

# Quantum Graph Analysis with Trapped Yb Ion Qubits

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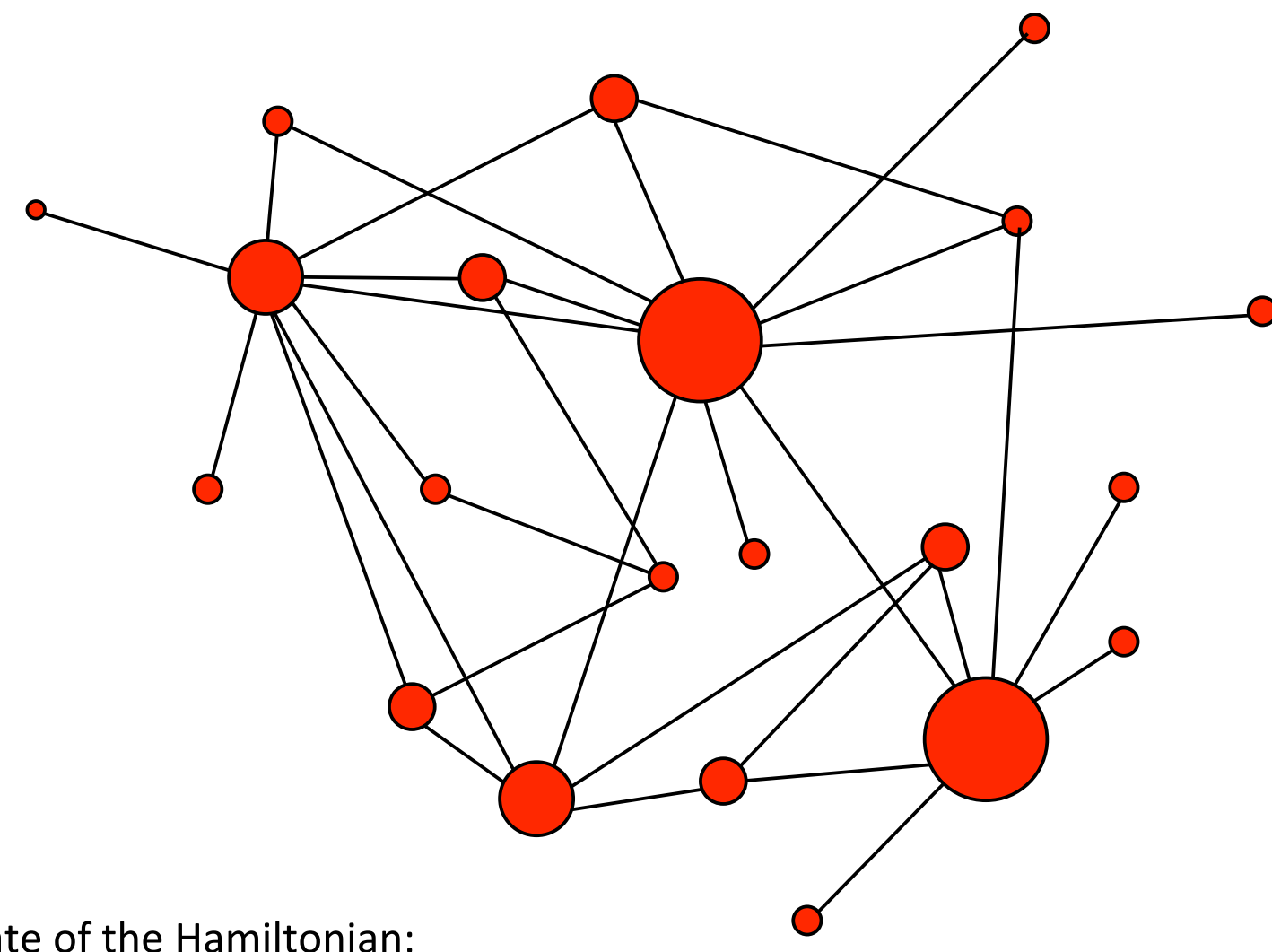
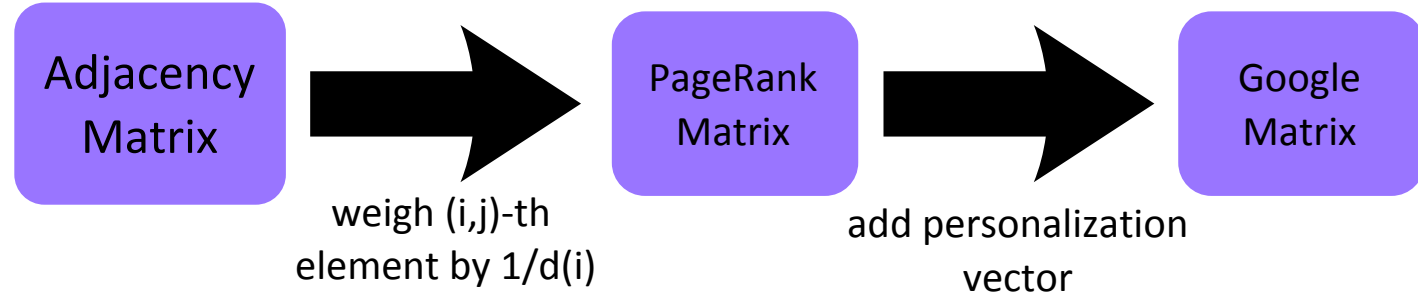


## Adiabatic Quantum Algorithm for PageRank

Recently, Garnerone *et al.* proposed an adiabatic quantum algorithm for search engine ranking based on the PageRank graph analysis algorithm utilized by Google [1]. Here we discuss the algorithm as a starting point for our work.

### PageRank Algorithm

- The PageRank Algorithm [2] finds the stationary distribution of a random walk on a graph
- The stationary state is an eigenvector of the Google matrix,  $G$
- The Google matrix is a matrix formed with the addition of a stochastic personalization vector



### Adiabatic Quantum Algorithm for PageRank

- In mapping to a quantum version, we are looking for the ground state of the Hamiltonian:

$$h^{(p)} = (1 - G)^\dagger (1 - G)$$

- This problem illustrates several features:
  - Needs only  $\log(N)$  qubits for an  $N$  vertex graph
  - Requires full control of Hamiltonian. i.e. encoding an arbitrary graph requires arbitrary matrix elements of the Hamiltonian.
- Can be easily extended to a single qubit per node, realizing an XY model:

$$H = \frac{1}{2} \sum_i (\mathbb{1}_i - Z_i) + \frac{1}{2} \sum_{i < j} h_{ij}^{(p)} (X_i X_j + Y_i Y_j)$$

### References

- [1] Garnerone, *et al. Phys. Rev. Lett.* **108**, 230506 (2012)
- [2] S. Brin and L. Page, *Computer Networks and ISDN Systems*, **30**, 107 (1998)

## Experimental Status

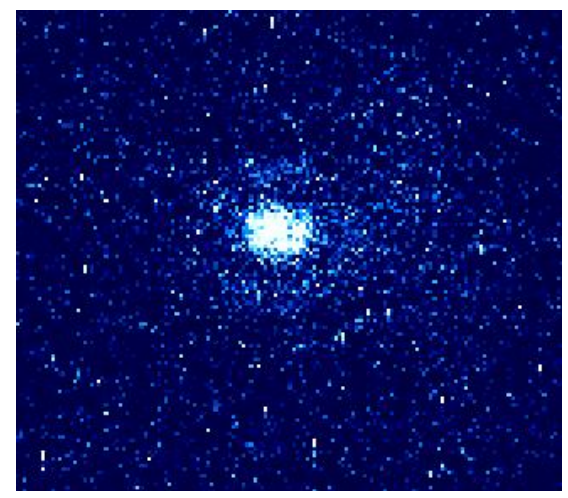
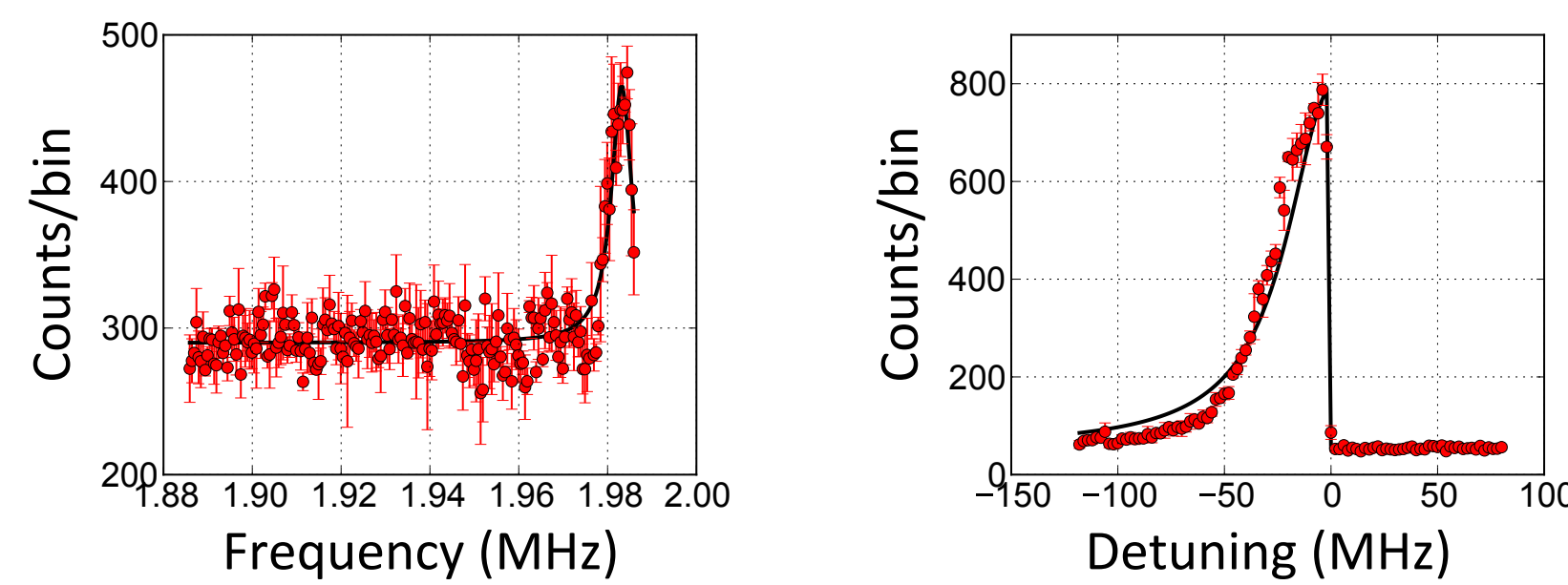


Image of a single  $^{174}\text{Yb}$  ion

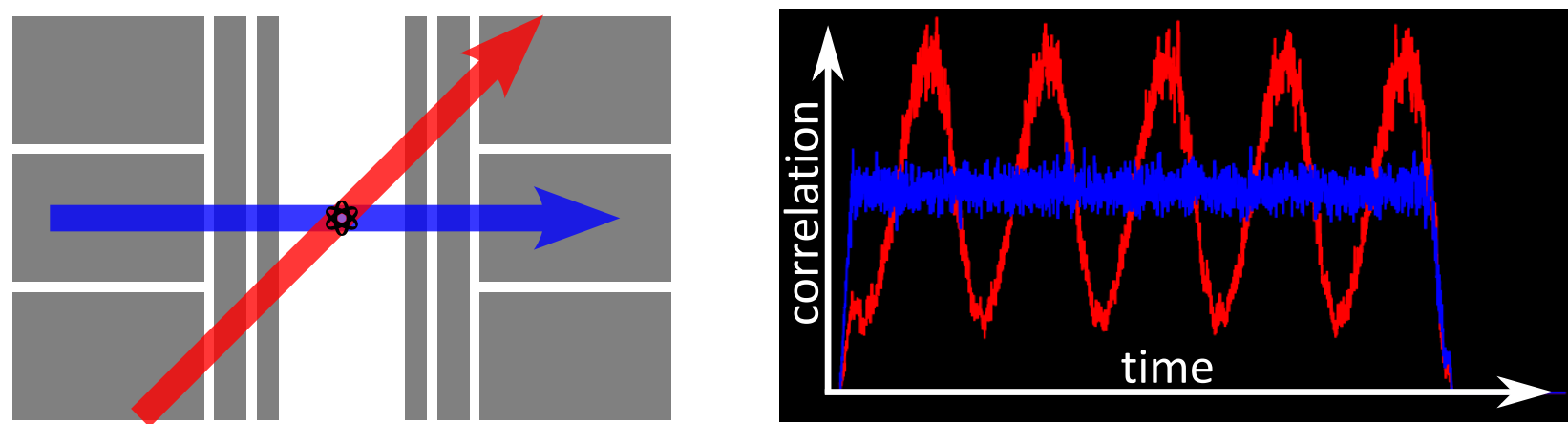
- Have trapped both ytterbium 174 and 171
- Applied RF: ~200V at 20MHz
- Trap characterization with ytterbium 174
- Secular frequencies: 0.500 MHz (axial), 1.98 MHz (radial)

### Experimental Control

- Python control software for voltage control and instrumentation
- Can control 96 independent voltages on the fly
- Provides feedback onto applied voltages and instruments based upon photon counts
- FPGA based pulsing system with photon counting, time-to-digital converter, and 6 direct digital synthesizers

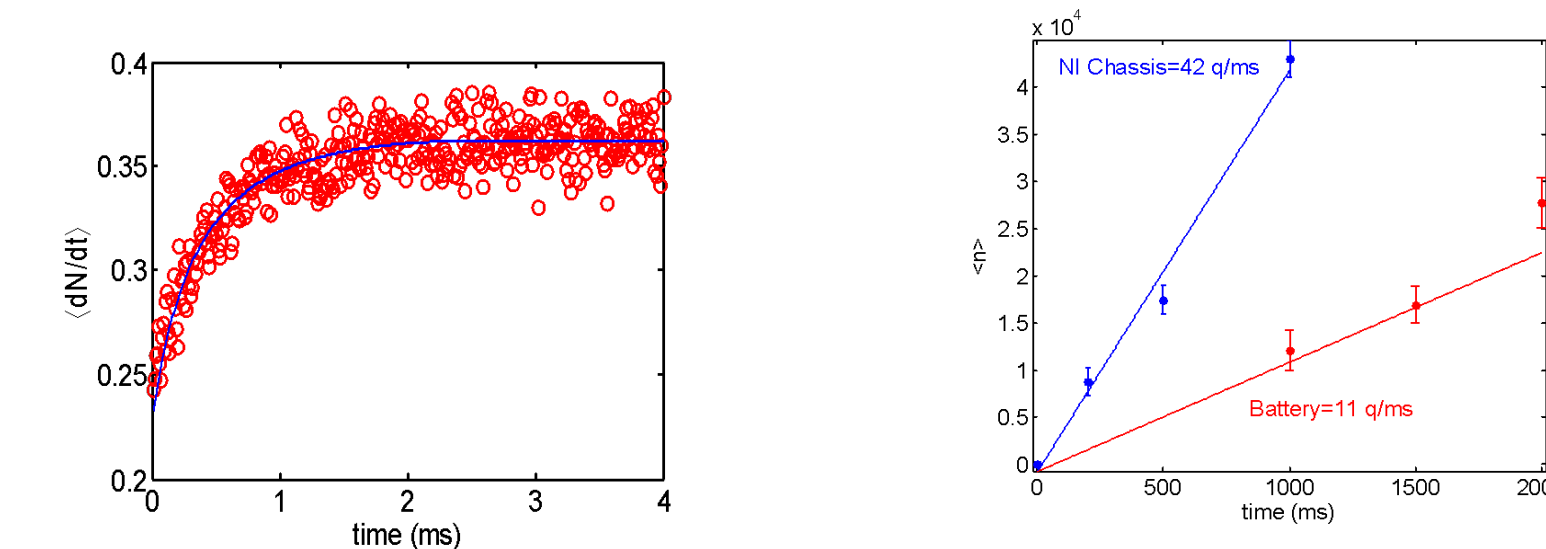


- In our experiments, we have two beams, on normal to trap axis (blue arrow below), and one at 45 degrees (red).
- Minimization of photon correlations with blue results in significant correlations with the red beam.
- This implies a large amount of axial micromotion. To compensate in all directions, we will need to use multiple beams in our minimization routine.



### Heating Rates

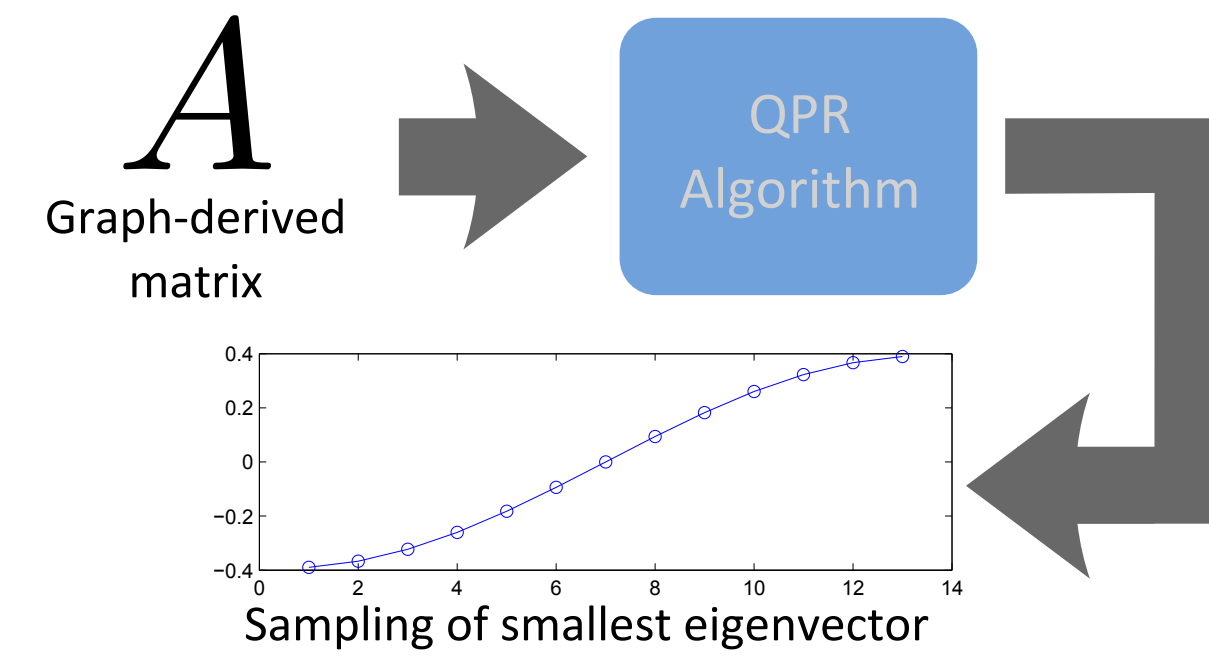
- Measuring heating rates via doppler recoiling [2].
- Measurements performed with calcium in another chamber with identical trap.
- Heating rate: ~42 quanta/ms with NI Chassis, 27 quanta/ms with batteries



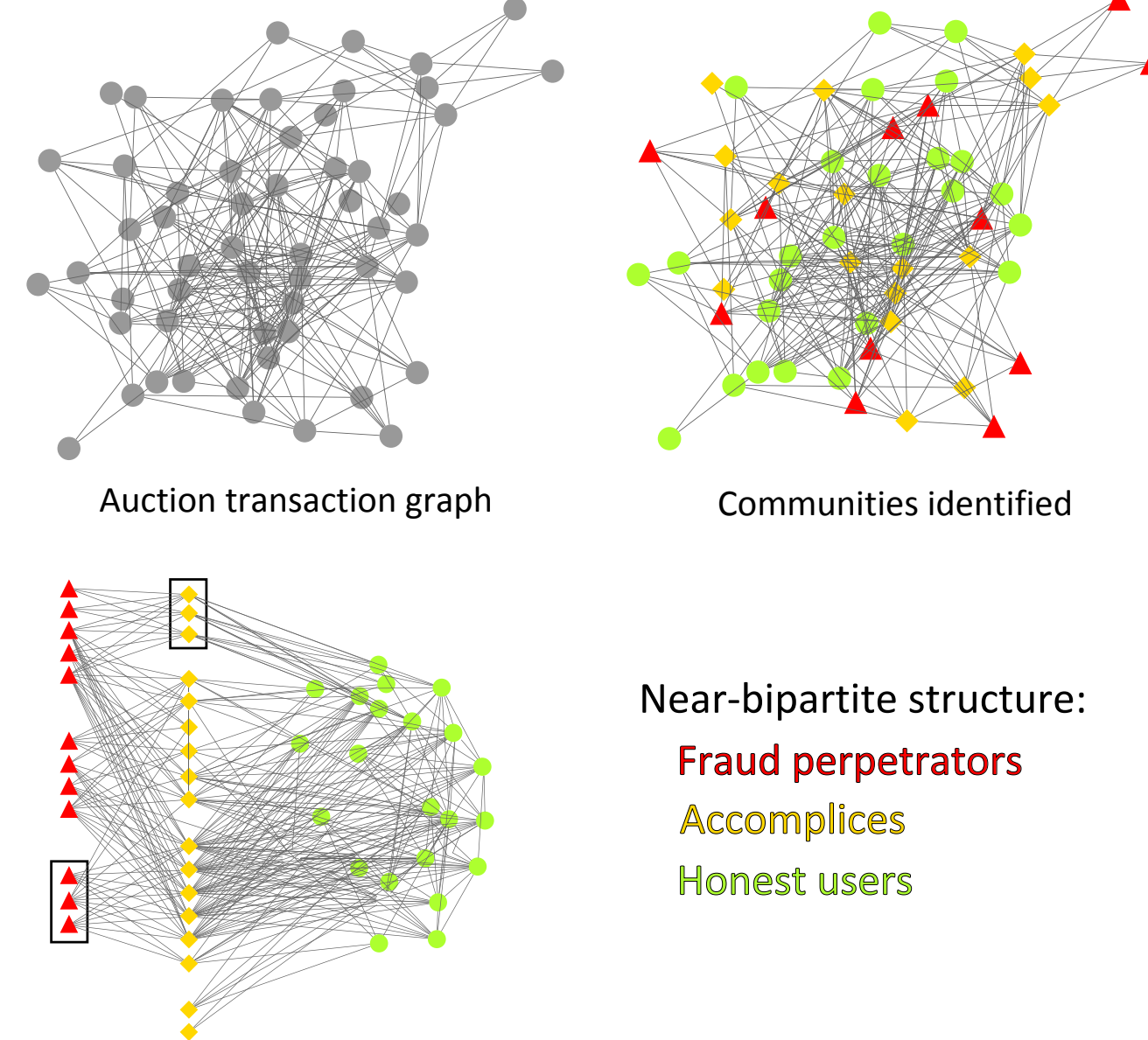
### References

- [1] D. Berkeland, *et al. Journal of Applied Physics*, **83**, 5025 (1998)
- [2] S. Narayanan, *et al. Journal of Applied Physics*, **110**, 114909 (2011)
- [3] J. H. Wesenberg, *et al. Physical Review A* **76**, 053416 (2007)

## Applications of Graph Theory



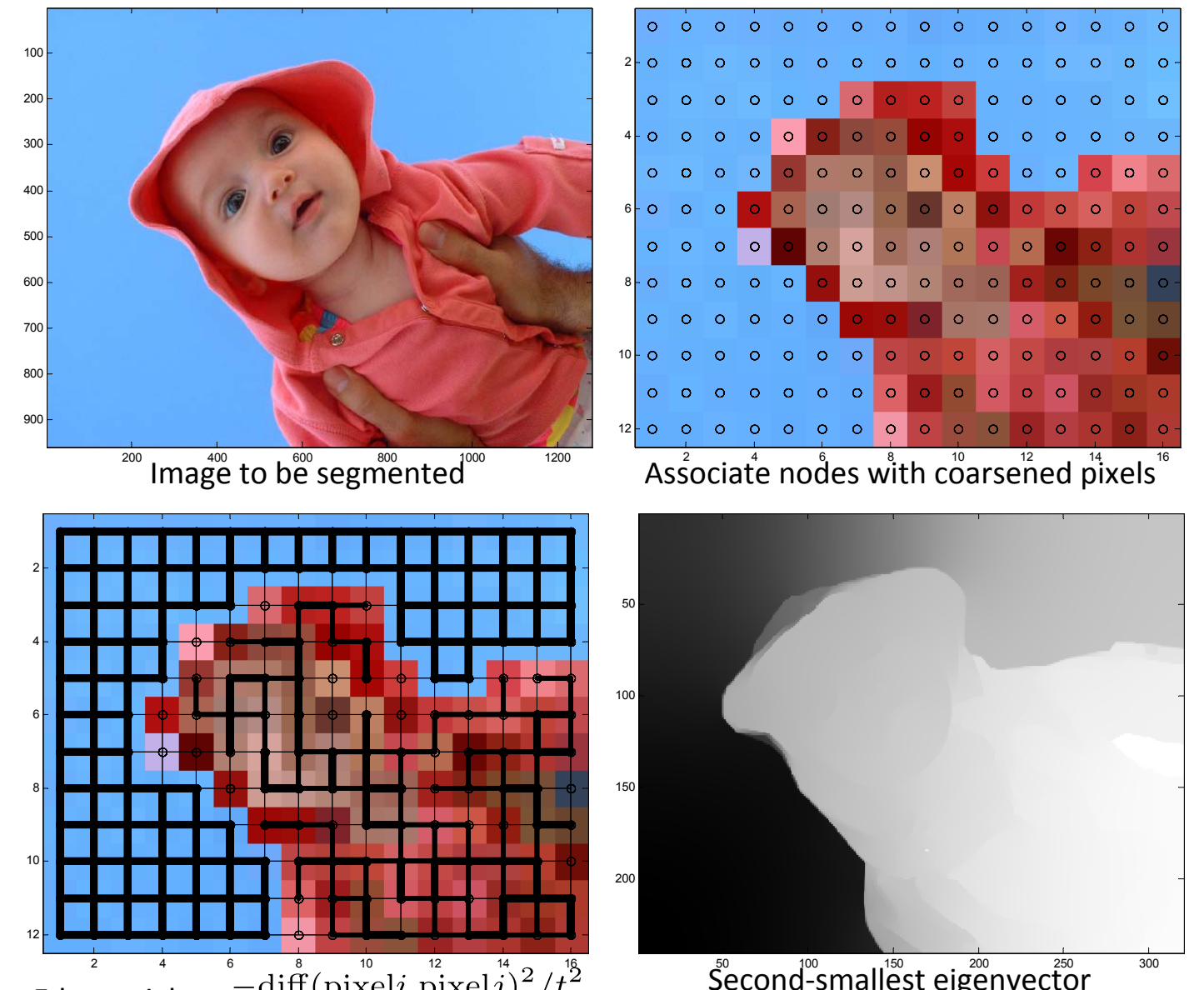
### Community Detection



- Communities typically identified by (weighted) edge structure
- Internally dense with sparse external connections
- Issue: *elusive communities* may be internally sparse?
- Some communities elude direct detection
- Collusion or fraud may prevent detection of edges
- How to find such communities?
- Use "targets" to identify elusive communities
- (Near-)Bipartite core: two densely connected very sparse sets
- One set elusive community, other its "targets"
- Spectral approaches are promising
- Applications: web communities [2], auction site fraud [1] (figure derived from [1])

- QPR algorithm provides sampling of smallest eigenvector
- Sampling probability proportional to magnitude of entry
- Potential sublinear time algorithm for top entries
- Apply to Graph-derived matrices (spectral algorithms)
  - Examples: Adjacency, Laplacian, Normalized Laplacian
- Instances need large spectral gap
- Dense instances imply non-local Hamiltonians

### Spectral Graph partitioning



- Use eigenvectors to partition graph
- Each entry is associated with a node
- E.g. sign of entry determine partitions
- Second-smallest eigenvector effective for partitioning
- Sampling gives "important" nodes in partitions
- Employ recursive hierarchical partitioning for  $> 2$  partitions
- Application: image segmentation [3] (figure derived from [4])

### References

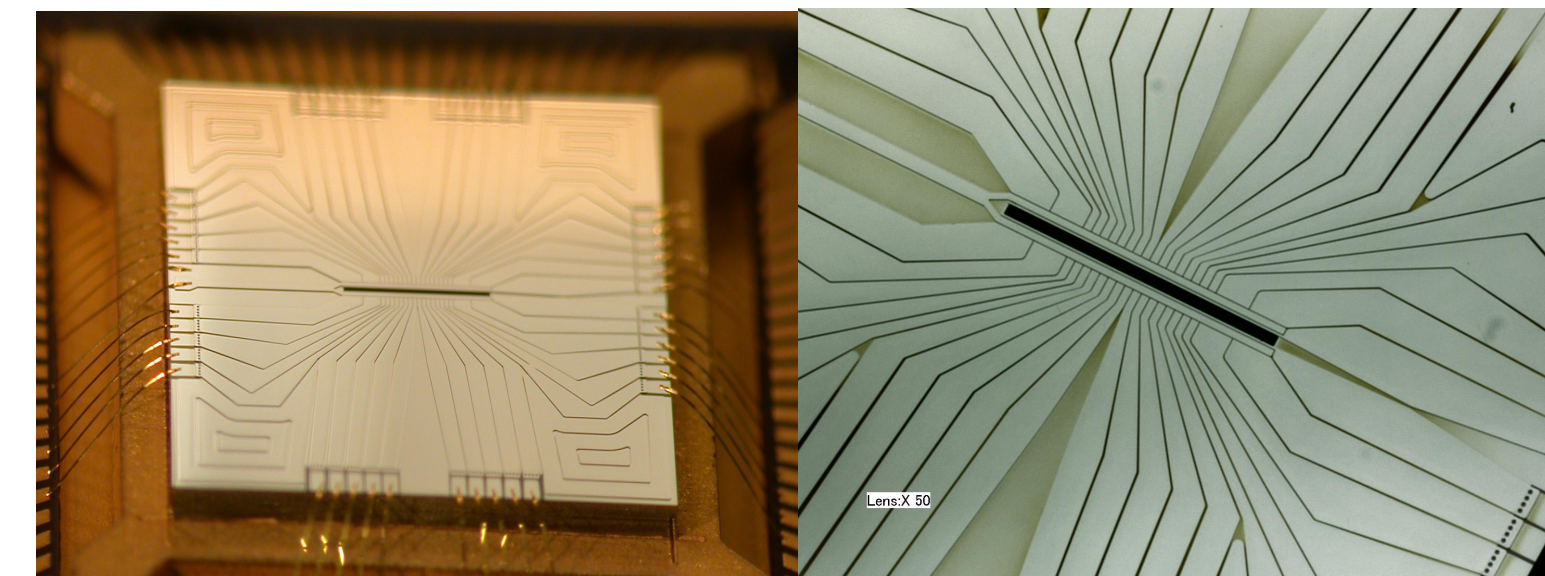
- [1] Chau *et al. Proc. ECML-PKDD conf.*, (2006)
- [2] Kumar *et al. Proc. 8th International WWW conf.*, (1999)
- [3] Shi and Malik, *IEEE Trans. on Pattern Anal. and Mach. Intel.*, **22**, 8 (2000)
- [4] Spielman, *Spectral Graph Theory and its Applications*, <http://cs.yale.edu/homes/spielman/sgta/SpectTut.pdf>

## Fabrication Technology

Utilizing the ion trap fabrication technology available at Sandia, we are currently using a workhorse linear trap to develop our ytterbium qubit capabilities, as well as developing advanced ion trap structures such as rings and junctions.

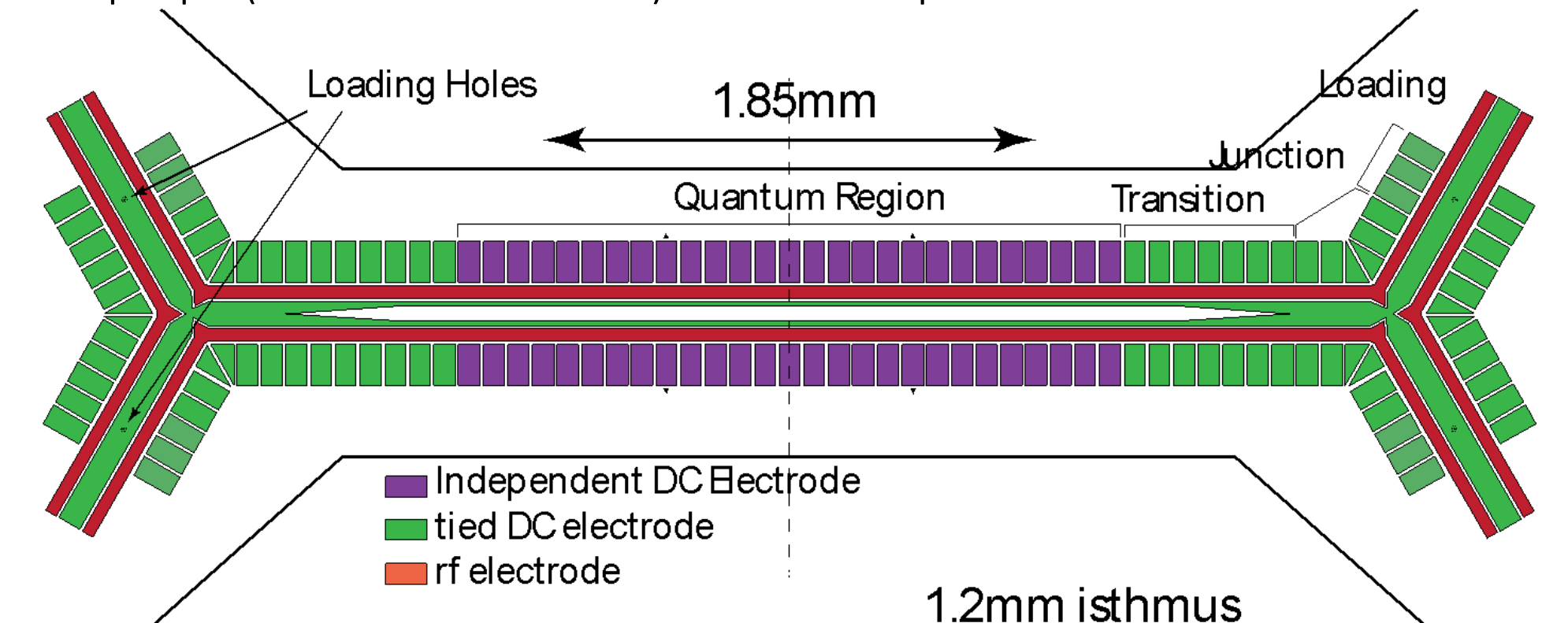
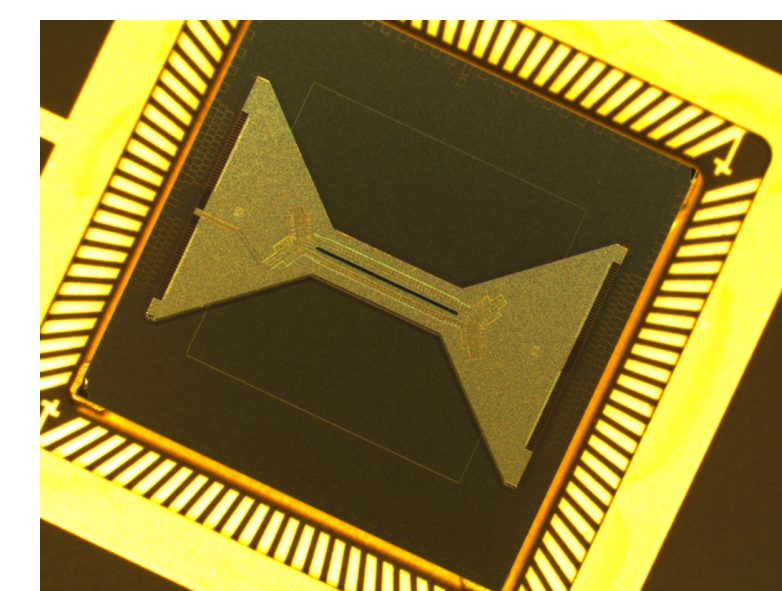
### Thunderbird Linear Trap

- Microfabricated linear trap using 2-level metallization
- Has been used in labs around the world to trap calcium, ytterbium, and magnesium
- 48 control electrodes



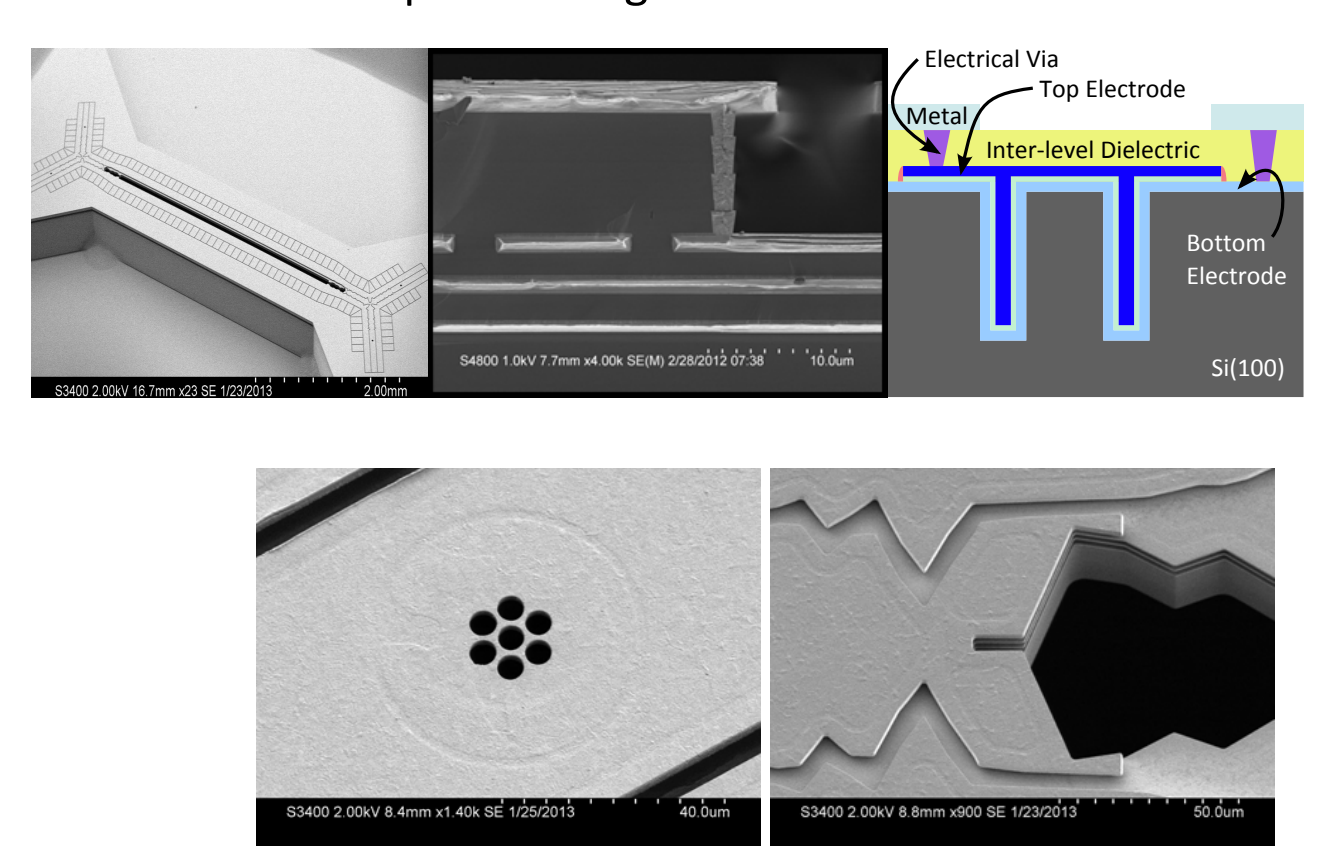
### High Optical Access Trap

- Surface skimming beams with waists as small as 4  $\mu\text{m}$
- Slot to accommodate tightly focused beams vertical to surface
- Loading regions and junctions to control ordering of a multi-species ion chain
- Designed to have a 4x improvement to the trap depth (from 50 meV to 200 meV) over earlier traps.



### Fabrication Techniques

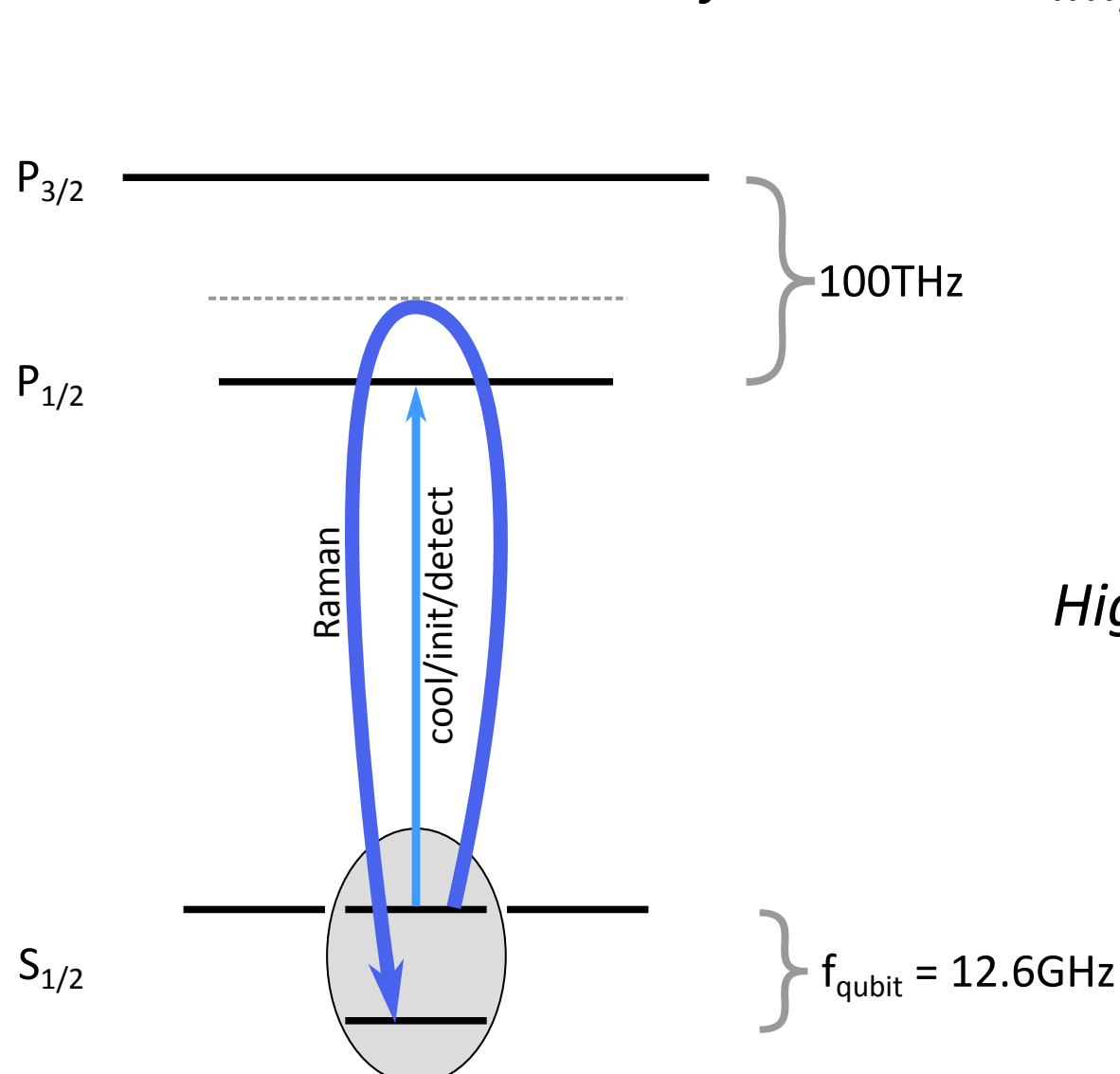
- Integrated trench capacitors for RF pickup filtering
- Four level metallization for routing/grounding
- Small through holes for loading
- Custom die shapes for a tight beam focus



## Implementing Graph Analysis with Trapped Ions

Ytterbium ions are good candidates for quantum bits due to long storage and coherence times [1], and high fidelity gates can be performed with high power pulsed lasers [2]. Additionally, they currently are used for quantum simulation of the transverse Ising model [3]. By leveraging this technology we hope to realize the spin-spin couplings needed for graph algorithms (such as the XY model).

### Relevant Atomic Structure of $^{171}\text{Yb}^+$



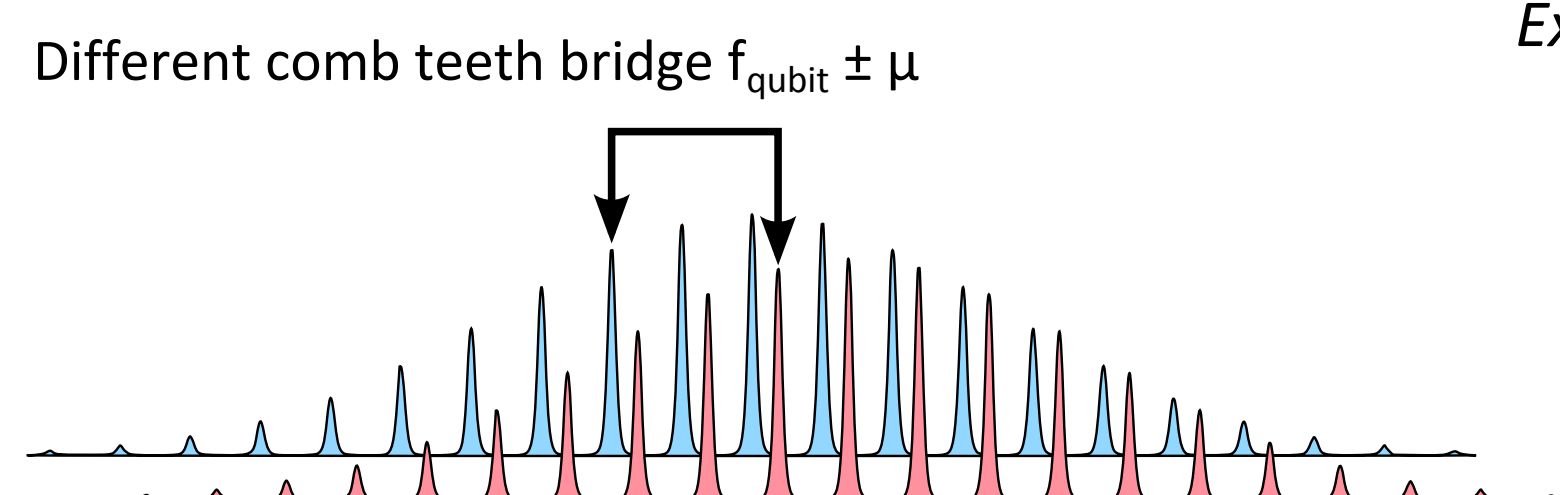
### Qubit levels

- $|S_{1/2}, F=0, m_F=0\rangle = |0\rangle$
- $|S_{1/2}, F=1, m_F=0\rangle = |1\rangle$
- Can have long coherence times ( $>1\text{s}$ ) due to 1st order insensitivity to magnetic field fluctuations

### Implementing the circuit model

- Single Qubit rotations:
  - Global Rotations: microwaves at 12.6GHz
  - Individual rotations: Raman beams at carrier
- Multi Qubit gates: Møllmer-Sørensen gate with Raman beams
- Initialization and detection: 369nm light on  $S_{1/2} \rightarrow P_{1/2}$  transition

### High power Raman Interactions



- Pulsed laser with large bandwidth can provide frequencies needed for gates/spin-spin interactions
- Tuning the relative phase of the two envelopes determines the type of interaction (carrier-envelope phase stabilization not necessary)

### Adiabatic Realization of XX interactions [3]

- Adiabatic quantum simulation of the transverse Ising model with trapped ions
- Carrier Raman  $\rightarrow$  Transverse B field (y direction)
- Møllmer-Sørensen  $\rightarrow$  XX coupling (tuning phase)
- Spin Spin interaction tuned by power and detuning
- Residual spin-motion terms can be eliminated by large detunings

$$H = \sum_i B_y \sigma_y^{(i)} + \sum_{i < j} J_{i,j} \sigma_x^{(i)} \sigma_x^{(j)}$$

Rabi Frequencies

$$J_{i,j} = - \sum_m \frac{\eta_{i,m} \Omega_i \eta_{j,m} \Omega_j \nu_m}{\mu^2 - \nu_m^2}$$

In general: spin-spin interaction is  $\sigma_a^i \sigma_b^j$   
Phase angle  $\phi$  is tuned by relative phase between RF sources in modulators

Detuning from motional modes  
 $\mu$  = detuning from carrier

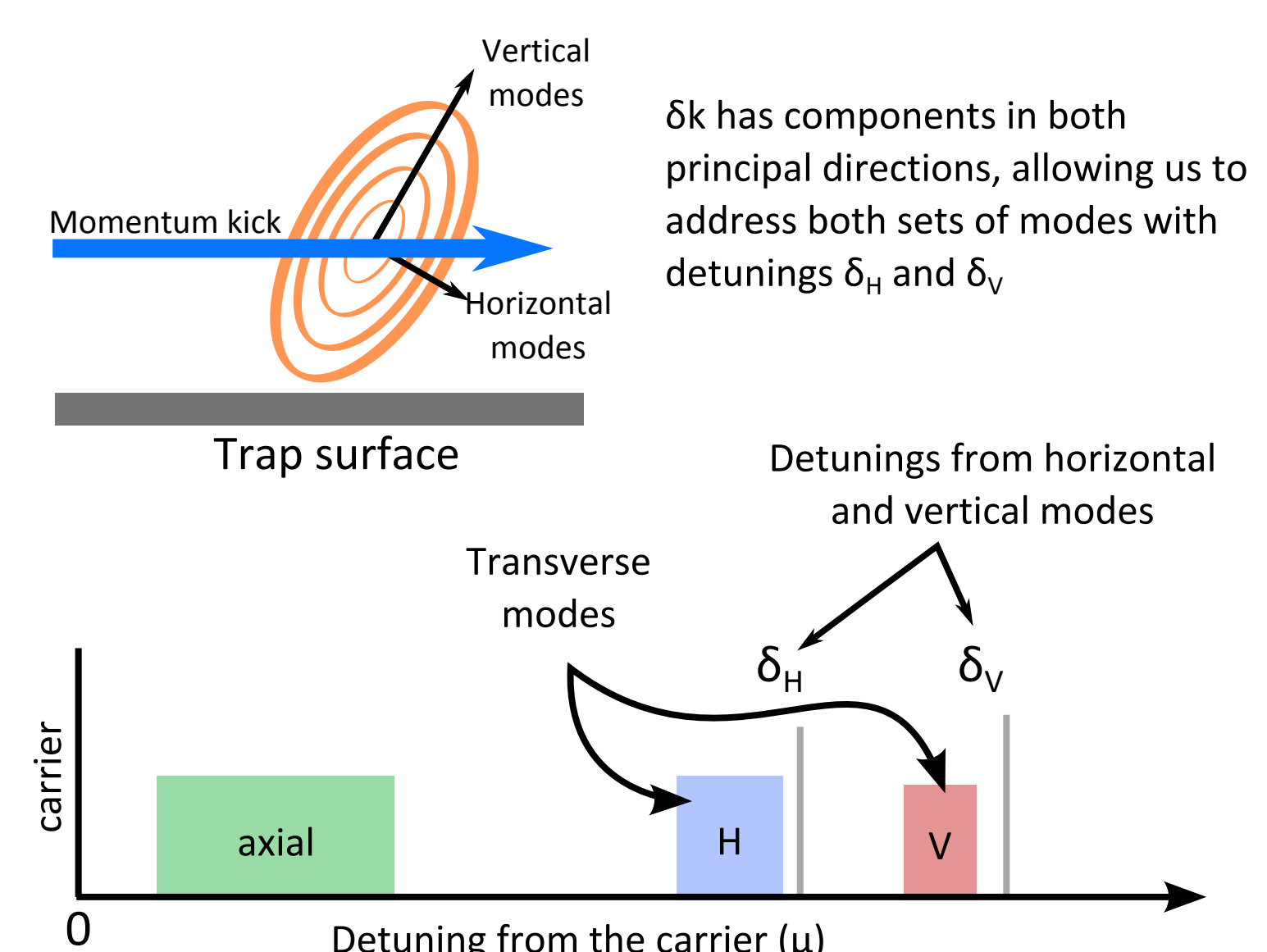
### Experimental Issues

- High power 355nm laser
  - Far detuned from any transition
  - Extremely low spontaneous emission rate
  - Differential Stark shifts small
  - High power may damage trap (effects unknown)
- Ti: Sapphire
  - Lower power, tune closer to  $P_{1/2}$
  - Possibly non-negligible spontaneous emission
  - May produce differential Stark shifts
  - Lower power will not damage trap

- What are the full set of experimental control knobs available?
- Given the set of controllable parameters, what is the set of realizable graphs?
- Can we realize algorithms with just an XX coupling? Or adiabatically tuning the phase in the  $\phi\phi$  interaction between XX and YY?

### Extension to the XY model

- Applying two sets of Møllmer-Sørensen gates with a  $\pi/2$  phase shift results in cross talk between modes.
- Possible solution: address different motional modes,
  - Multiple beams with different orientations to provide orthogonal kicks
  - Rotating the principal axes to change direction of kick
  - Splitting the horizontal and vertical in frequency space to help eliminate cross talk



### References

- [1] S. Olmschenk, *et al. Physical Review A*, **76**, 052314 (2007)
- [2] D. Hayes, *et al. Physical Review Letters*, **104**, 140501 (2010)
- [3] K. Kim, *et al. New Journal of Physics*, **13**, 105003 (2011)