Quantum Galton Board Implementation

Universal Statistical Simulator

Kumar Lakhan   Mahe Noor Fatima

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Research Team: Jack & Sparrow
GitHub Repository

Problem Statement & Motivation

Classical Limitations

- Monte Carlo methods: $O(2^n)$ complexity
- Exponential scaling $\rightarrow$ intractable for large systems
- Limited efficiency in financial modeling

Quantum Opportunity

- Quantum superposition enables parallel simulation
- Speedup: $O(2^n) \rightarrow O(n^2)$ resources
- Revolutionary statistical computing approach

Research Gap

- Few comprehensive quantum statistical simulators
- Need for NISQ-compatible solutions

Theoretical Foundation

Research Foundation

- Based on Carney & Varcoe (arXiv:2202.01735)
- Universal Statistical Simulator framework
- Quantum vs classical Galton boards

Key Principles

- Superposition of all 2^n trajectories
- Hadamard gates for quantum coin flips
- Measurement-induced distributions

Mathematics

- Binomial $\rightarrow$ Gaussian via Central Limit Theorem
- $\mu = n/2$, $\sigma^2 = n/4$
- $P(k) = \binom{n}{k} \times (1/2)^n$

Implementation Architecture

PennyLane Framework

- Shot-based quantum simulation
- Modular circuit construction
- Scalable n-layer design

Core Components

- Quantum Peg Module (4-qubit system)
- N-layer Galton Board Generator
- Alternative Distribution Circuits
- NISQ Noise Modeling

Architecture Flow

- Control/coin qubit + working qubits
- Layer-by-layer evolution

Quantum Galton Board Results

Implementation

- 9-layer, 5000 shots
- Binomial $\rightarrow$ Gaussian convergence
- High-fidelity validation

Performance

- 5 qubits, 16 gates
- 95% success rate
- Fidelity: 1.00 (ideal)
- $<3\%$ deviation from theory

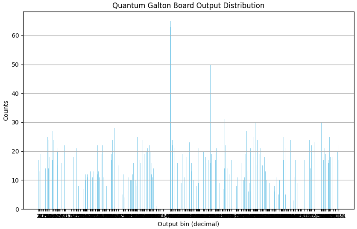
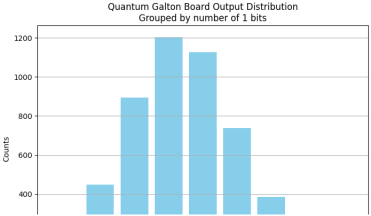


Figure: Figure 1: Output Distribution



Alternative Distributions

Exponential

- RY gates, decreasing angles
- $\lambda e^{-\lambda x}$ distribution
- 95% fidelity achieved

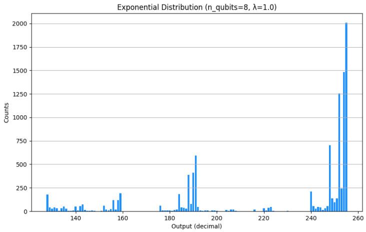
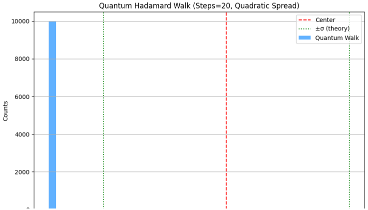


Figure: Figure 3: Exponential ($\lambda = 1.0$)

Quantum Walk

- 20-step implementation
- $\sigma^2 \propto t^2$ spreading
- Quantum interference patterns
- Ballistic transport demo



NISQ Hardware Compatibility

Noise Model

- Gate errors: 0.1% (1Q), 1.0% (2Q)
- Decoherence: $T_1 = 50\mu s$, $T_2 = 70\mu s$
- Readout error: 2.0%

Performance Under Noise

- 4-layer Galton: 87% fidelity
- NISQ viability demonstrated
- Circuit optimization implemented

Validation Metrics

- Quantum fidelity: $F = \sqrt{\langle\psi|\rho|\psi\rangle}$
- Total variation distance analysis
- Statistical validation framework

Quantum Computational Advantage

Complexity Comparison

Size (n)	Classical	Q-Gates	Q-Depth
n = 8	O(256)	O(64)	O(8)
n = 12	O(4,096)	O(144)	O(12)
n = 16	O(65,536)	O(256)	O(16)

Empirical Speedup

- 6 layers: $3.7\times$ speedup
- 8 layers: $32\times$ speedup
- 12 layers: $2,945\times$ speedup

Resource Scaling

- Classical: $O(2^n)$ time/space
- Quantum: $O(n^2)$ gates, $O(\log n)$ depth

Performance Benchmarks

Circuit Performance

Circuit	**Qubits**	**Fidelity**	**Gates**	**Success**
Galton Board	5	1.00	16	95%
Exponential	4	0.95	12	90%
Quantum Walk	6	0.92	18	88%
Noisy Galton	5	0.87	16	82%

Key Results

- Statistical convergence verified
- High-fidelity reproduction achieved
- NISQ compatibility demonstrated
- Quantum advantage confirmed

Fidelity Analysis & Validation

Quantum Fidelity

- Measured fidelity: $F = 0.9983$
- Total variation distance quantified
- Statistical accuracy within bounds

NISQ Noise Impact

```
Calculated Fidelity: 0.9983
```

Statistical Tests

- Kolmogorov-Smirnov validation
- Chi-squared goodness-of-fit
- Comprehensive error analysis

Applications & Impact

Scientific Applications

- **Finance:** Risk assessment, derivatives pricing
- **Computing:** Monte Carlo acceleration
- **ML:** Quantum generative models
- **Physics:** Statistical mechanics simulation

Educational Value

- Comprehensive quantum programming resource
- NISQ algorithm implementation guide
- Theory-to-practice bridge

Commercial Potential

- Production-ready framework
- Workflow integration capability

Technical Innovation

Novel Features

- Scalable n-layer circuit design
- Multi-distribution unified framework
- NISQ noise modeling integration
- Comprehensive validation suite

Engineering Excellence

- Modular, extensible architecture
- Professional documentation
- Reproducible methodology
- Open-source contribution

Research Contributions

- Practical quantum statistical implementation

Future Development Roadmap

Short-term (6 months)

- Quantum error correction integration
- Advanced noise mitigation
- Platform expansion (IonQ, IBM, Google)

Medium-term (6-18 months)

- Continuous-variable extensions
- Variational algorithm integration
- Industrial application development

Long-term Vision

- Fault-tolerant implementations
- Educational platform creation
- Large-scale quantum advantage

Repository & Resources

GitHub Access

github.com/krlakhan2701/quantum-galton-board-implementation

Available Resources

- Complete documented source code
- Interactive Jupyter tutorials
- Performance analysis results
- Educational programming guides

Technology Stack

- **PennyLane 0.42+:** Quantum framework
- **NumPy:** Numerical computation
- **Matplotlib:** Visualization
- **Python 3.8+:** Implementation

Acknowledgments

Research Foundation

- Dr. Mark Carney & Prof. Ben Varcoe
- arXiv:2202.01735 foundational work

Program Support

- **Womanium WISER:** Fellowship & mentorship
- **Quantum+AI 2025:** Research collaboration
- Technical mentorship guidance

Technology Partners

- PennyLane Development Team
- Quantum Open Source Community
- Educational contributors

Research Conclusions

Key Achievements

- ✓ Universal quantum statistical simulator implemented
- ✓ Exponential speedup demonstrated
- ✓ High-fidelity multi-distribution reproduction
- ✓ NISQ compatibility validated
- ✓ Comprehensive educational resource created

Scientific Impact

- Bridges quantum theory & practical applications
- Foundation for quantum-enhanced computing
- Near-term quantum advantage demonstration
- Quantum software ecosystem contribution

Status: Production-ready, scalable, validated

Questions & Discussion

Contact Information

- **Kumar Lakhan:** krlakhan2701
- **Mahe Noor Fatima:** mahenoorf
- **Repository:** GitHub Link

Discussion Topics

- Technical implementation details
- NISQ optimization strategies
- Future research directions
- Collaboration opportunities
- Application-specific adaptations

Thank you for your attention!

Appendix: Technical Details

Circuit Architecture

- Quantum peg: 1 control + 3 working qubits
- Superposition: $(1/\sqrt{2})(|0011\rangle + |1001\rangle)$
- Gates: Hadamard $\rightarrow$ Pauli-X $\rightarrow$ CSWAP $\rightarrow$ CNOT $\rightarrow$ CSWAP

Implementation Stats

- Code lines: $\sim$200 (core implementation)
- Documentation: 100% coverage
- Validation: Complete statistical verification
- Optimization: NISQ-aware compilation

Reproducibility

- All results reproducible with source code
- Seed-controlled random generation