CSC490 Assignment A2 - Data processing Pipelines

Armaan Rehman Shah - 1009641309 Boaz Cheung - 1007673607 Alice Sedgwick - 1009301355 Yuan Yu - 1008782195

October 1, 2025

1 Part One: Aspirational Datasets

Overview

Our aspirational dataset design for a Canada-focused immigration RAG chatbot is driven by three principles: provenance (link back to official sources), historical coverage (track rule changes), and embedding-readiness (clean, chunked text). Data will be scraped then ingested into **AWS S3**, and indexed in **AWS RDS** (**Postgres with pgyector**) for retrieval.

Because this is aspirational, we also describe datasets that do not currently exist in usable form (e.g., structured officer reasoning logs, semantically marked-up legislation). These represent our "magic wand" wish-list that would dramatically improve system performance.

Meta-Summary of Datasets

Table 1 provides a high-level overview of the datasets, their purpose, update cadence, and primary storage location.

| Dataset | Purpose | Update Cadence | Storage |
|-----------------------------|--|-----------------------|---------|
| IRCC Official | Core website content, guides, instruc- | Weekly/daily | AWS S3 |
| Pages IRCC Open Data | tions, historical versions Admissions, processing times, numeric | Monthly/quarterly | AWS S3 |
| Stats IRCC Notices | evidence Policy changes, program launches/clo- | As needed | AWS S3 |
| IRCC Forms | sures Application forms $+$ OCR text | Rarely | AWS S3 |
| (PDFs) Legislation | IRPA and Regulations (legal texts) | On amendment | AWS S3 |
| FAQ Corpus | Curated Q&A pairs for tuning and eval | Iterative | AWS S3 |
| Historical Change Log | Version diffs for rules over time | Derived daily | AWS S3 |
| Aspirational Reasoning Logs | Officer decision rationales, anonymized and structured | Non-existent/ magical | AWS S3 |

Table 1: Meta-summary of aspirational datasets

Datasets

1. IRCC Official Pages

Description: Core corpus of IRCC official website content. Ideal case: machine-readable JSON feeds with semantic tags; realistic case: scraping HTML. Stored in AWS S3.

```
CREATE TABLE ircc_official_pages (
                  VARCHAR PRIMARY KEY,
  page_id
                  VARCHAR,
  url
                  VARCHAR,
  language
  title
                  VARCHAR,
  content_clean
                  STRING,
  chunk_id
                  VARCHAR,
  chunk_index
                  INT,
  date_published DATE,
                  TIMESTAMP,
  date_scraped
  version_hash
                  VARCHAR
);
```

Usage: Primary retrieval source, citation backbone, historical tracking. *Aspirational:* Semantic annotations for sections (e.g., "eligibility", "fees") would make retrieval smarter.

2. IRCC Open Data Statistics

Description: Operational datasets (admissions, processing times, etc.). Currently CSV/Excel, aspirationally provided in APIs with consistent schemas.

```
CREATE TABLE ircc_open_stats (
                VARCHAR PRIMARY KEY,
  stat_id
  dataset_name VARCHAR,
  year
                INT,
  month
                INT,
  geography
                VARCHAR,
  metric_name
                VARCHAR,
  metric_value
                FLOAT.
  source_url
                VARCHAR
  date_ingested TIMESTAMP
);
```

Usage: Chatbot can answer "What is the average wait time for a study permit this year?" with authoritative numbers.

3. IRCC Notices and News

Description: Policy updates and announcements. Aspirationally, these would be available as structured RSS feeds with machine-readable metadata.

```
CREATE TABLE ircc_notices (
   notice_id    VARCHAR PRIMARY KEY,
   title         VARCHAR,
   content    STRING,
   url         VARCHAR,
   date_posted   DATE,
   tags         ARRAY,
   date_scraped TIMESTAMP
);
```

Usage: Supports recency-aware answers like "What programs launched in 2024?"

4. IRCC Forms (PDFs)

Description: Application forms (e.g., IMM 1294). Today only as PDFs; aspirationally, machine-readable JSON schemas with auto-validation.

Usage: Allows chatbot to guide users: "Form IMM1294 requires these fields..."

5. Legislation and Regulations

Description: IRPA and IRPR. Today in static HTML/PDF; aspirationally, linked open data with machine-readable citations.

Usage: Authoritative grounding. Chatbot can cite sections directly.

6. FAQ Corpus

Description: Curated Q&A pairs. Aspirationally, official FAQs tagged with difficulty levels and categories.

Usage: Helps with fine-tuning and evaluation.

7. Historical Change Log

Description: Records diffs between versions, complementing ircc_official_pages.

Usage: Enables queries like "What changed in study permit rules since 2021?"

Note: The ircc_official_pages table stores page content with a version_hash, which allows us to detect when something has changed. The change_log table then records what changed, storing diffs across versions. This two-tier design avoids duplication: one is for detection, the other for explanation.

8. Aspirational Officer Reasoning Logs

Description: Hypothetical anonymized logs of how IRCC officers made decisions, with structured reasoning chains. Not available in reality, but extremely valuable.

Usage: Would allow chatbot to explain not only rules but also how they are applied in practice.

End Note: While the aspirational datasets have different schemas, they would be unified downstream via a common representation in the embeddings index (chunk_id, content, source, embedding). This ensures schema heterogeneity does not block integration.

2 Part Two: Reality Check

| Table | $2 \cdot$ | Datasets |
|-------|-----------|----------|
| | | |

| Relevant Item | Table 2: Datasets Description | Commentary |
|---|--|---|
| Immigration and Refugee | | |
| Protection Act (IRPA) | Primary legislation governing immigration, refugee claims, enforcement, and admissibility. | The IRPA forms the statutory foundation for all Canadian immigration law. It establishes key principles such as admissibility, refugee protection, and enforcement powers. Referencing the IRPA is essential for research, legal analysis, or system design to ensure models and interpretations are aligned with statutory mandates, and to accurately model decision rules and exceptions. TLDR: This is the big document that has the most basic, abstract Canadian Immigration law in it. |
| Immigration and Refugee Protection Regulations | | |
| (IRPR) | Detailed subordinate legislation under the IRPA, covering procedures, eligi- bility, and compliance rules. | The IRPR defines the operational rules that officers follow to implement the IRPA. It includes procedural steps, timelines, eligibility criteria, and compliance mechanisms. Understanding these regulations is critical for interpreting how decisions are applied in practice by administrative staff and legal practitioners, ensuring consistency in enforcement and application of the law. TLDR: This is an extention of the IRPA that concretizes some of the principles stated in it for legal use. |
| IRCC Application Overview | Public-facing portal explaining immigration and citizenship application processes. | This portal translates statutory and regulatory requirements into actionable steps for applicants. It contains instructions, eligibility checklists, and process timelines. Analyzing this data enables linking legal requirements to end-user workflows, validating procedural models, and designing userfacing guides that reflect the practical application of the law. TLDR: This site provides a tips and tricks manual for filling out immigration applications. |

| Relevant Item | Description | Commentary |
|---|--|---|
| Relevant Item IRCC Program Delivery Instructions | Operational bulletins and manuals guiding IRCC officers in applying policies and procedures. | These manuals serve as a bridge between abstract law/regulation and actual administrative practice. They include instructions for officers, case handling examples, and internal interpretations. Studying these manuals is crucial for understanding decision-making patterns, modeling procedural logic, and imitating real-world adjudication processes. TLDR: This website |
| | | provides concrete instructions for policy enforcement and document processing. |
| IRCC Website Pages (Core URLs) | A collection of official IRCC web pages (applications, programs, notices, fees, biometrics, etc.). | Captures how IRCC presents information to the public, including updates over time. Useful for research on public communication and verifying how legal requirements are operationalized. This dataset is key to connecting legal text with practical instructions received by applicants. TLDR: This site has time sensitive updates and announcements relevant to immigrants. |
| IRCC Forms and Guides (e.g., IMM5710, IMM1295, CIT0001) | Official application forms and accompanying guides (PDF + HTML). | These forms represent the end-user interface for applying immigration rules. Each form captures specific legal and procedural requirements, including eligibility criteria, supporting document requests, and applicant declarations. They are essential for replicating workflows and ensuring that models or systems account for procedural realities. TLDR: These are the actual forms users would have to fill out. |

| Relevant Item | Description | Commentary |
|---|---|---|
| Refugee Law Lab – Canadian Legal Data (RAD + RPD) | Bulk data of tribunal decisions from the Refugee Appeal Division and Refugee Protection Division. | Contains detailed case decisions, reasoning, citations, and outcomes for refugee claims. This dataset allows for answering personal immigration questions, evaluating reasoning processes, and testing retrieval or decision-support systems. Provides both procedural and substantive examples of Canadian refugee law applied in practice. TLDR: These datasets contain Legal cases from real life immigrants with real life immigrant problems and explains how they were handled. |

References

- [1] Government of Canada. *Immigration and Refugee Protection Regulations (SOR/2002-227)*. Justice Laws Website, 2002, https://laws-lois.justice.gc.ca/eng/regulations/sor-2002-227/. Accessed 24 Sept. 2025.
- [2] Government of Canada. *Immigration and Refugee Protection Act (S.C. 2001, c. 27)*. Justice Laws Website, 2001, https://laws.justice.gc.ca/eng/acts/i-2.5/. Accessed 24 Sept. 2025.
- [3] Government of Canada. Apply to Come to Canada. Immigration, Refugees and Citizenship Canada, https://www.canada.ca/en/immigration-refugees-citizenship/services/application.html. Accessed 24 Sept. 2025.
- [4] Government of Canada. Operational Bulletins and Manuals. Immigration, Refugees and Citizenship Canada, https://www.canada.ca/en/immigration-refugees-citizenship/corporate/publications-manuals/operational-bulletins-manuals.html. Accessed 24 Sept. 2025.
- [5] Government of Canada. Immigration, Refugees and Citizenship Canada Official Website. Immigration, Refugees and Citizenship Canada, https://www.canada.ca/en/immigration-refugees-citizenship. html. Accessed 24 Sept. 2025.
- [6] Government of Canada. Application Forms and Guides (e.g., IMM5710, IMM1295, CIT0001). Immigration, Refugees and Citizenship Canada, https://www.canada.ca/en/immigration-refugees-citizenship/services/application/application-forms-guides.html. Accessed 24 Sept. 2025.
- [7] Refugee Law Lab. Canadian Legal Data: Refugee Appeal Division and Refugee Protection Division Decisions. Refugee Law Lab, https://refugeelab.ca/bulk-data/. Accessed 24 Sept. 2025.

3 Part Three: Data-processing pipelines

3.1 Data Schemas

Scope. We persist data in two layers: (i) an S3 data lake with raw/clean/curated zones (JSON/Parquet), and (ii) a serving database (PostgreSQL + pgvector) used for semantic search. Schemas below reflect the implemented system.

A. Data Lake (S3) — Curated Column Schema

Description: Chunked, cleaned documents ready for embedding. Stored as Parquet with the following columns.

```
id:
                 STRING
                                -- unique chunk id
title:
                 STRING
section:
                 STRING
content:
                 STRING
                                -- cleaned text
source:
                 STRING
                                -- e.g., IRCC URL or source tag
date_published:
                 DATE
                                -- if available
date_scraped:
                 TIMESTAMP
granularity:
                 STRING
                                -- page | section | paragraph
```

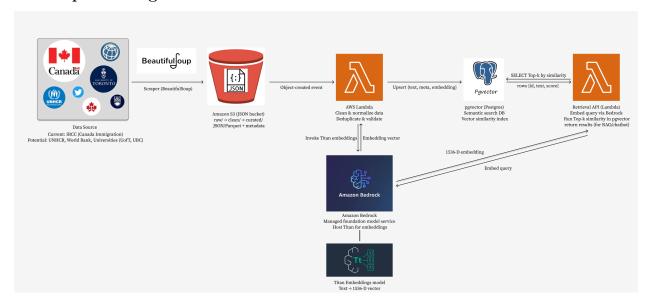
B. Serving DB (PostgreSQL + pgvector)

Description: Stores chunks and their embeddings for semantic retrieval.

```
CREATE TABLE documents (
                  VARCHAR PRIMARY KEY,
  id
                                           -- maps to S3 curated.id
  title
                  VARCHAR,
  section
                  VARCHAR,
  content
                  TEXT,
  source
                  VARCHAR,
                                            -- canonical source or URL
  date_published DATE,
  date_scraped
                  TIMESTAMP,
                                            -- page | section | paragraph
  granularity
                  VARCHAR,
                  VECTOR (1536)
                                            -- Titan Embeddings (via Bedrock)
  embedding
CREATE INDEX documents_embedding_ivf
  ON documents USING ivfflat (embedding vector_cosine_ops)
  WITH (lists = 100);
```

Notes. This implemented schema is a pragmatic subset of the Q1 aspirational design. For example, id corresponds to Q1's form_id/law_id; we omitted optional fields like version_hash for now.

3.2 Pipeline diagrams



3.3 When the pipelines will run and for which use cases

The pipeline runs in three modes. First, an *initial load* ingests and structures historical IRCC and law data into the data lake and serving database. Second, a *scheduled refresh* runs nightly to capture new IRCC bulletins and legal updates, ensuring that recent policy changes are reflected promptly. Third, *on-demand runs* may be triggered in response to urgent announcements or structural schema changes. These executions directly support downstream use cases: (i) chatbot retrieval, where embeddings in **pgvector** are kept upto-date for accurate policy guidance; (ii) summarization, enabled by maintaining a curated, chunked corpus; (iii) legal and policy Q&A, where users can query statutes and bulletins in natural language. Together, these runs ensure that both historical context and current developments remain accessible, reliable, and consistent.

3.4 Initial Code

See our github: https://github.com/UofT-CSC490-F2025/Immigreat

Scraping code is under /src/scraping/ Pipeline is under /src/lambda/sample.py

3.5 Next Steps

- Additional data sources. Extend the ingestion layer to include Statistics Canada datasets, UNHCR bulletins, or academic policy analyses, enabling richer retrieval and cross-source validation.
- Retrieval API. Implement the usage-facing retrieval component: a Lambda function (triggered via API Gateway) that embeds user queries with Bedrock, executes Top-k similarity search in pgvector, and returns structured results to a chatbot or web interface.
- Implement raw \rightarrow clean \rightarrow curated zones. At present all ingested data flows directly into a single S3 bucket; we will introduce explicit tiers to enable reproducibility, clearer debugging, and consistent lineage checks across ingestion, validation, and embedding stages.
- Advanced data validation. While basic cleaning is implemented, future work will integrate frameworks such as *Great Expectations* or *Deequ* to enforce data quality checks (e.g., no missing fields, consistent date formats, valid URLs).
- Monitoring and alerts. Add observability for scraping and transformation jobs (e.g., pipeline health metrics, failure alerts) to ensure robustness in production settings.