




# StatCan CEWS Midterm Presentation



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# Team

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- B.Sc. Computer Science | UBCO (2020)

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- B.Sc. Mathematics | University of Ottawa (2020)
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Data Scientist


- MDS | UBCO (2021)
- MBA | EGADE Business School (2017)
- B.A. Financial Management | Tec de Monterrey (2010)

# Client

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Statistics Canada





# **COVID-19 Canada Emergency Wage Subsidy Analysis & API Feasibility Study**

# Project

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## **Part 1: Canada Emergency Wage Subsidy (CEWS)**

- Interactive dashboard with power BI
- Exploratory report on the urban/rural divide

## **Part 2: Feasibility Study of APIs Use for Economic Recovery Tracking**

# Presentation Outline

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## Part 1: CEWS

- CEWS overview
- Data
- Research questions and goals
- Our approach
- Roadblocks
- Sample results

# Presentation Outline

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## Part 2: API Feasibility Study

- Overview
- Research questions and goals
- Our approach
- Roadblocks
- Sample results

# Part 1: CEWS

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# Canada Emergency Wage Subsidy Overview

Total approved applications

3,435,510

All approved applications by value

Under \$100K	3,322,330
\$100K to \$1M	107,530
\$1M to \$5M	5,120
Over \$5M	530

Applications received <sup>3</sup>

3,460,450

Unique applicants with  
approved claims


444,910


Dollar value of subsidies  
approved

\$79.03  
billion

# Data

## Canada Wage Subsidy Regional and Community-Level Database

 Statistics Canada Statistique Canada

Search website 

SubjectsDataAnalysisReferenceGeographyCensus ▼Surveys and statistical programs ▼About StatCanCanada.ca

[Home](#)

### Canada Emergency Wage Subsidy Regional and Community-level Database

Tables: 11-26-0003

*Description:*



The Canada Emergency Wage Subsidy Regional and Community-level Database (the database) is a custom dataset constructed with Canada Revenue Agency (CRA) Canada Emergency Wage Subsidy (CEWS) microdata and other administrative data sources available within Statistics Canada. The database contains variables on the amount of approved CEWS claims, number of CEWS supported employees, among other variables of interest. Data are available at sub-provincial levels of geography, notably rural and urban breakdowns, and by industry sectors and subsectors.

*Frequency:* Occasional

*Available formats:* HTML

Filter items

Showing 1 to 1 of 1 entries | Show  entries

Titles 	Release date 	More Information
<a href="#">Canada Emergency Wage Subsidy Regional and Community-level Database, 2021001</a>	March 18, 2021	<a href="#">More information</a>

```
cews.head(3)
```

	Start_date_of_CEWS_period	RegionCode	RegionName	RuralUrbanFlag	CMACAFIag	IndustryCode	IndustryName	Number_business_locations	Subsidy_amount	Supported_employees	CEWS_rehire_count
0	2020-03-15	10	Newfoundland and Labrador	Not applicable	Not applicable	11	Agriculture, forestry, fishing and hunting	30	823,000	362	0
1	2020-03-15	10	Newfoundland and Labrador	Not applicable	Not applicable	111	Crop production	10	X	90	0
2	2020-03-15	10	Newfoundland and Labrador	Not applicable	Not applicable	112	Animal production and aquaculture	10	X	X	0

```
cews.sample(3)
```

	Start_date_of_CEWS_period	RegionCode	RegionName	RuralUrbanFlag	CMACAFIag	IndustryCode	IndustryName	Number_business_locations	Subsidy_amount	Supported_employees	CEWS_rehire_count
231185	2020-06-07	1211006	Cumberland, Subd. B	RURAL	Not applicable	99	Other and Missing NAICS	5	X	X	0
190058	2020-05-10	3534005	Bayham	RURAL	Not applicable	23	Construction	10	84,000	30	0
508051	2020-09-27	1208008	East Hants	RURAL	Not applicable	238	Specialty trade contractors	5	43,000	39	0

## Standard Geographic Classification 2016

- 1-digit: Canada
- 2-digit: Province
- 5- digit: Census agglomeration or census metropolitan area
- 7-digit: Census subdivision

## North American Industry Classification System

- “All industries”
- 2-digit: Industry sector
- 3-digit: industry subsector

# Data

```
cews.info()
```

```
<class 'pandas.core.frame.DataFrame'>  
RangeIndex: 562491 entries, 0 to 562490  
Data columns (total 11 columns):
```

#	Column	Non-Null Count	Dtype
0	Start_date_of_CEWS_period	562491 non-null	object
1	RegionCode	562491 non-null	object
2	RegionName	562491 non-null	object
3	RuralUrbanFlag	562491 non-null	object
4	CMACAFFlag	562491 non-null	object
5	IndustryCode	562491 non-null	object
6	IndustryName	562491 non-null	object
7	Number_business_locations	562491 non-null	object
8	Subsidy_amount	562491 non-null	object
9	Supported_employees	562491 non-null	object
10	CEWS_rehire_count	562491 non-null	object

```
dtypes: object(11)  
memory usage: 47.2+ MB
```

```
cews['Subsidy_amount'].value_counts(normalize=True)
```

```
X          0.675029  
0          0.010516  
17,000     0.001916  
20,000     0.001888  
22,000     0.001865
```

```
...  
6,824,000  0.000002  
17,151,000 0.000002  
89,020,000 0.000002  
12,221,000 0.000002  
149,094,000 0.000002
```

```
Name: Subsidy_amount, Length: 16468, dtype: float64
```

```
cews['Supported_employees'].value_counts(normalize=True)
```

```
X          0.665020  
0          0.010779  
12         0.003127  
13         0.003095  
14         0.003052
```

```
...  
6,385      0.000002  
11,659     0.000002  
235,392    0.000002  
8,469      0.000002  
7,270      0.000002
```

```
Name: Supported_employees, Length: 12991, dtype: float64
```

# Research Questions and Goals

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- Design an interactive CEWS dashboard in PowerBI
- Write an exploratory research paper

# Our Approach

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## Dashboard:

- Develop a number of pages allowing users to explore the data on any dimensions, at any level of granularity

## Paper:

- Focus on rural Canada
  - Which industries were disproportionately affected in rural areas?
  - Which rural areas received the most subsidies, and what do they have in common?

# Roadblocks

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- Structure of data was not interpretable
  - Due to the hierarchical nature, individual subsidies are counted in multiple rows
    - I.e., once in the “Canada” row, once in the “B.C.” row, once in the “Kelowna” row
  - Could not remove aggregated rows due to information loss from suppression at more granular levels
  - **Solution:** Develop a set of “indicator” columns
    - Querying a specific level for each indicator ensures no data duplication

# Roadblocks

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- Initially unclear expectations from the client
  - Initial instruction for the report was “explore the data”
  - Much work thrown away before finding a thread the client was interested in
- Power BI licensing / Mac version
  - Many useful features are only available for paid versions of Power BI
    - GIS software is very limited in the free version
  - There is no Mac version of the software



# Current Progress

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- Report is finished, aside from formatting and proofreading
- Dashboard is mostly finished
  - Small tweaks after each client meeting

# GIS Analysis: Level 1 Industry(Industry Code: XX) Subsidy Distribution

Province/CSD region

province\_regionName, RegionName

Alberta

RuralUrbanFlag

RURAL

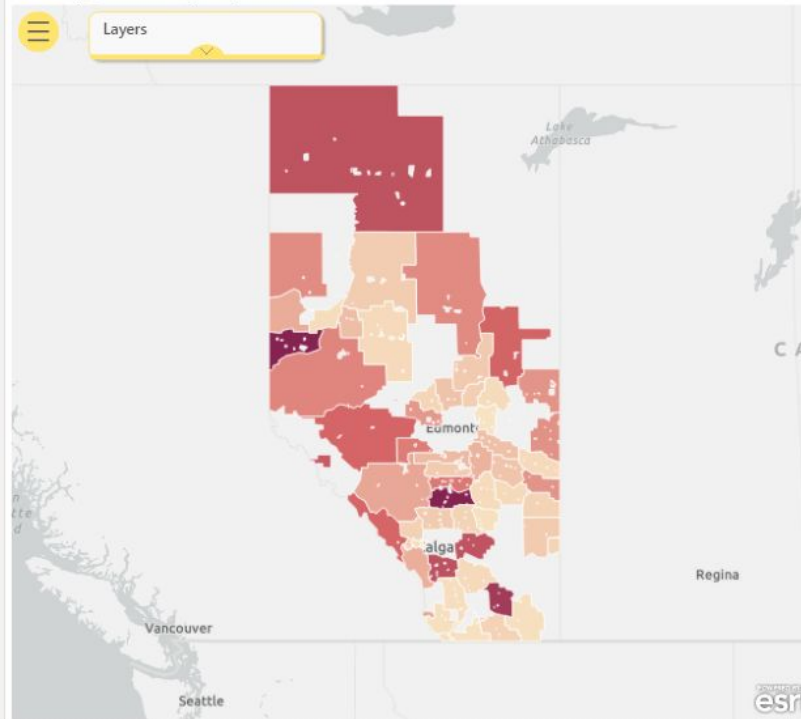
Start\_date\_of\_CEWS\_period

March 15, 2020

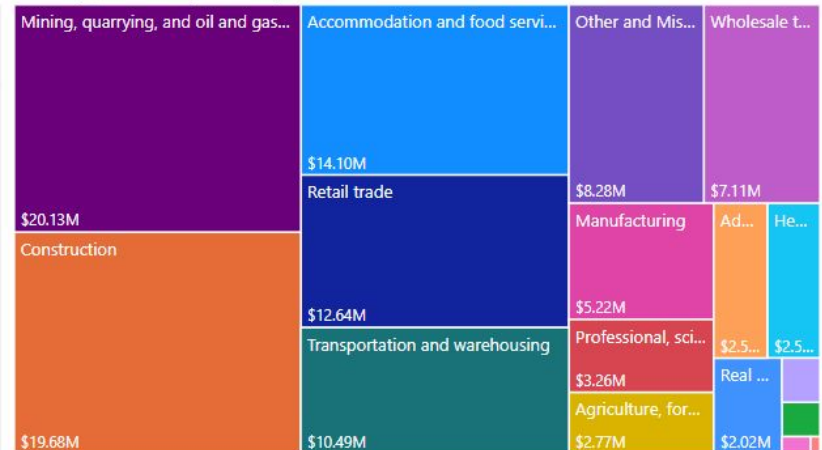
IndustryName

All

Subsidy\_amount by RegionName



Subsidy\_amount by IndustryName



IndustryName	Subsidy_amount
Health care and social assistance	\$2,525,000
Real estate and rental and leasing	\$2,023,000
Information and cultural industries	\$520,000
Arts, entertainment and recreation	\$404,000
Educational services	\$155,000
Finance and insurance	\$50,000



Statistics  
Canada

Statistique  
Canada

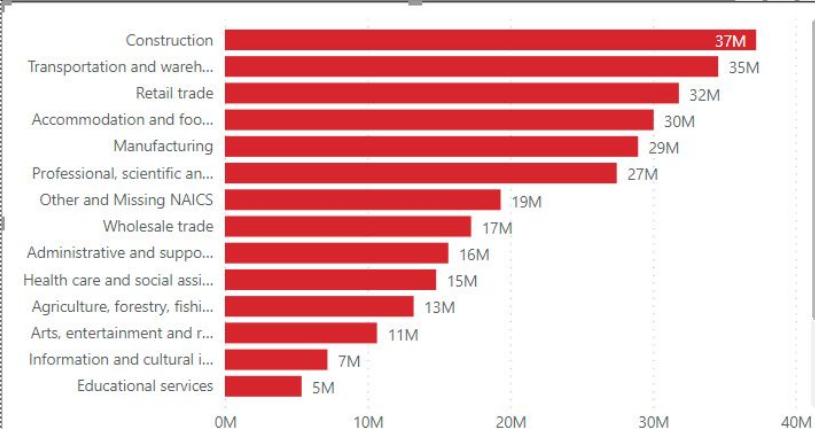
# CEWS Comparison Tool

*\*Note: Subsidy values may not be entirely accurate due to suppressed data.*

Kelowna

British Columbia

Subsidy



Period

All

Metric

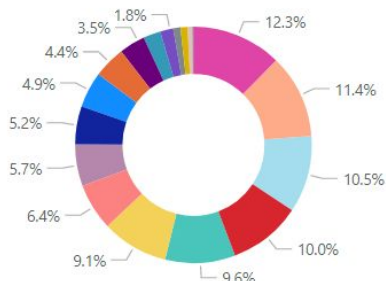
Subsidy

Geography

CMA/CA (Geographic Aggregati...

Industry Aggregation

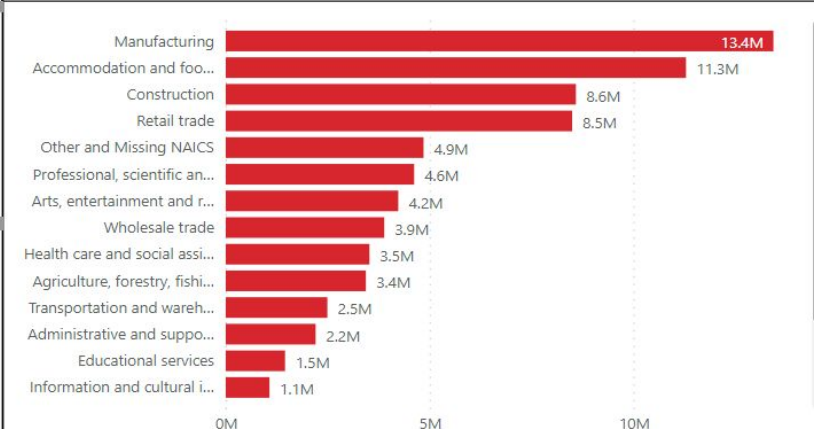
Industry Sector (2 Digit NAICS)



Chilliwack

British Columbia

Subsidy



Period

All

Metric

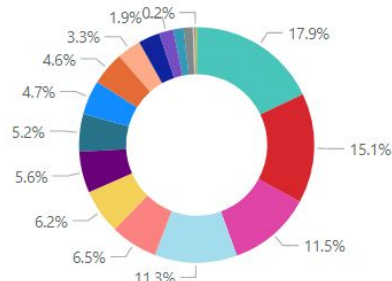
Subsidy

Geography

CMA/CA (Geographic Aggregati...

Industry Aggregation

Industry Sector (2 Digit NAICS)





Statistics  
Canada

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Canada

# Explore Subsidy Breakdowns

\*Note: Sum of unsuppressed values only.

Geography

CMA/CA

Industry Aggregation

Industry Sector (2 Digit NIA...

Metric

Subsidy

Province/ Territo... x

British Columbia

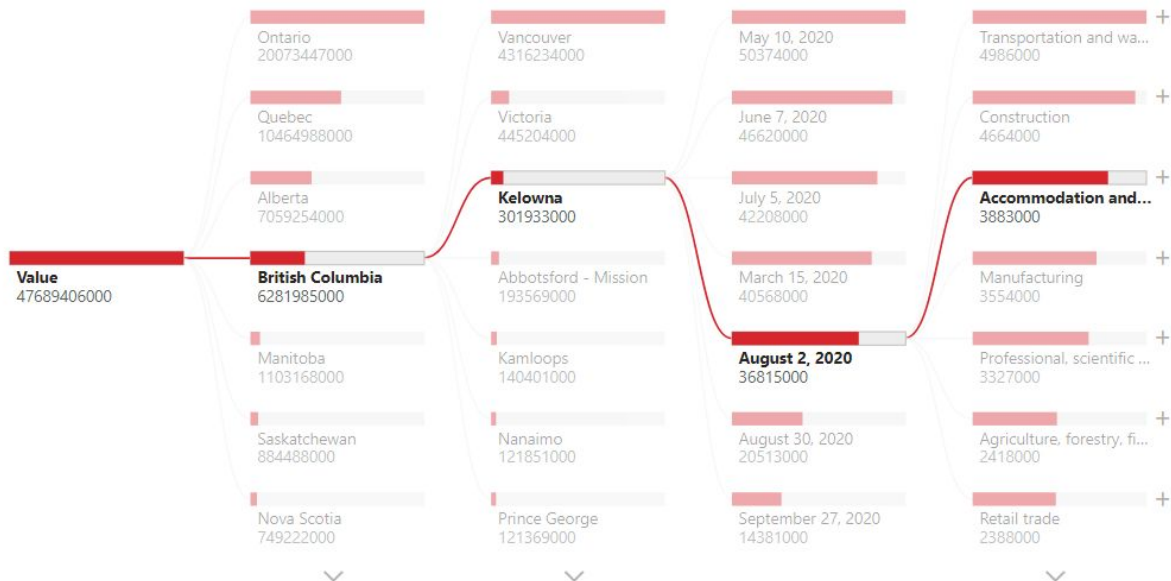
Region x

Kelowna

Period x

02/08/2020 12:00:00 A...

Industry x





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Canada

# CEWS Time Series by Region

*\*Note: Subsidy values may not be entirely accurate due to suppressed data.*

Geographic Aggregation

Region

Metric

Industry Aggregation

Industry

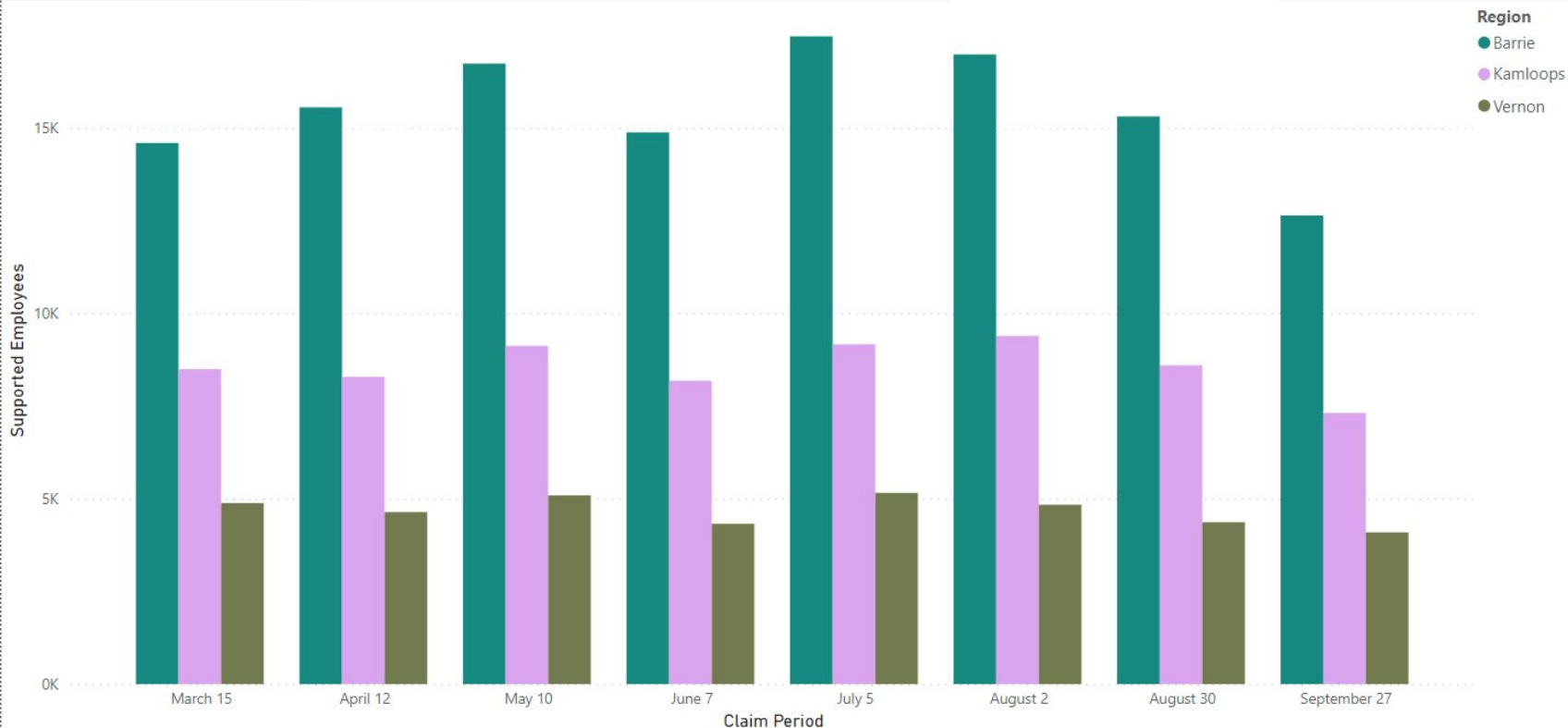
CSD

Multiple selections

Supported Employees

All Industries

All



## Dashboard Sample 1: GIS Analysis on Each Province's Subsidy Amount & It's Average Effects Over Periods.

Subsidy\_amount by RegionName



**56bn**

Subsidy\_amount

**21.72K**

Average of Number\_business\_locations

**2.16K**

Average of CEWS\_rehire\_count

**293.17K**

Average of Supported\_employees

# GIS Analysis: Level 1 Industry(Industry Code: XX) Subsidy Distribution

Province/CSD region

province\_regionName, RegionName

Alberta

RuralUrbanFlag

RURAL

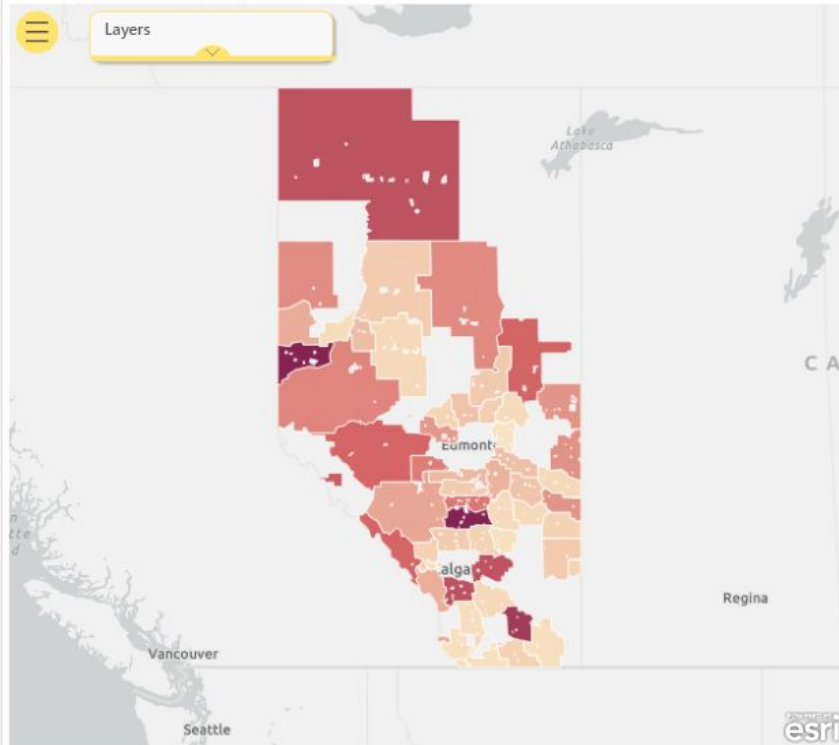
Start\_date\_of\_CEWS\_period

March 15, 2020

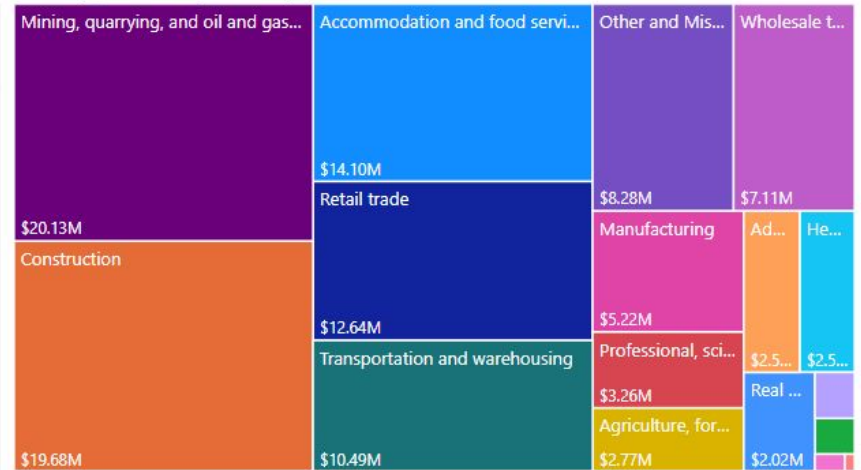
IndustryName

All

Subsidy\_amount by RegionName



Subsidy\_amount by IndustryName



IndustryName	Subsidy_amount
Health care and social assistance	\$2,525,000
Real estate and rental and leasing	\$2,023,000
Information and cultural industries	\$520,000
Arts, entertainment and recreation	\$404,000
Educational services	\$155,000
Finance and insurance	\$50,000





Statistics  
Canada

Statistique  
Canada

# CEWS Time Series by Industry

*\*Note: Subsidy values may not be entirely accurate due to suppressed data.*

Geographic Aggregation

Region

Metric

Industry Aggregation

Industry

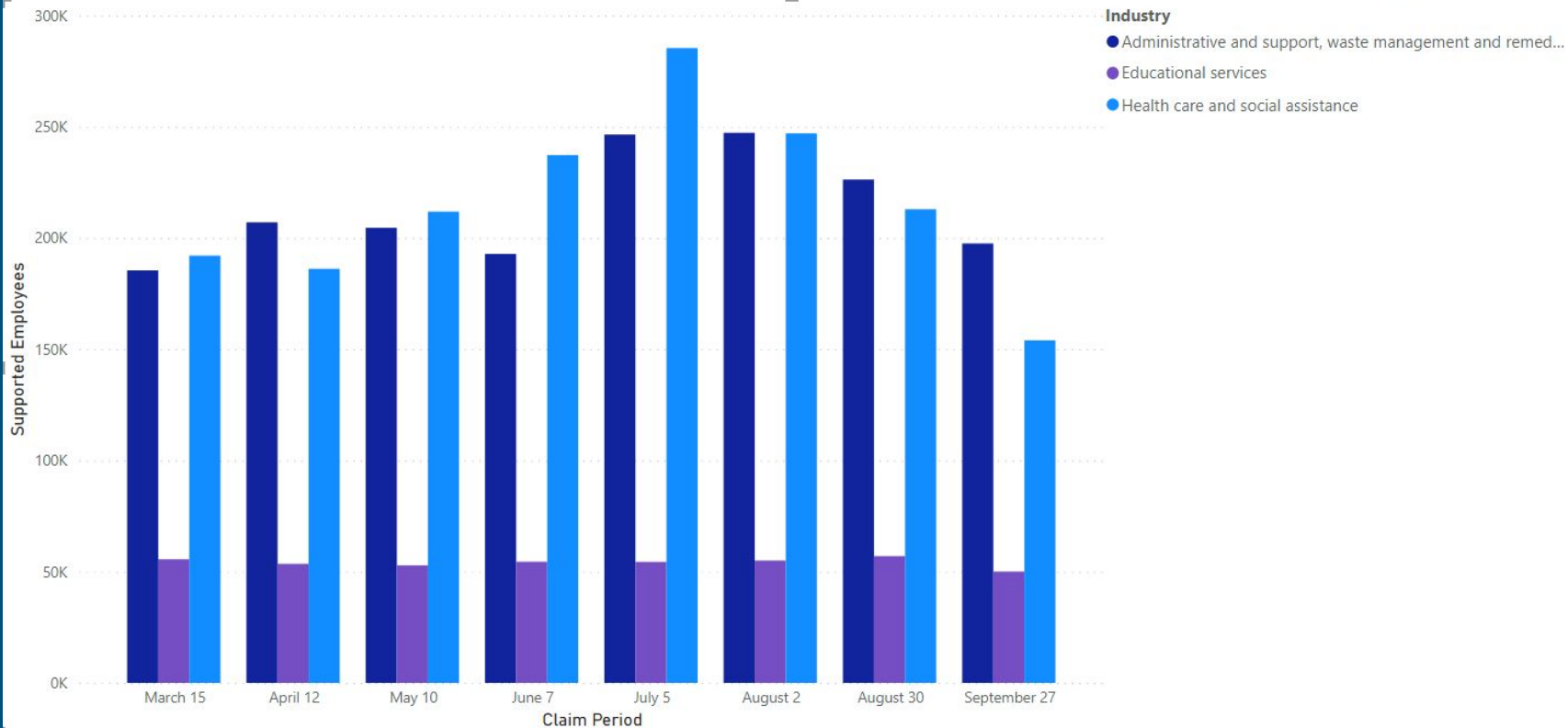
Canada

Canada

Supported Employees

Industry Sector (2 Digit NIACS)

Multiple selections





# Part 2: API Feasibility

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# Overview

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## STATISTICS CANADA DATA STRATEGY

Delivering insight through  
data for a better Canada

2019 to 2022



Statistics  
Canada Statistique  
Canada

Canada

# Research Questions and Goals

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- Study and report on the potential use of data collected from various APIs to create a real-time business indicator for economic activity and recovery in the context of COVID-19.
- Choose one or two APIs and develop prototype software

# Our Approach

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- Twitter
- Google
- Airbnb
- Uber
- Doordash/ Skipthedishes
- Reddit
- Yelp
- Facebook
- Foursquare
- Eventbrite

# Our Approach

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- Depending on the type of data extracted, numerical analysis, or text-based sentiment analysis and content extraction could be used.
  - Tracking of economic activity within regions
  - Examine post-COVID success of industries and compare to pre-COVID

# Roadblocks

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- Many APIs are expensive to use for these general purposes
- Personal data not available without user authorization (i.e., Facebook likes, Twitter networks)

# Current Progress

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- Exploring the potential of some APIs, with much focus on Twitter

# Thank You!

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# Questions and Demonstrations

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