# **BioNeuralNet**

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**BioNeuralNet** is designed to integrate omics data with neural network embeddings, facilitating advanced data analysis in bioinformatics. Leveraging Python, BioNeuralNet constructs and analyzes complex biological networks, ensuring comprehensive and scalable data processing.

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# Overview

BioNeuralNet empowers researchers to seamlessly integrate various omics datasets using advanced neural network embeddings. By combining the strengths of Python for data manipulation and analysis, BioNeuralNet provides a comprehensive toolkit for bioinformatics applications.



# **Features**

- Graph Construction: Utilize SmCCNet and WGCNA algorithms to build complex biological networks.
- Clustering: Perform clustering using methods like PageRank and Hierarchical Clustering.
- **Network Embedding**: Generate high-dimensional embeddings using Graph Neural Networks (GNNs) and Node2Vec.
- Subject Representation: Enhance omics data representations for downstream analyses.
- **Comprehensive Testing**: Ensure reliability with a robust testing suite and continuous integration.
- **Developer-Friendly**: Streamlined setup for contributors with pre-commit hooks and development tools.

# Installation

For Users: Python Package Installation

Most users can install **BioNeuralNet** directly via pip, which includes all necessary Python dependencies.

### 1. Ensure Python 3.7 or Higher is Installed

Verify your Python version:

```
python3 --version
```

## 2. Install BioNeuralNet via Pip

```
pip install bioneuralnet
```

This command installs the latest stable release from PyPI, including all base dependencies.

**Note:** If you require CUDA-enabled functionalities (for GPU acceleration), ensure that you have the appropriate CUDA version installed on your system.

For Users: R Dependencies

**BioNeuralNet** integrates R scripts for graph construction using SmCCNet and WGCNA. While Python users can install the package via pip, R dependencies need separate installation. Most users do not require R functionalities unless they intend to utilize these specific graph construction methods.

### 1. Manual R Installation

If you prefer manual installation or are on an unsupported operating system, follow these steps:

#### a. Install R

# • Download R:

Visit the CRAN R Project and download the appropriate installer for your operating system.

### • Install R:

Follow the installation instructions provided on the CRAN website for your specific OS.

### b. Install Required R Packages

Open R or RStudio and execute the following commands to install necessary packages:

```
install.packages(c("dplyr", "SmCCNet", "WGCNA"))
```

#### Notes:

• **System Dependencies:** Some R packages might require additional system dependencies. Ensure you have the necessary build tools installed (e.g., gcc, make).

• Permissions: You may need administrative privileges to install certain packages or dependencies.

For Developers: Development Environment Setup

Researchers and developers intending to contribute to **BioNeuralNet** should set up a development environment. This involves creating a virtual environment, installing dependencies, and setting up precommit hooks to maintain code quality.

### 1. Clone the Repository

```
git clone https://github.com/UCD-BDLab/BioNeuralNet.git
cd BioNeuralNet
```

# 2. Run the Setup Script

The setup sh script automates the setup process for developers.

```
./setup.sh
```

### What setup.sh Does:

- Creates and Activates a Virtual Environment: Ensures that dependencies are isolated.
- **Installs Base and Development Dependencies:** Sets up the environment with necessary packages.
- Installs Pre-Commit Hooks: Automates code quality checks before commits.
- Initializes the Project: Sets up directories and configuration files.

Note: Ensure you have execution permissions for setup. sh. If not, make it executable:

```
chmod +x setup.sh
```

# 3. Verify Pre-Commit Hooks

After running setup.sh, pre-commit hooks should be installed automatically. To confirm, you can run:

```
pre-commit run --all-files
```

This will execute all configured pre-commit hooks on the entire codebase.

### 4. Install R Dependencies (If Needed)

If your development work involves R scripts, ensure that R and its required packages are installed as per the R Dependencies section.

# **Quick Start Guide**

Begin using **BioNeuralNet** by following these streamlined steps:

#### 1. Prepare Input Data

- Omics Data: Place your omics CSV files (e.g., proteomics\_data.csv, metabolomics\_data.csv) in the input/ directory.
- Phenotype Data: Place phenotype\_data.csv in the input/ directory.
- Clinical Data: Place clinical\_data.csv in the input/ directory.

#### 2. Combine Omics Data

If you have multiple omics datasets, combine them using the combine\_omics\_data utility.

```
from bioneuralnet.utils.data_utils import combine_omics_data

omics_file_paths = [
    './input/proteomics_data.csv',
    './input/metabolomics_data.csv'
]

combined_omics_file = './input/omics_data.csv'

combine_omics_data(omics_file_paths, combined_omics_file)
```

# 3. Run the Example Usage Script

Execute the example usage script or create your own pipeline script to perform data integration and analysis.

```
python examples/usage_examples.py
```

This script demonstrates how to use various components of BioNeuralNet with direct parameter passing.

# **Pipeline Components**

BioNeuralNet's pipeline consists of several interconnected components:

## 1. Graph Construction

- **SmcCNet**: Builds graphs based on higher-order correlations.
- WGCNA: Constructs weighted correlation networks and detects modules.

## 2. Clustering

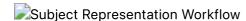
- PageRankClustering: Clusters nodes based on personalized PageRank.
- HierarchicalClustering: Performs agglomerative hierarchical clustering.

### 3. Network Embedding Generation

- o GNNEmbedding: Generates embeddings using Graph Neural Networks.
- Node2VecEmbedding: Generates embeddings using the Node2Vec algorithm.

# 4. Subject Representation

 SubjectRepresentationEmbedding: Integrates node embeddings into omics data to enhance subject representations.



### 5. Integrated Tasks

 Disease Prediction using Multi-Omics Networks: Leverages the power of Graph Neural Networks (GNNs) to capture intricate relationships between biological entities and extract valuable knowledge from this network structure.



## 6. Utility Functions

Includes tools for data manipulation, path validation, and more.

# Acknowledgements

BioNeuralNet utilizes several external packages and libraries that are integral to its functionality. We extend our gratitude to the developers and contributors of these projects:

#### SmCCNet

- o Description: An R package for Sparse Multiple Canonical Correlation Network.
- Repository: SmCCNet on CRAN

# • WGCNA

- Description: Weighted Correlation Network Analysis for R.
- Repository: WGCNA on CRAN

#### Node2Vec

- o Description: Scalable Feature Learning for Networks.
- Repository: Node2Vec GitHub

#### Other Libraries

- o **dplyr**: A grammar of data manipulation for R. dplyr on CRAN
- **PyTorch**: An open source machine learning library based on the Torch library. PyTorch Official Site
- PyTorch Geometric: Extension library for PyTorch to handle geometric data. PyTorch
   Geometric GitHub
- o Pytest: A framework that makes building simple and scalable tests easy. Pytest Official Site
- Pre-commit: A framework for managing and maintaining multi-language pre-commit hooks.
   Pre-commit GitHub
- Other Dependencies: Refer to requirements.txt for a complete list of Python dependencies.

Thank you to all the open-source communities that make projects like BioNeuralNet possible.

# **Documentation**

Comprehensive documentation is available to help you navigate and utilize all features of BioNeuralNet.

- Main Documentation: Located in the docs/ directory, providing detailed guides and usage instructions.
- API Reference: Detailed API documentation is available here. (Replace with your actual documentation URL)
- **Testing Documentation:** Refer to tests/README.md for information on running and writing tests.
- Additional Guides: Explore other README.md files within subdirectories for specific component details.

*Note:* The **README.md** provides an overview and essential instructions, while the **API Reference** offers indepth technical details about the package's classes, functions, and methods.

# **Testing**

Ensuring the reliability of **BioNeuralNet** is paramount. Automated tests run on every commit and pull request via GitHub Actions, and pre-commit hooks enforce local testing before code is committed.

#### Overview

- **Testing Framework:** Utilizes pytest for writing and running tests.
- **Continuous Integration:** GitHub Actions runs tests on multiple Python versions, checks code quality, and reports coverage.
- Local Enforcement: Pre-commit hooks automate tests and code quality checks before commits.

# **Running Tests Locally**

Detailed instructions are available in tests/README.md, but here's a quick overview:

1. Ensure Development Dependencies are Installed

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

#### 2. Run All Tests

```
pytest
```

# 3. View Coverage Reports

```
pytest --cov=bioneuralnet --cov-report=html tests/
```

Open htmlcov/index.html in your browser to view the coverage details.

# Continuous Integration

Every commit and pull request triggers GitHub Actions workflows that:

- Install dependencies.
- Lint and format code.
- Run the test suite.
- Upload coverage reports to Codecov.

Ensure that all tests pass in the CI pipeline before merging changes.

# Contributing

Contributions are welcome! To ensure a smooth collaboration process, please adhere to the following guidelines:

# 1. Fork the Repository

```
git clone https://github.com/UCD-BDLab/BioNeuralNet.git
cd BioNeuralNet
```

#### 2. Create a Feature Branch

```
git checkout -b feature/your-feature-name
```

### 3. Install Development Dependencies

```
./setup.sh
```

# 4. Make Your Changes

- Write clean, readable code following PEP 8 standards.
- Add or update tests as necessary.
- o Update documentation if your changes affect usage or functionality.

### 5. Run Tests Locally

```
pytest
```

### 6. Commit Your Changes

```
git add .
git commit -m "Add feature XYZ"
```

Pre-commit hooks will run automatically, ensuring code quality and passing tests before the commit is finalized.

### 7. Push to Your Fork

```
git push origin feature/your-feature-name
```

# 8. Open a Pull Request

Navigate to the original repository and open a pull request detailing your changes.

# **Pre-Commit Hooks**

To maintain code quality, pre-commit hooks are enforced. After setting up your development environment, ensure that pre-commit hooks are installed:

```
pre-commit install
```

These hooks will automatically run tests, format code, and perform linting before each commit.

# **Guidelines for Writing Tests**

Refer to tests/README. md for comprehensive guidelines on writing effective and consistent tests.

# License

This project is licensed under the MIT License.

# Contact

For questions, support, or contributions, please open an issue on GitHub or contact the maintainers directly.

# **Final Notes**

• **Primary Installation Method:** Most users can seamlessly install **BioNeuralNet** using pip install bioneuralnet, which handles all necessary Python dependencies.

- **R Dependencies:** R scripts required for SmCCNet and WGCNA are not installable via pip. Users needing these functionalities should follow the R installation instructions provided above.
- **Usage with Direct Parameter Passing:** All components in BioNeuralNet can be used by directly passing parameters to the classes, without the need for configuration files. Refer to the example usage scripts in the examples/ directory.
- **Developer Setup:** Developers contributing to the project should use the **setup.** sh script to establish their development environment, ensuring consistency and adherence to project standards.
- **Documentation and Testing:** Comprehensive documentation and a robust testing suite ensure that both users and contributors have the resources needed to effectively utilize and enhance **BioNeuralNet**.

By maintaining a clear and organized README.md, we aim to facilitate ease of use for end-users and streamline the development process for contributors. This structured approach enhances the overall quality and maintainability of the **BioNeuralNet** project.