



## QA for the Enterprise: Platform and Applications

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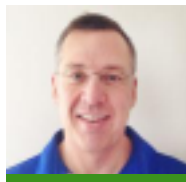
# QC WARE OVERVIEW

<b>Mission:</b>	Solve real-world problems with QC resources
<b>Technology partners:</b>	NASA, D-Wave, USRA, Stanford, Fortune 500 companies
<b>Office location:</b>	NASA Research Park, Mountain View, CA
<b>Team:</b>	12 scientists and engineers + senior advisors
<b>Machine access:</b>	Access to multiple D-Wave systems



# TEAM

Unrivalled Talent & Experience



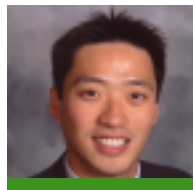
**Matt Johnson - CEO**

MBA @ Wharton  
BS @ USAF Academy



**Asier Ozaeta**

PhD @ UPV (Spain)  
Condensed Matter Physics



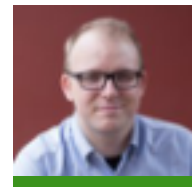
**Kin-Joe Sham - COO**

PhD, MBA @ UMN  
BS, MEng @ MIT  
Electrical Engineering



**Randall Correll – Sr. Sci.**

PhD @ UT Austin  
Theoretical Physics



**Peter McMahon**

PhD, MS @ Stanford  
Quantum Info Sciences



**Karthik Choutagunta**

PhD candidate @ Stanford  
Electrical Engineering



**Shreyas Parthasarathy**

BS candidate @ Berkeley  
Engineering Physics



**Vincent Su**

MS, BS candidate @ Stanford  
Physics and CS

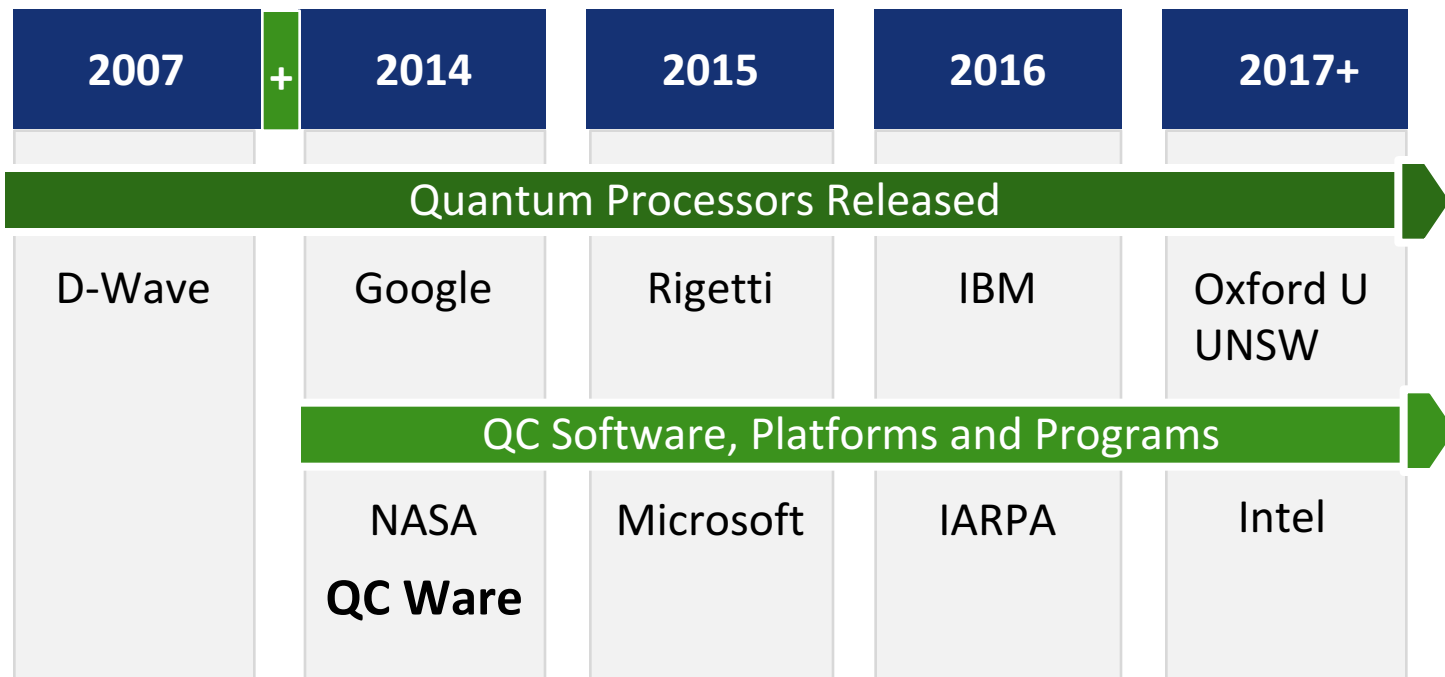


**Alejandro Perdomo-Ortiz**

**Sci. Advisor**  
MS, PhD @ Harvard  
Computational Physics



## QC ECOSYSTEM MILESTONES ...





# GOOGLE'S BENCHMARKING ANNOUNCEMENT

## The Telegraph

Home Video News World Sport Finance Comment Culture Travel Life Women  
Apple iPhone Technology News Technology Companies Technology Reviews Video Games

HOME » TECHNOLOGY » TECHNOLOGY NEWS

Google's new quantum computer is '100 million times faster than your PC'

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HOT TOPICS: WIRELESS SAVINGS CALCULATOR PERSONAL TECHNOLOGY VENTURE CAPITAL

4:02 pm ET  
Dec 10, 2015

ARTIFICIAL INTELLIGENCE

Google's Tough Search: A Quantum Leap in Computing Power

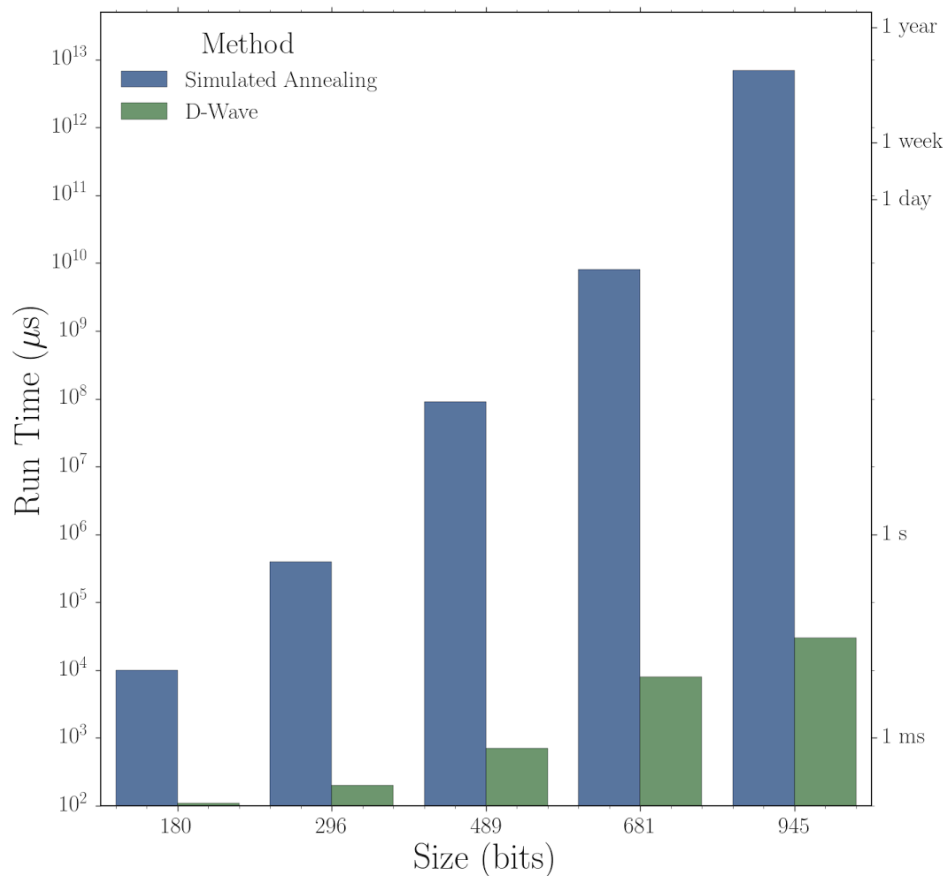
## MIT Technology Review

Computing

Google Says It Has Proved Its Controversial Quantum Computer Really Works



# QUANTUM ANNEALING – SPEED ADVANTAGE



- The smallest problem size takes  $\sim 10$  milliseconds for SA and a fraction of one millisecond for the D-Wave machine.
- For a problem that's only  $\sim 5$  times larger, the SA approach takes over a year, whereas the D-Wave requires less than a second.

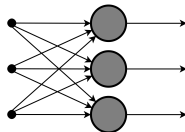


## NEAR-TERM PERFORMANCE BY DESIGN

- Decompose problem at formulation level
- Avoid full-connectivity, if possible
- Avoid ancillary variables, if possible
- Decompose problem at QUBO level
- Post-process to pull best answers from spectrum of solutions



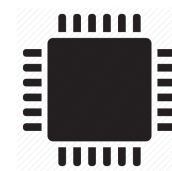
# PLATFORM STACK



Application / SDK layer



Platform / Cloud layer







# QC WARE PLATFORM OBJECTIVES

## High-Performance Applications

- Deep learning, cybersecurity, quant finance
- Apps run on QC Ware platform

## Full SDK Suite

- Simplify programming experience for novice QC users

## Hardware-Agnostic Acceleration Platform

- Obtain optimal performance with no manual fine-tuning (for D-Wave and other QC hardware systems)

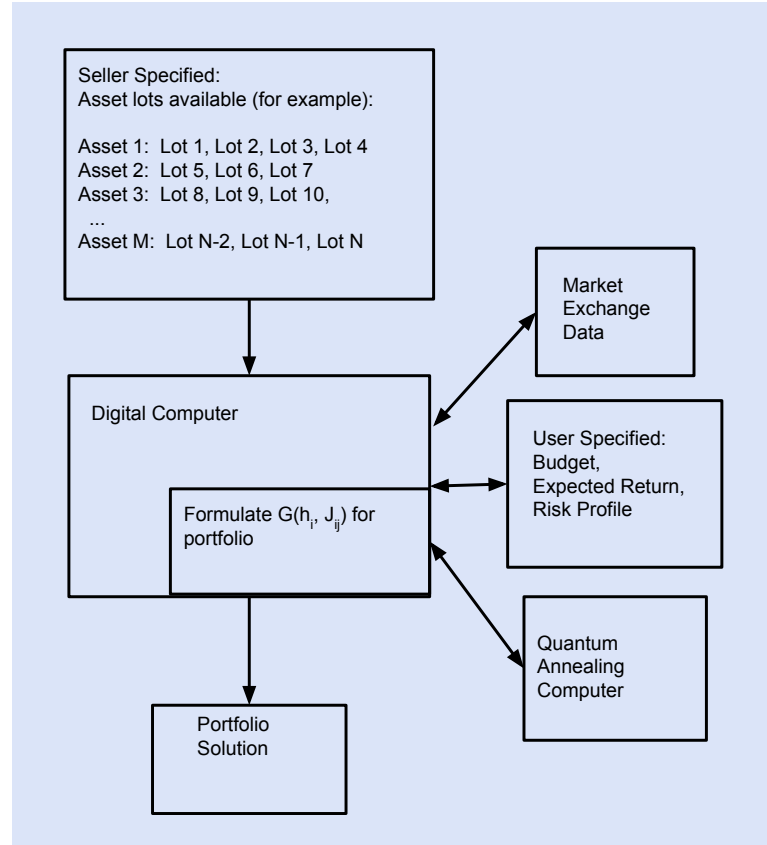


## QA APPLICATION MODES

- Optimality
- Time-to-Target
- Sampling



# Example: Portfolio Optimization



$$G = \sum_i h_i s_i + \sum_{i < j} J_{ij} s_i s_j$$

$$G = f_{pr} G_{past\ return} + f_{er} G_{expected\ return} + f_c G_{cost}$$

$$r_i(t_0) = (p(t_0) - p(t_{-1}))/p(t_{-1})$$

$$G_{past\ return} = \sum_i p_i^2 \text{Var}[r_i] s_i + \sum_{i < j} 2p_i p_j \text{Cov}[r_i, r_j] s_i s_j$$

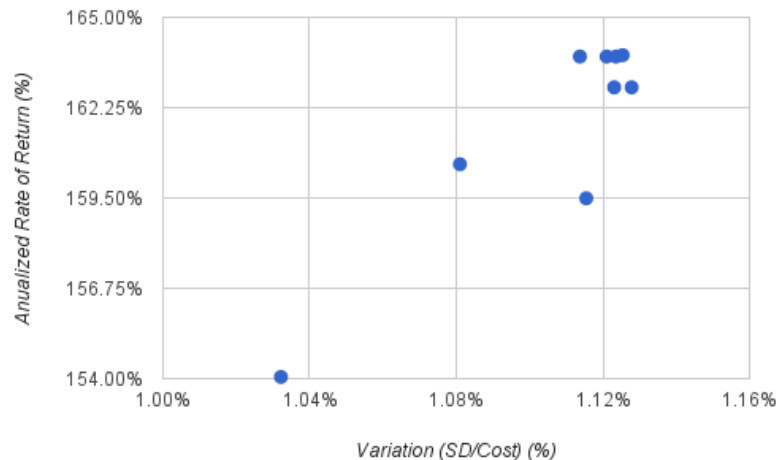
$$G_{cost} = -2C \sum_i p_i s_i + \left( \sum_i p_i s_i \right) \left( \sum_j p_j s_j \right)$$

$$G_{expected\ return\ (max)} = \sum_i E_i s_i$$

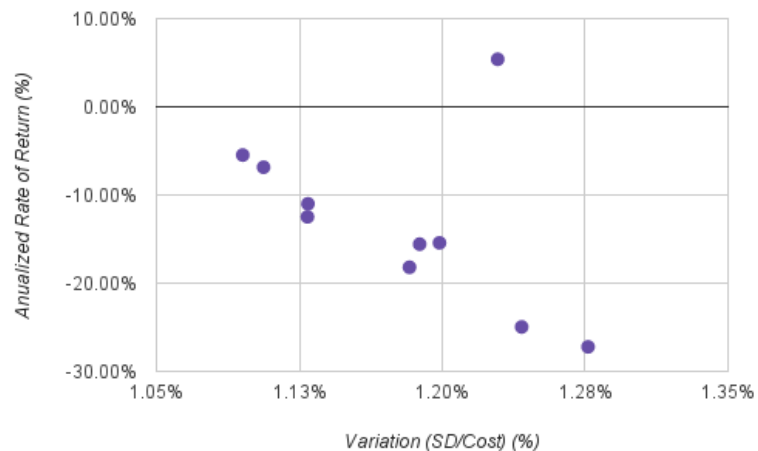


# Optimized versus Random Portfolios

Return vs. Variation from Optimized Portfolios

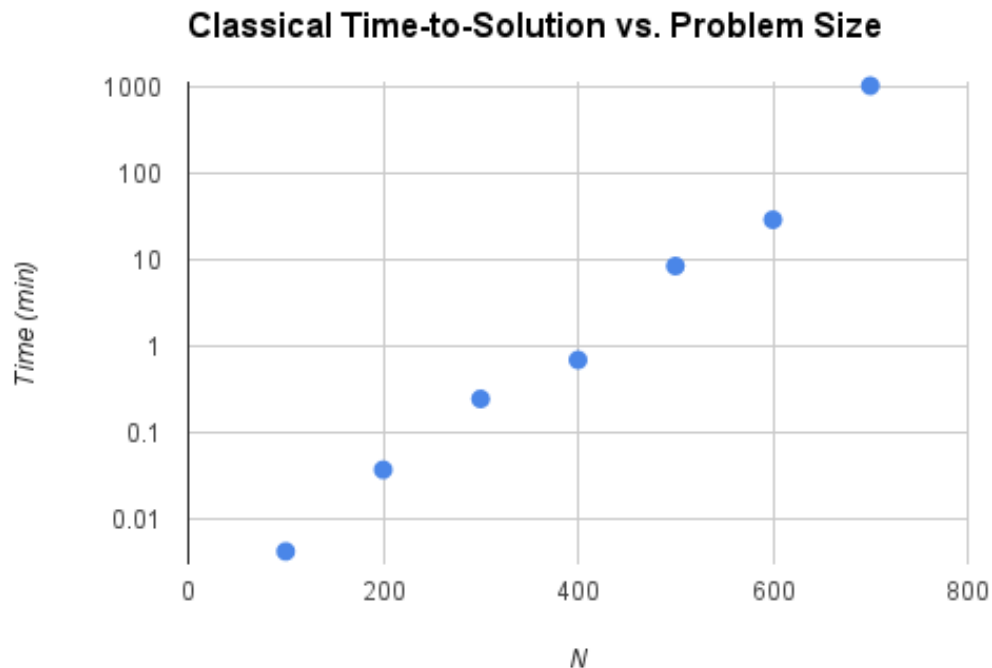


Return vs Variation for Random Portfolios





## Example: Portfolio Optimization Classical Performance



Approximate classical time-to-solution (min.) versus problem size for fully-connected QUBO problems using CPLEX default settings on a quad-core CPU.



## Take Aways

- Now is the time to begin developing applications
- Work with enterprises to focus on relevant problems
- Success breeds success; Apps breed more apps
- Design apps that perform on near-term hardware
- A useful algorithm is valuable on quantum or classical hardware