## Quantum Back-Action of an Individual Variable-Strength Measurement

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Measuring a quantum system can randomly perturb its state. The strength and nature of this back-action depend on the quantity that is measured. In a partial measurement performed by an ideal apparatus, quantum physics predicts that the system remains in a pure state whose evolution can be tracked perfectly from the measurement record. We demonstrated this property using a superconducting qubit dispersively coupled to a cavity traversed by a microwave signal. The back-action on the qubit state of a single measurement of both signal quadratures was observed and shown to produce a stochastic operation whose action is determined by the measurement result. This accurate monitoring of a qubit state is an essential prerequisite for measurement-based feedback control of quantum systems.

Ithough the evolution ("state collapse") of a quantum system subject to an infinitely strong (i.e., projective) quantum nondemolition (QND) measurement is textbook physics, the subtlety and utility of finite strength (i.e., partial) measurement phenomena are neither widely appreciated nor commonly verified experimentally. Standard quantum measurement theory puts forward the principle that observing a system induces a decoherent evolution proportional to the measurement strength (1-5). Thus, partial measurement is often associated with partial decoherence of the state of a quantum system. However, this measurement-induced degradation occurs only if the measurement is inefficient informationally—that is, if only a portion of the measurement's information content is available to the observer for use in reconstructing the new state of the system.

If, instead, the measurement apparatus is entirely efficient, the new state of the quantum system can be perfectly reconstructed. This outcome-dependent revision of the system's imposed initial conditions constitutes a fundamental quantum effect called measurement back-action (2, 6–8). Although the system's evolution under measurement is erratic (hence, the measurement outcome cannot be predicted in advance), the measurement record faithfully reports the perturbation of the system after the fact.

We use the powerful, combined qubit-cavity architecture, circuit quantum electrodynamics (cQED) (9, 10), which allows for rapid, repeated quantum nondemolition (QND) (II, 12) superconducting qubit measurement (13-18). The

cavity output is monitored in real time by using a phase-preserving amplifier working near the quantum limit, where the noise is only caused by the fundamental quantum fluctuations of the electrodynamic vacuum (19). The decision to read out our qubit by using coherent states of the resonator has two important consequences. First, the outcomes of a partial measurement form a quasicontinuum, unlike the set of discrete answers obtained from a projective measurement. Second, measuring both quadratures of the signal leads to two-dimensional (2D) diffusion of the direction of the qubit effective spin. We show that the choice of measurement apparatus and of measurement strength both affect the evolution of a quantum system, but neither results in degradation of the system's state if the measurement is informationally efficient. Such precise knowledge of the measurement back-action is a necessary prerequisite for general feedback control of quantum systems.

Our superconducting qubit is a transmon (20), consisting of two Josephson junctions in a closed loop, shunted by a capacitor to form an anharmonic oscillator. The two lowest energy states,  $(|g\rangle \text{ and } |e\rangle)$ , are the logical states of the qubit. The qubit is dispersively coupled to a compact resonator, which is further asymmetrically coupled to input and output transmission lines (Fig. 1, B and C), determining the resonator bandwidth  $(\kappa/2\pi = 5.8 \text{ MHz})$ . To measure a qubit prepared in initial state  $|\psi\rangle = c_g|g\rangle + c_e|e\rangle$ , a microwave pulse of duration  $T_m >> 1/\kappa$  is applied to the resonator. The state-dependent shift of the resonator frequency ( $\chi/2\pi = 5.4$  MHz) results in an entangled state of the qubit and pulse  $|\Psi\rangle = c_{\sigma}|g\rangle \otimes |\alpha_{\sigma}\rangle +$  $c_e|e\rangle\otimes|\alpha_e\rangle$ , where  $|\alpha_{g,e}\rangle$  refers to the coherent state after traversing the resonator.

Amplification is required to convert the pointer state  $|\Psi\rangle$  into a macroscopic signal that can be processed and recorded with standard instrumentation. In our case, the pulse, having traversed the resonator, is amplified by using a linear, phase-preserving amplifier with gain G, which can be

seen as multiplying the average photon number in  $|\alpha_{\sigma,e}\rangle$  (Fig. 1B). For dynamical range considerations, our amplifier, called the Josephson parametric converter (JPC) (21–24) is operated in this experiment with a gain G = 12.5 dB and bandwidth of 6 MHz, adding close to the minimum amount of noise allowed by quantum mechanics. The added quantum fluctuations are due to a second, "idler," input (19). A measurement of both quadratures of the output mode results in an outcome, denoted  $(I_m, O_m)$ , which is then used to determine the new state of the qubit after measurement (Fig. 1A). As has been shown in (8), and detailed in the supplementary materials, this outcome contains all information necessary to perfectly reconstruct the new state of the qubit. Remarkably, the additional quantum fluctuations introduced during amplification enter in the measurement back-action on the qubit without impairing our knowledge of it.

We first demonstrate projective qubit readout by strongly measuring the qubit using an 8-us pulse with the drive power set so that the average number of photons in the resonator during the pulse was  $\overline{n} = 5$  (Fig. 2). Selected individual measurement records for the qubit are shown in Fig. 2B. The data are digitized with a sampling time of 20 ns and smoothed with a binomial filter with  $T_m = 240$  ns width, which corresponds to eight cavity lifetimes, and scaled by the experimentally determined standard deviation ( $\sigma$ ). The highlighted trace shows clear quantum jumps in the qubit state, which are identified by vertical black dotted lines indicating  $4\sigma$  deviations from the current gubit state. The 8% equilibrium gubit excitedstate population is consistent with other measurements of superconducting qubits (25). By counting the number of up and down transitions in 25,000 traces with no qubit excitation pulse, we calculate  $T_1 \leq 3.1$  µs. Although we fail to resolve pairs of transitions separated by much less than our filter time constant, this method for estimating  $T_1$  yields a value in good agreement with the value  $T_1 = 2.8 \,\mu s$  calculated from fitting an exponential to the averaged trajectory of all traces. Further, the average qubit polarization did not vary over 8 µs of continuous measurement, nor did  $T_1$  diminish with larger readout amplitude up to  $\overline{n} \cong 15$ , which demonstrates the QND nature

Histograms of the scaled  $I_m$  component of the outcome for the first 240 ns of measurement after a qubit rotation by  $\theta=0$ ,  $\pi/2$ ,  $\pi$  are shown in Fig. 2C. The ground and excited distributions are separated by 4.8  $\sigma$ , which corresponds to a measurement fidelity of 98% when  $I_m=0$  is used as the discrimination threshold. We emphasize that the discreteness of the z measurement of the transmon circuit, illustrated by the bimodality of the histogram, is here due only to the quantum nature of the circuit and not to any nonlinearity of the readout. Thus, this measurement of a continuous, unbounded pointer state is exactly equivalent to the Stern-Gerlach experi-

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ment. These strong, high-fidelity measurements allow us to perform precise tomography and to prepare the qubit in a known state by measurement. We next use these tools to quantify measurement back-action of partial measurement on the qubit state.

The qubit evolution due to partial measurement can be precisely calculated from the complete measurement record using the quantum trajectory approach (6, 7), but this is computationally intensive. Instead, we calculate the backaction from the average output over the time  $T_m$ , as in (8). Provided that the measurement time is short compared with the qubit coherence times  $T_1$  and  $T_2$ , and long compared with the cavity lifetime and amplifier response time, this approach allows the qubit to be tracked without degradation. In this experiment,  $T_m = 240$  ns, which is shorter than  $T_1 = 2.8$  µs and  $T_{2R} = 0.7$  to 2.0 µs, and much longer than the cavity lifetime and JPC response time of 30 ns.

Assuming the qubit is initially polarized along the +y axis, we calculate the final qubit Bloch vector  $(x_6, y_6, z_r)$  as a function of measurement

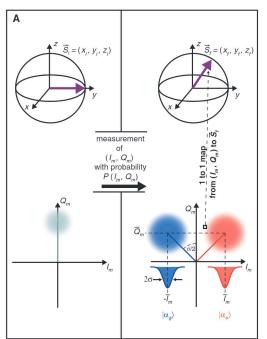
outcome  $(I_m, Q_m)$  (see detailed derivation in the supplementary materials) to be

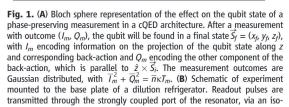
$$\begin{split} x_f^{\eta}(I_m, & Q_m) = \operatorname{sech}\left(\frac{I_m \ \overline{I}_m}{\sigma^2}\right) \\ & \times \sin\left[\frac{Q_m \ \overline{I}_m}{\sigma^2} + \frac{\overline{Q}_m \ \overline{I}_m}{\sigma^2} \left(\frac{1-\eta}{\eta}\right)\right] \\ & \times e^{-\frac{\gamma^2}{\sigma^2}\left(\frac{1-\eta}{\eta}\right)}, \\ y_f^{\eta}(I_m, & Q_m) & = \operatorname{sech}\left(\frac{I_m \ \overline{I}_m}{\sigma^2}\right) \\ & \times \cos\left[\frac{Q_m \ \overline{I}_m}{\sigma^2} + \frac{\overline{Q}_m \ \overline{I}_m}{\sigma^2} \left(\frac{1-\eta}{\eta}\right)\right] \\ & \times e^{-\frac{\overline{I}_m^2}{\sigma^2}\left(\frac{1-\eta}{\eta}\right)}, \\ z_f^{\eta}(I_m) & = \tanh\left(\frac{I_m \ \overline{I}_m}{\sigma^2}\right) \end{split} \tag{1}$$

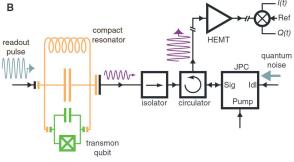
where  $\overline{I}_m$  and  $\overline{Q}_m$  and  $\sigma$  define the center and standard deviation of the outcome distributions.

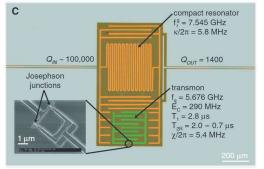
and  $\eta$  is the quantum efficiency of the amplification chain (Fig. 1A). In this theory, we neglect the effect of qubit decoherence and losses before amplification. In the limit of a perfectly efficient amplification ( $\eta=1$ ), we see that the length of the Bloch vector is unity, irrespective of outcome. The parameter  $\overline{I}_m/\sigma$  can be identified as the apparent measurement strength because the measurement becomes more strongly projective as  $\overline{I}_m/\sigma$  increases. It is given in terms of experimental parameters as  $\overline{I}_m/\sigma=\sqrt{2\overline{n}\eta\kappa T_m}\sin(\vartheta/2)$ , where  $\vartheta=2$  arctan  $\gamma/\kappa$ .

The pulse sequence for determining measurement back-action is shown in Fig. 3A. We first strongly read out the qubit with a 240 ns,  $\bar{n}=5$  pulse and record the outcome, which will be used to prepare the qubit in the ground state by post-selection. Then, the qubit is rotated to the +y axis and measured with a variable measurement strength  $(T_m=240 \text{ ns})$ , and the outcome  $(I_m, Q_m)$  is recorded. The final, tomography, phase measures the x, y, or z component of the qubit Bloch vector with a strong  $(\bar{n}=5, T_m=240 \text{ ns})$  measurement pulse. To compensate for the finite







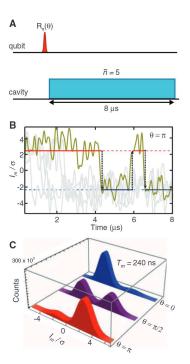


lator and circulator, to the signal port (Sig) of a JPC. The idler port (Idl) is terminated in a 50  $\Omega$  load. The amplified signal output is routed via the circulator and further isolators (not shown) to a high electron mobility transistor (HEMT) amplifier operated at 4 K, and subsequently demodulated and digitized at room temperature. (C) False-color photograph of the transmon qubit in compact resonator with qubit and resonator parameters. Inset is a scanning electron micrograph of the center of the transmon showing a loop of two Al/AlOx/Al junctions that form an effective junction tunable by an external magnetic field.

readout strength and qubit temperature, trials with outcomes  $|I_m/\sigma| < 1.5$  (corresponding to state purity < 99%) for the first and third measurements are discarded, as well as outcomes for the first measurement with the qubit in  $|e\rangle$ . To quantify the measurement back-action for a given measurement outcome  $(I_m, O_m)$ , the average final qubit

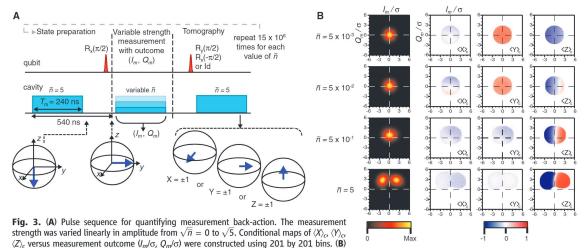
Fig. 2. (A) Pulse sequence for strong measurement. An initial qubit rotation  $R_x(\theta)$  of  $\theta$  radians about the x axis is followed by an 8- $\mu$ s readout pulse with drive power such that  $\overline{n} = 5$ . (B) Individual measurement records. The data are smoothed with a binomial filter with a  $T_m = 240$  ns time constant and scaled by the experimentally determined standard deviation (a). Black dotted lines indicate  $4\sigma$  deviation events. The qubit is initially measured to be in the excited state, and quantum jumps between excited and ground states are clearly resolved. The center of the ground- and excited-state distributions are represented as horizontal dotted lines. (C) Histograms of the initial 240-ns record of the readout pulse along  $I_m$  axis, for  $\theta = 0$ ,  $\pi/2$ ,  $\pi$ . Finite qubit temperature and  $T_1$ decay during readout are visible as population in the undesired gubit state.

Bloch vector, conditioned by the measurement outcome  $(I_m, Q_m)$ ,  $(\langle X \rangle_c, \langle Y \rangle_c, \langle Z \rangle_c)$ , is calculated versus outcome using the results of the tomography phase. These conditional maps of  $\langle X \rangle_c, \langle Y \rangle_c, \langle Z \rangle_c$  were constructed using 201 by 201 bins in the plane of scaled measurement outcomes  $(I_m/\sigma, Q_m/\sigma)$ .



Results for four measurement strengths increasing by decades from  $\overline{n} = 5 \times 10^{-3}$  to 5 are shown in Fig. 3B (see movie S1 of histograms and tomograms for all measurement strengths). The left column shows a 2D histogram of all scaled measurement outcomes recorded during the variable-strength readout pulse. At weak measurement strength, the ground- (left) and excited-(right) state distributions overlap almost completely. Their separation grows with increasing strength until they are well separated at  $\bar{n} = 5$ , which corresponds to the strong projective measurement shown in Fig. 1A. The rightmost columns show  $\langle X \rangle_c$ ,  $\langle Y \rangle_c$ ,  $\langle Z \rangle_c$  versus the associated  $(I_m/\sigma, Q_m/\sigma)$  bin. At weak measurement strength  $(\overline{n} \ll 1)$ , the qubit state is only slightly perturbed, with all measurement outcomes corresponding to Bloch vectors pointing nearly along the +y (initial) axis. However, gradients in  $\langle X \rangle_c$  along the  $Q_m$  axis and  $\langle Z \rangle_c$  along the  $I_m$  axis are visible, demonstrating the outcome-dependent backaction of the measurement on the qubit state. As the measurement strength increases, so does the back-action, as seen in the increase of the gradients in the  $\langle X \rangle_c$  and  $\langle Z \rangle_c$  maps (see fig. S2). When the measurement becomes strong, the qubit is projected to +z for positive  $I_m$  (-z for negative  $I_m$ ), whereas  $\langle X \rangle$  and  $\langle Y \rangle$  go unconditionally to zero, as expected.

One of the key predictions of finite-strength measurement theory is that the statistics of the measurement process, in particular the apparent measurement strength in the I-quadrature (which can be determined experimentally from the statistics of the measurement outcomes), are sufficient to infer  $z_f$  for any apparent measurement strength or outcome (see Eq. 1). For weak measurement, where the back-action is symmetric along both x and z, the apparent measurement strength deter-



Results are shown increasing by decades from  $\bar{n} = 5 \times 10^{-3}$  to 5. The left column shows a 2D histogram of all scaled measurement outcomes recorded during the variable-strength readout pulse. The three rightmost columns are tomograms showing  $\langle X \rangle_C$ ,  $\langle Y \rangle_C$ ,  $\langle Z \rangle_C$  versus the associated  $\langle I_m / \sigma, Q_m / \sigma \rangle$  bin.

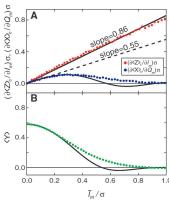


Fig. 4. Correlation between back-action and measurement outcome. (A) Experimental data for correlated back-action signal along z,  $(\partial \langle Z \rangle_d \partial I_m) \sigma$ , and along x,  $(\partial \langle X \rangle_c / \partial Q_m) \sigma$ , evaluated at  $(I_m, Q_m) =$ 0, are plotted versus  $\overline{I}_m/\sigma$ . For weak measurement strength, the slopes at the origin (represented by solid and dashed line, for z and x, respectively) agree with theoretical predictions, including firstorder corrections for  $T_1$  and  $T_2$ . The solid curve is the full theoretical expression for the x back-action plotted with  $\eta = 0.2$ ,  $\overline{Q}_m = 1.28 \overline{I}_m$ , and  $\exp(-\tau/2)$  $T_2$ ) = 0.58. (B) Experimental data for unconditioned  $\langle Y \rangle$  versus  $\overline{I}_m/\sigma$ . The data show the expected measurement-induced dephasing when the measurement outcome is not used to condition the perturbed gubit state. The dephasing rate is proportional to  $(\overline{I}_m/\sigma)^2$ , resulting in the apparent Gaussian dependence of  $\langle Y \rangle$  versus  $\overline{I}_m/\sigma$ . The theoretical expression for  $\langle Y \rangle$  versus  $\overline{I}_m/\sigma$  with parameters listed above is shown as a solid curve.

mines the amplitude of the x back-action as well (see eq. 14 in the supplementary materials). In Fig. 4A, we quantitatively compare this prediction with our experimental result. The scaling coefficients relating measurement outcome to back-action along z,  $(\partial \langle Z \rangle_c / \partial I_m) \sigma$ , and along x,  $(\partial \langle X \rangle_c / \partial Q_m) \sigma$ , extracted from the tomograms at  $I_m = Q_m = 0$ , are plotted versus the apparent measurement strength extracted from the histograms,  $\overline{I}_m / \sigma$  (see section 1.4 in the supplementary materials).

Both coefficients,  $(\partial \langle Z\rangle_c/\partial I_m)\sigma$  and  $(\partial \langle X\rangle_c/\partial Q_m)\sigma$ , are predicted at  $I_m=Q_m=0$  to be equal to  $\overline{I}_m/\sigma$ ; therefore, the data in Fig. 4A should have unity slope. However, finite  $T_1$  and  $T_2$  acting for a time  $\tau$  reduce the state purity and the apparent back-action. To first order, the coefficients are modified to  $(\partial \langle Z\rangle_c/\partial I_m)\sigma=(\overline{I}_m/\sigma)e^{-\tau/T_1}$  and  $(\partial \langle X\rangle_c/\partial Q_m)\sigma\cong(\overline{I}_m/\sigma)e^{-\tau/T_2}$  for the z and x back-action, respectively. In our pulse sequence,  $\tau\cong380$  ns, predicting slopes of  $0.87\pm0.09$  and  $0.58\pm0.06$  for z and x, in excellent agreement with the experimentally determined slopes of  $0.86\pm0.01$  and  $0.55\pm0.01$ . All further theoretical predictions are modified to reflect the effects of  $T_1$  and  $T_2$ , following the description in eq. 2 in the sup-

plementary materials. The black curve is the full theoretical dependence of  $(\partial \langle X \rangle_c / \partial Q_m) \sigma =$  $\overline{I}_m/\sigma\cos\{\overline{Q}_m\,\overline{I}_m/\sigma^2[(1-\eta)/\eta]\}e^{-\overline{I}_m^2/\sigma^2[(1-\eta)\eta]}e^{-\tau/T_2}$ using  $\eta = 0.2$ , the lowest value of  $\eta$  we extract from other measurements (see section 1.3 in the supplementary materials). We attribute the discrepancy between theory and data at high measurement strength to environmental dephasing effects due to finite  $T_2$  and losses before the JPC. Additionally, we process the tomography results unconditioned by measurement outcome in Fig. 4B. Theory predicts  $\langle Y \rangle = e^{-\overline{I}_m^2/\eta\sigma^2} \cos(\overline{I}_m \overline{O}_m/\eta\sigma^2) e^{-\tau/T_2}$ . This expression evaluated with  $\eta = 0.2$  is shown as a black curve with the deviation for stronger measurements attributed to dephasing effects due to losses before amplification.

Similar experiments have studied measurement of the state of a microwave cavity by Rydberg atoms (26) and partial nonlinear measurement of phase qubits (27). Also, phase-sensitive parametric amplification has been used to implement weak measurement-based feedback (18). In our experiment, the ability to perform both weak and strong high-efficiency, QND, linear measurements within a qubit lifetime, coupled with our high-throughput and minimally noisy readout electronics, allows us to acquire 13.5 billion qubit measurements in ~28 hours, data that can be compared with complete theoretical predictions of the conditional evolution of quantum states under measurement. They provide strong evidence that the purity of the state would not decrease in the limit of a perfect measurement, even when the signal is processed by a phase-preserving amplifier.

Our experiment illustrates an alternate approach to the description of a quantum measurement. In the case of a qubit, a finite-strength QND measurement can be thought of as a stochastic operation whose action is unpredictable but known to the experimenters after the fact if they have a quantum-noise-limited amplification chain. Any final state is possible, and the type of quantity measured, combined with the measurement strength, determines the probability distribution for different outcomes. This partial (i.e., finite strength) measurement paradigm is not inconsistent with the usual view of projective (i.e., infinite strength) measurement. Rather, projective measurement is the limiting case of the broader class of finite strength measurements.

The finite-strength measurement predictions that we have verified have immediate applicability to proposed schemes for feedback stabilization and error correction of superconducting qubit states. Whereas classical feedback is predicated on the idea that measuring a system does not disturb it, quantum feedback has to make additional corrections to the state of the system to counteract the unavoidable measurement back-action. The measurement back-action that is the subject of this paper thus crucially determines the transformation of the measurement outcome into the optimal correction signal for feedback. Our ability to experimentally quantify the back-action of an arbitrary-strength measurement thus provides a

dress rehearsal for full feedback control of a general quantum system.

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Acknowledgments: The authors thank A. Korotkov, B. Huard, M. Reed, A. Wallraff, and C. Eichler for helpful discussions. Facilities use was supported by the Yale Institute for Nanoscience and Quantum Engineering (YINQE) and the NSF MRSEC DMR 1119826. This research was supported in part by the Office of the Director of National Intelligence (ODNI), Intelligence Advanced Research Projects Activity (IARPA), through the Army Research Office (W911NF-09-1-0369) and in part by the U.S. Army Research Office (W911NF-09-1-0514). All statements of fact, opinion, or conclusions contained herein are those of the authors and should not be construed as representing the official views or policies of IARPA, the ODNL or the U.S. government, M.M. acknowledges partial support from the Agence National de Recherche under the project EPOQ2, ANR-09-JCJC-0070. M.H.D. acknowledges partial support from the College de France, S.M.G. acknowledges support from the NSF DMR 1004406.

## Supplementary Materials

www.sciencemag.org/cgi/content/full/339/6116/178/DC1 Materials and Methods Supplementary Text Figs. S1 to S3 References Movie S1

3 July 2012; accepted 20 November 2012 10.1126/science.1226897