

# A Methodology for Empirical Analysis of Permission-Based Security Models and its Application to Android

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**Carleton**  
UNIVERSITY

**Canada's Capital University**



# Outline

- Problem
- Motivation
- Methodology – Self Organizing Maps
- Results
- Other Applications
- Conclusions

# Android App Installation



# Android App Installation



# Android App Installation









# Android App Installation



12:15

apps  
All applications

Top paid Top free Just in

	<b>Dictionary.com</b> Dictionary.com, LLC	FREE ★★★★★
	<b>Twitter</b> Twitter, Inc.	Installed ★★★★★
	<b>Backgrounds</b> Stylem Media	FREE ★★★★★
	<b>Talking Tom Cat Free</b> Outfit7 Ltd.	FREE ★★★★★
	<b>ASTRO File Manager</b> Metago	FREE ★★★★★
	<b>Shazam</b> Shazam Entertainment Limi...	Installed ★★★★★

# Android App Installation



The screenshot shows the top of an Android phone with various status icons (Android robot, Wi-Fi, signal strength, battery, alarm) and the time 12:15. Below the status bar is a grey header for the 'apps' drawer, labeled 'apps' and 'All applications' with a search icon. Three tabs are visible: 'Top paid', 'Top free', and 'Just in'. The 'Top free' tab is selected. The list of apps includes:

- Dictionary.com** (Dictionary.com, LLC) - FREE, 5 stars
- Twitter** (Twitter, Inc.) - Installed, 5 stars
- Backgrounds** (Stylem Media) - FREE, 5 stars (highlighted with a red border)
- Talking Tom Cat Free** (Outfit7 Ltd.) - FREE, 5 stars
- ASTRO File Manager** (Metago) - FREE, 5 stars
- Shazam** (Shazam Entertainment Limi...) - Installed, 5 stars

# Android App Installation



12:16

**Backgrounds** FREE  
Stylem Media ★★★★☆

About Comments

**Description**

10,000 awesome unique designs.  
New Backgrounds added daily.

Categories: Funny, Cute, Quotes,  
Sunsets, Beaches, Cars, Girly, Guys,  
Games, Flowers, Models, Love,  
Christmas, Military, Money, Sports,  
City, Scary, Money, New Years, Music,  
Movies, Animals, Space, ...

Set Contact Icons. #1 iPhone  
Wallpaper app. Uses (but not  
endorsed by) Flickr API.

Version 2.0.0 120KB

Install



# Android App Installation



12:16

**Backgrounds** FREE  
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Version 2.0.0 120KB


**Install**

# Android App Installation



 **Backgrounds** FREE  
Stylem Media ★★★★★


This application has access to the following:

-  **Network communication**  
full Internet access
-  **Your personal information**  
read contact data, write contact data
-  **Storage**  
modify/delete SD card contents
-  **Phone calls**  
read phone state and identity
-  **System tools**  
prevent phone from sleeping


 **Show all**

# Android App Installation



 **Backgrounds** FREE  
Stylem Media ★★★★★

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 **Show all**

OK

Cancel

# Android App Installation



Android system icons: Android robot, Downloads, USB, Wi-Fi, Signal strength, Battery, Alarm, 12:34

**Backgrounds** FREE  
Stylem Media ★★★★★

- ! Your personal information**  
read contact data, write contact data
- ! Storage**  
modify/delete SD card contents
- ! Phone calls**  
read phone state and identity
- ! System tools**  
prevent phone from sleeping

---

**Hide**

---

- Network communication**  
view network state
- System tools**  
set wallpaper

# Android App Installation



12:34

**Backgrounds** FREE  
Stylem Media ★★★★★

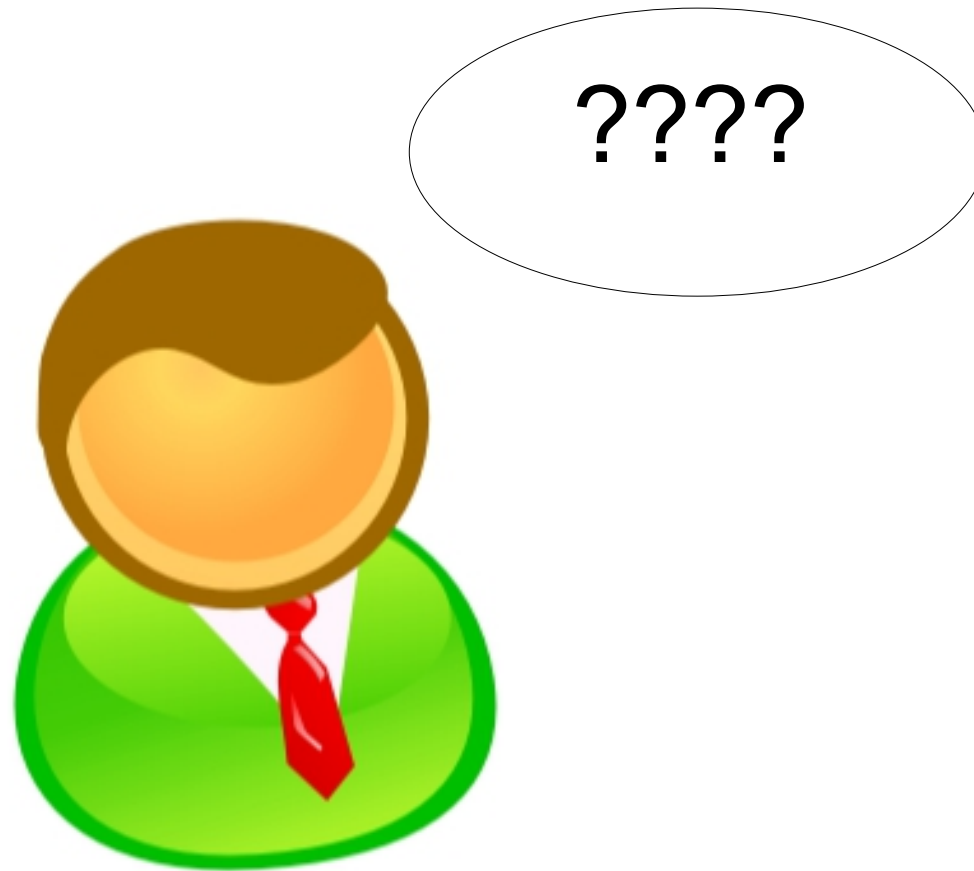
- ! Your personal information**  
read contact data, write contact data
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modify/delete SD card contents
- ! Phone calls**  
read phone state and identity
- ! System tools**  
prevent phone from sleeping

**Hide**

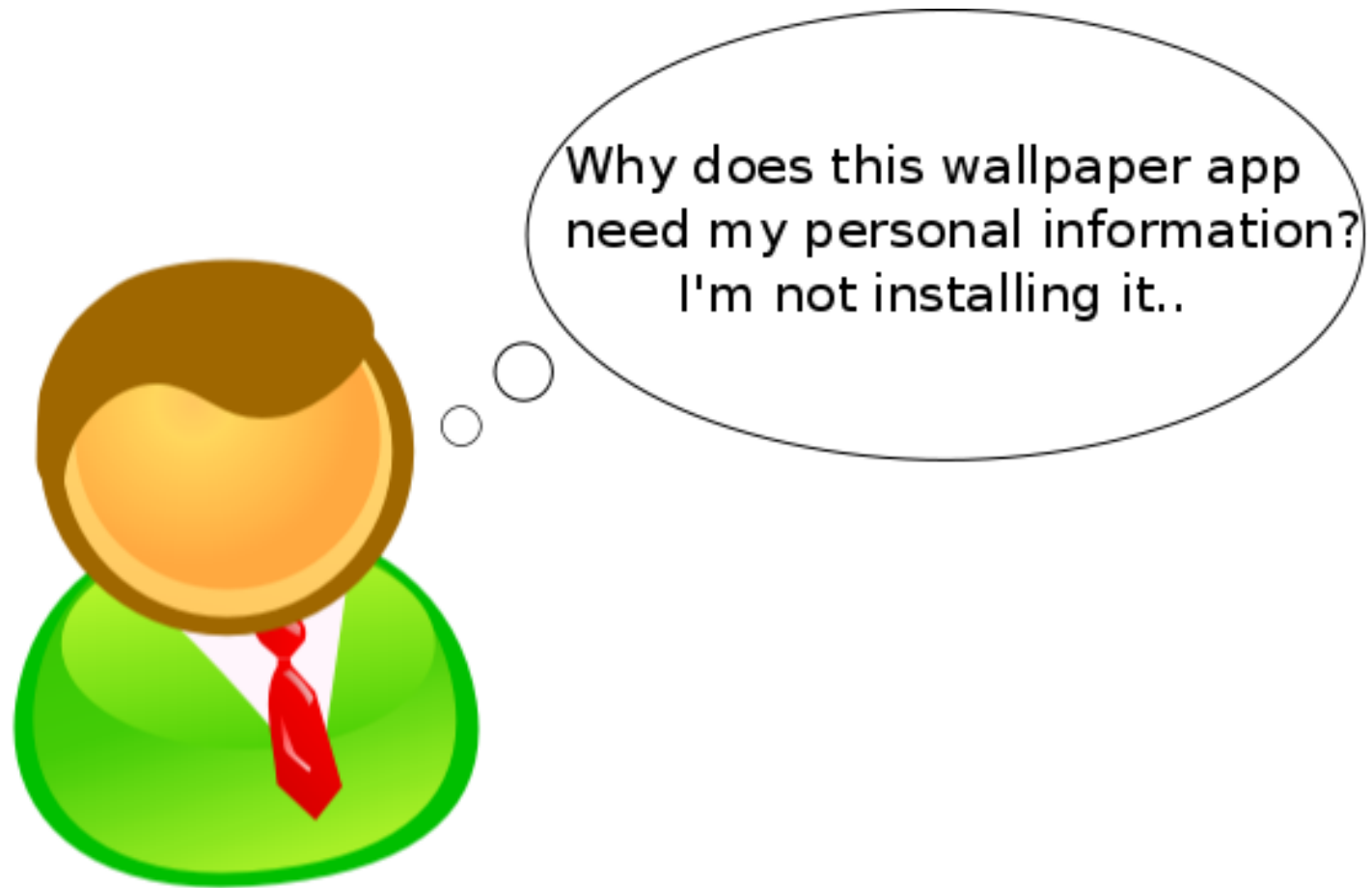
- Network communication**  
view network state
- System tools**  
set wallpaper

OK Cancel

# Problem



# Goal



# Reality

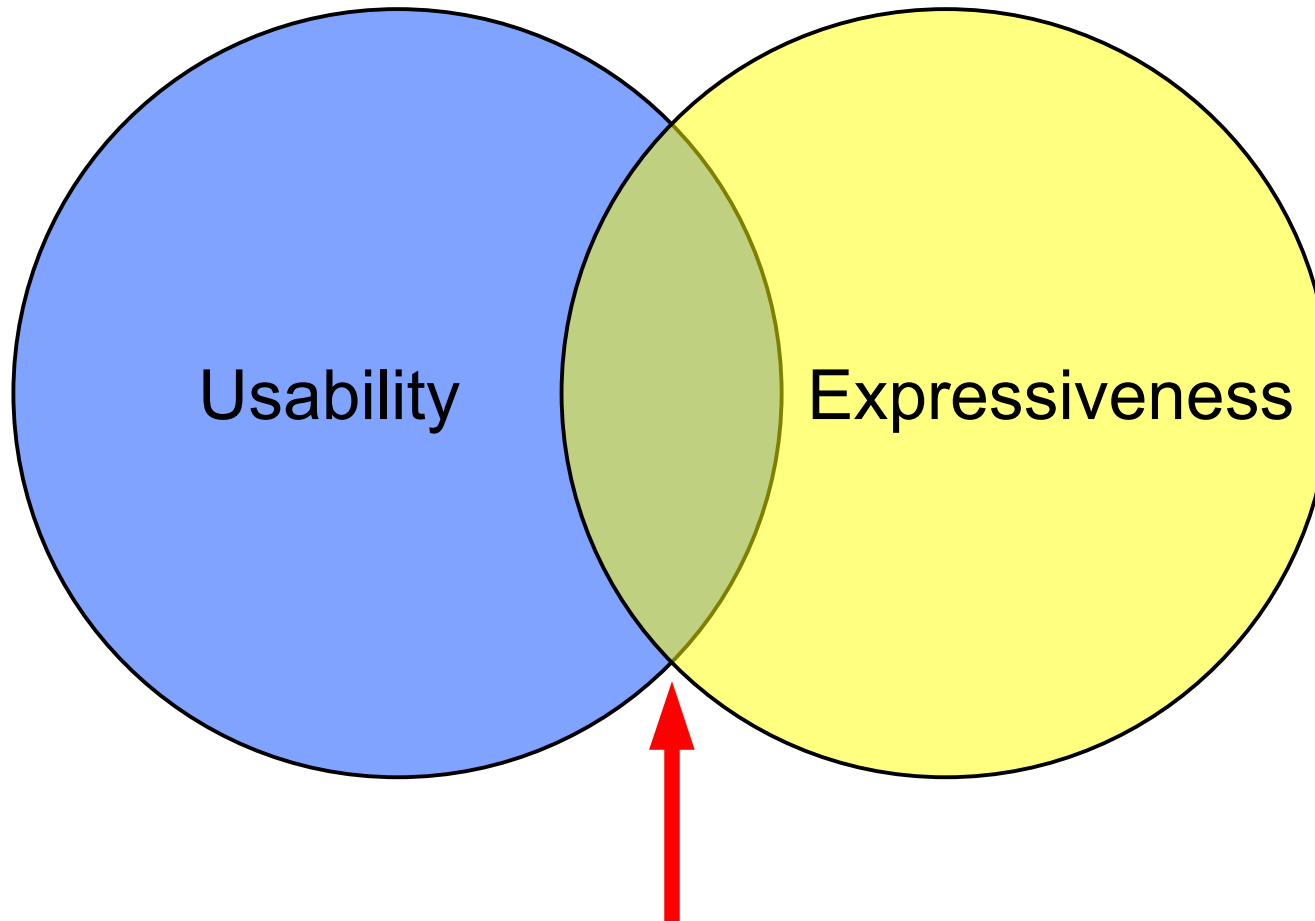




# Problem

- Usability challenges with the Android permission model.
- Not unique to Android
- If we want to improve these systems, where do we start?

# Motivation



# Motivation

- How is the permission model used in practice?
- Which permissions are used/not used?
- Which permissions are used together?
- Are permissions correlated to categories?
- More...

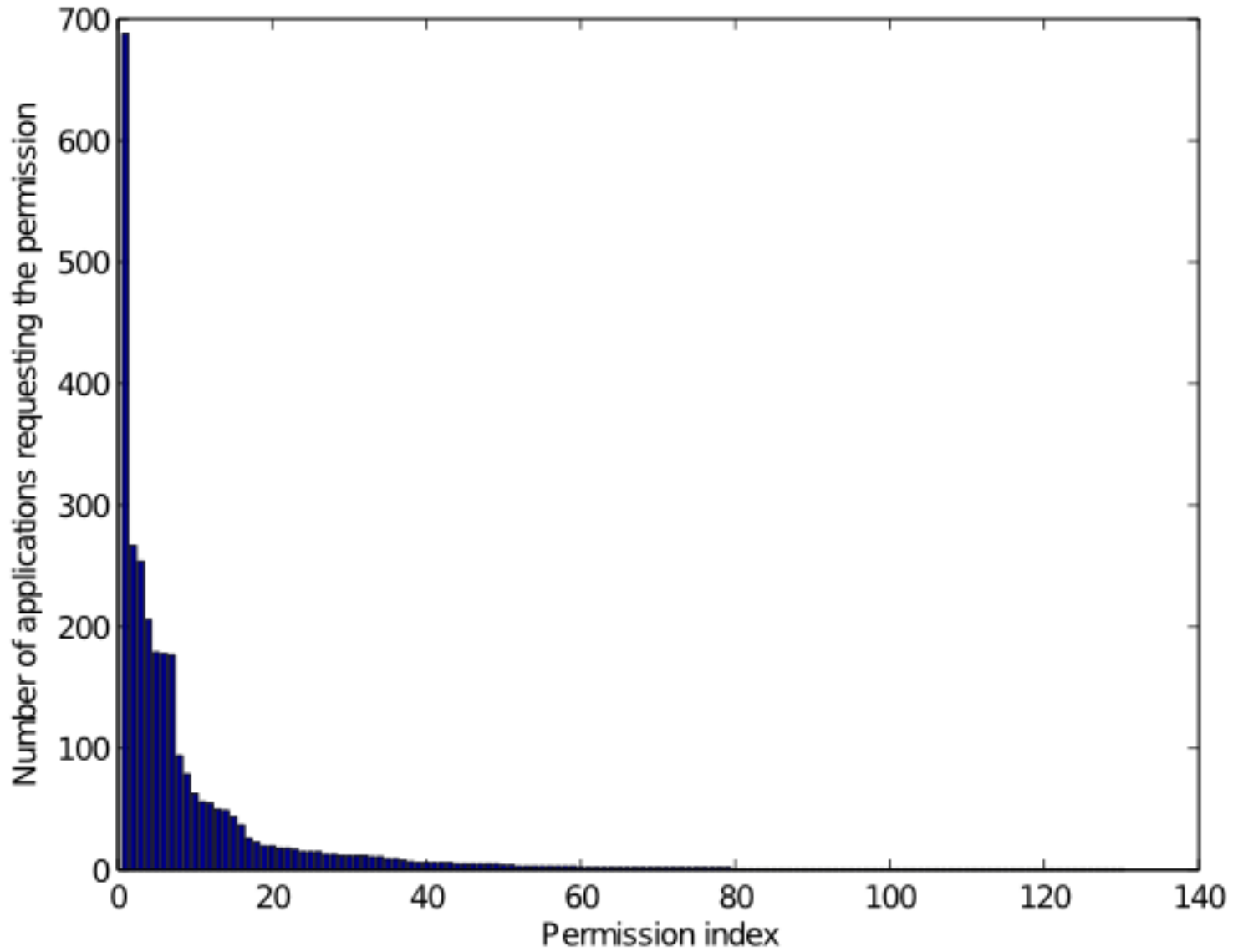
# Motivation

- Empirically analyze a permission-based access control system that's currently in use (Android)
- Generalize the Android case for use in other systems

# Dataset

- Dataset
  - 1,100 Android apps
  - Top 50 apps in 22 categories (18+4)
  - December 2009
- Some stats
  - 119 distinct permissions (38/81)
  - Max permissions in one app: 22 (Handcent SMS)

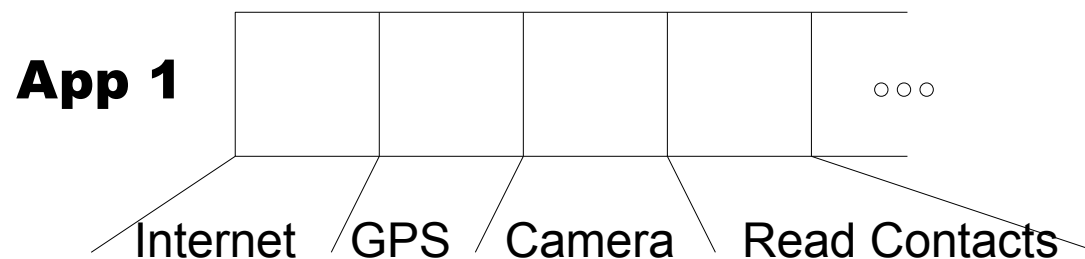
# Dataset



# Methodology

- For each app, read the manifest and build a bit string

```
<manifest>
...
<uses-permission android:name="android.permission.CAMERA" />
<uses-permission android:name="android.permission.INTERNET" />
<uses-permission android:name="android.permission.READ_CONTACTS" />
...
</manifest>
```



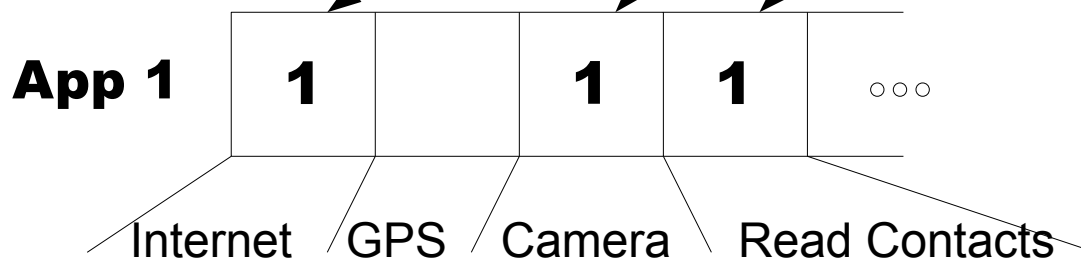
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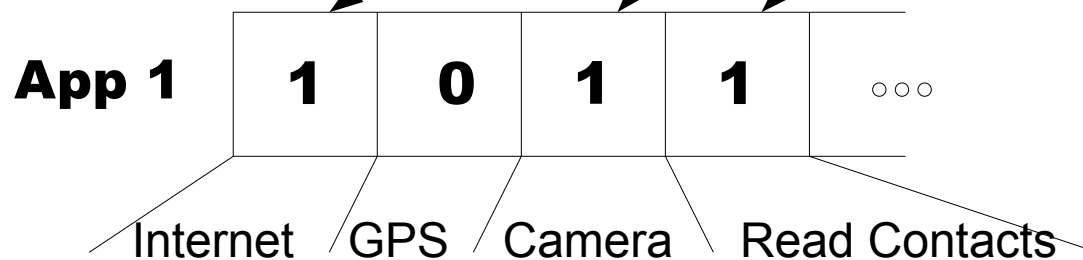
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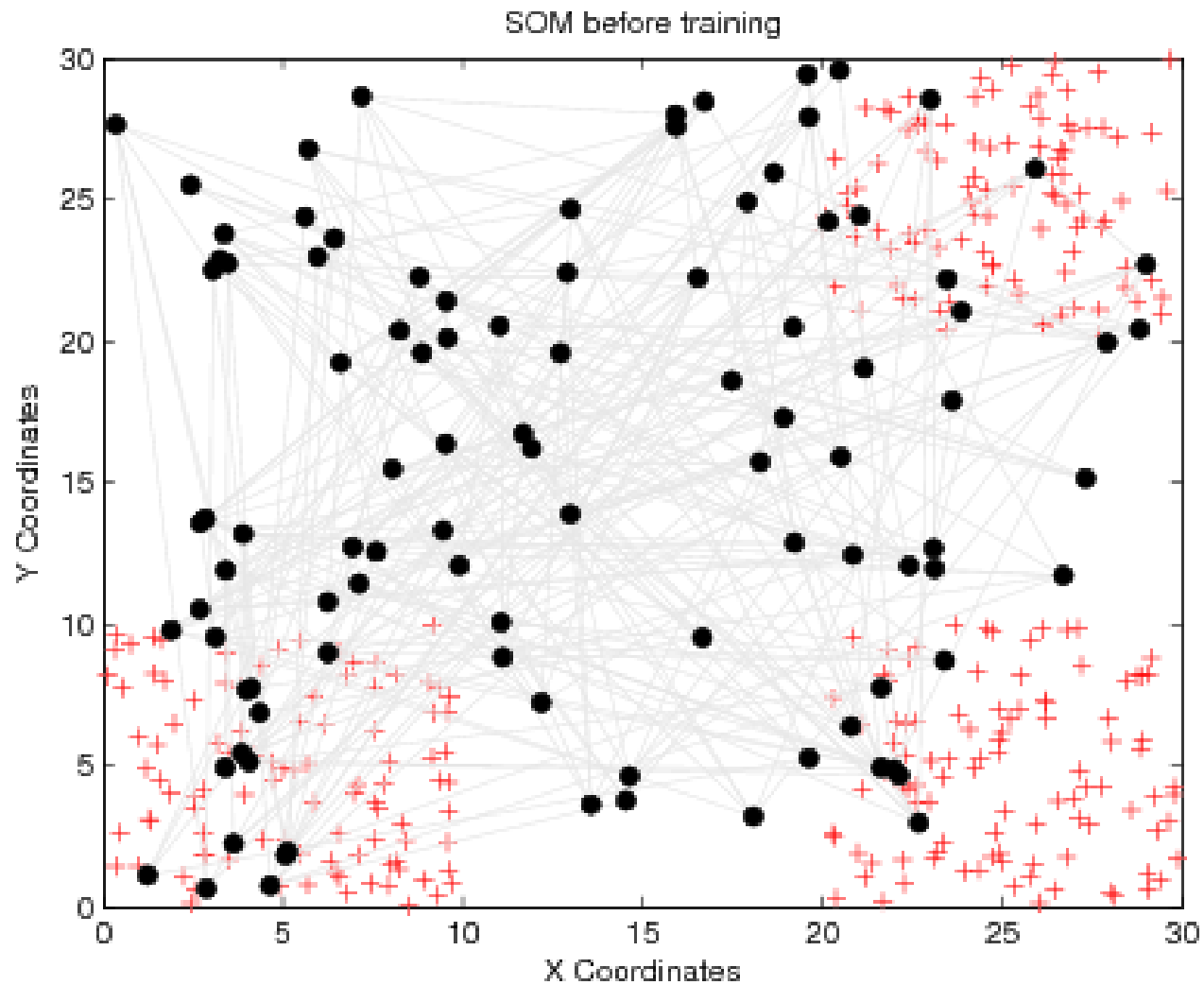
```
</manifest>
```



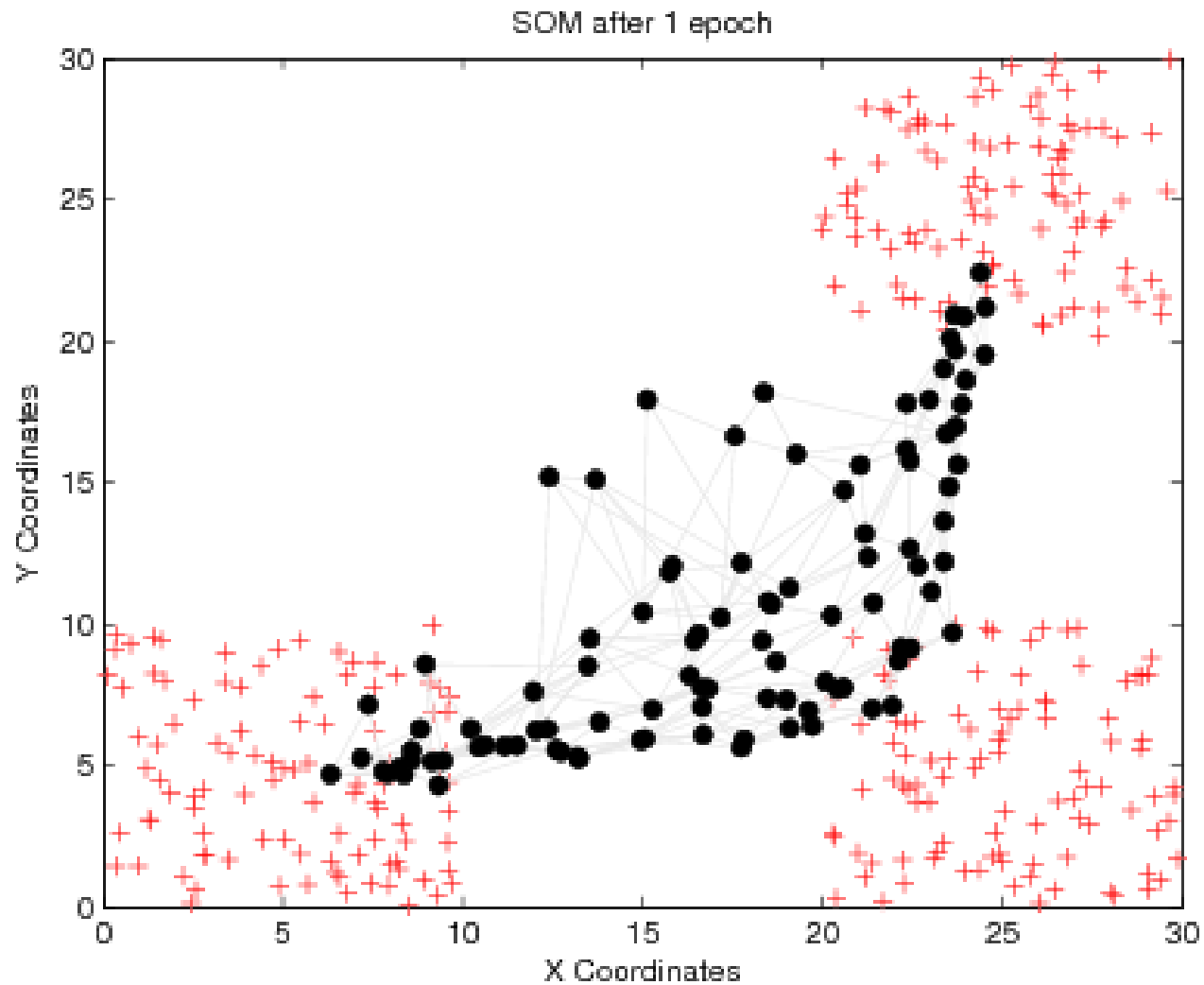
# Methodology

- Self Organizing Maps (SOM)
  - Unsupervised neural-network learning algorithm
  - Provides clustering and dimensionality reduction
  - Helps with data exploration for large datasets

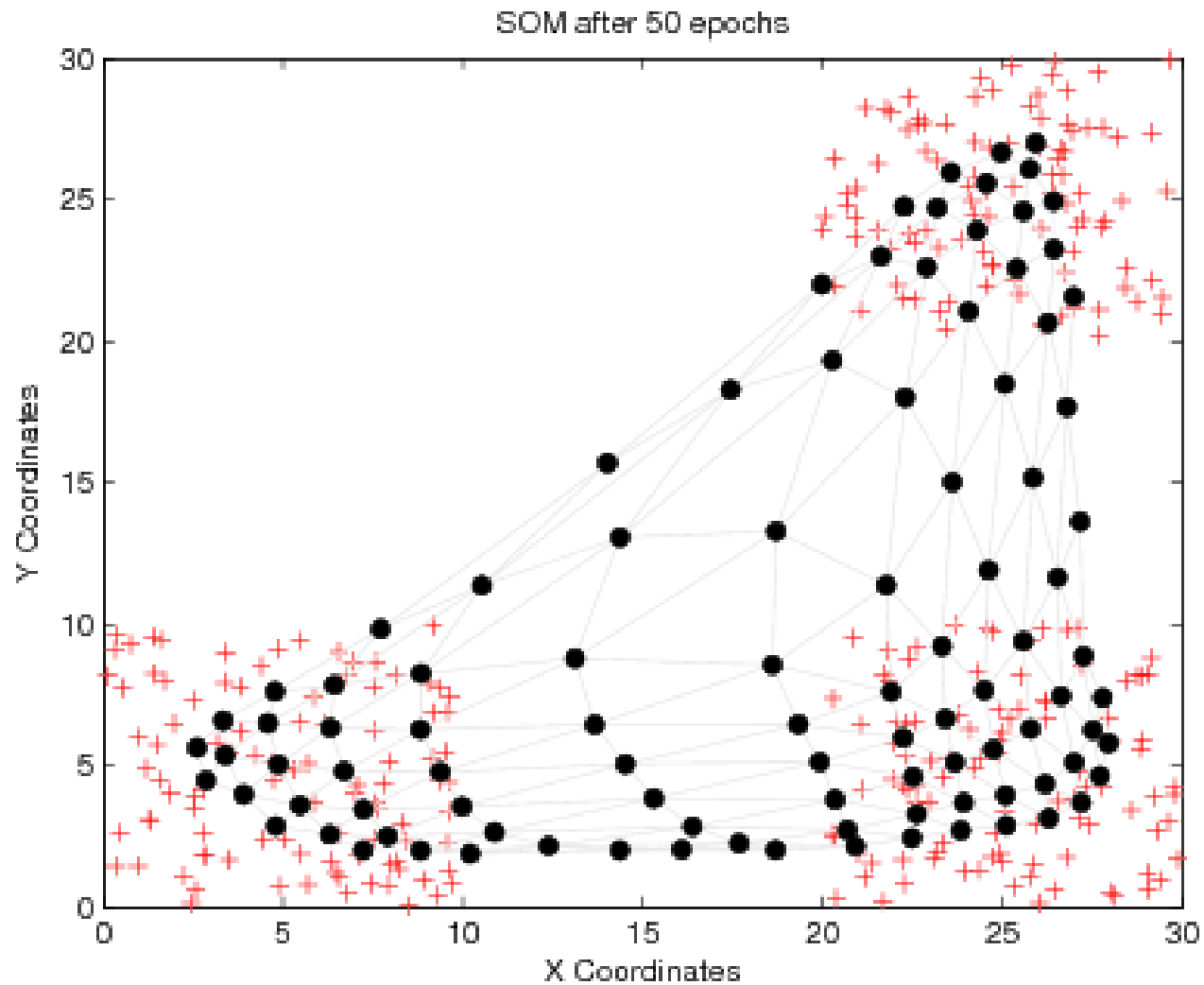
# Methodology - Example



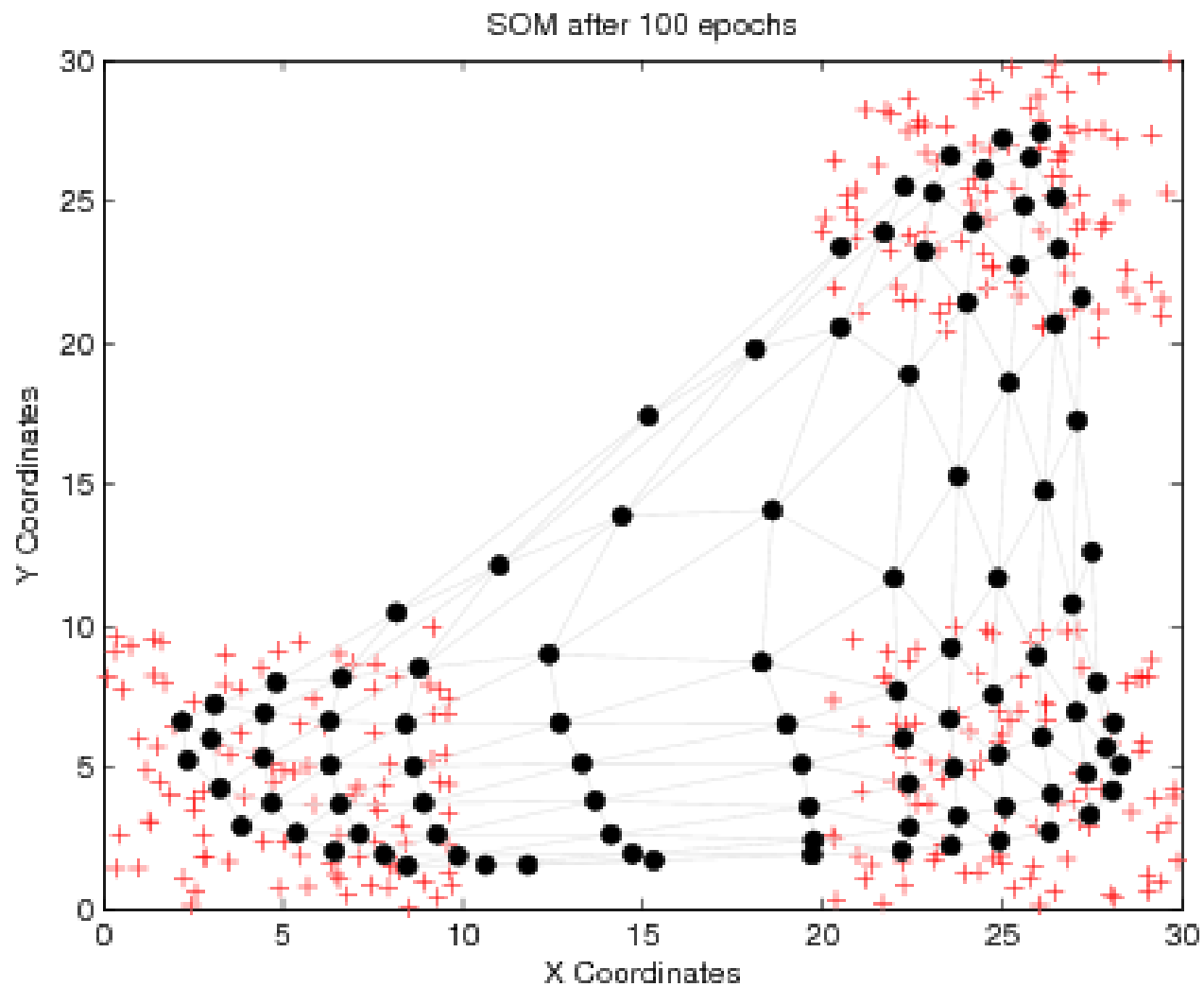
# Methodology - Example



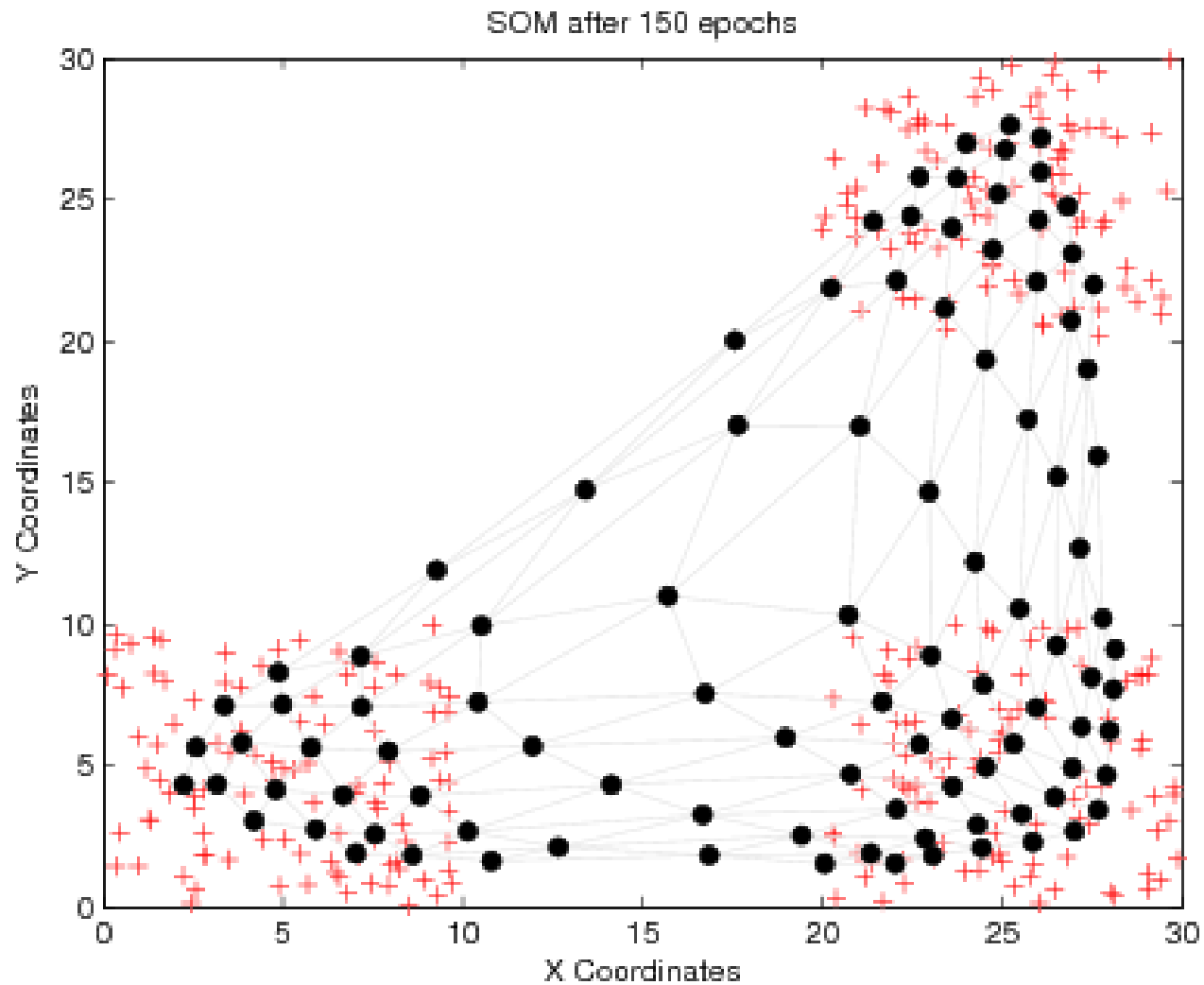
# Methodology - Example



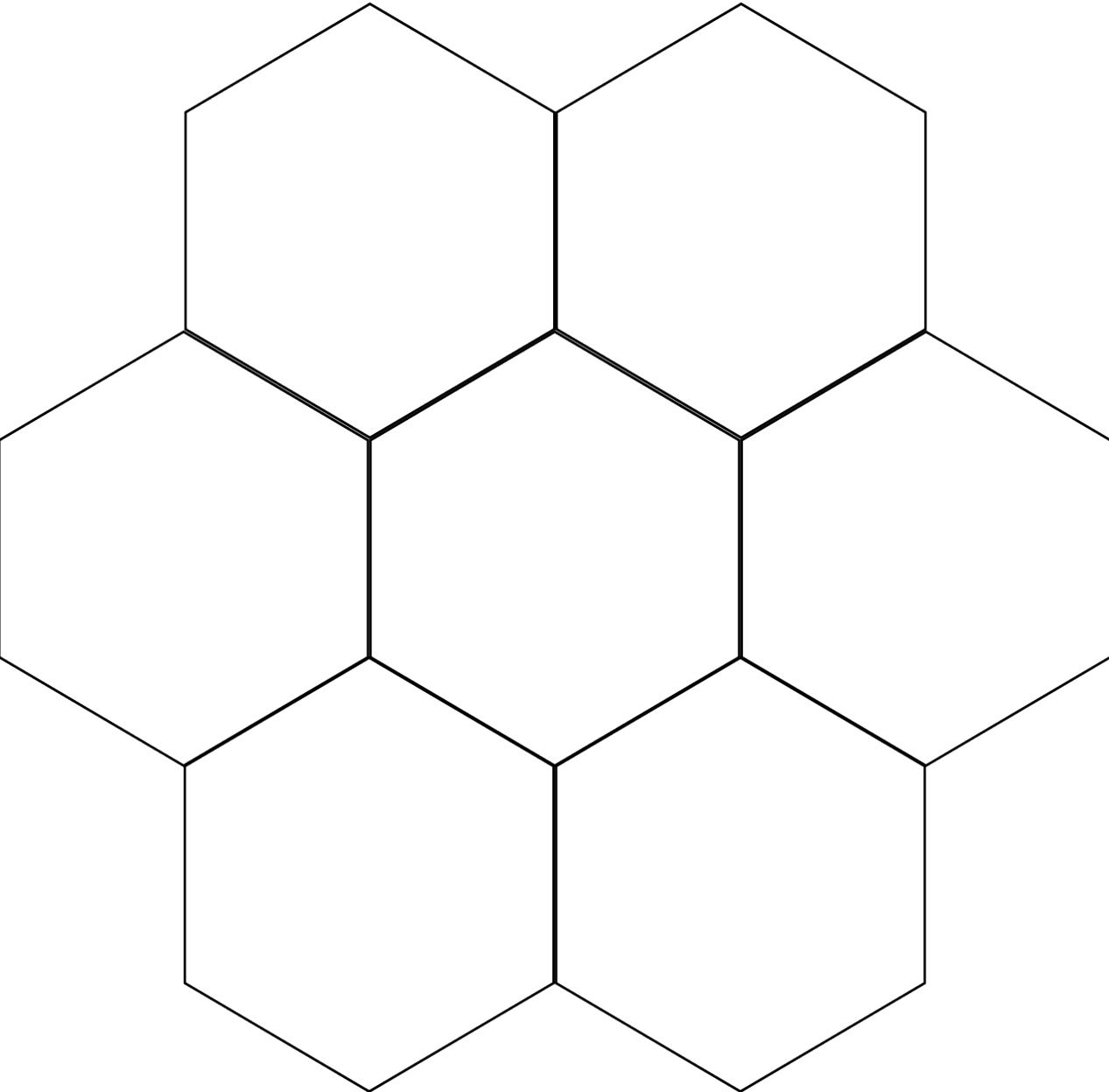
# Methodology - Example



# Methodology - Example

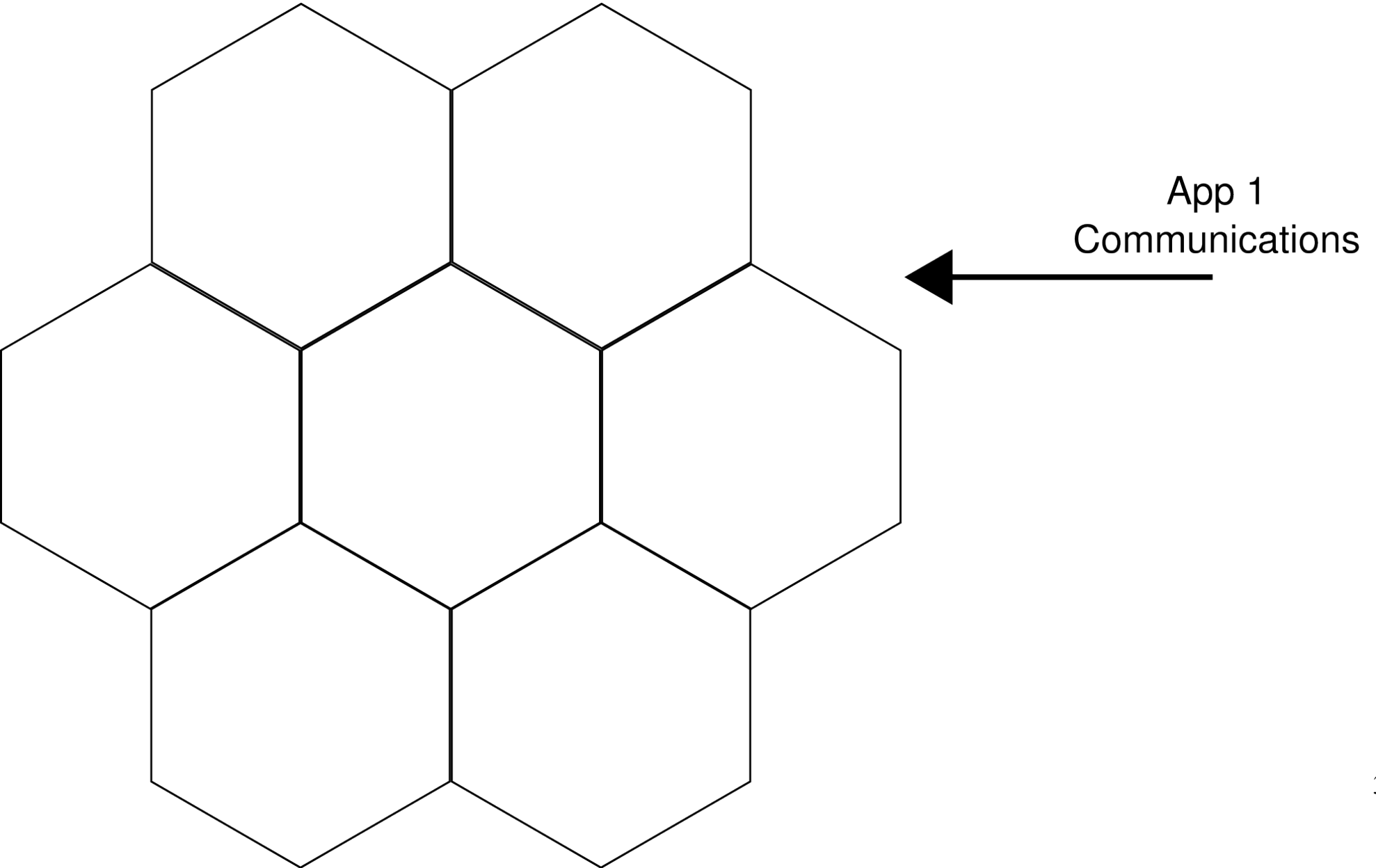


# Methodology - Labeling

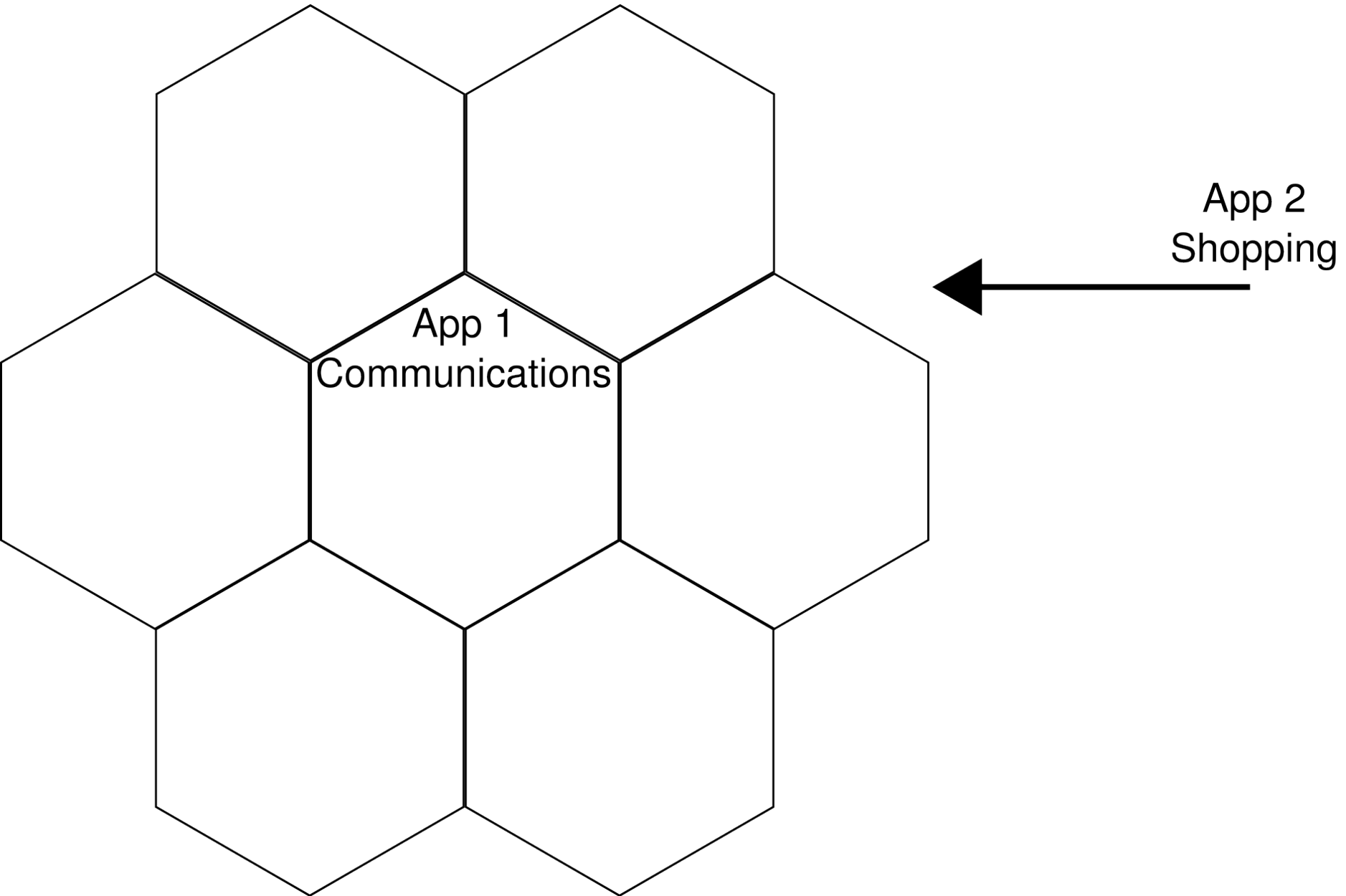




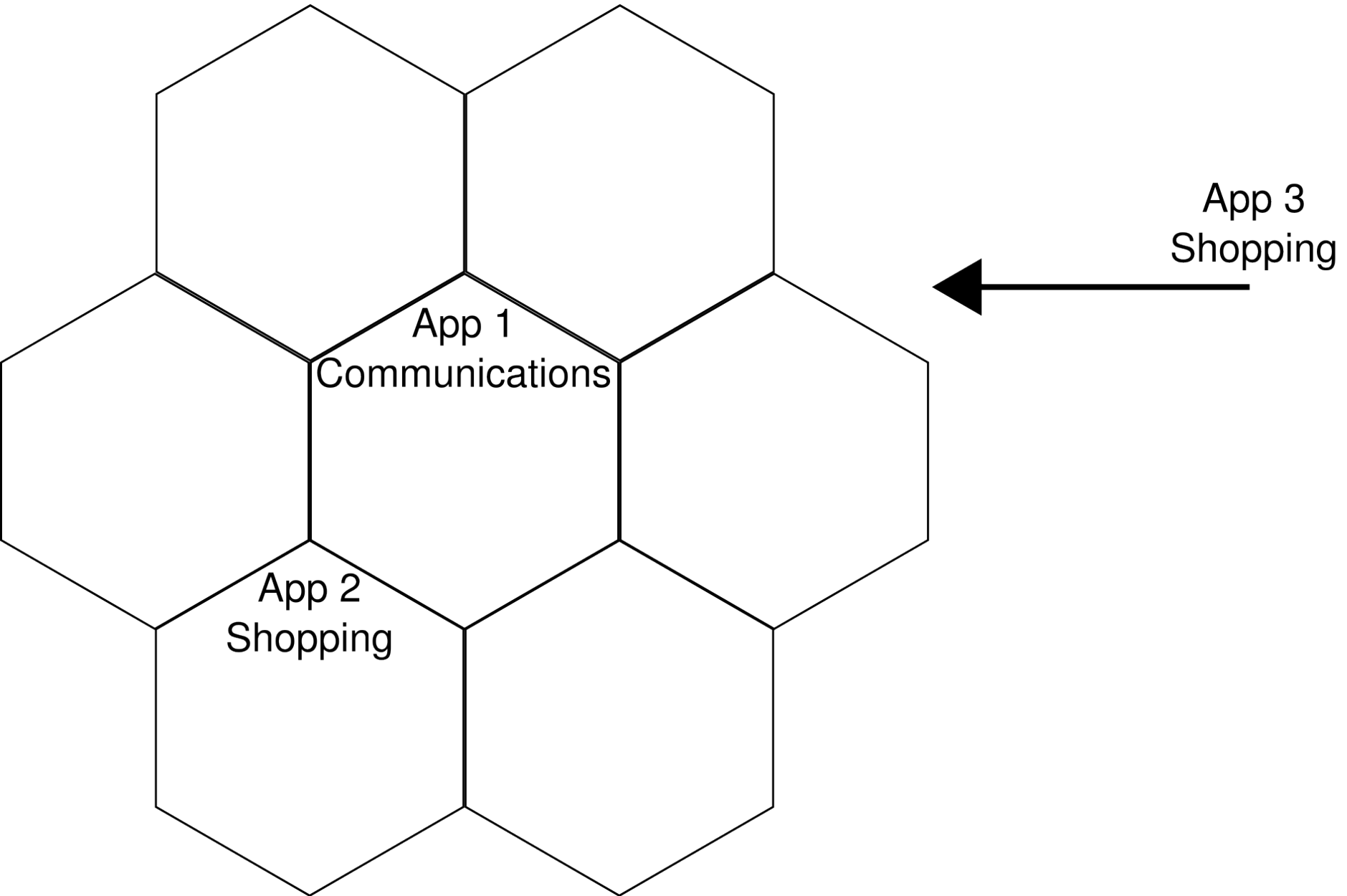
# Methodology - Labeling



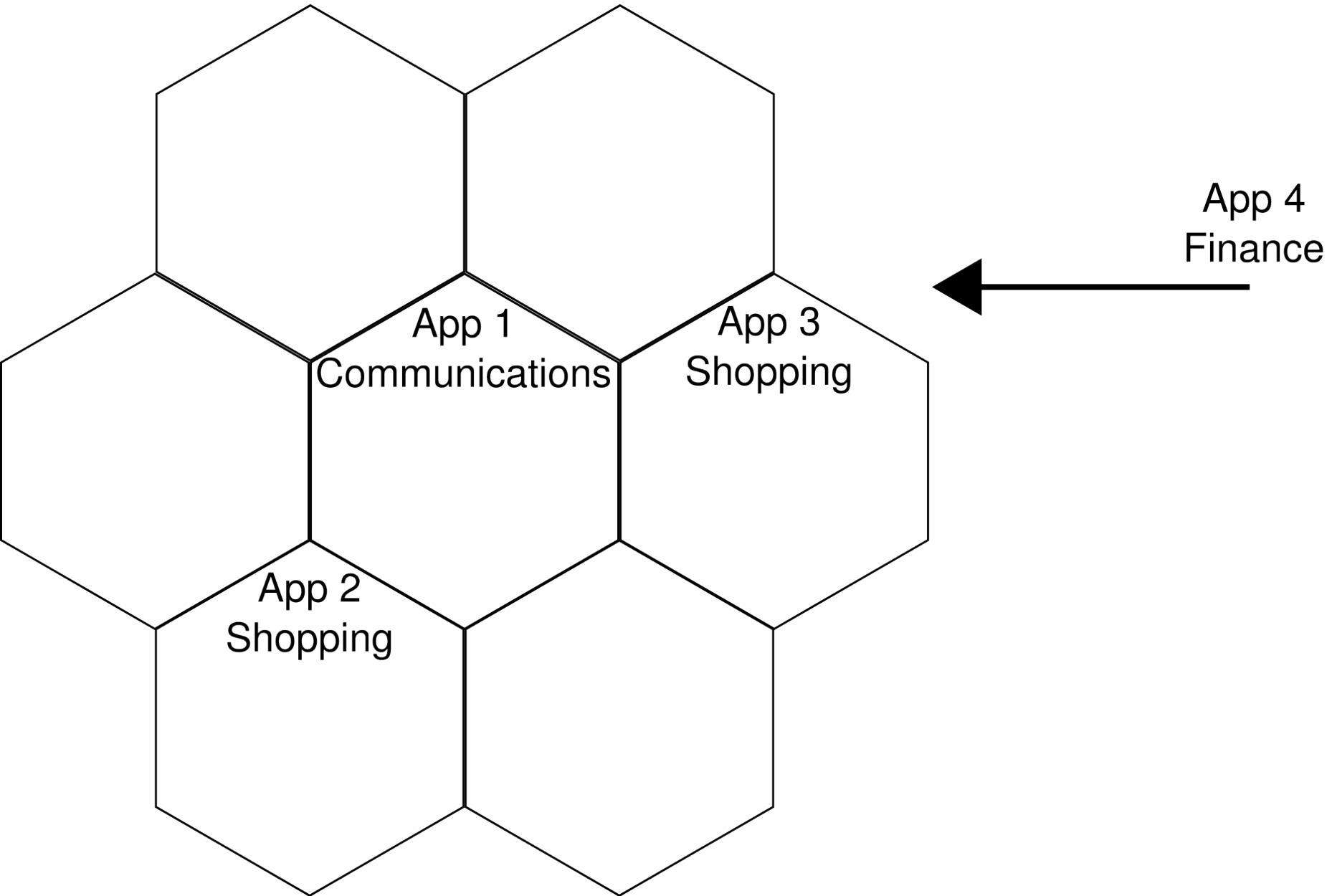
# Methodology - Labeling



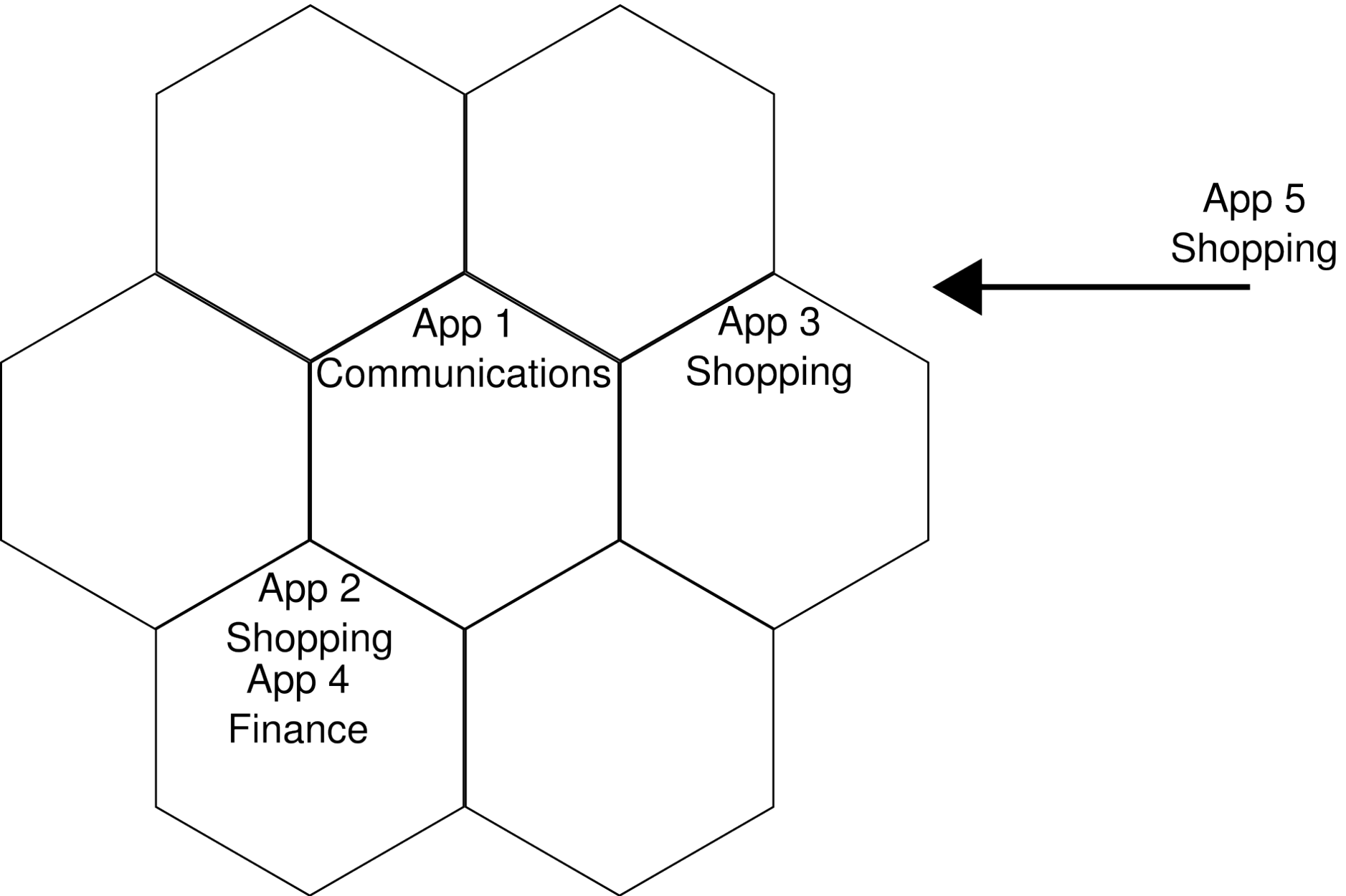
# Methodology - Labeling



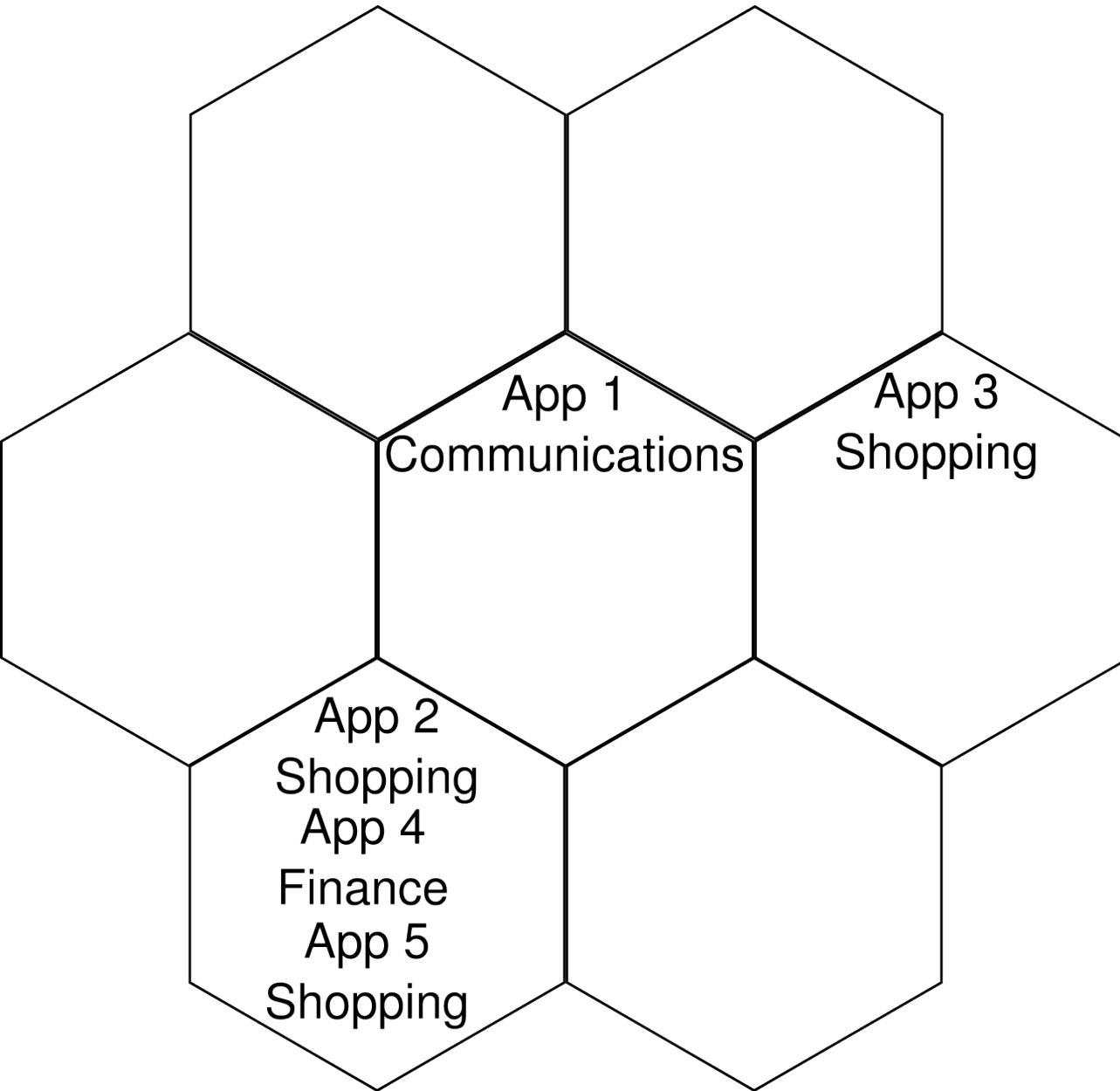
# Methodology - Labeling



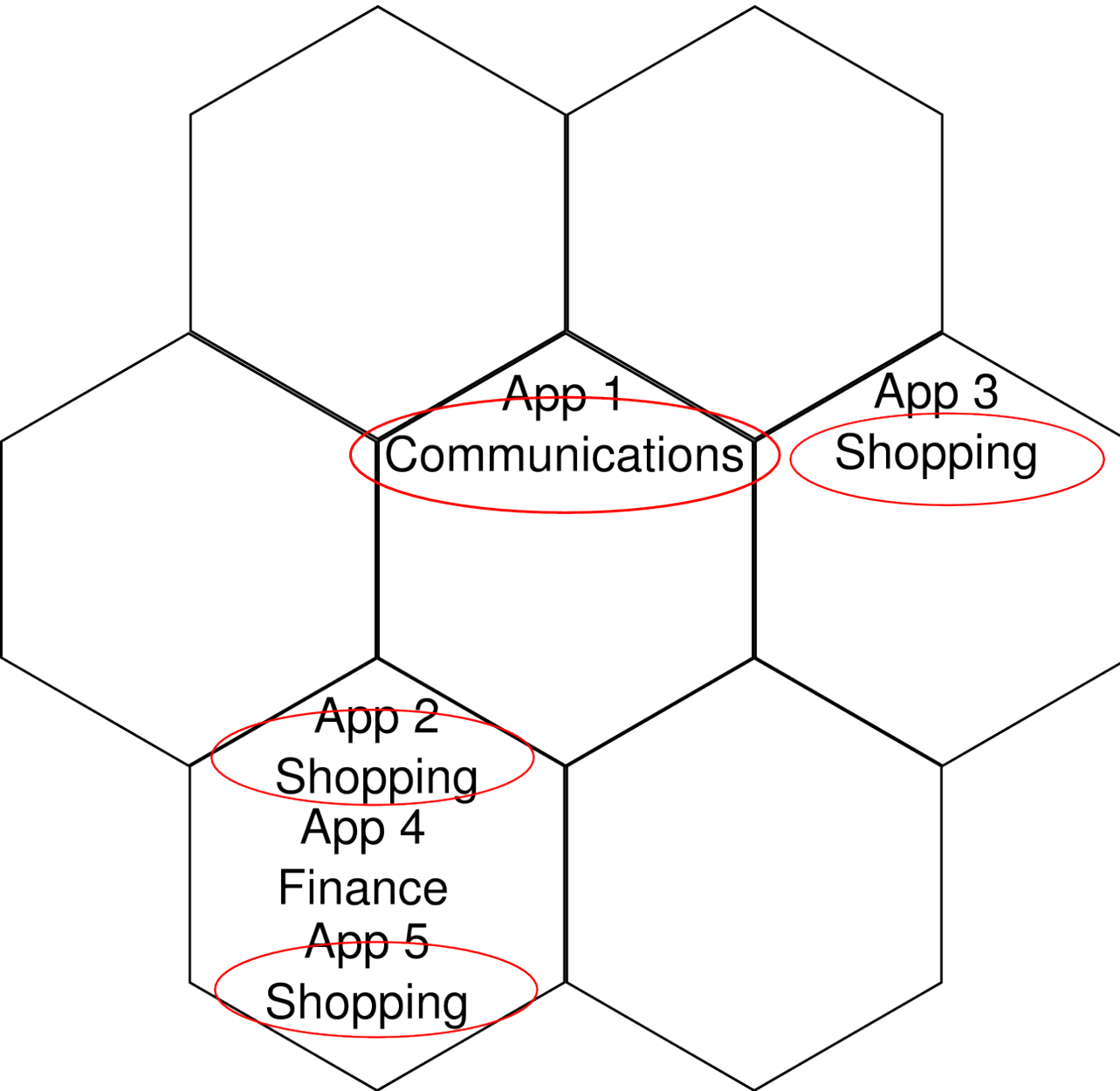
# Methodology - Labeling



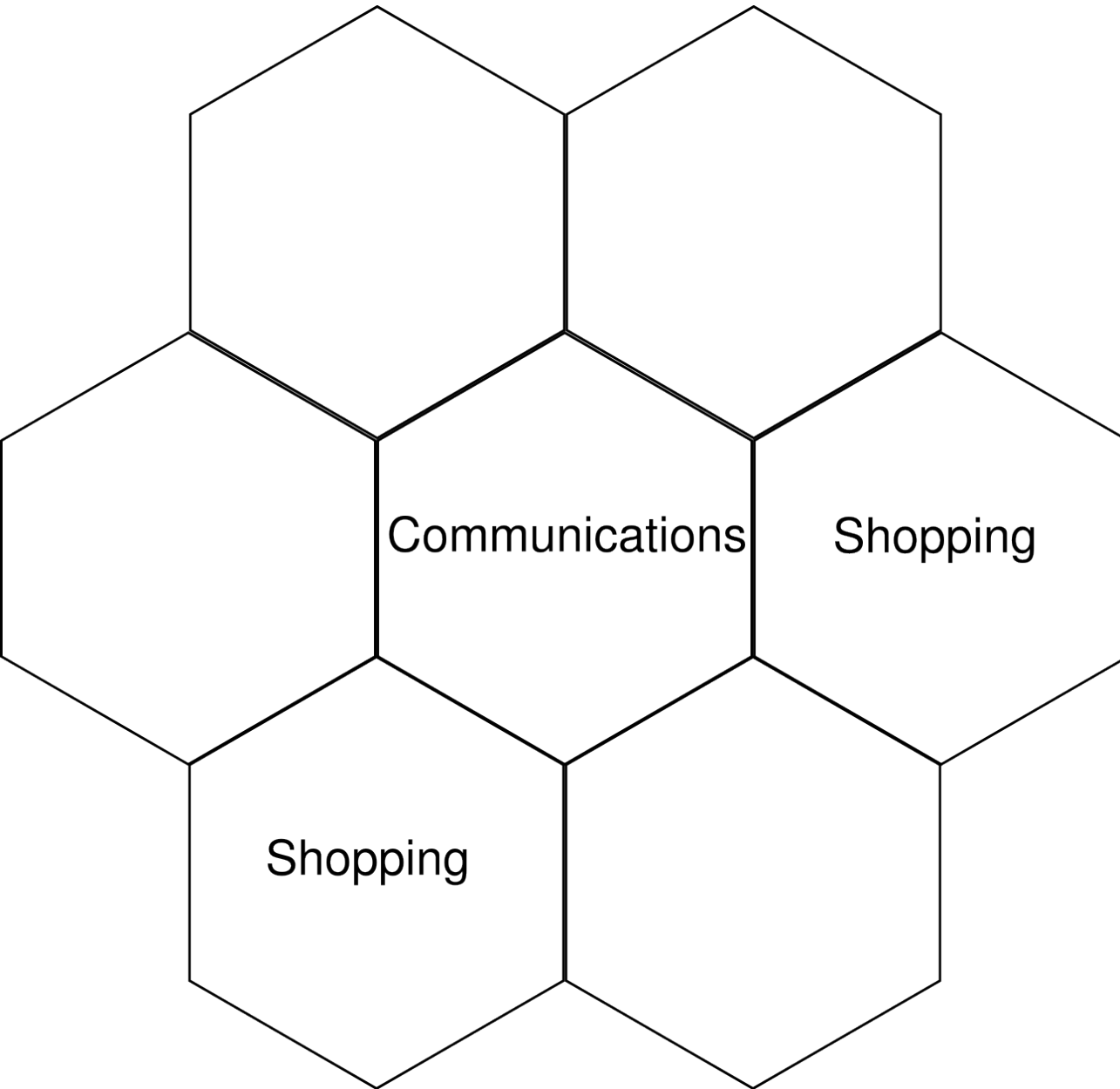
# Methodology - Labeling



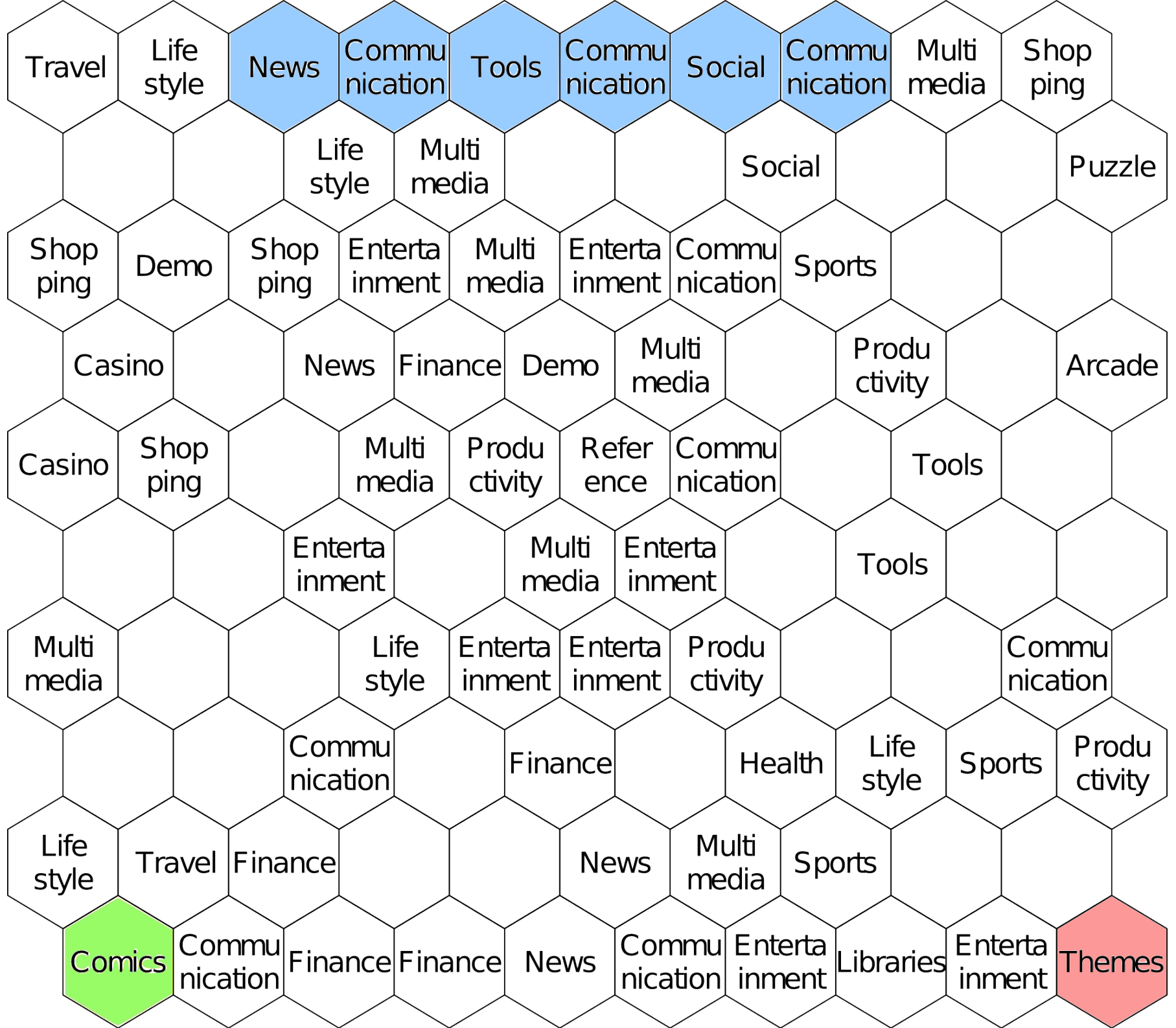
# Methodology - Labeling



# Methodology - Labeling





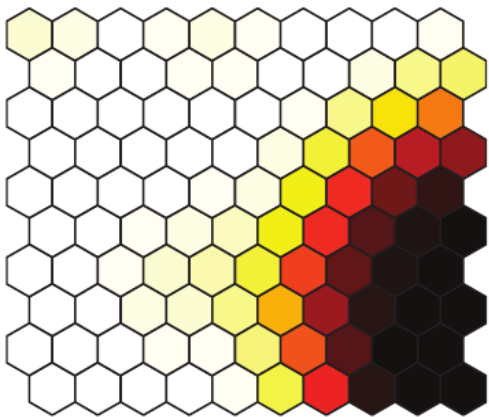


# Results

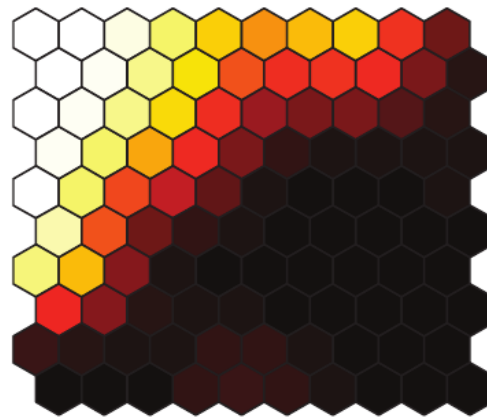
- Principal component analysis
  - One graph per permission
  - How each permission is used

# Results – Popular Perms.

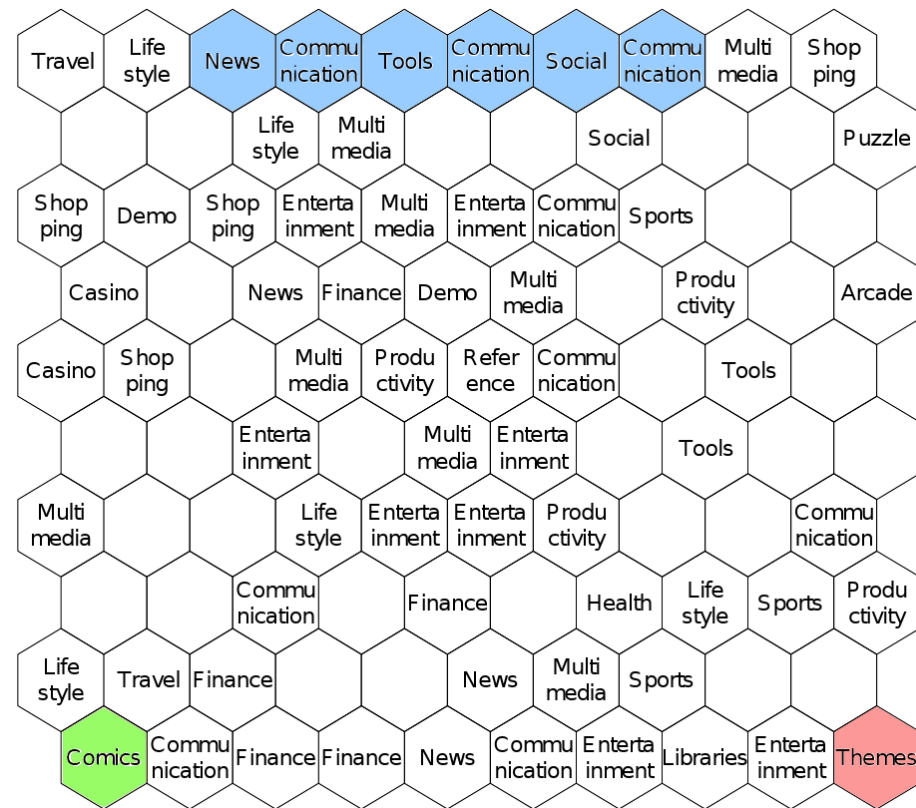
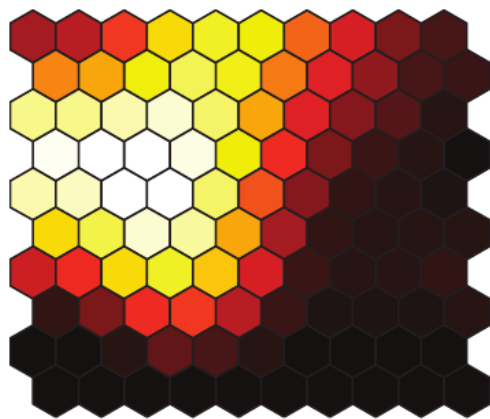
internet



access\_coarse\_location

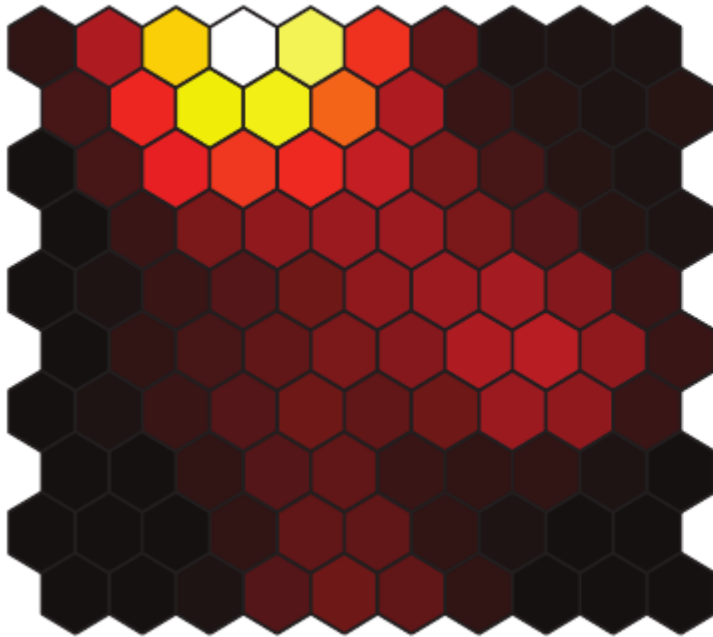


read\_phone\_state

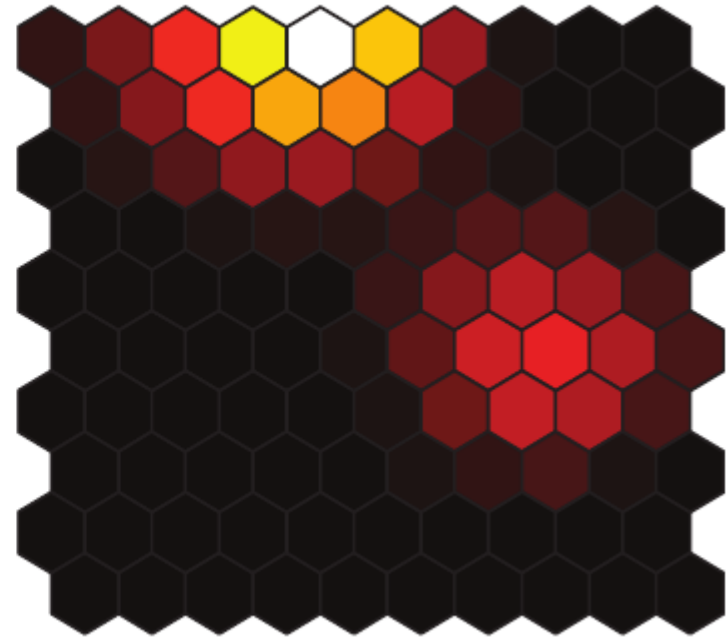


# Results - Supersets

access\_wifi\_state

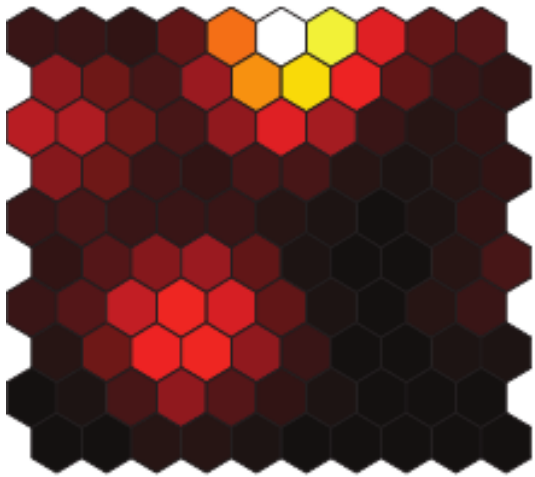


change\_wifi\_state

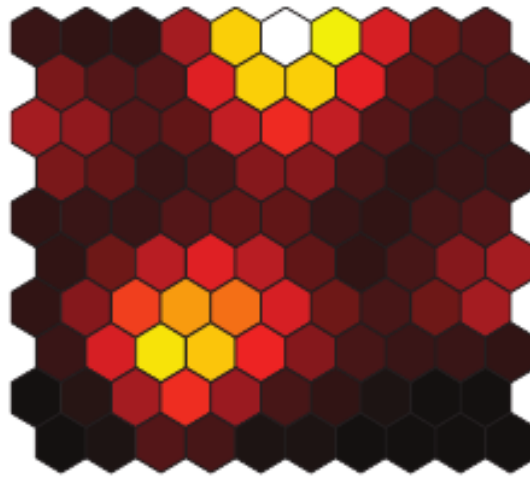


# Results – Commonly Grouped

write\_contacts



read\_contacts



process\_outgoing\_calls



disable\_keyguard



add\_system\_service



device\_power



# Other Applications

- Apply methodology to other permission-based systems
  - E.g., Google Chrome



# Conclusions

- To improve a system, we need to analyze and understand it.
- To analyze you need techniques
- This technique allows us to gain insight and find areas for improvement
- Can be generalized for different systems

# Questions?





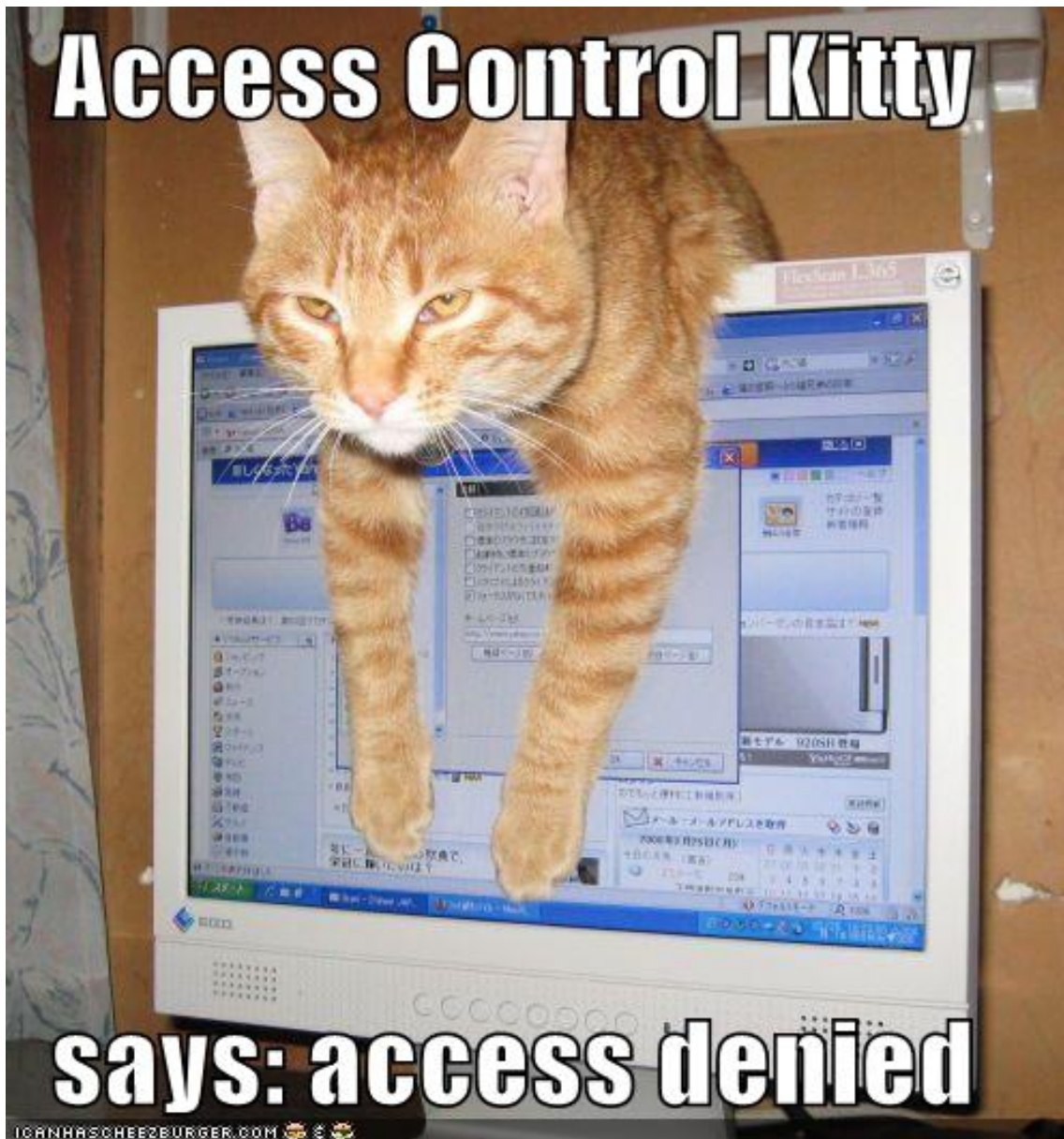
# Contact

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- **twitter**: @davidbb

**Access Control Kitty**



**says: access denied**