# University of Waterloo

Faculty of Mathematics

# Quantum Communication Complexity and Raz's Problem

Institute for Quantum Computing
University of Waterloo
Waterloo, ON

James Hawley
20423520
3A Mathematical Physics
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# Memorandum

To: Joseph Emerson From: James Hawley Date: August 27, 2014

Re: Work Report: Quantum Communication Complexity and Raz's Problem

I have prepared the enclosed report, "Quantum Communication Complexity and Raz's Problem", for my 3A work report and for your research group at the Institute for Quantum Computing. This report, the third of four work reports that the Co-operative Education Program requires that I successfully complete as part of my BMath Co-op degree requirements, has not received academic credit and was written entirely by myself.

The research group you lead explores open questions in quantum foundations and quantum information science. My job as an Undergraduate Student Research Assistant required me to research topics in classical and quantum information processing, understand and expand upon recent publications, and present my work to the rest of the group and other colleagues. This report is a study of Raz's problem and is a summary of my work this term.

The Faculty of Mathematics requests that you evaluate this report for command of topic and technical content/analysis. Following your assessment, the report, together with your evaluation, will be submitted to the Math Undergrad Office for evaluation on campus by work report markers. The combined marks determine whether the report will receive credit and whether it will be considered for an award.

I'd like to thank you, Richard Cleve, Mark Howard, and Joel Wallman for the helpful conversations over the past few months, as well as NSERC for providing funding for this research.

James Hawley

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# **Executive Summary**

This report states and analyzes a family of classical algorithms that solves Raz's problem, a problem in the communication complexity framework of distributed computing. These solutions are adaptations of the protocol developed by Pashayan et al., which is inspired by the stabilizer sub-theory of quantum computing and relies on the discrete Wigner function formalism [7].

The protocols' probabilistic convergence to the answer, their communication complexities, and how each protocol behaves in special cases of input variables are discussed. The family of protocols behaves in the following way:  $O(\log d)$  communication complexity when stabilizer states and Clifford gates are guaranteed,  $O(d \log d)$  when only the quantum gates are Clifford,  $O(d^2 \log d)$  when the input vector is a stabilizer state, and  $O(d^3 \log d)$  when there are no specifications on the input vector or gates. It performs as well as the quantum algorithm in the stabilizer sub-theory, but performs poorly in the general case.

Areas for improvement include specifying better bounds on the mana of states and unitary matrices to give a tighter bound on required repetitions, determining bounds on the mana of unitary matrices in the extended Clifford hierarchy, and looking at a protocol that uses the nearest neighbour in the stabilizer framework.

## Chapter 1

## Introduction

Quantum computing has made large strides in the last couple decades, and is emerging as a field of particular interest for mathematicians, physicists, computer scientists, and electrical engineers. From a theoretical standpoint, developing algorithms that take advantage of quantum phenomena and characterizing the differences between quantum and classical computational algorithms is necessary to determine precisely what resources are needed for quantum computers to be considerably more effective than current computers. The qubit (quantum bit) is a basis for much of the theoretical framework, and its two-state design is analogous to the classical 0-1 framework of classical computers. Working in dimensions higher than two (qubits are renamed qudits to emphasize the d-dimensional systems), can yield some results that are more intuitive than results strictly in two dimensions.

One area of study is communication complexity, and how entangled particles can help physically separated parties perform calculations. Given a problem, the communication complexity is the minimum amount of information exchanged between the two parties needed to solve the problem [5]. Looking at the information that must be exchanged has ties to cryptography, secure communication channels, and distributed computation.

Another relevant topic of interest is known as the stabilizer sub-theory. It involves certain quantum operators (also called gates, which are mathematically represented by unitary matrices) and how quantum algorithms associated with these operators can be simulated efficiently on classical com-

puters. Closely related to the formalism of stabilizers is the discrete Wigner function, which serves as both an intuitive approach to quantum states, and a mathematical representation of them. While both of these areas are quite technical, the reader should refer to Appendix A and Appendix B to get a better understanding of these topics.

While communication complexity and the stabilizer sub-theory are not typically overlapping topics of study, some problems coming from a communication complexity framework can be solved effectively by developing algorithms that are based upon the stabilizer formalism; one such problem is known as Raz's problem.

Raz's problem [8] comes in two variants, but both are based off of the same premise. The following definitions are consistent across both variants: the two parties of interest are named Alice and Bob;  $x \in \mathbb{R}^d$  is a unit vector, where d is an odd prime number;  $M_0$  and  $M_1$  are orthogonal subspaces of  $\mathbb{R}^d$ ; and  $\vartheta \in \mathbb{R}$  where  $0 \le \vartheta < 1/\sqrt{2}$ .

**Problem 1.** Let Alice have the vector x, Bob have the subspaces  $M_0$  and  $M_1$ , and both Alice and Bob have the value  $\vartheta$ . Alice and Bob must communicate to output the value  $\vartheta$  if the distance  $d(x, M_0) < \vartheta$ , and 1 otherwise.

**Problem 2.** Let Alice have x and the subspaces  $M_0, M_1$ , Bob have an orthogonal matrix U, and both Alice and Bob have the value  $\vartheta$ . Alice and Bob must communicate to output the value  $\vartheta$  if the distance  $d(Ux, M_0) < \vartheta$ , and 1 otherwise.

The goal is to provide solutions to these problems that minimize the communication complexity between Alice and Bob. A visual representation of these problems can be seen in Figure 1.1. Raz showed that there exists a protocol that solves Problem 2 where the lower bound for its complexity, using probabilistic classical computation, is  $\Omega(\sqrt{d})$ , and its upper bound is  $O(d^{3/4})$ . There is also a bound for Problem 1 of  $O(\sqrt{d})$ . As stated by Raz, and further discussed by Buhrman et al., efficient quantum computational protocols, however, have a communication complexity of  $\Theta(\log d)$ , demonstrating an exponential separation in complexity between the two methods [1]. The purpose of this report is to develop a classical protocol that approaches these lower bounds in general, and in special cases behaves like the quantum protocols. In addition, characterizing the special cases

and how the protocol behaves in general will be discussed.

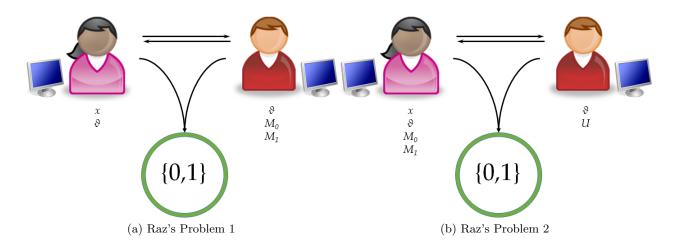


Figure 1.1: Visualization of Raz's problems

# Chapter 2

# Analysis

To capitalize on the ideas provided by quantum mechanics, one can associate x with the d-dimensional qudit  $|\psi\rangle$ , where in the measurement basis, denoted  $\{|j\rangle\}_{j=0}^{d-1}, |\psi\rangle = x$ . By considering the vector x as the mathematical representation of the quantum state  $|\psi\rangle$ , some of the tools provided by the discrete Wigner function become useful in solving this problem. By adapting the protocol outlined in [7] for each problem, one can arise at some classical computational protocols that solve Raz's problem probabilistically.

A key point to note is that throughout both of these protocols, no quantum computation ever occurs. These solutions are inspired by the stabilizer sub-theory, which behaves differently than general quantum computation. Additionally, calculating  $\hat{x}$  between Step 5 and Step 6 in Protocol 1 (and similarly calculating  $\hat{v}$  between Step 6 to Step 7 in Protocol 2) can be done since the vectors x and Ux are real (and thus  $|\psi\rangle$  and  $U|\psi\rangle$  are as well). If one was to perform a basis measurement on  $|\psi\rangle$  and O is the random variable associated with the measurement outcome, then O is associated with the distribution  $\Pr(O=k)=|\langle\psi|k\rangle|^2$ . The value of the probability is the square of the kth component of  $|\psi\rangle$ . Computing the sample probability  $\Pr(O=k)$  approximates the value of the kth element of x in Protocol 1. Doing this for each k produces the values of the vector  $\hat{x}$ . The same idea holds for  $U|\psi\rangle$  and the kth value of U in Protocol 2, using  $\Pr(O=k)=|\langle\psi|U|k\rangle|^2$ .

#### 2.1 Protocol 1: Solution to Problem 1

- 1. Let  $\rho = |\psi\rangle\langle\psi|$ , and let  $W_{\rho}$  and  $\mathcal{M}_{\rho}$  be as defined in Appendix B.
- 2. Alice samples a value  $\alpha \in \mathbb{Z}_d^2$  according to the weighted probability distribution

$$\Pr(\alpha) = \frac{|W_{\rho}(\alpha)|}{\mathcal{M}_{\rho}} \tag{2.1}$$

and sends  $\alpha$  to Bob. She also sends  $\operatorname{Sgn}(W_{\rho}(\alpha))$  and  $\mathcal{M}_{\rho}$  (some positive real number). Alice will need to send back a truncated value of  $\mathcal{M}_{\rho}$ , denoted  $\hat{\mathcal{M}}_{\rho}$ , since sending the entire real number can in principle use an infinite amount of information. How precise this truncated value needs to be will be discussed in Section 2.4.

3. Bob samples possible measurement outcomes from the distribution

$$\Pr(O = k | \alpha) = |W_{E_k}(\alpha)| \tag{2.2}$$

4. Bob sets the value

$$r = \hat{\mathcal{M}}_{\rho} W_{E_k}(\alpha) \operatorname{Sgn}(W_{\rho}(\alpha))$$
(2.3)

He can regard this value as a realization of some random variable R, whose probability distribution is given by

$$\Pr(R = r) = \frac{|W_{\rho}(\alpha)|}{\mathcal{M}_{\rho}} \tag{2.4}$$

5. Alice and Bob repeat steps 2-4  $T_1$  times, and Bob calculates  $\hat{R}$ , the sample average of R over the  $T_1$  repetitions. The particular value for  $T_1$  is another topic of interest, and is discussed in Section 2.3. As shown in [7],

$$\mathbb{E}(R) = \Pr(E_k|\rho) \tag{2.5}$$

where  $\mathbb{E}(R)$  is the expected value of R. By doing this, Bob can approximate the measurement probabilities and create an estimate,  $\hat{x}$ , for the vector x.

6. On his computer, since Bob has the vector  $\hat{x}$ , he computes  $d(\hat{x}, M_0)$ , which does not require any further communication, and outputs 1 or 0, depending on the result.

#### 2.2 Protocol 2: Solution to Problem 2

- 1. Let  $\rho = |\psi\rangle\langle\psi|$ , and let  $W_{\rho}$  and  $\mathcal{M}_{\rho}$  be as defined in Appendix B.
- 2. Alice samples a value  $\alpha \in \mathbb{Z}_d^2$  according to the weighted probability distribution

$$\Pr(\alpha) = \frac{|W_{\rho}(\alpha)|}{\mathcal{M}_{\rho}} \tag{2.6}$$

and sends  $\alpha$  to Bob.

3. Bob has the orthogonal (which is, by definition, unitary) matrix U, so by using the Wigner representation of U,  $W_U$ , he now samples  $\beta \in \mathbb{Z}_d^2$  according to the distribution

$$\Pr(\beta|\alpha) = \frac{|W_U(\beta|\alpha)|}{\mathcal{M}_U(\alpha)} \tag{2.7}$$

Bob sends  $\beta$  to Alice, along with  $\operatorname{Sgn}(W_U(\beta|\alpha))$  and  $\hat{\mathcal{M}}_U(\alpha)$ . Like in the previous protocol, the precision to which Bob can send back  $\hat{\mathcal{M}}_U(\alpha)$  needs to be specified. This will also be discussed in Section 2.4.

4. Alice samples possible measurement outcomes from the distribution

$$\Pr(O = k|\beta) = |W_{E_k}(\beta)| \tag{2.8}$$

5. Alice sets the value

$$r = \hat{\mathcal{M}}_{U}(\alpha) \mathcal{M}_{\rho} W_{E_{k}}(\beta) \operatorname{Sgn}(W_{\rho}(\alpha) W_{U}(\beta|\alpha))$$
(2.9)

Alice regards this value as a realization of some random variable R, whose probability distribution is given by

$$\Pr(R=r) = \frac{|W_{\rho}(\alpha)|}{\mathcal{M}_{\rho}} \frac{|W_{U}(\beta|\alpha)|}{\mathcal{M}_{U}(\alpha)}$$
(2.10)

6. Alice and Bob repeat steps 2-5  $T_2$  times, and Alice calculates  $\hat{R}$ , the sample average of R over

the  $T_2$  repetitions (this value will also be discussed in Section 2.3). As shown in [7],

$$\mathbb{E}(R) = \Pr(E_k | \rho, U) \tag{2.11}$$

By doing this, Alice can approximate the measurement probabilities and create an estimate,  $\hat{v}$ , for the vector Ux.

7. Alice computes  $d(\hat{v}, M_0)$ , which does not require any communication, and outputs 1 or 0, depending on the result.

#### 2.3 Convergence and Repetition of the Protocols

The sample average,  $\hat{R}$ , over T repetitions obeys the Chernoff-Hoeffding inequality, as explained in [7].

$$\Pr(|\hat{R} - \mathbb{E}(R)|) \ge \epsilon) \le 2e^{\frac{-T\epsilon^2}{2\mathcal{M}^2}}$$
(2.12)

where  $\mathcal{M} = \mathcal{M}_{\rho} \mathcal{M}_{U}$ , the total mana of the system (refer to Appendix B for more information). Thus, if T is large enough for each solution, then probabilistic convergence is guaranteed. In order to determine T, finding an upper bound for  $\mathcal{M}$  is required. This value of  $\mathcal{M}$  depends on x and the matrix U, but some upper bound for  $\mathcal{M}$  can be established. The next few subsections are dedicated to characterizing special cases of  $\mathcal{M}$  given certain types of U and x.

#### 2.3.1 Mana of General States and Matrices

Bounding  $\mathcal{M}$  in a general case can be done by using the following propositions. Their proofs are listed in Appendix C for reference.

**Proposition 1.** For any quantum state  $\rho, \mathcal{M}_{\rho} \leq \sqrt{d}$ .

**Proposition 2.** For any unitary (and by definition, orthogonal) matrix  $U, \mathcal{M}_U \leq d$ .

This information states that for Protocol 1,  $\mathcal{M} = \mathcal{M}_{\rho} \leq \sqrt{d}$ , so Equation 2.12 becomes

$$\Pr(|\hat{R} - \mathbb{E}(R)|) \ge \epsilon) \le 2e^{\frac{-T_1 \epsilon^2}{2d}}$$
(2.13)

This convergence becomes independent of the dimension d if  $T_1 = d$ , which is a desirable quality of an algorithm. Similarly for Protocol 2,  $\mathcal{M} = \mathcal{M}_U \mathcal{M}_\rho \leq d\sqrt{d}$ , and thus setting  $T_2 = d^{3/2}$  will remove the dependence of the size of x from the convergence of the protocol.

#### 2.3.2 Mana of Stabilizer States and Clifford Gates

As is discussed in Appendix B, the discrete Wigner function and the stabilizer sub-theory are intimately connected, so using an algorithm based on the discrete Wigner function will likely behave in special ways when dealing with stabilizer states and unitary matrices. The following propositions are useful for characterizing the stabilizers in these solutions:

**Proposition 3.** For any stabilizer state  $|\phi\rangle$ ,  $W_{|\phi\rangle\langle\phi|}(\alpha) \geq 0$ .

**Proposition 4.** For any Clifford unitary U,  $W_U(\beta|\alpha) \geq 0$ .

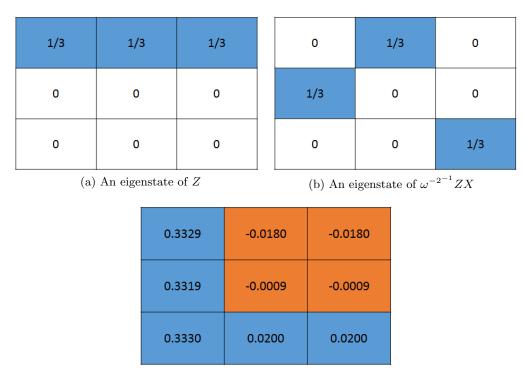
Proposition 3 is also known as Hudson's Theorem for finite-dimensional quantum systems, and the proof of both of these propositions is given by Daniel Gross [4]. The positive nature of the Wigner function for stabilizer states and Clifford gates yields the following corollaries.

Corollary 1. For any stabilizer state  $|\phi\rangle$ ,  $\mathcal{M}_{|\phi\rangle\langle\phi|}=1$ .

Corollary 2. For any Clifford unitary, U,  $\mathcal{M}_U(\alpha) = 1$  for all  $\alpha \in \mathbb{Z}_d^2$ .

These follow immediately from the above propositions and the properties of the discrete Wigner function given in Appendix B. This means that the in the case of states and matrices guaranteed to be in the stabilizer sub-theory, calculating the mana is unnecessary, and the concerns raised in Step 2 of Protocol 1 and Step 3 of Protocol 2 can be ignored. Better yet, due to the positive properties of stabilizers, Alice and Bob can use a geometric argument to produce an efficient protocol. As stated in Appendix B, stabilizer states form lines in the discrete phase space. Lines in this space are specified by  $ax + bz = p \pmod{d}$ , and an individual line can be uniquely determined by two points if d is prime.

Alice can specify what state x is by sending Bob four integers (two points in the discrete phase space that have non-zero values) since that specifies a line. Bob then knows exactly what state



(c) A typical non-stabilizer state

Figure 2.1: The stabilizer states form a line in the discrete phase space (d = 3 shown), while non-stabilizer states do not.

Alice has. Using Figure 2.1a for example, Alice could send (0,0) and (0,1) to Bob (the northwest and noth points in the grid), and he would know for certain which eigenstate of the Z matrix x was. In Problem 2, since Clifford matrices map stabilizer states to stabilizer states, Ux will form a line in the phase space, and Bob can send four integers back to Alice that specify two non-zero elements. Working in the stabilizer sub-theory ensures a simple and effective way of solving both Problem 1 and Problem 2.

#### 2.4 Communication Complexity of the Protocols

Without considering the precision on the mana values, Table 2.1 shows the maximum communication complexity of each step in Protocols 1 and 2. The communication complexity behaves like  $O(T_1 \log d)$  for Protocol 1 and  $O(T_2 \log d)$  for Protocol 2. Given the analysis of repetitions required for each protocol in Section 2.3, the complexities for each problem can be stated concisely. This is done in Table 2.2.

Step No.	Protocol 1	Protocol 2
Step 1	0 bits	0 bits
Step 2	$2 \log d$ bits	$2 \log d$ bits
Step 3	0 bits	$2 \log d$ bits
Step 4	0 bits	0 bits
Step 5	$T_1$ times	0 bits
Step 6	0 bits	$T_2$ times
Step 7	N/A	0 bits

Table 2.1: Communication complexity of each step in the two protocols.

	Stabilizer $x$ ,	General $x$ ,	Stabilizer $x$ ,	General $x$ ,
	Clifford $U$	Clifford $U$	General $U$	General $U$
Problem 1	$\bullet O(\log d)$	$\bullet O(d \log d)$	N/A	N/A
	• 1 round	$\bullet$ d rounds		
	• one-way	• one-way		
Problem 2	● O(log d)	$\bullet \ O(d \log d)$	$\bullet O(d^2 \log d)$	$\bullet O(d^3 \log d)$
	• 1 round	$\bullet$ d rounds	• $d^2$ rounds	• $d^3$ rounds
	• two-way	• two-way	• two-way	• two-way

Table 2.2: Communication complexity, number of rounds, and what type of communication (one-way or two-way) for each protocol in specified input cases.

In order to keep the complexities listed,  $\hat{\mathcal{M}}_U(\alpha)$  and  $\hat{\mathcal{M}}_\rho$  must be transmitted in  $O(\log d)$  bits, or less, for each case. For unsigned real numbers (unsigned numbers can be used since the mana is always positive), this can be done using the Institute of Electrical and Electronics Engineers (IEEE) convention, since the mana is always bounded by d. For example, if a number is expressed as  $a = c2^q$ , c,  $q \in \mathbb{Z}$ , letting c be 3 log d digits long (log d digits ensures it can reach the value d, and the other 2 log d can be for extra precision in the numbers to the right of the decimal) and  $q \in [0, 2 \log d]$  will ensure the decimal point can reach where it needs to be. Sending these two integers c and d can be expressed in d0(log d0) bits, which is the desired result. Thus, Alice and Bob can communicate these mana values while achieving high precision and not changing the overall communication complexity of the protocols.

# Chapter 3

# Conclusions

Classical protocols that solve Raz's problem approach  $O(\sqrt{d})$  communication complexity, and in some cases perform better than this, have been developed and characterized. Some of these protocols will solve the problem exactly each time, and others will solve the problem probabilistically. The best case scenario arises when the two parties are working within the stabilizer subtheory or quantum computation, where the problem can be solved exactly in one round of communication, with a complexity of  $O(\log d)$ . This mirrors the complexity of the best known quantum protocol, and is a desirable result. This complexity, unfortunately, does not hold when extended into general matrices and unit vectors, as these same protocols will require  $O(d \log d)$  complexity for Problem 1 and  $O(d^3 \log d)$  complexity for Problem 2. These solutions will converge probabilistically in multiple rounds of communication. These upper bounds for the protocols are not tight, however, so there may be room for improvement in the complexity of the solutions presented, or in developing new algorithms.

# Chapter 4

# Recommendations

The guaranteed convergence of the protocols is dependent on the upper bounds on the mana values. The propositions presented gave reasonable upper bounds, but they are not shown to be tight (it is not known which unitary matrices or density operators satisfy the equality in the propositions). The weakness arises from the use of the Cauchy-Schwarz Inequality, and making use of the Jamiołkowski transformation may bring tighter bounds.

The mana has been quantified for Clifford unitary operators, but these operators do not form a set of universal quantum gates. Finding bounds on the mana for the extended Clifford hierarchy of operators may proof useful in establishing a better protocol that deals with general orthogonal matrices.

One may be able to find a better probabilistic protocol for general unit vectors and matrices by considering nearest neighbouring stabilizer states and Clifford operators. By using states and matrices that behave efficiently under classical computation and most closely resemble the input states and matrices, one may be able to find a solution that will approximate the correct answer, and do so with little communication complexity.

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# Appendix A

# The Stabilizer Sub-theory

The stabilizers states are the set of eigenstates of the Weyl-Heisenberg operators. The set of Weyl-Heisenberg operators is defined as follows:

$$\mathcal{D} = \{ D_{x,z} = \omega^{-2^{-1}xz} Z^z X^x | x, z \in \mathbb{Z}_d \}$$
(A.1)

where  $\omega = e^{\frac{i2\pi}{d}}$  and  $2^{-1}$  is the multiplicative inverse of 2 modulo d. X and Z are d-dimensional generalizations of the two-dimensional Pauli matrices X and Z, and are defined by their action on basis vectors.

$$X|k\rangle = |k+1 \pmod{d}\rangle \tag{A.2}$$

$$Z|k\rangle = \omega^k |k\rangle \tag{A.3}$$

Equivalently, their matrices take the forms

$$Z = \begin{pmatrix} 1 & 0 & \dots & 0 \\ 0 & e^{\frac{i2\pi}{d}} & & \vdots \\ \vdots & & \ddots & \\ 0 & \dots & 0 & e^{\frac{i2\pi}{d}(d-1)} \end{pmatrix}, X = \begin{pmatrix} 0 & \dots & 0 & 1 \\ 1 & 0 & \dots & 0 \\ 0 & \ddots & \ddots & \vdots \\ 0 & 0 & 1 & 0 \end{pmatrix}$$
(A.4)

Related to the stabilizer states is the group of unitary matrices called the Clifford group. This group is defined as follows:

$$C_d = \{ U \in \mathcal{U}(d) | \forall P \in \mathcal{D}, \exists Q \in \mathcal{D} \text{ where } UPU^{\dagger} = Q \}$$
(A.5)

(ie. Clifford operators map Weyl-Heisenberg operators to Weyl-Heisenberg operators). A main reason why this particular subset of states and operators is interesting is the Gottesman-Knill theorem [3]. This was originally published by Gottesman and later expanded upon by Knill, but it states that "A quantum circuit using only preparation of qudits in computational basis states, quantum gates from the Clifford group, and measurements in the computational basis, can be simulated efficiently on a classical computer." This makes the stabilizers a very important set of gates and states when contrasting the differences between quantum and classical computing.

# Appendix B

# The Discrete Wigner Function

The discrete Wigner function was originally introduced by Wootters [10] as a discrete analogue to the continuous Wigner function, which is a representation of continuous quantum states in phase space. The discrete phase space can be thought of as a d-by-d matrix (where d is the dimension of the Hilbert space), where a representation of a quantum state has a particular value in each element of the matrix. The discrete phase space also has a matrix operator is associated with each point in the matrix, often called phase point operators and denoted by A, which have the following definition:

$$A_{0,0} = \frac{1}{d} \sum_{x,z \in \mathbb{Z}_d} D_{x,z}$$
 (B.1)

$$A_{x,z} = D_{x,z} A_{0,0} D_{x,z}^{\dagger} \tag{B.2}$$

where  $D_{x,z}$  is a Weyl-Heisenberg displacement operator, as defined in Appendix A. Equivalently, the elements of the phase point operators can be expressed as

$$(A_{x,z})_{k,l} = \delta_{2x,k+l} e^{\frac{i2\pi}{d}z(k-l)}$$
 (B.3)

where  $\delta$  is the Kronecker Delta symbol and 2x and k+l are taken modulo d. Throughout the rest of the report, the notation  $\alpha=(x,z)$ , or any other Greek letter, has been used for brevity and clarity. Two useful properties of the phase point operators follow from their definition.

$$Tr(A_{\alpha}) = 1 \tag{B.4}$$

$$Tr(A_{\alpha}A_{\beta}) = d\delta_{\alpha\beta} \tag{B.5}$$

The phase point operators form a basis for the space of d-by-d matrices, so any quantum density operator  $\rho$  representing a single qudit state can be expressed as a linear combination of phase point operators. Specifically,

$$\rho = \sum_{\alpha \in \mathbb{Z}_d^2} W_{\rho}(\alpha) A_{\alpha} \tag{B.6}$$

$$U\rho U^{\dagger} = \sum_{\alpha,\beta \in \mathbb{Z}_d^2} W_{\rho}(\beta) W_U(\beta|\alpha) A_{\alpha}$$
 (B.7)

for a unitary matrix U. Using the above properties of phase point operators and rearranging the previous equations yields the following definitions for the discrete Wigner function for a density

operator  $\rho$ , unitary matrix U, and measurement E:

$$W_{\rho}(\alpha) = \frac{1}{d} \text{Tr}(\rho A_{\alpha}) \tag{B.8}$$

$$W_U(\beta|\alpha) = \frac{1}{d} \text{Tr}(A_\alpha U A_\beta U^\dagger)$$
 (B.9)

$$W_E(\alpha) = \text{Tr}(EA_\alpha) \tag{B.10}$$

The following properties follow immediately from their definition:

$$\sum_{\alpha \in \mathbb{Z}_d^2} W_{\rho}(\alpha) = 1 \tag{B.11}$$

$$\sum_{\alpha \in \mathbb{Z}_d^2} W_U(\beta|\alpha) = 1 \tag{B.12}$$

$$\sum_{\beta \in \mathbb{Z}_d^2} W_U(\beta | \alpha) = 1 \tag{B.13}$$

$$\sum_{\alpha \in \mathbb{Z}_d^2} W_E(\alpha) = 1 \tag{B.14}$$

$$\operatorname{Tr}(\rho \rho') = d \sum_{\alpha \in \mathbb{Z}_d^2} W_{\rho}(\alpha) W_{\rho'}(\alpha)$$
(B.15)

$$W_{U_1U_2}(\beta|\alpha) = \sum_{\gamma \in \mathbb{Z}_d^2} W_{U_2}(\beta|\gamma) W_{U_1}(\gamma|\alpha)$$
(B.16)

Since the phase point operators are Hermitian, the Wigner function will always produce real values. Specific bounds for the individual values are

$$|W_{\varrho}(\alpha)| \le 1/d \tag{B.17}$$

$$|W_U(\beta|\alpha)| \le 1 \tag{B.18}$$

$$|W_E(\alpha)| < 1 \tag{B.19}$$

An interesting theorem arises from this formalism, named Hudson's Theorem for finite-dimension quantum systems, and its proof is given in [4]. It states that the only states corresponding to an entirely non-negative discrete Wigner function are the stabilizer states. Additionally, the non-zero values of  $W_{\rho}$  form a line if one plots the values in a matrix. This line is expressed as

$$ax + bz = p \pmod{d} \ a, b, p \in \mathbb{Z}_d$$
 (B.20)

and an example can be seen in Figure 2.1b. In light of the positivity of stabilizer states, the definition for the "mana" of a state and of a unitary operator are made as follows:

$$\mathcal{M}_{\rho} = \sum_{\alpha \in \mathbb{Z}_d^2} |W_{\rho}(\alpha)| \tag{B.21}$$

$$\mathcal{M}_{U} = \max_{\alpha \in \mathbb{Z}_{d}^{2}} \sum_{\beta \in \mathbb{Z}_{d}^{2}} |W_{U}(\beta|\alpha)|$$
(B.22)

One can intuitively think of this mana value as some measure of distance between a particular state and the stabilizer polytope, or the distance from some unitary operator to the Clifford group.

# Appendix C

# **Proofs of Propositions**

**Proposition 1.** For any quantum state  $\rho, \mathcal{M}_{\rho} \leq \sqrt{d}$ .

*Proof.* For any density operator  $\rho$ ,  $1 \geq \text{Tr}(\rho^2)$ , and by definition of the discrete Wigner function

$$1 \ge \operatorname{Tr}(\rho^2) = d \sum_{\alpha} W_{\rho}(\alpha)^2 = d \sum_{\alpha} |W_{\rho}(\alpha)|^2$$
 (C.1)

Using the Cauchy-Schwarz Inequality,

$$\mathcal{M}_{\rho}^{2} = \left(\sum_{\alpha} |W_{\rho}(\alpha)|\right)^{2} \tag{C.2}$$

$$\leq \left(\sum_{\alpha} |W_{\rho}(\alpha)|^2\right) \left(\sum_{\alpha} |1|^2\right) \tag{C.3}$$

$$= d(d\sum_{\alpha} |W_{\rho}(\alpha)|^2) \tag{C.4}$$

$$\leq d$$
 (C.5)

**Proposition 2.** For any unitary operator  $U, \mathcal{M}_U \leq d$ .

Proof.

$$UA_{\alpha}U^{\dagger} = \sum_{\beta} W_U(\beta|\alpha)A_{\beta} \tag{C.6}$$

$$d = \text{Tr}(A_{\alpha}A_{\alpha}) \tag{C.7}$$

$$= \operatorname{Tr}(U A_{\alpha} U^{\dagger} U A_{\alpha} U^{\dagger}) \tag{C.8}$$

$$= \sum_{\beta} dW_U(\beta|\alpha)^2 \tag{C.9}$$

$$1 = \sum_{\beta} W_U(\beta | \alpha)^2 \tag{C.10}$$

By the Cauchy-Schwartz Inequality,

$$\mathcal{M}_{U}(\alpha)^{2} = \left(\sum_{\beta} |W_{U}(\beta|\alpha)|\right)^{2}$$

$$\leq \left(\sum_{\beta} |W_{U}(\beta|\alpha)|^{2}\right)\left(\sum_{\beta} |1|^{2}\right)$$

$$= d^{2}$$
(C.11)
$$(C.12)$$

$$\leq \left(\sum_{\beta} |W_U(\beta|\alpha)|^2\right) \left(\sum_{\beta} |1|^2\right) \tag{C.12}$$

$$= d^2 \tag{C.13}$$

$$\mathcal{M}_U(\alpha) \le d$$
 (C.14)

Since this holds true for all  $\alpha$ , it holds for the maximum value of  $\mathcal{M}_U(\alpha)$ , which is the definition of  $\mathcal{M}_U$ .





## **Employer Evaluation of Work Report**

Work term for which report writte	en: Year 20	☐ January - April	☐ May - Augus	st	- December
Student's Name ID No					
Year/Term Prog	Report No.				
Employer's Name					
Title of Report					
Evaluator's Name		Evaluato	or's Title/Dept. —		
Evaluator's Signature			[	Date	
One of the requirements of Co-o reports prior to graduation. Work a student must receive acceptab	Reports are marked le or higher from both	by both the employe markers.	r and an on-camp	ous evaluator. To rece	ive credit for the report,
normally related to the work envi Please read the student's report, report that is submitted to the U presentation, structure, literary q	ronment. Therefore, we complete the evaluation inversity. With your assuality, and content.	e request your assist on below, and give it	tance in this area. t to the student wl	no will include it as th	ne last page of the
Your input is greatly appreciated.					
Quality of Subject Matter	Outstanding	Very Good	Good	Acceptable	Unacceptable
Command of Topic					
Technical Content/Analysis					
Overall					
To the best of my knowledge, thi	s report is original wo	rk completed by the	student.	rue 🗌 False	
Evaluator's Comments (if more	space is required, ple	ase use the back of	the page)		