TalentSieve RAG Talent Screener

1. Title

Project: TalentSieve RAG Talent Screener — Automated CV & Project Evaluation Backend

2. Candidate Information

• Full Name: Muhammad Ulil 'Azmi

• Email Address: ulilazmi100@gmail.com

3. Repository Link

GitHub Repository: https://github.com/ulilazmi100/TalentSieve-talent-screener

⚠ Repository information:

The repository includes a reproducible DEMO_MODE, full Docker setup, and Jest test coverage.

4. Approach & Design

Initial Plan

Goal: build a backend API that automates evaluation of candidate CVs and project reports using an LLM (Gemini) and RAG pipeline.

Breakdown of requirements

- 1. Accept and store CV + project report uploads.
- 2. Create a background evaluation job (non-blocking).
- 3. Evaluate via RAG + LLM scoring.
- 4. Return a structured JSON result with 5 fields (cv_match_rate, cv_feedback, project_score, project_feedback, overall_summary).

Key assumptions & scope boundaries

 Offline demo mode (DEMO_MODE=true) must be self-contained and reproducible.

- Evaluation should always produce a complete JSON result, even if the LLM fails.
- Real LLM and Qdrant integrations optional for reviewers.

System & Database Design

API Design

| Endpoint | Method | Description | Example Response |
|--------------|---------------------|--------------------------------|--|
| /upload | POST (multipart) | Upload CV and project PDFs | { "cv_id": "file_xxx", "project_id": "file_xxx" } |
| /evaluate | POST (JSON) | Enqueue evaluation job | { "id": "job_xxx", "status": "queued" } |
| /result/{id} | GET | Retrieve job status and result | { "id": "job_xxx", "status": "completed", "result": {} } |

Database Schema

- documents stores file metadata
 id, filename, type, storage_path, extracted_text, created_at
- **jobs** tracks each evaluation job id, job_title, cv_id, project_id, status, result (JSONB), worker_logs, timestamps
- **demo_db.json** local file-based fallback database when DEMO_MODE=true.

Job Queue

- Implemented using **BullMQ + Redis**.
- Jobs are queued by the API server and processed by a worker (src/worker.js).

LLM Integration

Chosen Provider: Google Gemini (via src/lib/aiClient.js)

Why: simple REST integration, cost-efficient, easy to replace.

Fallback: deterministic heuristic scoring when LLM unavailable (in demo mode).

Temperature: fixed at 0.0 for reproducibility.

Prompt Design & RAG Strategy

RAG:

- Extracts text from PDFs (pdf-parse)
- Chunks text (1,200 chars with 200 overlap)
- Embeds using Gemini (or random vector in demo)
- Retrieves context from Qdrant (when live)

Prompting (real snippets):

// CV Evaluation Prompt

Evaluate the candidate's CV for job title: {jobTitle}.

Return JSON with integer scores (1–5) for technical_skills, experience_level, relevant_achievements, cultural_fit, and short cv_feedback (1–3 sentences).

// Project Evaluation Prompt

Evaluate the project report for job title: {jobTitle}.

Return JSON with integer scores (1–5) for correctness, code_quality, resilience, documentation, creativity, and project_feedback (2–4 sentences).

Resilience & Error Handling

- AJV validation ensures JSON format correctness.
- Fallback scorer (src/fallback/scorer.js) provides deterministic numeric values.
- Retries/backoff for Qdrant & LLM calls.
- Graceful shutdown (app.shutdown()) ensures tests terminate cleanly.

Edge Cases Considered

- Missing/invalid PDF → fallback to raw text extraction.
- LLM returns malformed JSON → auto-repair & fallback scoring.
- External services down → demo mode continues offline.
- Empty content → produces neutral scoring with zero errors.

5. Results & Reflection

Outcome

What worked well

- End-to-end RAG pipeline runs deterministically in demo mode.
- All five required fields generated correctly.
- Integration tests (Jest) pass consistently.
- Docker infra for Redis/Postgres/Qdrant provided and reproducible.

⚠ What didn't work / limitations

- Live Gemini calls require API key (not executed in CI).
- No authentication or rate-limiting (for demo simplicity).
- Uploaded PDFs stored in plaintext (for local testing).

Evaluation of Results

Real test evidence (from your terminal):

```
$ curl http://localhost:3000/result/job_0c02f13a-0331-4980-9800-dcd9ed376327 | jq
{
 "id": "job_0c02f13a-0331-4980-9800-dcd9ed376327",
 "status": "completed",
 "result": {
  "cv_match_rate": 0.73,
  "cv_feedback": "Strong backend tech footprint. Has measurable achievements.
Mentions collaboration/culture keywords.",
  "project score": 3.2,
  "project_feedback": "Includes testing or validation mentions. Contains
documentation cues. Shows creative elements",
  "overall_summary": "Good candidate fit with some areas to improve; consider for
interview with targeted questions. CV note: Strong backend tech footprint. Project note:
Includes testing or validation mentions. Contains documentation cues."
}
}
```



Future Improvements

- Add JWT/API key authentication.
- Encrypt file storage and add antivirus scanning.
- Add Prometheus metrics + Grafana dashboards.
- Expand fallback heuristics with lightweight ML model.
- Add CI workflow running Postgres + Qdrant integration tests.

6. Screenshots of Real Responses

Include screenshots of:

1. Upload response → job id + status

```
Using HOST=http://localhost:3000
Uploading sample files...
Upload response: {"cv_id":"file_984a2d59-9169-4e77-b521-0b52e003e3df","project_id":"file_3b1b5f35-1cb1-47ff-9b4b-516f4ed3c8c3"}
Polling job result: job_9bb345b4-99da-46e5-975c-e987c462eece
```

```
$ HOST=http://localhost:3000 bash scripts/run_sample_job.sh Using HOST=http://localhost:3000 Uploading sample files... Upload response: {"cv_id":"file_984a2d59-9169-4e77-b521-0b52e003e3df","project_id":"file_3b1b5f35-1cb1-47ff-9b4b-516f4ed3c8c3"}
Creating evaluation job...
Evaluate response: {"id":"job_9bb345b4-99da-46e5-975c-e987c462eece","status":"queued"}
Polling job result: job_9bb345b4-99da-46e5-975c-e987c462eece
```

2. The final JSON result as above.

}

```
$ curl -s http://localhost:3000/result/job_9bb345b4-99da-46e5-975c-e987c462eece |
jq
{
    "id": "job 9bb345b4-99da-46e5-975c-e987c462eece",
    "status": "completed",
    "result": {
        "cv_feedback": "Strong backend tech footprint. Has measurable achievements. Me
ntions collaboration/culture keywords.",
        "cv_match_rate": 0.73,
        "project_score": 2.65,
        "overall_summary": "Good candidate fit with some areas to improve; consider fo
r interview with targeted questions. CV note: Strong backend tech footprint. Has
measurable achievements. Project note: Includes testing or validation mentions. Co
ntains documentation cues. Shows creative elements.",
        "project_feedback": "Includes testing or validation mentions. Contains documen
tation cues. Shows creative elements"
}
}

$ curl -s http://localhost:3000/result/job_9bb345b4-99da-46e5-975c-e987c462eece |
        "id": "job_9bb345b4-99da-46e5-975c-e987c462eece",
        "status": "completed",
        "result": {
        "cv_feedback": "Strong backend tech footprint. Has measurable achievements.

Mentions collaboration/culture keywords.",
        "cv_match_rate": 0.73,
        "project_score": 2.65,
        "overall_summary": "Good candidate fit with some areas to improve; consider for
interview with targeted questions. CV note: Strong backend tech footprint. Has
measurable achievements. Project note: Includes testing or validation mentions.
Contains documentation cues. Shows creative elements.",
        "project_feedback": "Includes testing or validation mentions. Contains
documentation cues. Shows creative elements"
```

3. Full run sample result:

```
$ HOST=http://localhost:3000 bash scripts/run_sample_job.sh
Using HOST=http://localhost:3000
Uploading sample files...
Upload response: {"cv_id":"file_d5fbc318-27af-44a9-8d67-f287caf9e0c1","project_id":"file_67a4d4e6-43c7-4cc0-8f18-b3861749dfcd"}
Creating evaluation job...
Evaluate response: {"id":"job_a0ebd010-98df-4c52-9dbc-15babb4c2952","status":"queu
ed"
Polling job result: job_a0ebd010-98df-4c52-9dbc-15babb4c2952
 status=processing
status=processing
 status=processing
 status=processing
status=processing
status=processing
status=processing
status=processing
 status=processing
status=processing
status=processing
status=processing
 status=processing
 status=processing
status=processing
status=processing
status=processing
status=processing
 status=processing
status=processing
status=processing
status=processing
 status=processing
 status=processing
status=processing
status=completed
RESULT:
      "id": "job_a0ebd010-98df-4c52-9dbc-15babb4c2952",
"status": "completed",
      "result": {
   "cv_feedback": "Strong backend tech footprint. Has measurable achievements. Mentions collaboration/culture keywords.",
           "cv_match_rate": 0.73,
"project_score": 4.65,
           "overall_summary": "Strong candidate fit. Good technical match and project qua
   lity. CV note: Strong backend tech footprint. Has measurable achievements. Project note: The project demonstrates a robust and well-designed backend system for an "project_feedback": "The project demonstrates a robust and well-designed backed back
  nd system for an LLM-powered RAG pipeline, effectively addressing the core require
   e demo mode, and thorough consideration of edge cases. The detailed system design and consistent test pass rates reflect a high standard of engineering."
      }
$ HOST=http://localhost:3000 bash scripts/run_sample_job.sh
Using HOST=http://localhost:3000

Uploading sample files...

Upload response: {"cv_id":"file_d5fbc318-27af-44a9-8d67-

f287caf9e0c1","project_id":"file_67a4d4e6-43c7-4cc0-8f18-b3861749dfcd"}
Creating evaluation job...
Evaluate response: {"id":"job_a0ebd010-98df-4c52-9dbc-
15babb4c2952","status":"queued"}
Polling job result: job_a0ebd010-98df-4c52-9dbc-15babb4c2952
status=processing
status=processing
```

```
status=processing
status=completed
RESULT:
   "cv_feedback": "Strong backend tech footprint. Has measurable achievements.

Mentions collaboration/culture keywords.",
    "cv_match_rate": 0.73,
    "project_score": 4.65,
    "overall_summary": "Strong candidate fit. Good technical match and project
quality. CV note: Strong backend tech footprint. Has measurable achievements. Project note: The project demonstrates a robust and well-designed backend system
for an LLM-powered RAG pipeline, effectively addressi.",

"project_feedback": "The project demonstrates a robust and well-designed backend system for an LLM-powered RAG pipeline, effectively addressing the core requirements. Key strengths include the comprehensive error handling, a highly reproducible demo mode, and thorough consideration of edge cases. The detailed system design and consistent test pass rates reflect a high standard of engineering."
engineering.
}
```

4. Docker Compose logs for API:

loogs with { quiet: true }
api-1 | Listening 3000
api-1 | Connected to Redis: redis://redis:6379

Postgres pool connected OK

Redis client ready

api-1

api-1

api-1

```
docker compose logs -f api
api-1
api-1
          > talentsieve-rag-talent-screener@0.3.0 start
api-1
          > node src/server.js
api-1
         [dotenv@17.2.3] injecting env (6) from .env -- tip: 🚳 suppress all loo
api-1
gs with { quiet: true }
         Listening 3000
Connected to Redis: redis://redis:6379
api-1
api-1
          Redis client ready
api-1
          Postgres pool connected OK
api-1
$ docker compose logs -f api
api-1
         > talentsieve-rag-talent-screener@0.3.0 start
> node src/server.js
api-1
api-1
api-1
```

[dotenv@17.2.3] injecting env (6) from .env -- tip: 🔅 suppress all

5. Docker Compose logs for Worker

```
$ docker compose logs -f worker
worker-1
worker-1
               > talentsieve-rag-talent-screener@0.3.0 worker
               > node src/worker.js
 vorker-1
worker-1
worker-1 | [dotenv@17.2.3] injecting env (6) from .env -- tip: @ prevent build ing .env in docker: https://dotenvx.com/prebuild worker-1 | Worker connected to Redis: redis://redis:6379
               Worker Redis client ready
               Postares pool connected OK
$ docker compose logs -f worker
worker-1
               > talentsieve-rag-talent-screener@0.3.0 worker
> node src/worker.js
worker-1
worker-1
worker-1
worker-1 | [dotenv@17.2.3] injecting env (6) from .env -- tip: 🕡 prevent
building .env in docker: https://dotenvx.com/prebuild
worker-1 | Worker connected to Redis: redis://redis:6379
worker-1
               Worker Redis_client ready
worker-1
             Postgres pool connected OK
```

6. Jest test summary:

```
PASS
      tests/validator.test.js
      tests/fallback.test.js
PASS
Test Suites: 3 passed, 3 total
             5 passed, 5 total
Tests:
             0 total
Snapshots:
             2.145 s
Time:
Ran all test suites.
```

```
ASS tests/validator.test.js
PASS tests/fallback.test.js
```

Test Suites: 3 passed, 3 total Tests: 5 passed, 5 total

0 total 2.145 s **Snapshots:** Time: Ran all test suites.

7. (Optional) Bonus Work

All bonus features are factual and verifiable from the repository:

| # | Bonus Feature | Description | |
|---|---------------------------|---|--|
| 1 | Offline Demo Mode | Allows full functionality (upload, evaluate, result) | |
| | (DEMO_MODE=true) | with no external dependencies. Uses .demo_db.json | |
| | | and mock embeddings. | |
| 2 | Canonical Key | Accepts flexible JSON keys (cvDocId, projectId, etc.) | |
| | Normalization | and normalizes them for robustness. | |
| 3 | AJV Validation + Fallback | Ensures valid structured results even when LLM | |
| | Logic | output is invalid. | |
| 4 | Integration & Unit Tests | Automated Jest tests for end-to-end evaluation flow. | |
| 5 | Graceful Shutdown API | Enables clean termination of async jobs in tests | |
| | | (app.shutdown()). | |
| 6 | Dockerized Infra Stack | Fully functional local environment: Redis, Postgres, | |
| | | Qdrant, API, Worker. | |
| 7 | Deterministic Heuristic | Stable keyword-based fallback scoring algorithm | |
| | Scorer | (src/fallback/scorer.js). | |

End of Report