

Vector Search

pgvector embeddings and semantic search

PSScript Manager Docs

Vector Search and File Integrity

This document describes the implementation of vector search and file integrity verification features in the PSScript platform.

Overview

We've added two key features to enhance the platform's capabilities:

1. **File Integrity Verification:** Ensures script files are not duplicated and maintains data integrity through MD5 hash verification.
2. **Vector Search:** Enables semantic similarity search for PowerShell scripts using vector embeddings.

File Integrity Features

Key Components

- **Hash Calculation:** MD5 hash generation for file content to uniquely identify scripts.
- **Duplicate Detection:** Prevents uploading identical scripts by comparing file hashes.
- **Integrity Verification:** Ensures scripts haven't been tampered with by comparing stored and calculated hashes.

Implementation Files

- `src/backend/src/utils/fileIntegrity.ts` : Utility functions for file hash calculation and verification.
- `src/db/migrations/add_file_hash_to_scripts.sql` : Database migration to add file hash column.
- `run-file-hash-migration.sh` : Script to run the migration and update existing scripts.

Vector Search Features

Key Components

- **Embedding Generation:** Creates vector embeddings for script content using OpenAI's embedding models.
- **Similarity Search:** Finds semantically similar scripts using cosine similarity.
- **Hybrid Search:** Combines vector similarity with keyword search for better results.

Implementation Files

- `src/backend/src/Utils/vectorUtils.ts` : Utility functions for vector operations and search.
- `src/backend/src/controllers/ScriptController.ts` : Updated controller with vector search integration.

Database Changes

The following changes were made to the database schema:

```
-- Add file_hash column to scripts table
ALTER TABLE scripts ADD COLUMN IF NOT EXISTS file_hash VARCHAR(255)

-- Add index on file_hash for faster duplicate detection
CREATE INDEX IF NOT EXISTS idx_scripts_file_hash ON scripts(file_hash)

-- Add embedding column for vector search
ALTER TABLE scripts ADD COLUMN IF NOT EXISTS embedding vector(1536)

-- Create vector index for faster similarity search
CREATE INDEX IF NOT EXISTS idx_scripts_embedding ON scripts USING
```

Usage Examples

File Integrity

```
// Calculate hash for a file
const fileHash = calculateBufferMD5(fileBuffer);

// Check if a file with the same hash exists
const existingScriptId = await checkFileExists(fileHash, sequelize)
if (existingScriptId) {
  // Handle duplicate file
}

// Verify file integrity
const isValid = verifyFileIntegrity(content, expectedHash);
```

Vector Search

```
// Find similar scripts
const similarScripts = await findSimilarScripts(scriptId, 5, 0.7);

// Perform hybrid search with keywords and vectors
const searchResults = await hybridSearch(query, 10, 0.7, {
  categoryId: 5,
  isPublic: true
});
```

Testing

Use the `test-file-hash-vector.sh` script to test the implementation:

```
./test-file-hash-vector.sh
```

This script tests: 1. File hash migration 2. Hash calculation 3. Vector search functionality

Performance Considerations

- Vector search operations can be computationally intensive. The implementation uses PostgreSQL's vector operators with indexes to optimize performance.
- File hash calculation is performed once during upload and stored for future reference.
- Batch operations are provided for updating file hashes and embeddings for existing scripts.

Future Improvements

- Implement periodic integrity checks to ensure all scripts maintain their integrity.
- Add more sophisticated vector search algorithms like Hierarchical Navigable Small World (HNSW).
- Explore using different embedding models for different types of PowerShell scripts.
- Implement caching for frequently accessed vector search results.