

QAQA:

This is an optimization problem. Try to optimize an NP-Complete Problem.

PROBLEM: MaxSat [NP-Complete]

INTUITION: n variables, m clauses: Satisfy as many clauses as possible.

GIVEN: $\bigwedge_{j=1}^m (l_{j1} \vee l_{j2})$, int k (can we satisfy at least k clauses)

↙ ↗

Boolean variables
(or negation)

EXAMPLE : $(x_1 \vee x_2) \wedge (x_2 \vee \neg x_5) \wedge (\neg x_3 \vee \neg x_4) \wedge \dots$

n BOOLEAN VARIABLES : $Z \in \{0,1\}^n$

$$\text{count}_j(z) = \begin{cases} 1, & \text{if } z \text{ satisfies the } j^{\text{th}} \text{ clause} \\ 0, & \text{otherwise} \end{cases}$$

does z (boolean string) satisfy j^{th} clause.

↳ combination of n boolean variables.

$$\text{count}(z) = \sum_{j=1}^m \text{count}_j(z) .$$

$$C_j |z\rangle = \text{count}_j(z) |z\rangle$$

$$C |z\rangle = \text{count}(z) |z\rangle$$

$$= \sum_{j=1}^m \text{count}_j(z) |z\rangle$$

$$= \sum_{j=1}^m C_j |z\rangle$$

HERMITIAN
MATRICES

$$B = \sum_{k=1}^{n-1} \text{NOT}_k$$

↪ X gate on k^{th} Qubit

SEPARATOR:

Mark the good cases. [Built from $C|z\rangle$]

MIXER:

Boost the amplitude of the marked cases. [Built from B]

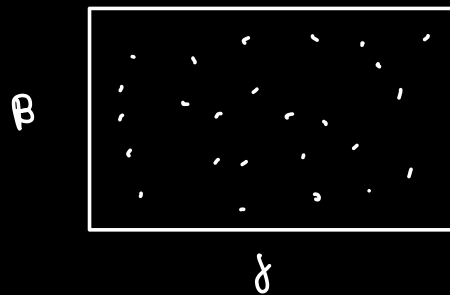
$$(\gamma, \beta) \in [0, 2\pi] \times [0, \pi]$$

$$\text{Sep}(\gamma) = e^{-i\gamma C}$$

As C is hermitian, Sep is unitary.

$$\text{Mix}(\beta) = e^{-i\beta B}$$

Now, we try all possible values of δ, β



QAOA:

for many (δ, β) {

QUANTUM

MEASURE:

$$(\text{Mix}(\beta) \text{ Sep}(\delta) H^{\otimes n} |0^n\rangle)$$

all possible combinations



Mark the good ones

Boost the marked good ones.

}

Pick a good one

EXAMPLE:

$$(x_0) \wedge (x_0 \wedge x_1)$$

WHAT IS $Sep(\delta)$:

$$Sep(\delta) = e^{-i\delta C}$$

$$= e^{-i\delta \sum_j C_j}$$

$$= \prod_j e^{-i\delta C_j} \quad \rightarrow C_j \text{'s commute}$$

$$e^{-i\delta C_j} |z\rangle = \begin{cases} e^{-i\delta} |z\rangle, & \text{if } \text{count}_j(z) = 1 \\ |z\rangle, & \text{if } \text{count}_j(z) = 0 \end{cases}$$

mark

$$Sep(\delta) \sum_{z \in \{0,1\}^n} a_z |z\rangle \quad \rightarrow \text{amplitudes}$$

$$= \prod_j e^{-i\delta C_j} \sum_z a_z |z\rangle$$

$$= \sum_z a_z \prod_j e^{-i\delta C_j} |z\rangle$$

if $\text{count}_j(z) = 1$, it remains
so it is multiplied
 $\text{count}(z)$ times.

$$= \sum_z a_z \boxed{(e^{-i\delta})^{\text{count}(z)}} |z\rangle$$

EXAMPLE:

$$(x_0) \wedge (x_0 \wedge x_1)$$

$$\text{sep}(\gamma) (a_{00}|00\rangle + a_{01}|01\rangle + a_{10}|10\rangle + a_{11}|11\rangle)$$

$$= a_{00}|00\rangle + a_{01}|01\rangle + a_{10}(e^{-i\gamma})^1|10\rangle$$

$$+ a_{11}(e^{-i\gamma})^2|11\rangle.$$



GOOD CASES MARKED

$$\gamma = \beta = \pi/4:$$

$$00: 3.7\%$$

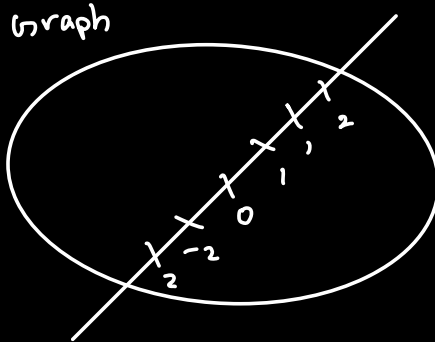
$$01: 3.7\%$$

$$10: 28.7\%$$

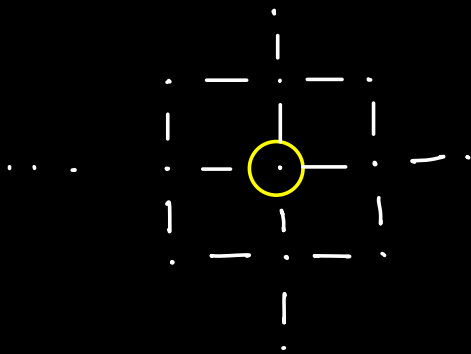
$$11: 64.0\%$$

Grover's PAPER:

MAX CUT:



Sycamore Quantum Computer:



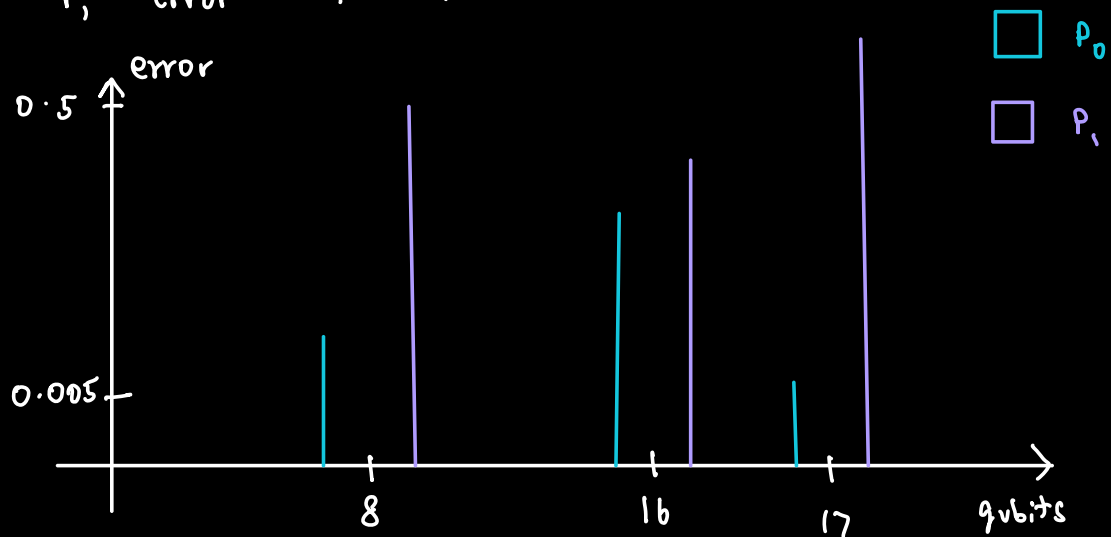
Graphs: (Types of graphs they work with in the paper)

1. Subgraphs of the hardware graph] Most used
2. 3-regular graph
(connected to 3 other nodes)] known NP complete with least edges
3. Fully connected graph.] Most edges case

BIAS IN MEASUREMENT:

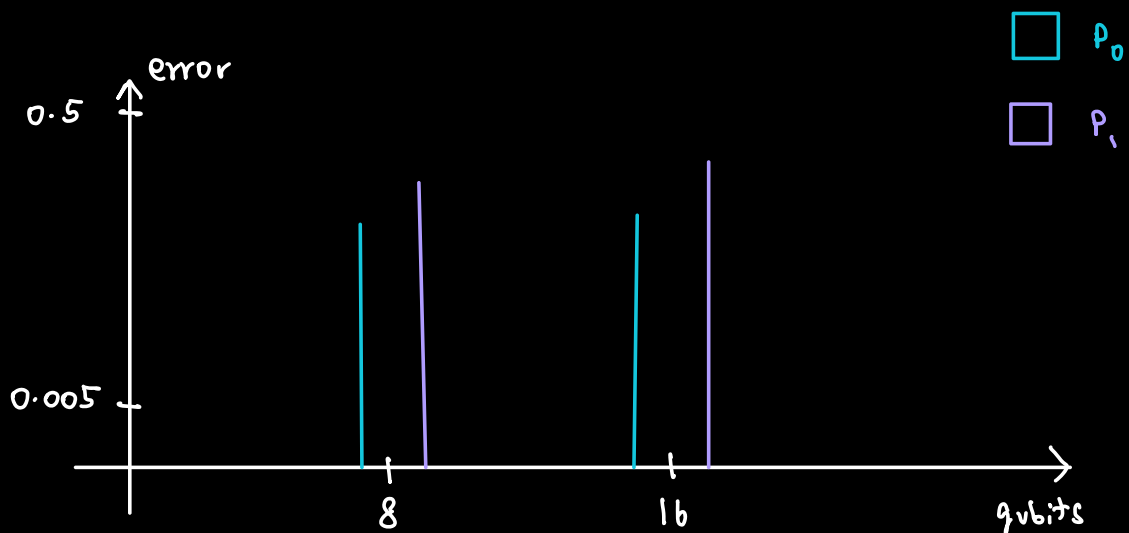
P_0 error: $0 \rightarrow 1$
 expected observed

P_1 error: $1 \rightarrow 0$



So the error is random for different qubits. No idea which are nice.

So we run multiple times and post process



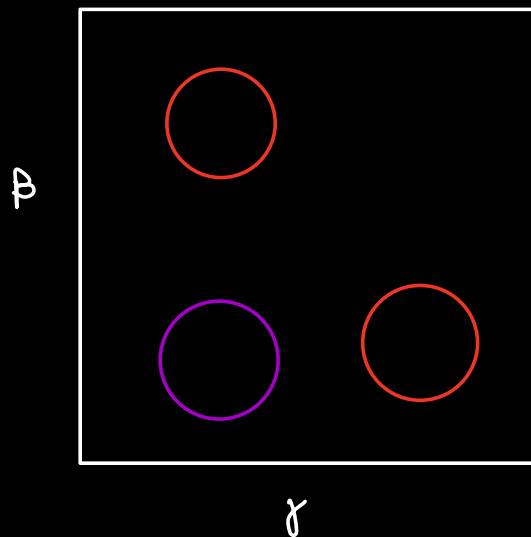
This helps them get closer.

$0 \rightarrow 1$ and $1 \rightarrow 0$ are equally likely and reduces the bias.

note: p_1 by nature is mostly larger than p_0

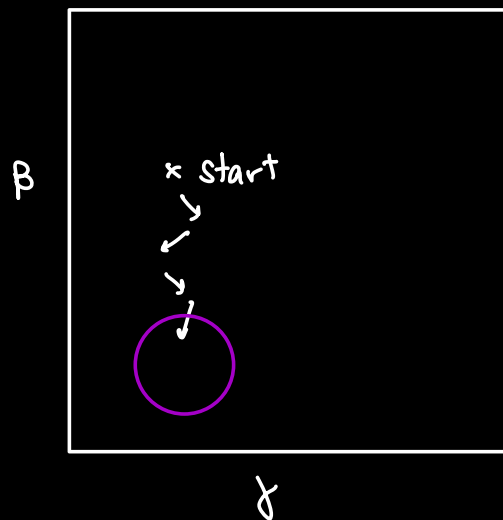
so we observe more 0s than expected.

SIMULATION :



QUANTUM COMPUTER :

○ good
○ Bad



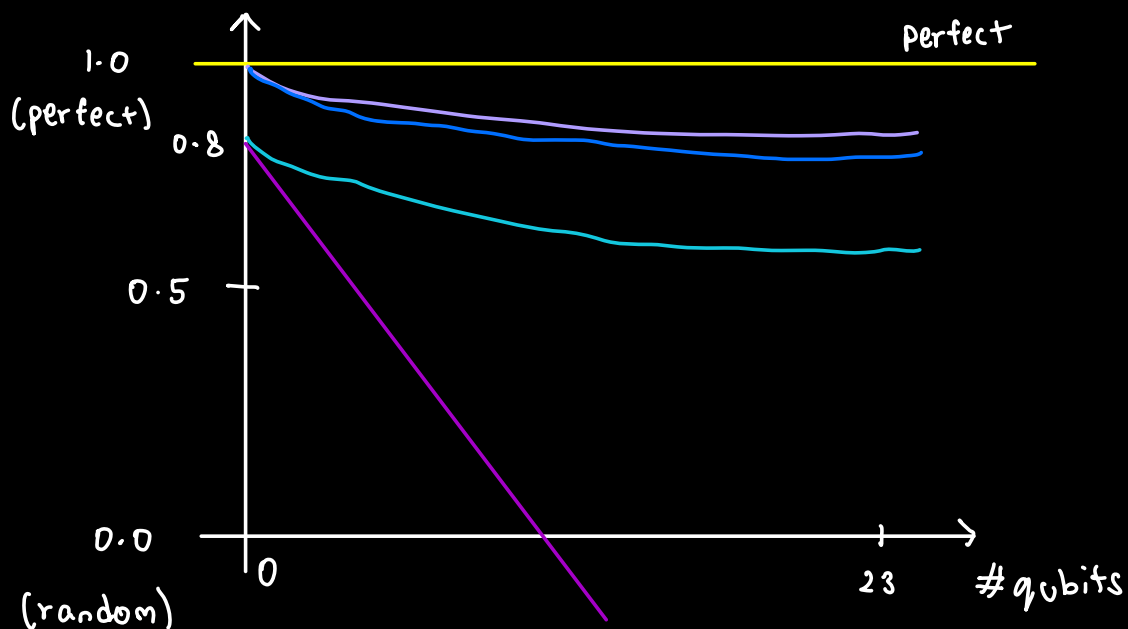
→ 50,000 times done for each δ, β

(5000 per second is the speed)

→ Then do a kind of gradient descent

→ Move to new δ, β

← repeat



Simulation, hardware subgraph

Quantum Computer, hardware subgraph

Simulation, Fully connected graph

Quantum Computer, Fully connected graph.

So though theoretically and in simulation, repeatedly doing separator, mixer improves results.

But in practice error outweighs the optimization.