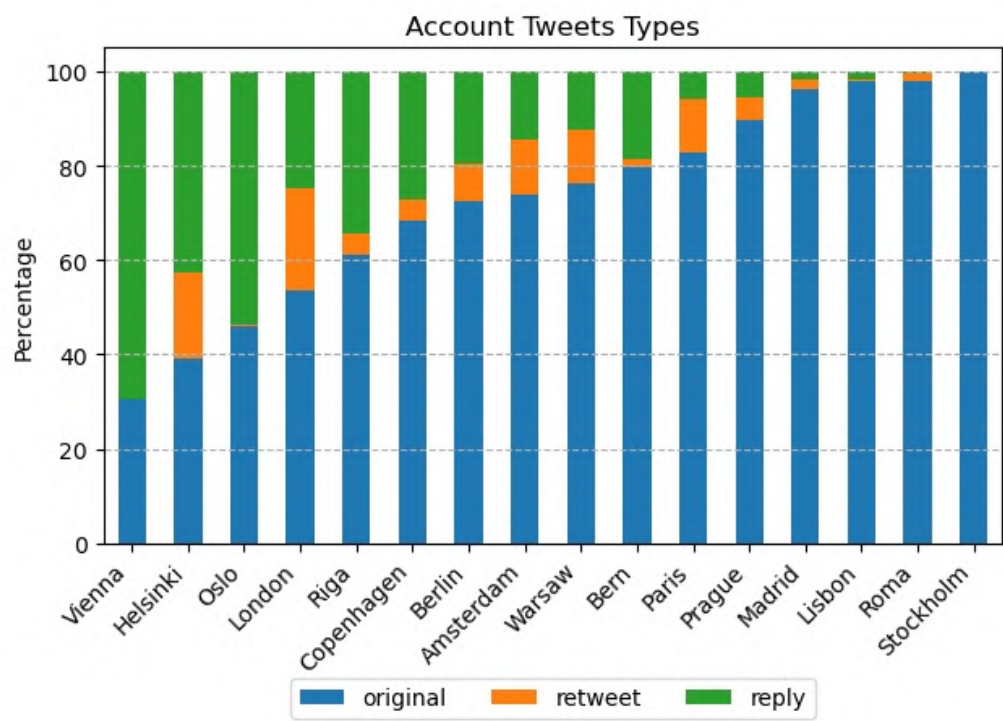


# DATA COLLECTING - DATA TOPOLOGY



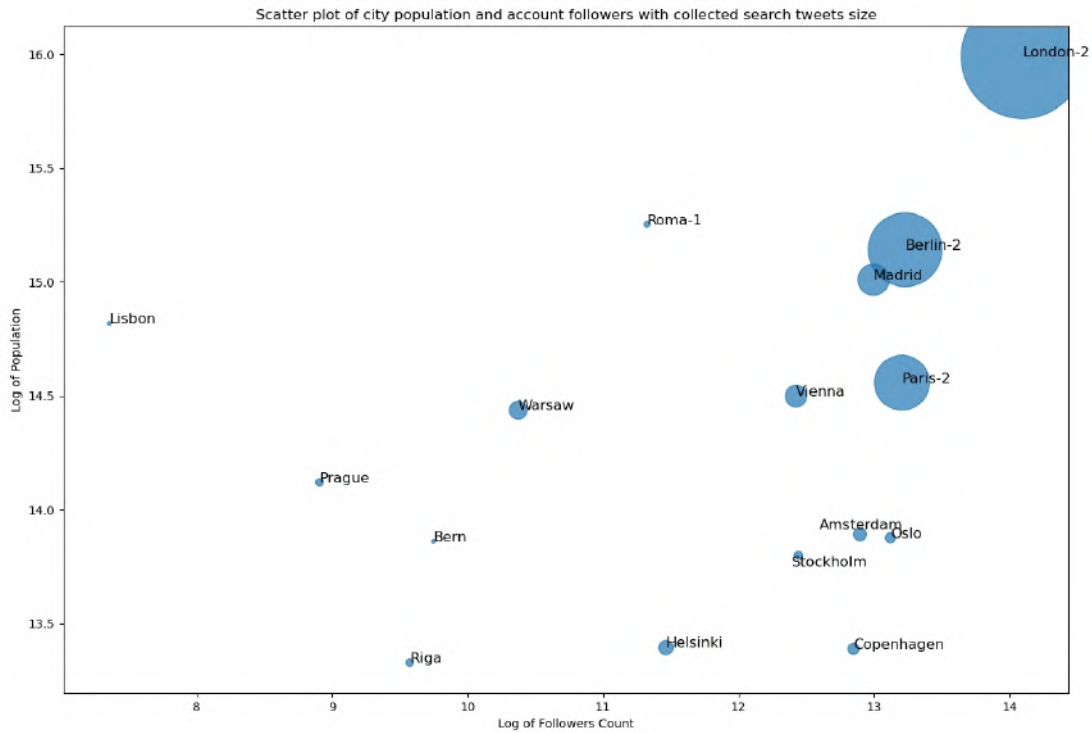
## ACCOUNTS TIMELINE

68,670 account tweets with an average of 3,270 tweets per account



## ACCOUNT TWEETS TYPES

- Original: user themselves creates
- Retweets: shared by the user that were originally tweeted by another user
- Reply: directly respond to another user

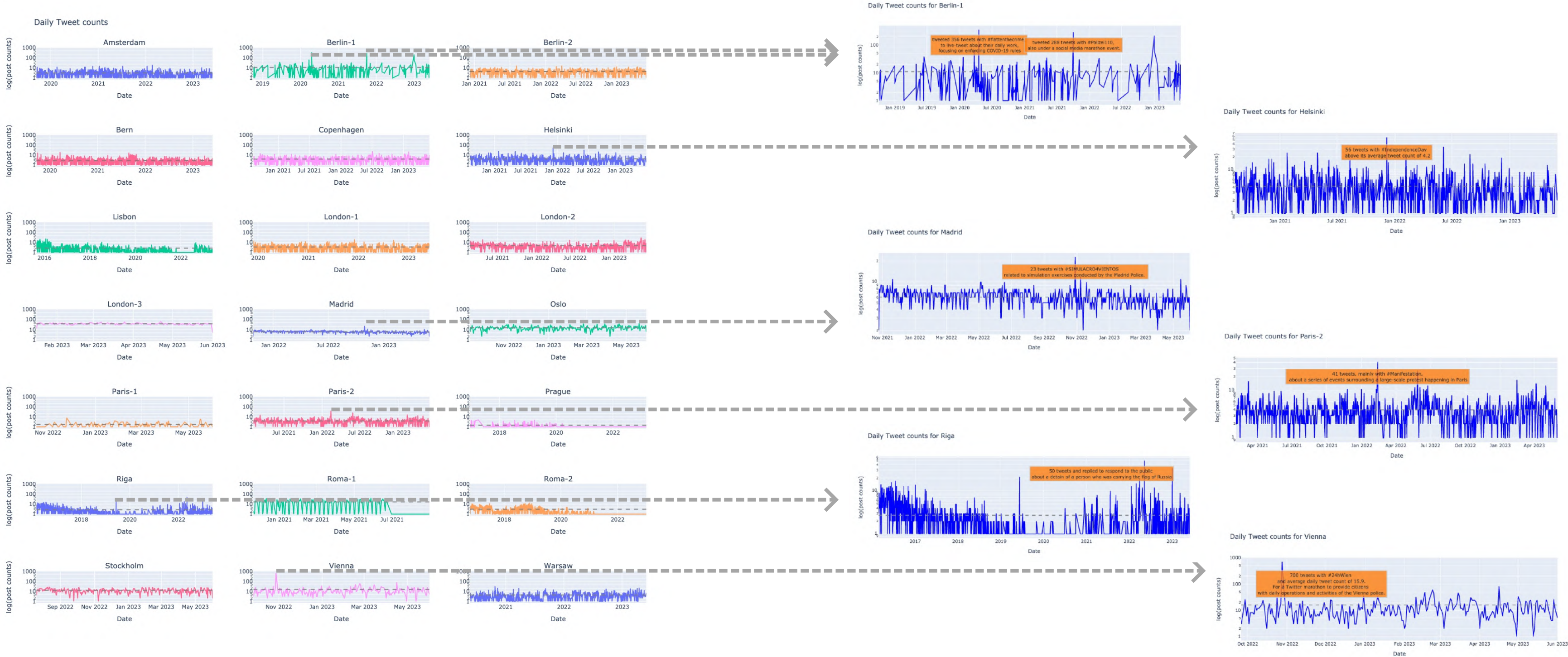


## POPULATION FOLLOWERS WITH COLLECTED SEARCH TWEETS

365,932 Search Tweets for April and May of 2023

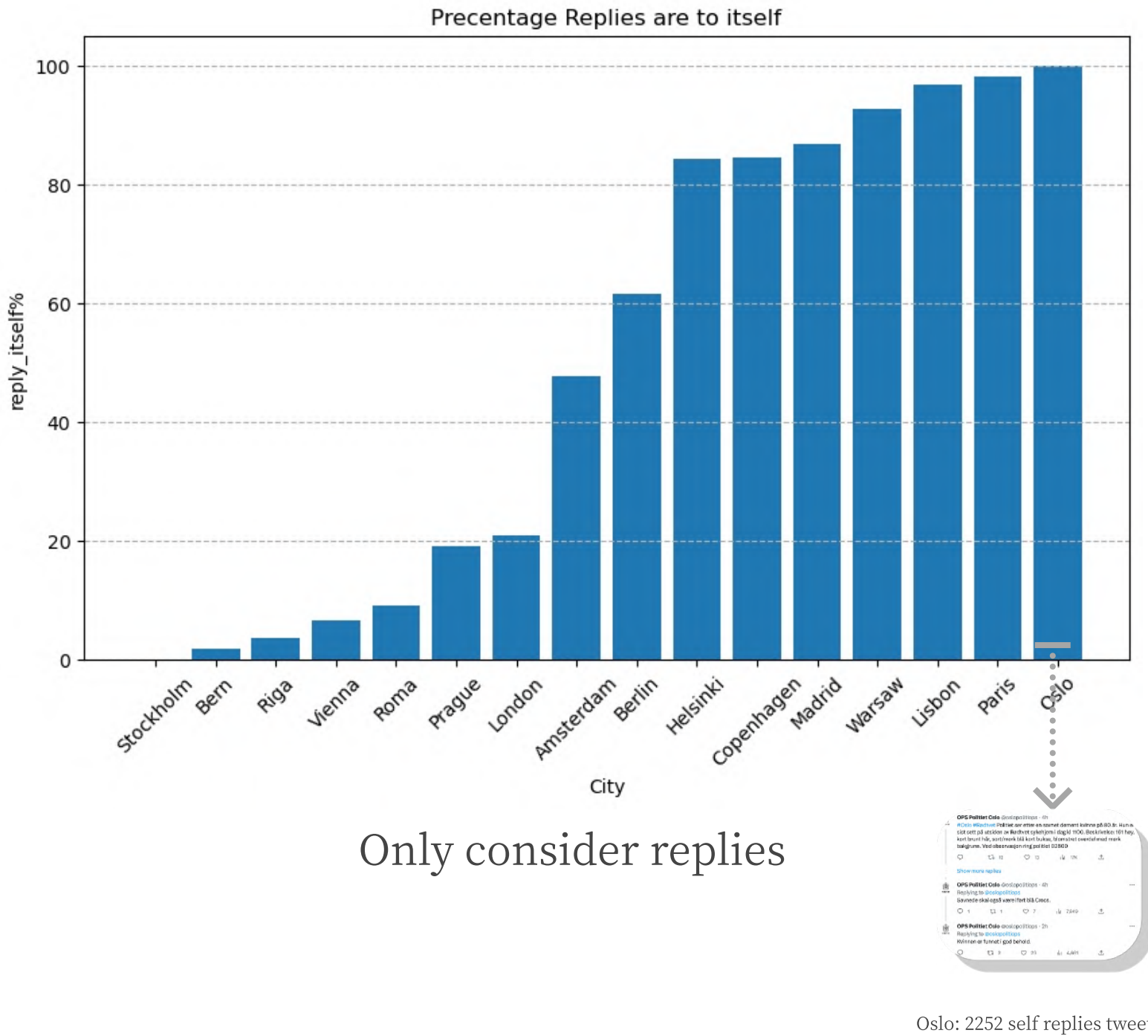
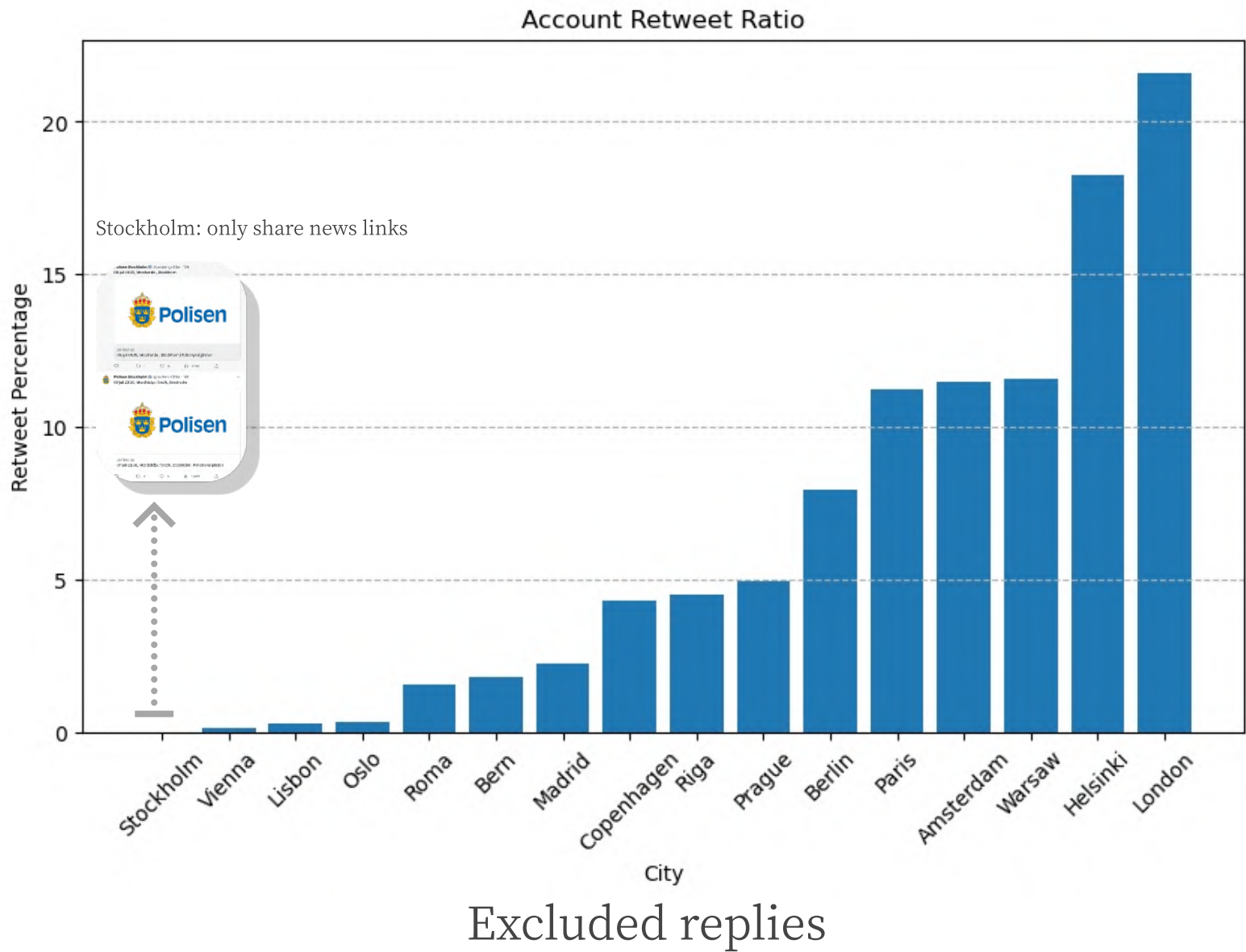


# ACCOUNT TWEETS ANALYSIS - LEVEL OF ACTIVITY



DAILY TWEETS

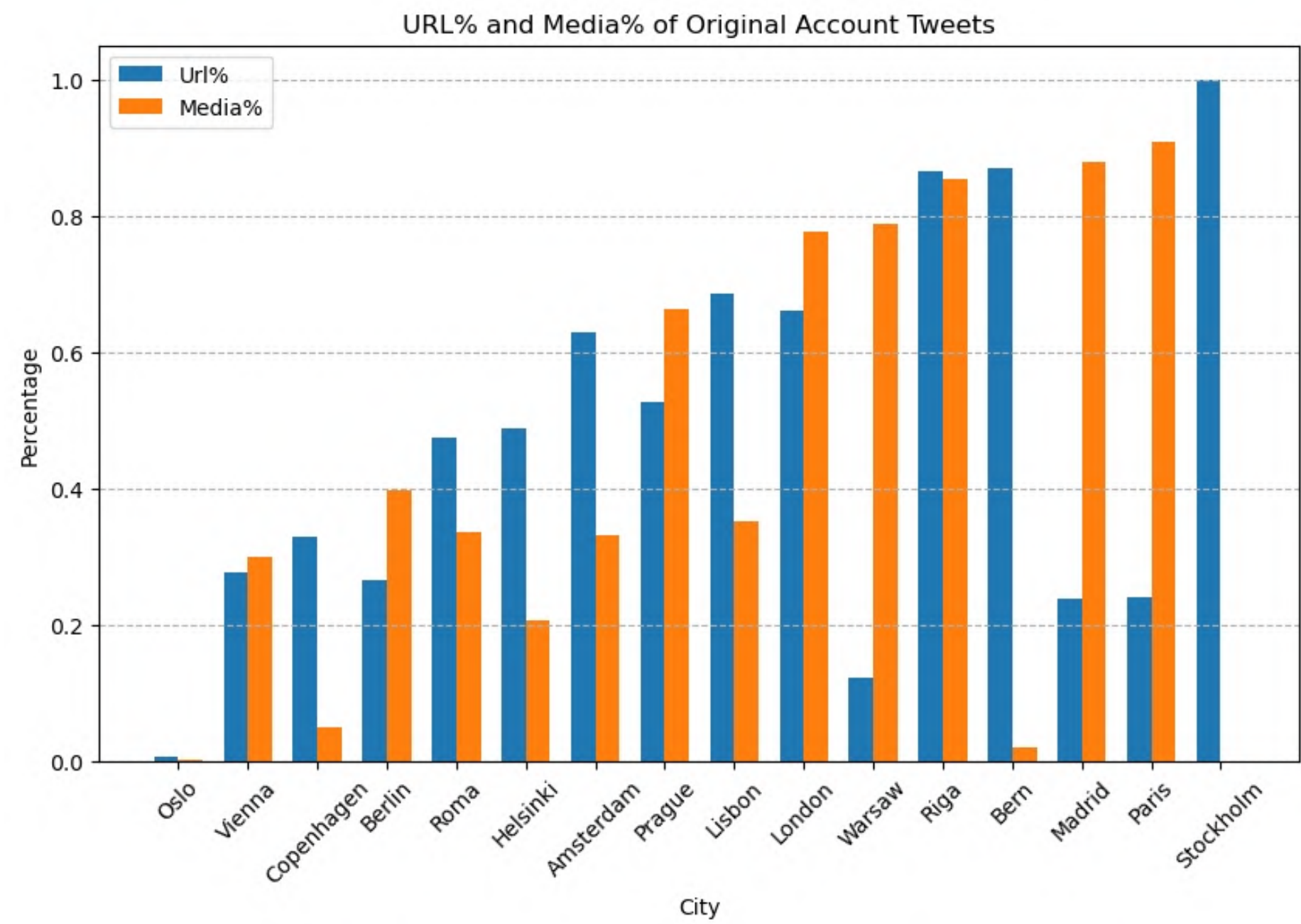




Retweeted and Mentioned Accounts



# ACCOUNT TWEETS ANALYSIS - RESOURCE SHARING

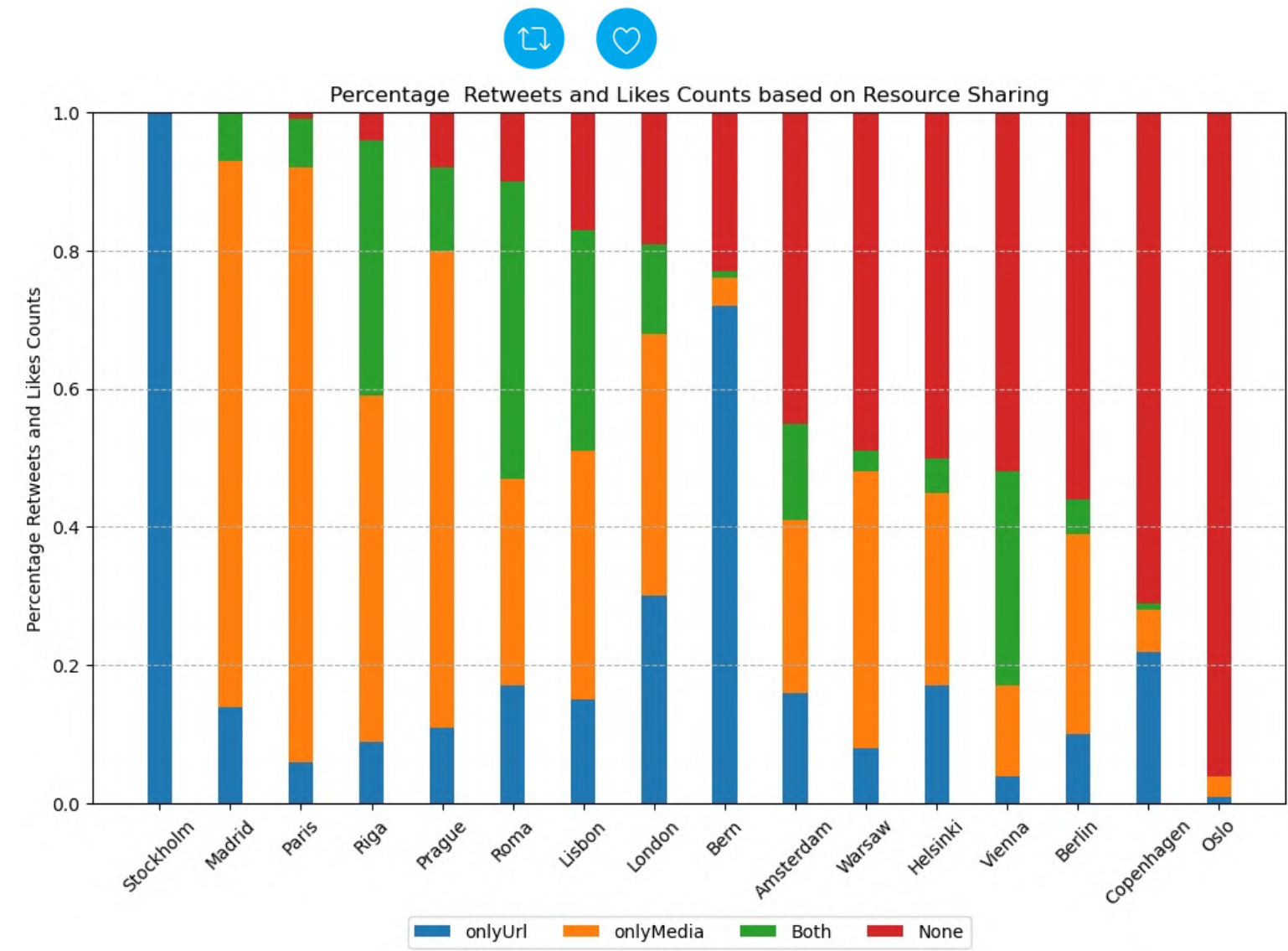
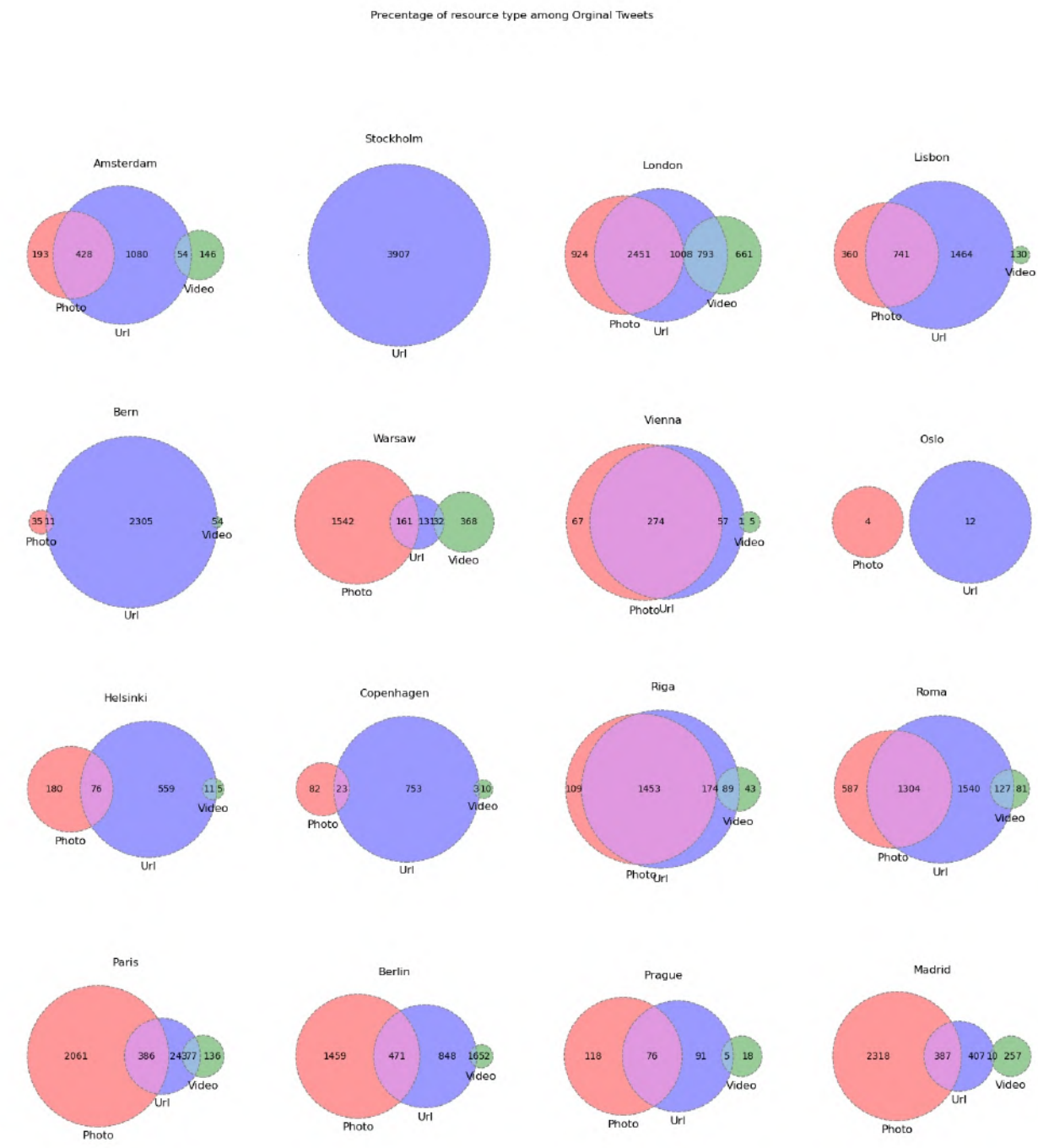


URL links





# ACCOUNT TWEETS ANALYSIS - RESOURCE SHARING

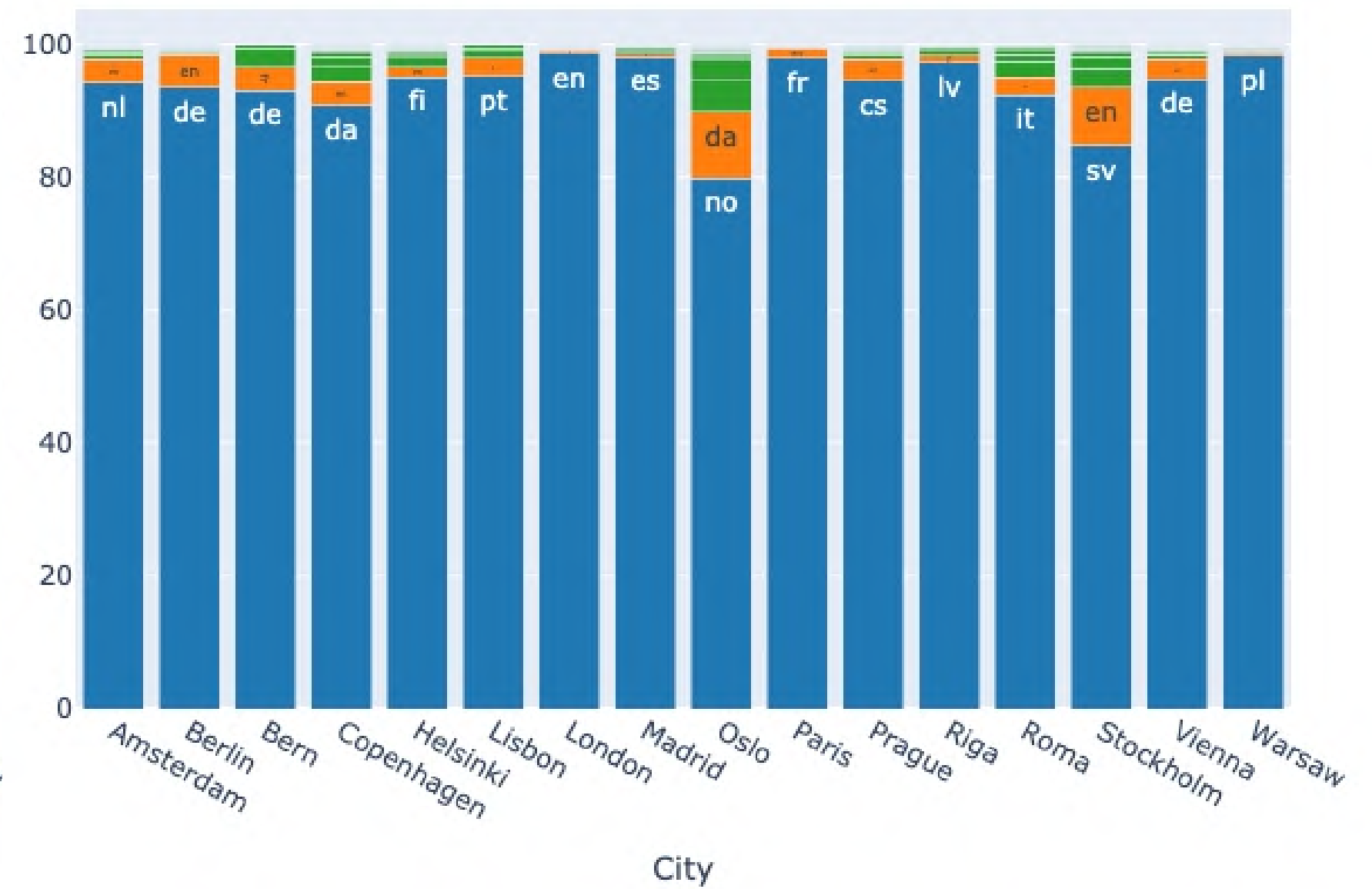




# ACCOUNT AND SEARCH TWEETS ANALYSIS - LANGUAGE



English Account Tweets Topics

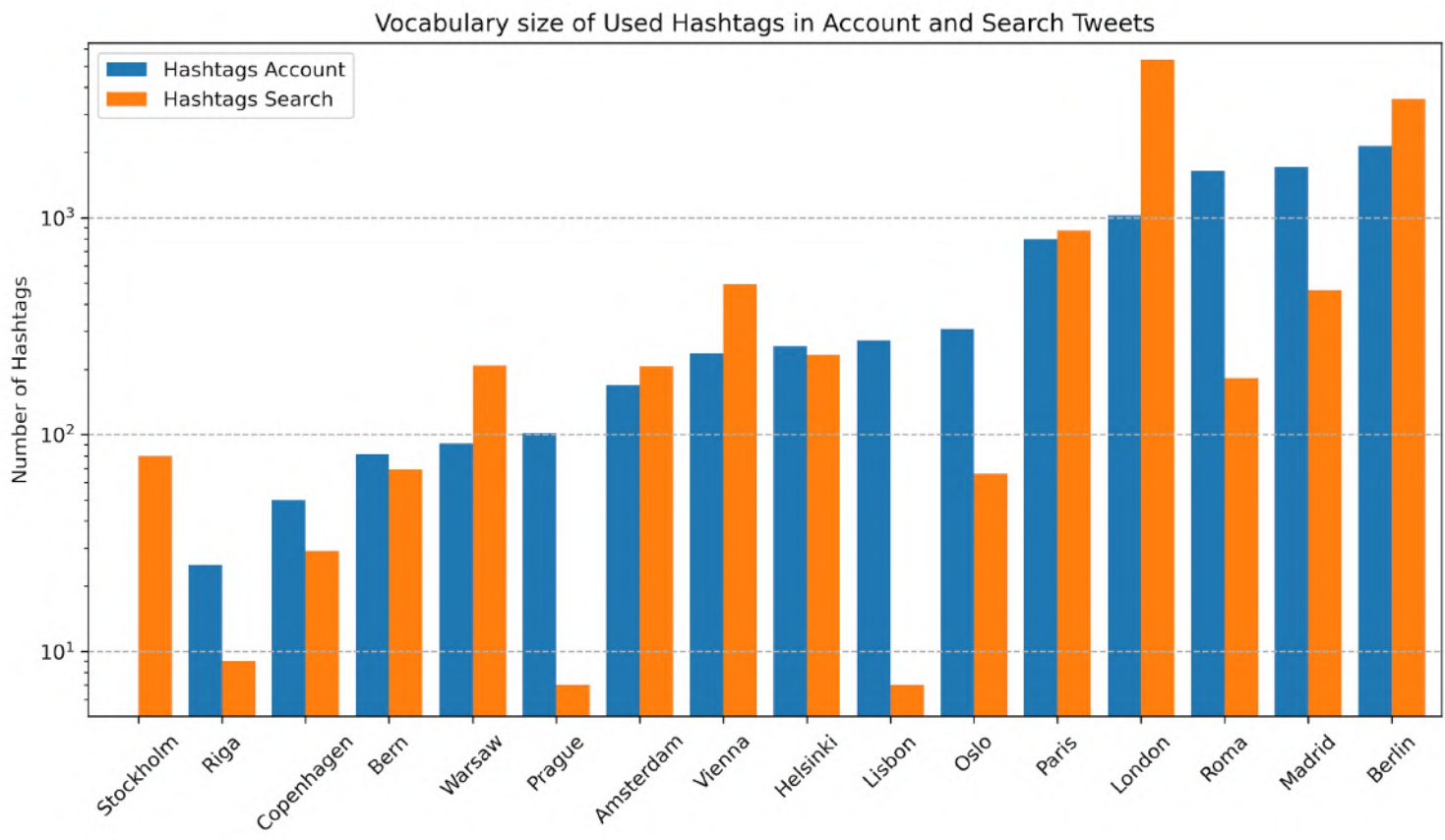
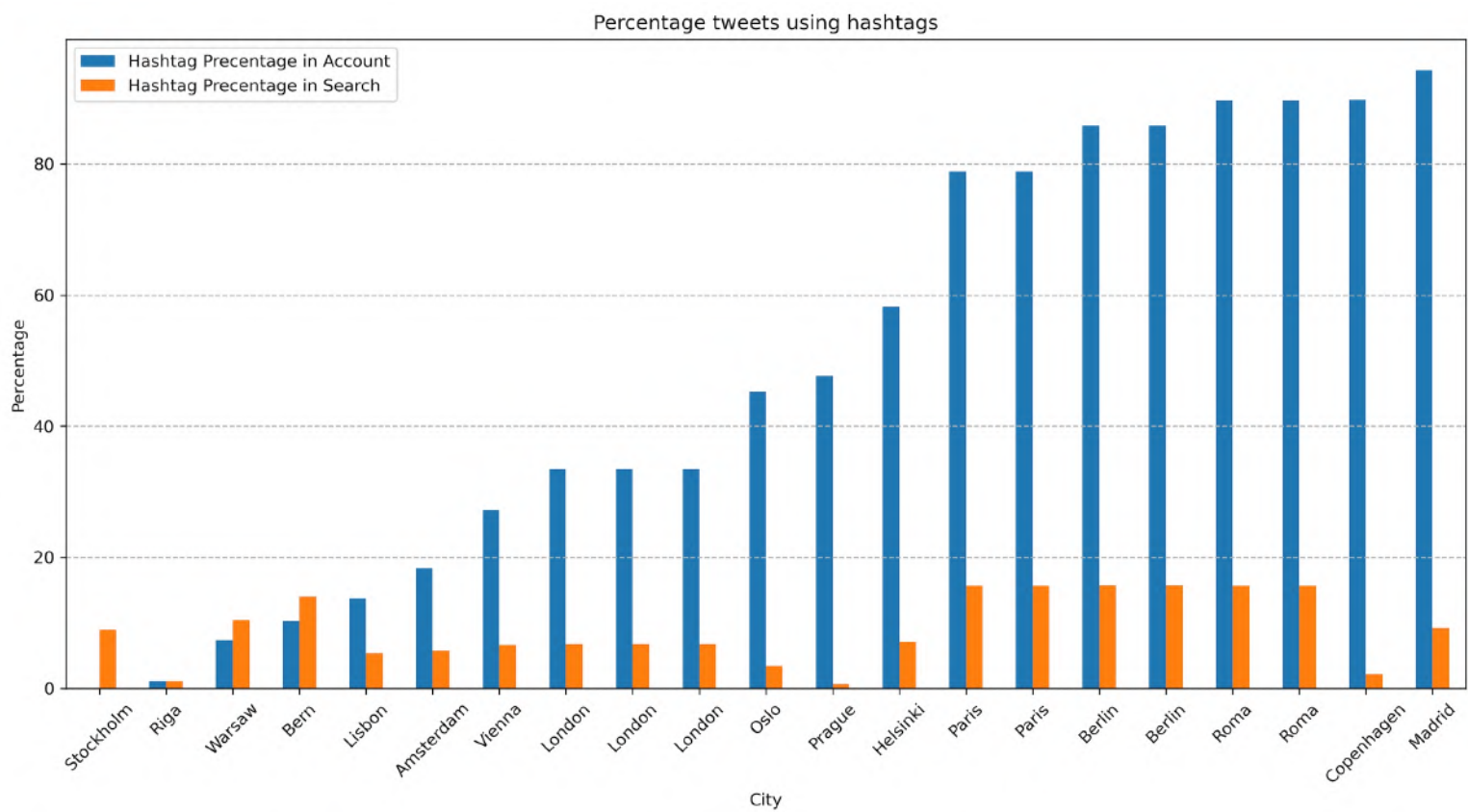


English Search Tweets Topics





# ACCOUNT AND SEARCH TWEETS ANALYSIS - HASHTAGS







# ACCOUNT AND SEARCH TWEETS ANALYSIS - HASHTAGS

## ACCOUNT



## SEARCH

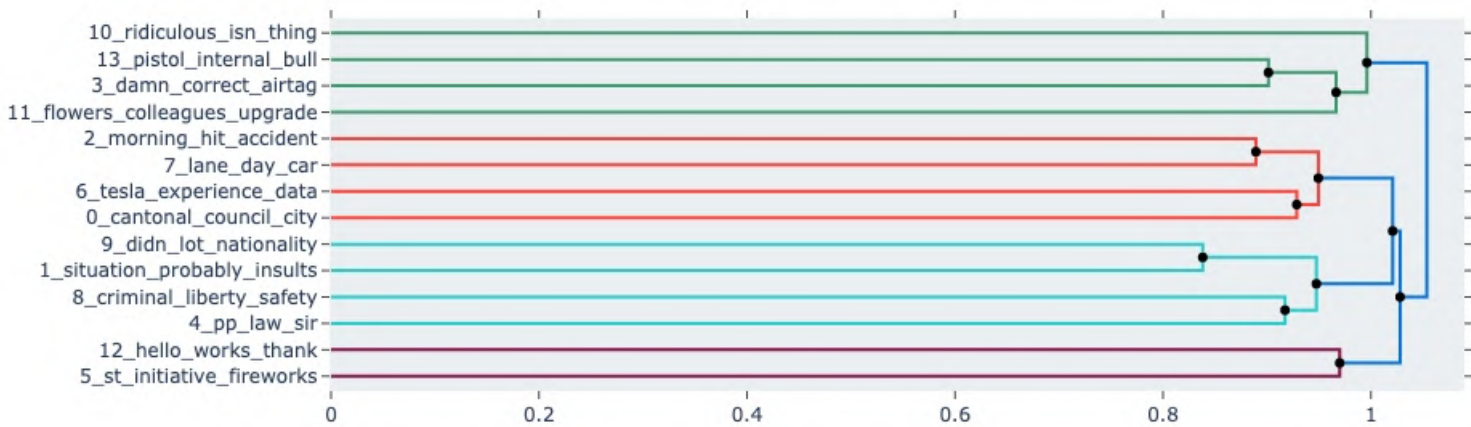




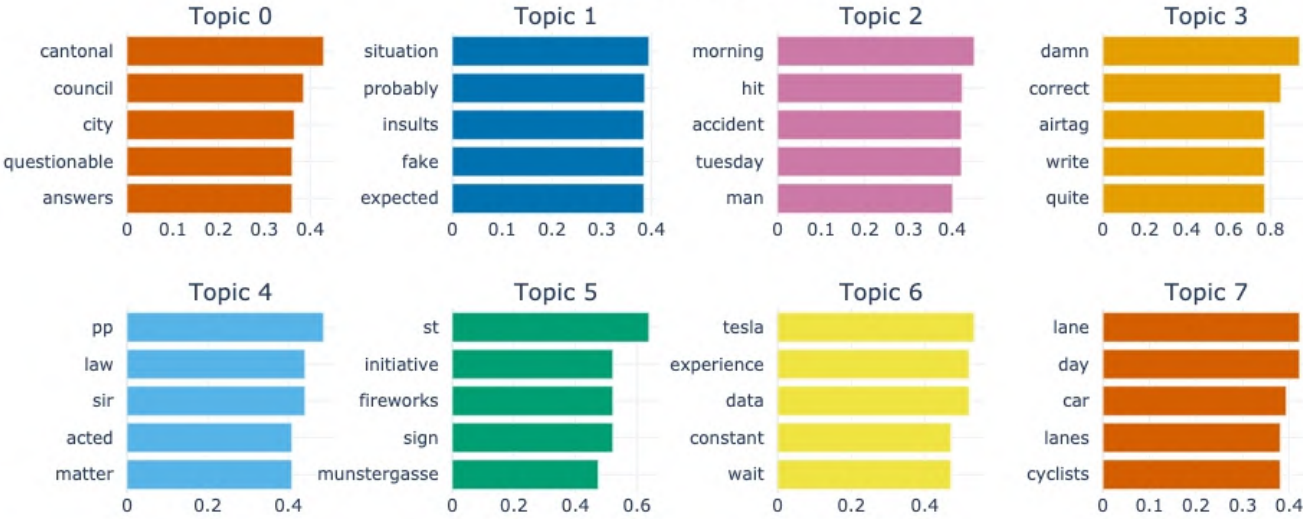


# TOPICS IN ACCOUNT AND SEARCH TWEETS

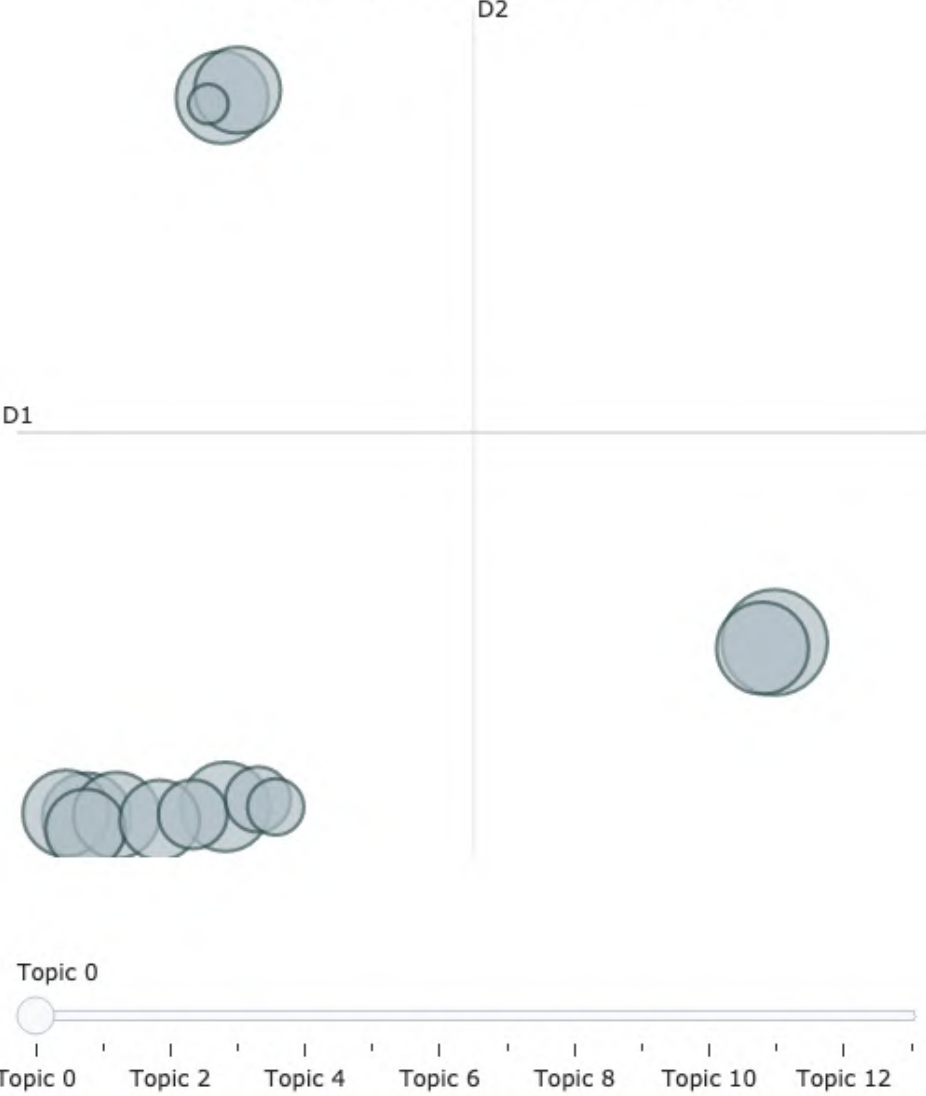
Hierarchical Clustering



Bern\_topic\_score



Intertopic Distance Map





# TOPICS IN ACCOUNT TWEETS—COMMON TOPICS

## Insights into Police Work



## Emergency Reporting Guidelines



## Police action and response



Aid and support

Making arrests and investigating on crimes

Public Safety and security measurements

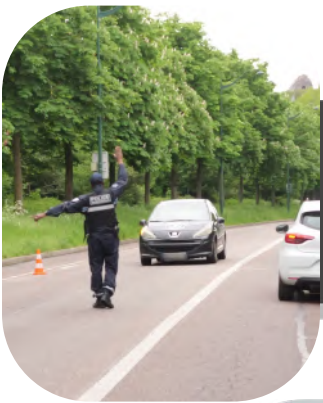
## Seek public assistance



Calls for witnesses

Reports on misbehavior and crime

## Traffic Management and Driving Control



## Information dissemination



Urban issue

Raise awareness

Public safety and police presence

General announcement

## Drugs and alcohol-related issues







## TOPICS IN SEARCH TWEETS

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### COMMON TOPICS

Public safety concerns and crime rates

Traffic management and road safety

Public sentiments about police performance  
and conduct

Reports of incidents and call for police action

### CITY SPECIFIC

Stockholm - concern of crime

Madrid - environmental concern

Riga - scooter issue

Paris - public gathering

Lisbon, Paris - nightlife

Copenhagen, Stockholm - religion and multicultural

...





## TOPICS IN ACCOUNT AND SEARCH TWEETS — CLOSE ALIGNMENT



A:Reporting channels and citizen engagement

S:Authorities' accountability



A:Requesting public help in investigations

S:Express urgency for support and attention



Similar crimes and incidents,  
including discussions on drone  
surveillance in Stockholm.





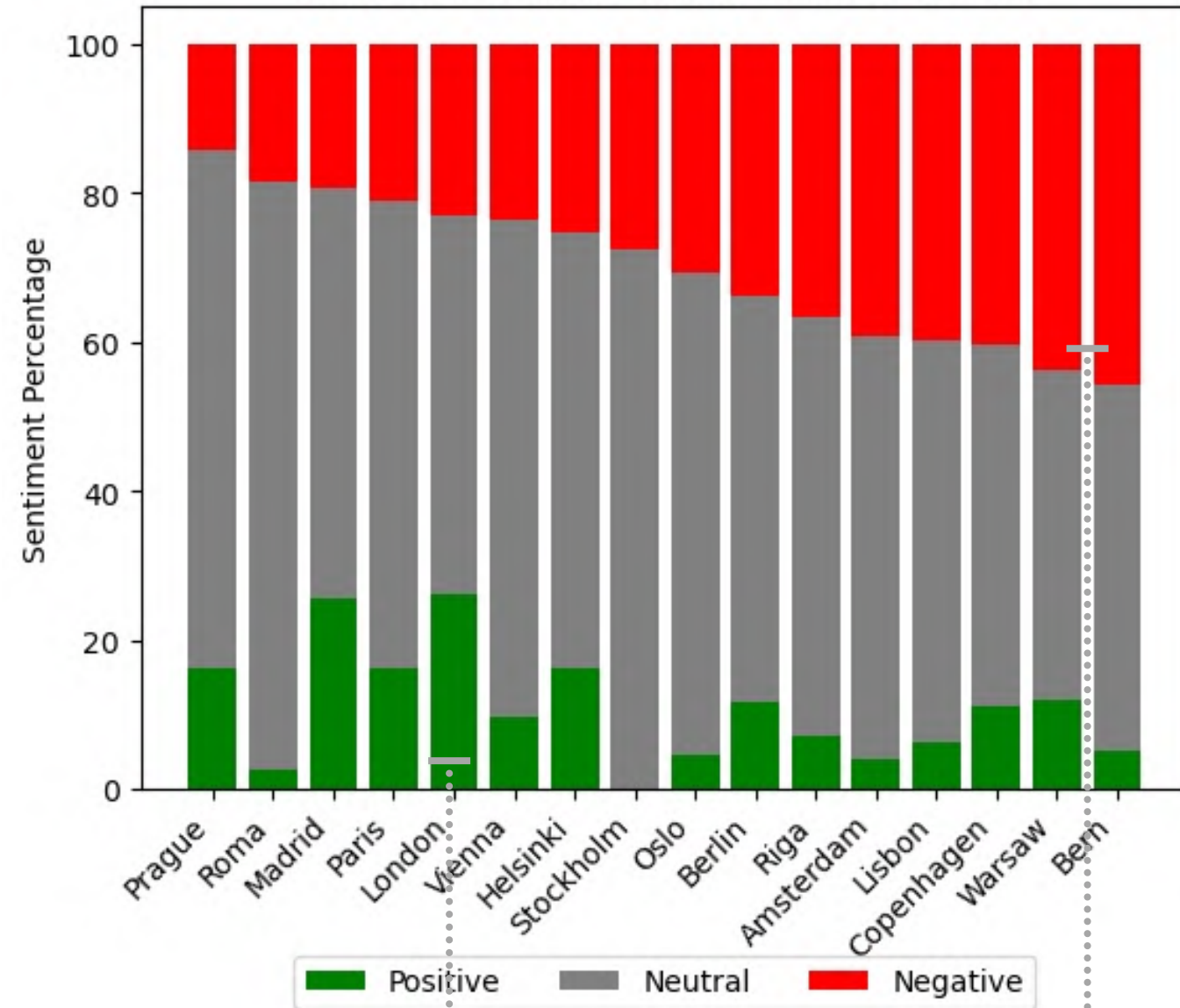
TOPICS IN ACCOUNT AND SEARCH TWEETS — SHARE A TOPIC





# SENTIMENTS IN ACCOUNT AND SEARCH TWEETS

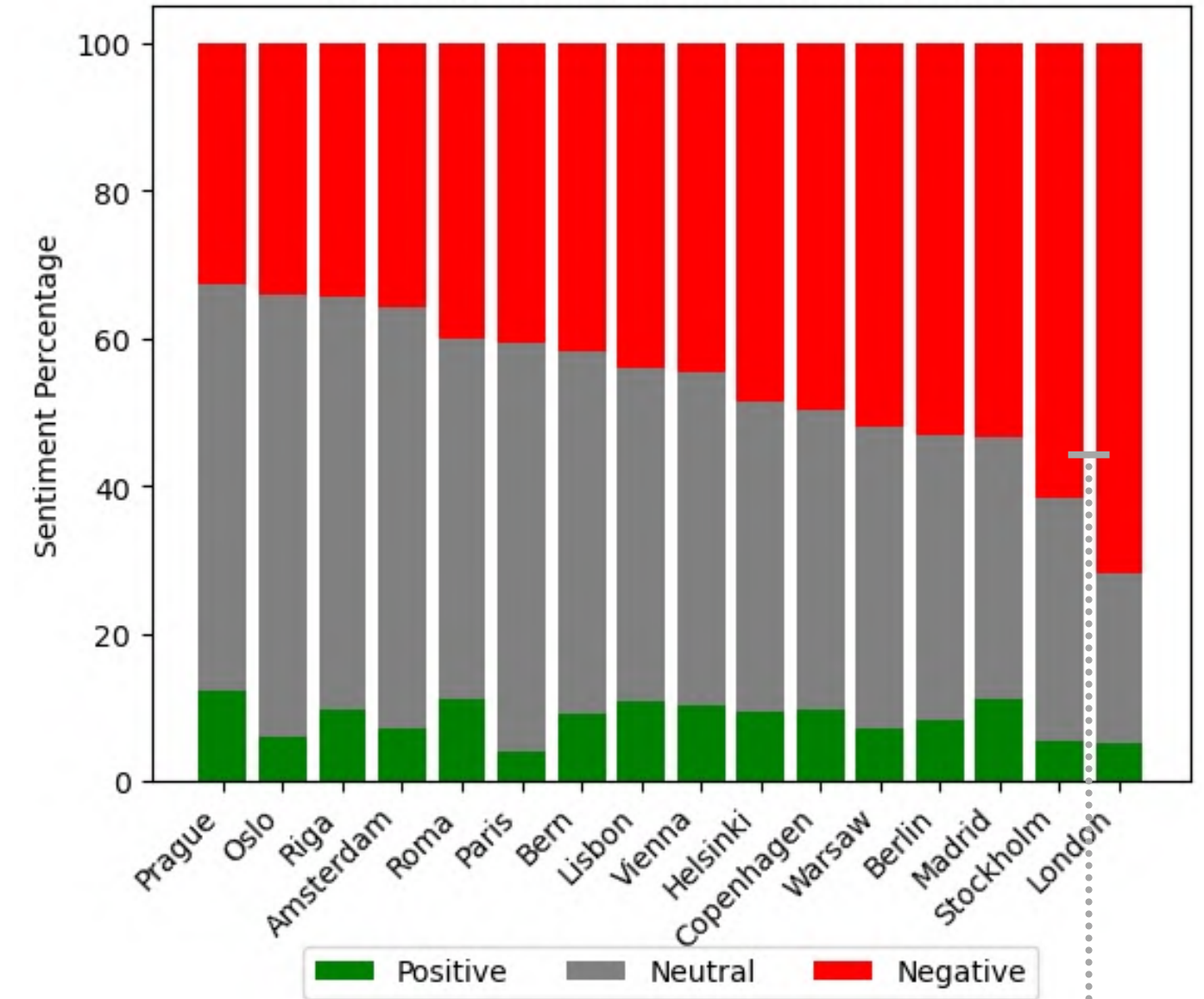
Sentiment Distribution of Account Tweets



London 26.27%: encourage citizen cooperation  
Madrid 24.45%: issues reminders and safety alerts

Bern 45.82%: calls for witnesses and reactions to public events  
Warsaw 44.82%: related to crime

Sentiment Distribution of Search Tweets



London 71.88%: calls for accountability and fairness  
Stockholm 61.6%: crime reporting and public security concerns





## CONCLUSION AND FUTURE WORK

### MAIN TAKEAWAYS RQ1:

- Twitter isn't an apt medium for crime reporting or emergency service
- More frequently using social media during special events Eg. Berlin, Vienna, Twitter Marathon
- Retweets: Helsinki, London - H; Vienna, Oslo, Lisbon -L
- Retweet accounts: government bodies, local law enforcement, emergency services, and transportation services
- Resource sharing: 10 cities have more than 80%, no correlation with engagement level
- Shared URLs: official city authorities' websites ; Copenhagen, Vienna, Berlin, Paris tweets links of social media platforms
- Local language predominates and English tweets topics aligned closely with all tweets
- Hashtags: City name and Police related term were commonly used; Berlin, Madrid, and Rome had the most diverse hashtag vocabulary

### FUTURE WORK

- Social media usage preference
- demographic analysis of followers

- Why retweet ratios vary among cities and the type of content retweeted.
- What topics are being retweeted

- Investigate Hashtags meaning
- Role of hashtags in driving engagement







## CONCLUSION AND FUTURE WORK

### MAIN TAKEAWAYS RQ2:

- Topics in **accounts tweets** closely associated with police duties
- Unique focuses:  
Vienna - understand police work; London - report guidelines; Prague - public appreciation; Amsterdam - crime-related topics
- **Search tweets** topics are disparate , primarily complaints or concerns over crime rates and public safety.
- Various focuses :  
Paris - public gatherings; Madrid - environmental issues; Copenhagen, Oslo, Amsterdam - crime-related and multicultural concerns.
- Sentiment of tweets aligns with their topics: account tweets - neutral; search tweets - negative

### FUTURE WORK

- Link engagement and topics to an activity timeline
- Tone conveyed in account and search tweets





# THANK YOU

## Q&A



A Comparative Analysis of European City Police Presence on Twitter

Master Thesis Defense

Shasha Jiang

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