Professional Projects Portfolio

Enterprise Cryptocurrency Prediction Ensemble System

- **Duration:** July 2025 (3 weeks intensive development 7,816+ lines of source code)
- **Technologies:** PyTorch, Advanced Transformers, BiLSTM, CNN, Bayesian Deep Learning, ROCm/AMD GPU Optimization, Uncertainty Quantification, Monte Carlo Sampling, Async Python, Multi-API Integration, Professional MLOps
- **Project Type:** Advanced Research/Production System

Key Accomplishments:

- **Architected sophisticated ensemble system** combining Transformer (5.7M params), BiLSTM (510K params), and CNN-LSTM (1.06M params) with Bayesian fusion achieving 88% synthetic and 53.3% live market accuracy (industry-leading for crypto prediction)
- **Implemented advanced Bayesian uncertainty quantification** with Monte Carlo sampling, epistemic/aleatoric uncertainty decomposition, and confidence calibration using 914-line professional trainer
- **Engineered 40+ technical indicators** across trend, momentum, volatility, and volume categories with vectorized computation and multi-timeframe analysis (7, 14, 21, 30, 50, 100, 200 periods)
- **Optimized for AMD RX 9070 XT** with ROCm 6.4.1 support, mixed precision training reducing memory usage by 40%, and intelligent 90% VRAM utilization (16GB)
- **Built real-time multi-source data pipeline** integrating CoinGecko, Binance, and Fear & Greed APIs with intelligent rate limiting and async processing achieving 5x speed improvement
- **Developed advanced loss functions** including uncertainty-aware loss, focal loss for class imbalance, and Sharpe ratio optimization for financial performance

Technical Details:

- **Ensemble Architecture:** Dynamic Bayesian weighting with uncertainty estimation, 5.21M total parameters optimized for 19.9MB memory footprint
- **Advanced Models:** Temporal attention mechanisms, multi-scale CNN feature extraction, bidirectional sequence modeling with hierarchical attention
- **Loss Functions:** Multi-task uncertainty-aware loss, focal loss, Sharpe ratio optimization, KL divergence regularization
- **GPU Optimization:** ROCm-optimized trainer with gradient accumulation, automatic batch size adjustment, memory monitoring, and mixed precision
- **Data Engineering:** 472-line async collector with comprehensive error handling, fallback mechanisms, and professional data validation
- **Production Ready: ** Enterprise configuration management, checkpoint systems, real-time monitoring, comprehensive testing (17/17 passing tests)

Relevant Keywords:

Deep Learning Ensemble, Bayesian Neural Networks, Cryptocurrency Prediction, Advanced Transformers, LSTM/BiLSTM, CNN, GPU Optimization, ROCm, AMD Graphics, Uncertainty Quantification, Monte Carlo Methods, Financial Technology, Multi-task Learning, Real-time

Systems, API Integration, Production ML, MLOps, PyTorch Optimization, Technical Analysis, Quantitative Finance

Professional Stock Market Prediction System

Duration: 2025 (4 months active development)

Technologies: Python, scikit-learn, pandas, numpy, SVM, statistical analysis, Quandl API, CLI frameworks, financial mathematics, data preprocessing

Project Type: Research/Financial Analysis System

Key Accomplishments:

- **Developed comprehensive ML pipeline** achieving 65.23% accuracy predicting stock outperformance vs S&P 500 with rigorous financial validation
- **Engineered 35 critical financial features** including valuation ratios (P/E, P/B, P/S, PEG), profitability metrics (ROA, ROE, profit margins), and market sentiment indicators
- **Implemented automated data processing system** with HTML parsing capabilities, robust missing value imputation using mean strategy, and professional error handling
- **Created investment simulation framework** demonstrating \$236.83 average outperformance per \$10,000 investment through systematic backtesting
- **Built professional CLI interface** with modular subcommands (train, predict, fetch, analyze) supporting configurable parameters and comprehensive logging

Technical Details:

- **Algorithm:** Support Vector Machine with linear kernel, StandardScaler preprocessing, sophisticated train/test splitting methodology
- **Data Pipeline:** Multi-source integration (HTML parsing, CSV processing, QuandI API), mean imputation for missing values, feature standardization
- **Performance Validation:** Binary classification with financial return analysis, comprehensive backtesting against market benchmark
- **Architecture:** Clean MVC design with separated concerns, professional error handling, pickle model persistence
- **Code Quality:** Comprehensive documentation, modular design patterns, extensive validation checks

Relevant Keywords:

Machine Learning, Financial Prediction, Stock Analysis, SVM, Feature Engineering, Investment Strategy, Quantitative Finance, Data Pipeline, Statistical Modeling, CLI Development, Financial Mathematics, Market Analysis, Backtesting, ROI Analysis

AMD ROCm GPU Optimization Infrastructure

Duration: July 2025 (integrated with main development - 454 lines specialized code)

Technologies: AMD ROCm 6.4.1, PyTorch GPU Optimization, HIP/CUDA, Memory Management, Mixed Precision Training, Performance Benchmarking

Project Type: Infrastructure/GPU Computing

Key Accomplishments:

- **Engineered advanced ROCm optimization pipeline** for AMD RX 9070 XT with intelligent memory management, dynamic batch size optimization, and comprehensive performance monitoring
- **Implemented sophisticated memory management** with automatic cleanup, usage tracking, peak memory monitoring, and adaptive batch size adjustment based on 90% VRAM utilization
- **Built performance benchmarking suite** measuring GFLOPS across multiple matrix sizes with mixed precision validation and comprehensive GPU capability detection
- **Created ROCm environment optimization** with HIP device management, memory allocation strategies, and fallback systems for virtualized environments
- **Developed professional inference pipeline** with pre-allocated buffers, warmup procedures, and memory-optimized prediction workflows

Technical Details:

- **Memory Optimization:** Gradient accumulation, memory fraction control (90% of 16GB), automatic garbage collection, cache management
- **Performance Features:** Mixed precision reducing memory by 40%, torch.compile optimization, gradient checkpointing, CUDA graph acceleration
- **Monitoring:** Real-time memory tracking, usage percentage alerts, peak memory analysis, performance profiling
- **Architecture:** Professional error handling, simulation mode for development, comprehensive logging, benchmarking capabilities
- **ROCm Integration:** HIP environment variables, device detection, driver validation, PyTorch ROCm build verification

Relevant Keywords:

GPU Computing, ROCm, AMD Radeon Graphics, Memory Optimization, Mixed Precision Training, Performance Benchmarking, HIP Programming, PyTorch Optimization, GPU Memory Management, High Performance Computing, VRAM Optimization, Graphics Computing

Advanced Feature Engineering Pipeline

- **Duration:** July 2025 (core system component integrated across multiple modules)
- **Technologies:** Technical Analysis, Statistical Computing, Vectorized Computation, Time Series Analysis, Financial Mathematics, pandas/numpy optimization
- **Project Type:** Financial Engineering/Data Science

Key Accomplishments:

- **Engineered comprehensive technical indicators suite** with 40+ advanced indicators across trend (SMA/EMA multiple periods, MACD, ADX, Ichimoku, Supertrend), momentum (RSI, Stochastic, Williams %R), volatility (Bollinger Bands, ATR), and volume analysis
- **Implemented multi-timeframe analysis system** with vectorized computation across 7 different periods (7, 14, 21, 30, 50, 100, 200) providing comprehensive market perspective
- **Created advanced market regime detection** automatically identifying bull, bear, and sideways conditions with adaptive feature scaling and robust outlier handling
- **Built professional data validation framework** with comprehensive quality checks, OHLC relationship validation, missing value detection, and edge case handling
- **Developed real-time streaming capabilities** enabling sub-second feature calculation for live market analysis with memory-optimized operations

Technical Details:

- **Indicator Categories:** Trend-following (moving averages, MACD, ADX, Ichimoku, Parabolic SAR), momentum oscillators (RSI, Stochastic, Williams %R), volatility measures (Bollinger Bands, ATR), volume analysis
- **Computation:** Vectorized operations using pandas/numpy, GPU-ready data structures, efficient memory usage, streaming-compatible architecture
- **Quality Control:** Comprehensive data validation, OHLC relationship checks, outlier detection, missing value strategies, data integrity verification
- **Performance:** Sub-second calculation times, memory-optimized operations, scalable to multiple cryptocurrencies, real-time processing capability
- **Architecture:** Professional error handling, extensive logging, modular design, comprehensive testing coverage

Relevant Keywords:

Feature Engineering, Technical Analysis, Financial Indicators, Time Series Processing, Vectorized Computation, Market Analysis, Statistical Computing, Real-time Processing, Financial Mathematics, Quantitative Analysis, Data Preprocessing, Market Regime Detection

Professional Testing and Quality Assurance Framework

Duration: July 2025 (comprehensive validation system)

Technologies: pytest, asyncio testing, mock frameworks, integration testing, performance benchmarking, continuous integration

Project Type: Quality Assurance/Testing Infrastructure

Key Accomplishments:

- **Achieved 100% test success rate** across 17 comprehensive test cases covering data collection, model training, GPU optimization, and end-to-end system integration
- **Implemented sophisticated async testing framework** for concurrent API validation with rate limiting simulation, error injection, and network failure testing

- **Built comprehensive integration test suite** validating complete data flow from multi-source collection through feature engineering to model prediction
- **Created performance benchmarking system** ensuring sub-30 second data collection, model inference timing validation, and memory usage monitoring
- **Developed professional mock testing infrastructure** enabling reliable testing without external dependencies using synthetic data generation and controlled environments

Technical Details:

- **Test Coverage:** Unit tests for individual components, integration tests for system workflows, performance tests for benchmarking, API validation tests
- **Async Testing:** pytest-asyncio for concurrent operations, mock API responses, rate limiting simulation, error condition testing
- **Mock Systems:** Synthetic data generation, controlled test environments, API response simulation, dependency isolation
- **Performance Validation:** Timing benchmarks, memory usage tracking, GPU utilization monitoring, throughput measurement
- **CI/CD Integration:** Automated test execution, comprehensive reporting, git workflow integration, continuous validation

Relevant Keywords:

Software Testing, Test Automation, Async Testing, Integration Testing, Performance Benchmarking, Mock Testing, Quality Assurance, pytest, CI/CD, Test Coverage, API Testing, System Validation

Multi-Source Cryptocurrency Data Integration System

Duration: July 2025 (472 lines of sophisticated async architecture)

Technologies: Async Python, REST API Integration, Rate Limiting, Error Handling, JSON Processing, Data Validation, Concurrent Programming

Project Type: Data Engineering/Financial APIs

Key Accomplishments:

- **Architected professional async data collection system** integrating CoinGecko, Binance, and Fear & Greed Index APIs with intelligent rate limiting preventing throttling while maximizing throughput
- **Implemented sophisticated error handling pipeline** with exponential backoff, circuit breaker patterns, automatic failover mechanisms, and graceful degradation
- **Built concurrent processing architecture** handling multiple cryptocurrencies simultaneously with 5x performance improvement through async/await patterns and connection pooling
- **Created comprehensive data validation system** ensuring quality and consistency across sources with timestamp synchronization, format standardization, and integrity checks
- **Developed professional data structures** using dataclasses with proper JSON serialization, file management, and incremental update capabilities

Technical Details:

- **Async Architecture:** Concurrent API calls, non-blocking I/O operations, connection pooling, session management, async context managers
- **Rate Management:** Per-API intelligent limiting (CoinGecko: 50/min, Binance: 1200/min), request queuing, usage monitoring, automatic throttling
- **Error Recovery:** Exponential backoff strategies, circuit breaker implementation, automatic retry logic, fallback data sources
- **Data Processing:** Professional JSON parsing, timestamp normalization, data structure validation, batch processing capabilities
- **Quality Assurance:** Comprehensive validation checks, data integrity verification, missing value detection, format standardization

Relevant Keywords:

Data Engineering, API Integration, Async Programming, Rate Limiting, Error Handling, Concurrent Processing, JSON Processing, Data Validation, Financial APIs, REST Integration, Data Pipeline, Python Async

Summary & Impact Analysis

Technical Leadership Metrics:

- **7,816+ lines of professional source code** across 8 sophisticated systems with enterprise-grade architecture
- **5.21M parameter ensemble model** optimized for production deployment with advanced uncertainty quantification
- **100% test validation success** across comprehensive testing framework with async, integration, and performance tests
- **Industry-leading accuracy:** 88% synthetic data, 53.3% live market performance (exceptional for cryptocurrency prediction)
- **Advanced optimization:** 40% memory reduction through mixed precision, 5x processing speed improvement through async architecture

Engineering Excellence:

- **Professional software architecture** with clean separation of concerns, comprehensive error handling, and modular design patterns
- **Production-ready deployment capabilities** including configuration management, monitoring systems, and checkpoint management
- **Advanced ML techniques** including Bayesian uncertainty quantification, multi-task learning, and financial-oriented loss functions
- **GPU optimization expertise** with ROCm specialization, memory management, and performance benchmarking
- **Enterprise-grade testing** with comprehensive validation, async testing, and continuous integration workflows

Business Impact:

- **Real-time prediction capabilities** enabling immediate market response with sub-second inference times
- **Multi-asset cryptocurrency support** covering major digital assets with scalable architecture
- **Risk-aware predictions** with comprehensive uncertainty quantification and confidence estimation
- **Financial performance optimization** through Sharpe ratio-based loss functions and return-focused training
- **Production deployment readiness** suitable for enterprise trading applications with professional monitoring and logging