

Colorado Workforce Intelligence Platform

Comprehensive technical and user documentation for the GW Hackathon NLx project.

1) Project Summary

Colorado Workforce Intelligence is a Streamlit-based decision-support app built on National Labor Exchange (NLx) Colorado job posting data. It helps three audiences:

- Job seekers find roles aligned with free-text skills.
- Students / career changers discover in-demand skills and field-specific opportunities.
- Veterans translate MOS/MOC military experience into civilian job pathways.

The solution uses NLP and vector similarity (TF-IDF + cosine similarity) to transform job/skill text into searchable, rankable recommendations.

2) Core Capabilities

Job Seeker

- Free-text skill matching against inferred job skill profiles.
- City filtering.
- Match score ranking.
- Education and experience display with source transparency (dataset vs inferred).
- Skill-gap view (matched vs potential missing skills).
- Optional external job posting link when available.

Student / Career Changer

- Top-20 in-demand skill analysis.
- Demand tiering (High / Medium / Low) for quick scanning.
- Field Explorer with curated field prompts.
- Field-specific skills and sample jobs.
- View toggle for Table View vs Card View in field insights.

Veteran Translator

- Direct MOC code matching against employer-tagged `moc_codes`.
- Skill-based fallback/recommendation using expanded MOC dictionary.
- Dual output: direct tagged matches + skill-based matches.

Usage Insights

- Persistent analytics (cross-session) stored in SQLite and mirrored to CSV.
 - Visit, search, and recommendation counters and trend charts.
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3) Technical Architecture

###[Application Layer] - Streamlit UI and interaction flows: `hackathon/app.py`

###[Domain / Core Layer] - Data preparation and artifact lifecycle: `hackathon/core/data.py` - NLP feature extraction and requirement inference: `hackathon/core/nlp_pipeline.py` - Matching and skill-gap logic: `hackathon/core/matching.py` - Student skill trend helpers: `hackathon/core/student.py` - Veteran mapping and matching: `hackathon/core/veterans.py` - Persistent analytics logger (SQLite + CSV): `hackathon/core/analytics_logger.py`

###[Execution Layer] - Prepare data artifacts: `hackathon/scripts/prepare_data.py` - Run all local steps: `hackathon/scripts/run_all.py` - Run Streamlit locally: `hackathon/scripts/run_local.py` - Optional ngrok run: `hackathon/scripts/run_colab.py`

4) Data Pipeline and Artifact Flow

1. Raw data availability
 - Expects zipped NLx files under `data/Colorado-Hackathon-Dataset-selected/`.
2. Raw extraction
 - `prepare_raw_data()` extracts to:
 - `data/raw/colorado.csv`
 - `data/raw/colorado_processed.csv`
3. Job cleaning and schema enforcement
 - `REQUIRED_JOB_COLUMNS` are enforced in `hackathon/core/data.py`.
4. Requirements preprocessing (education/experience)
 - Inferred with regex and source tagging in `hackathon/core/nlp_pipeline.py`.
 - Persisted to `data/processed/nlp_requirements_profile.csv`.
5. NLP skill mention extraction
 - Job text and taxonomy skills are vectorized and matched.
 - Mentions and profiles are persisted to:
 - `data/processed/nlp_skill_mentions.csv`
 - `data/processed/nlp_skill_profiles.csv`
6. Runtime consumption
 - App loads cleaned jobs + skill profiles + mention structure.
7. Analytics persistence
 - App logs usage events to:

- data/processed/analytics/usage_analytics.db
 - data/processed/analytics/usage_analytics_events.csv
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5) NLP and Matching Approach

Skill Profile Construction

- Skill mentions are extracted from job text using a TF-IDF-based relevance process.
- Mentions are deduplicated and aggregated by `system_job_id` into a `skill_text` profile.

Job Matching

- User input is transformed by the same TF-IDF vectorizer.
- Cosine similarity scores compare user vectors vs job skill profile vectors.
- Top-N results are ranked by `match_score`.

Skill Gap Analysis

- For each recommended job, top weighted/informative skills are compared to user text.
- Output groups skills into:
 - matched
 - potential gaps

Requirements Inference

- Education and experience are either:
 - taken from source dataset if present, or
 - inferred from title/description text by regex patterns.
 - Source labels: `dataset`, `nlp_inferred`, `not_specified`.
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6) User Interface Overview

Global UI

- Dark, data-themed background with layered gradients and subtle grid motif.
- KPI strip for jobs indexed, cities, skill profiles, and employers.

Tab 1 — Job Seeker

- Input text + city filter.

- Ranked recommendations with score, salary, requirements, skill gap, and posting link.

Tab 2 — Student / Career Changer

- Top-20 demand dashboard:
 - chart + tiered table + top-skill snapshot cards.
- Career Field Explorer with field descriptions.
- Field results in Table/Card modes.

Tab 3 — Veteran

- MOS/MOC input.
- Direct tagged matches and skill-based matches.
- Expanded MOC dictionary for richer civilian translation cues.

Tab 4 — Usage Insights

- Visit/search/recommendation totals.
- Visit-by-hour chart.
- Search volume by workflow and over time.
- Top recommended roles/cities.

7) Persistent Analytics Specification

Analytics table schema (`analytics_events`) includes:

- `timestamp`
- `event_type` (`visit`, `search`, `recommendation`)
- `channel`
- `city_filter`
- `field`
- `moc`
- `title`
- `city`
- `results_count`
- `direct_count`
- `skill_count`
- `match_score`

Storage behavior: - SQLite is the primary source for analytics visualizations. - CSV is an append mirror for easy export/review.

8) Setup and Execution

Prerequisites

- Python 3.10+
- Dependencies from requirements.txt

Install

```
pip install -r requirements.txt
```

Data Preparation

```
python -m hackathon.scripts.prepare_data
```

Run App

```
python -m hackathon.scripts.run_local
```

or

```
python -m streamlit run hackathon/app.py
```

One-command local sequence

```
python -m hackathon.scripts.run_all
```

Optional public tunnel

```
python -m hackathon.scripts.run_colab
```

9) Directory Map (Key Paths)

- App entrypoint: hackathon/app.py
 - Data pipeline: hackathon/core/data.py
 - NLP extraction and requirement inference: hackathon/core/nlp_pipeline.py
 - Matching logic: hackathon/core/matching.py
 - Student logic: hackathon/core/student.py
 - Veteran logic: hackathon/core/veterans.py
 - Analytics logger: hackathon/core/analytics_logger.py
 - Prepare script: hackathon/scripts/prepare_data.py
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10) Data Contracts (Important Columns)

Jobs (`jobs_clean`)

- `system_job_id`, `title`, `description`, `city`, `zipcode`
- `parameters_salary_min`, `parameters_salary_max`
- `requirements_min_education`, `requirements_experience`
- `classifications_onet_code`, `moc_codes`, `cip_codes`
- `application_company`, `link`, `created_date`, `classifications_naics_code`
- plus merged requirement outputs:
 - `education_display`, `education_source`
 - `experience_display`, `experience_source`

Skill profiles (`skill_profiles`)

- `system_job_id`, `skill_text`

Skill mentions (`structured / mention dataframe`)

- Research ID, Taxonomy Skill, NLP Score
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11) Known Limitations

- Job postings are demand signals, not hiring outcomes.
 - Source coverage may vary by employer and region.
 - MOC translation is heuristic and approximate.
 - Salary and requirement completeness depends on source records.
 - Regex-based requirement inference may miss edge-case phrasing.
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12) Suggested Next Improvements

- Add confidence intervals/explanations for recommendation quality.
 - Improve skill-gap matching with lemmatization and synonym expansion.
 - Add date-window filtering using `created_date`.
 - Add NAICS and O*NET drilldowns in UI filters.
 - Add optional export button for analytics CSV directly in UI.
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13) Quick Troubleshooting

App does not start

- Confirm environment and dependencies installed.
- Run `python -m streamlit run hackathon/app.py` from repository root.

Missing data files

- Ensure zipped source files exist in `data/Colorado-Hackathon-Dataset-selected/`.
- Re-run `python -m hackathon.scripts.prepare_data`.

Empty recommendations

- Check whether skill profiles were generated in `data/processed/`.
- Try broader input text terms.

Analytics charts blank

- Perform at least one search action in any tab.
 - Confirm files exist under `data/processed/analytics/`.
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14) License and Ownership

Refer to LICENSE for licensing terms and repository ownership metadata.