Synchronization in a one-dimensional array of point Josephson junctions coupled to a common load

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We study the synchronization in a one-dimensional array of point Josephson junctions coupled to a common capacitor, which establishes a long-range interaction between junctions and synchronizes them. The stability diagram of synchronization in a noise-free system is obtained. The current when junctions transform from resistive state into zero-voltage state is then calculated and its dependence on the shunt parameters and the dissipation of junctions is revealed. In the presence of thermal noise, the synchronized oscillations are destroyed at a critical temperature and the system undergoes a continuous phase transition of desynchronization. A possible stability diagram of the synchronized oscillations with respect to thermal noise, current, dissipations, and shunt capacitance is then constructed. Finally we investigate the dynamic relaxation from random oscillations into a synchronized state. The relaxation time increases with the system size and temperature, but is reduced by the shunt capacitor.

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I. INTRODUCTION

Josephson junctions are building elements of many electronic and electromagnetic devices as well as a candidate for quantum computers.¹ In practical applications, one usually integrates large arrays of junctions on a chip to enhance the performance; thus coherent operations in these junctions are crucial. The synchronization between junctions can be realized by coupling them to a common resonator, most frequently through electromagnetic coupling. The common resonator establishes long-range interaction between junctions, which then synchronizes them under appropriate condition. The junction arrays have become an extremely important playground to understand the synchronization mechanism for a large population of nonlinear oscillators, partially because of the relatively easy experimental realization.^{2–10}

The successful observations of coherent emission from cuprate superconductors renew the interests in understanding the synchronization of arrays of Josephson junctions.^{11–17} Cuprate superconductors, such as Bi₂Sr₂CaCu₂O_{8+ δ} (BSCCO), are a natural realization of a stack of Josephson junctions of atomic thickness,^{18,19} known as intrinsic Josephson junctions (IJJs). Because of the large supercoducting energy gap, these built-in Josephson junctions can be operated at frequencies in the terahertz region, where the electromagnetic waves have wide applications.^{20,21}

Radiation from IJJs occurs in the resistive state. Such a state is reached by increasing the bias current above the Josephson critical current and then diminishing it down to the voltage V corresponding to the target frequency according to the Josephson relation $\omega = 2eV/\hbar$. The resistive state is preserved down to the retrapping current below which the system undergoes transition into the zero-voltage state. Such a procedure is possible because the resistivity of IJJs is very large; i.e., junctions are strongly underdamped. Thus the hysteretic behavior allows us, in principle, to reach a quite low voltage of the order of that corresponding to the Josephson frequency (~0.1 THz for BSCCO). In the resistive state, the Josephson plasma of composite oscillations of Cooper pairs and electromagnetic waves is excited. If the plasma oscillations

are in-phase, then the total radiation power is proportional to the number of junctions squared. Below a threshold current called the retrapping current, the resistive state becomes unstable and the system switches into a zero-voltage one. Important questions to be addressed are the following:

(1) What is the retrapping current in the array of point junctions and how does a shunt affect it?

(2) In what parameter region of junction and shunt do oscillations of junctions remain synchronized in the resistive state?

The stability of synchronized oscillations depends crucially on interaction between junctions. The junctions in cuprate superconductors interact with each other through nearest neighbor coupling, either inductive or capacitive. These shortrange interactions, however, are insufficient to establish a global phase coherence.^{22,23} There are two methods to achieve global synchronization by coupling all junctions to a common resonator.

In the first approach, the cavity formed by the superconductor's single crystal plays the role of the resonator.^{12,13} The synchronization is realized by the excitation of the cavity mode in the crystal.^{24,25} Alternatively, the synchronization can be achieved by the radiation fields²⁶ and/or by a shunted circuit.²⁷ The synchronization by a shunted circuit attracts considerable interest, because it can be implemented easily.

Real junctions involve thermal noise, especially for those in high- T_c superconductors. Generally, one expects thermal noise to broaden the linewidth of the oscillating spectrum, or even destroy the coherence. It is preferable to have robust coherent oscillation against noise. To this end, it is important to know how thermal fluctuations destroy the synchronization.

The dynamical process of building up the synchronization is also important for both applications and theoretical understandings. For an initial condition that is very close to the fully synchronized state, the relaxation to a synchronized state can be analyzed based on the standard local stability analysis.^{26,28,29} However, for a complete random initial state, the dynamic process is highly nontrivial. The system may even not relax into the synchronized state. Two questions naturally arise: How does one reach the synchronized state in a controlled way, and what is the relaxation time?

In this paper, we consider a one-dimensional array of point Josephson junctions coupled to a common circuit. First we provide analytical and numerical study on the stability of the synchronized state and map out the stability phase diagram. Based on the diagram, we derive the dependence of the retrapping current on the shunt circuit. Then we introduce thermal noise into the system and describe the effect on the synchronization. Mean-field critical behaviors are identified at the desynchronization transition, i.e., the transition from the the synchronized state to the state with random or partially random oscillations. We reveal the dependence of the transition temperature on the shunt circuit and bias current. Based on these results, a possible stability diagram of the synchronized oscillations is constructed taking thermal noise into account. Finally, we study the relaxation dynamics starting from a disordered state, where junctions oscillate randomly.

The remaining part of the paper is organized as follows. In Sec. II, we introduce the model. In Sec. III, we perform stability analysis of the synchronized oscillations both numerically and analytically. In Sec. IV, we study the desynchronization transition of the coherent state and obtain the corresponding transition temperature. In Sec. V, we study the dynamic relaxation from a disordered initial state into the synchronized state. The paper is concluded by a short summary.

II. MODEL

Arrays of Josephson junctions coupled to a common load were extensively studied decades ago,^{3,6,9} not only for their importance for the application in electronic device, but also as a fruitful platform to understand the underlying synchronization mechanism. These models, although less transparent than the well-known Kuramoto model,³⁰ can be realized experimentally^{31,32} much more easily than the Kuramoto model. The latter has been realized experimentally only very recently,³³ long after its proposal. Some specific configuration of the array, such as a one-dimensional array of Josephson junctions shunted by a serial RLC circuit, can be mapped onto the Kuramoto model.⁴

We consider a stack of IJJs with lateral sizes of order of several micrometers. This geometry of junctions is an alternative route to strong emissions²⁶ and has attracted a lot of attention recently. In this case, the variation of superconductivity phase in the lateral direction is small and the junction can be approximated as a point junction. The inductive coupling^{34–36} between junctions then vanishes under this approximation. Meanwhile, the capacitive coupling^{37,38} between junctions is weak and short-range; thus it can be neglected in comparison with the long-range interaction mediated by the shunt circuit. Under these simplifications, a stack of IJJs reduces to a serial array of point junctions.

We study a serial array of point Josephson junctions shunted by a lumped C circuit, which is shown schematically in Fig. 1. Each junction is modeled as a resistively and capacitively shunted circuit. The total current across the junction is

$$I_J = I_c \sin\phi_k + \frac{\hbar}{2eR_J}\dot{\phi}_k + \frac{\hbar}{2e}C_J\ddot{\phi}_k, \qquad (1)$$



FIG. 1. (Color online) (a) Schematic view of an array of Josephson junctions shunted with a capacitor. The junctions are biased by a dc current I_B . (b) The Josephson junction is modeled as a shunt circuit of a capacitor, a resistor, and a nonlinear Josephson current.

where $V = \frac{\hbar}{2e} \dot{\phi}_k$ is the voltage of the junction according to the ac Josephson relation. Here ϕ_k is the gauge-invariant superconductivity phase difference of the *k*th junction, and R_J , C_J , and I_c are the resistance, capacitance, and critical current of the junction, respectively. Using Kirchhoff's loop law, we obtain the equation of motion

$$I_B = \dot{Q} + I_c \sin\phi_k + \frac{\hbar}{2eR_J} \dot{\phi}_k + \frac{\hbar}{2e} C_J \ddot{\phi}_k + I_k^n, \quad (2)$$

$$V = \frac{\hbar}{2e} \sum_{k}^{N} \dot{\phi}_{k} = \frac{Q}{C_{s}},\tag{3}$$

where Q is the charge on the shunted capacitance, C_s is the shunted capacitance, and I_B is the bias dc current. We have introduced the Nyquist noise (white noise) current I_k^n ,

$$\left\langle I_k^n \right\rangle = 0, \quad \left\langle I_k^n(t) I_{k'}^n(t') \right\rangle = (4k_B T/R_J) \delta(t-t') \delta(k-k'), \tag{4}$$

where k_B is the Boltzmann constant and T is the temperature. We have also assumed that junctions are identical. In the presence of the common circuit, a small spread in the junction's parameters will not destroy the coherent oscillations.

We will use dimensionless quantities in the following calculations. The time is in units of Josephson plasma frequency $\omega_p = \sqrt{2eI_c/\hbar C_J}$, current in units of I_c , capacitance in units of C_J , resistance in units of R_J . We then arrive at the dimensionless version of Eqs. (2), (3), and (4):

$$I_B = \dot{Q} + \sin\phi_k + \beta\dot{\phi}_k + \ddot{\phi}_k + I_k^n, \tag{5}$$

$$V = \sum_{k}^{N} \dot{\phi}_{k} = \frac{Q}{C_{s}},\tag{6}$$

$$\left\langle I_{k}^{n}(t)I_{k'}^{n}(t')\right\rangle = 2\beta T\delta(t-t')\delta(k-k'),\tag{7}$$

where $1/\beta^2$ with $\beta = \sqrt{\hbar}/(R_J\sqrt{2eI_cC_J})$ is the McCumber number which determines the hysteretic behavior of junctions. Upon increasing the bias current, the system remains zero voltage until the bias current exceeds the critical current. Then the junctions switch into the resistive state. The system keeps resistive even when the bias current is reduced below the critical current for a junction with small β .³⁹ In the resistive state, the superconductivity phase ϕ_k is rotating accompanied by small oscillations. The angular velocity of the rotation for ϕ_k is the same for all junctions determined by the voltage, but the phase ϕ_k may vary from junction to junction. We will consider the synchronization of the phase of the junction arrays in the following.

In this model, all junctions are coupled to the capacitor C_s , which establishes mutual interaction among all junctions. Thus the effective dimensionality of the system is infinite, which is crucial for the synchronization.^{22,23} Another consequence of this mean-field behavior is the permutation symmetry; i.e., all junctions are biased by the same external current and the current in the shunt circuit. The exchange of any pair of junctions in the circuit does not change the topology of the circuit. If configuration ($\phi_1, \phi_2, \ldots, \phi_i, \ldots, \phi_j, \ldots, \phi_j, \ldots, \phi_i$) is a solution to Eqs. (5), (6), and (7), then ($\phi_1, \phi_2, \ldots, \phi_j, \ldots, \phi_j, \ldots, \phi_i$) is also a solution. This symmetry greatly simplifies the stability analysis as will be shown below.

Apparently, Eqs. (5), (6), and (7) always have a trivial solution that all junctions oscillate out of phase, and the dynamics of each junction is independent because the current in the shunt circuit vanishes. However, suppose at some instance, a small population of junctions oscillates with the same phase, then the capacitance C_s acquires energy, which is proportional to the number of in-phase junctions squared. Now the capacitance is able to attract more junctions to oscillate at its phase and in turn its energy increases further. This is a positive feedback process with explosive increases of energy in the capacitance and an avalanche of junctions oscillating coherently. Therefore we expect that in a certain parameter space, the out-of-phase oscillations lose stability and synchronization sets in. The qualitative picture will be elaborated in subsequent sections.

III. STABILITY OF THE SYNCHRONIZED STATE

In this section, we analyze the local stability of the coherent oscillations of all junctions in the absence of thermal fluctuations, T = 0. The local stability is determined by the dynamics of the system in the vicinity of the trajectory of the uniform solution. We consider the uniform oscillations $\phi_k = \phi_0$, where

$$(NC_s + 1)\ddot{\phi}_0 + \beta\dot{\phi}_0 + \sin\phi_0 = I_B,$$
(8)

with *N* being the number of junctions. The junction coupling strength is enhanced by a factor of *N*, in accordance with the typical behavior in the mean-field theory. We then add small perturbations δ_k to the uniform solution and determine the time evolution of the perturbations. The equations for the

perturbations read

$$\ddot{\delta}_k + \beta \dot{\delta}_k + \cos(\phi_0) \delta_k + C_s \sum_{i=1}^N \ddot{\delta}_i = 0.$$
(9)

The permutation symmetry between junctions allows us to decouple Eqs. (9) by introducing the quantities $\Delta_k = \delta_{k+1} - \delta_k$ and $\sigma = \frac{1}{N} \sum_{i=1}^N \delta_k$. We obtain equations for $\Delta_k = \Delta$ and σ :

$$\ddot{\Delta} + \beta \dot{\Delta} + \cos(\phi_0) \Delta = 0, \qquad (10)$$

$$\ddot{\sigma} + \beta \dot{\sigma} + \cos(\phi_0)\sigma + C_s N \ddot{\sigma} = 0.$$
(11)

If Δ diverges with time, the uniform solution becomes unstable. On the other hand, if σ diverges while Δ decays with time, the synchronization is kept and the system transits into another synchronized state if it exists. We are interested in the coherent oscillation, and we will only focus on Eq. (10) in the later analysis. We will solve Eq. (10) for weak oscillations both analytically and numerically based on the Floquet theorem.

A. Analytical treatment

We consider the region where the amplitude of Josephson oscillation is small. The solution of Eq. (8) in linear approximation can be written as

$$\phi_0 = \omega t + A \exp(i\omega t) \tag{12}$$

with

$$A = \frac{i}{-(C_s N + 1)\omega^2 + i\beta\omega} \ll 1.$$
(13)

The frequency ω is determined by the dc current conservation

$$I_B = \beta \omega + \operatorname{Re}[A]/2. \tag{14}$$

Substituting Eq. (12) into Eq. (10), we get the equation for Δ ,

$$\ddot{\Delta} + \beta \dot{\Delta} + \left\lfloor \frac{1}{2} (e^{i\omega t} + e^{-i\omega t}) - \frac{1}{2i} (e^{2i\omega t} - 1)A \right\rfloor \Delta = 0.$$
(15)

The coupling of perturbations to the oscillation $\exp(i\omega t)$ induces higher frequency harmonics. The general solution for Δ is

$$\Delta = e^{-i\Omega t} \sum_{k=-\infty}^{+\infty} a_k e^{ik\omega t}.$$
 (16)

The stability is determined by the spectrum of perturbations Ω . In the framework of the Floquet theory,⁴⁰ we call Im(Ω) the Floquet exponent. The uniform solution is stable if and only if the largest Floquet exponent is negative; i.e., Im(Ω) < 0. One may easily identify Im(Ω) as a relaxation time and Re(Ω) as an energy gap of perturbations.

To obtain Ω , we plug Eq. (16) into Eq. (15) and compare each frequency component. Then we have the following linear equations for the coefficients a_k :

$$-(k\omega - \Omega)^2 a_k + i(k\omega - \Omega)\beta a_k + \frac{1}{2}(a_{k-1} + a_{k+1}) - \frac{A}{2i}(a_{k-2} - a_k) = 0.$$
(17)

The existence of the nonzero solution of a_k requires that the determinant of the coefficient matrix vanishes, det $\mathbf{D} = 0$ with

$$\mathbf{D} = \begin{pmatrix} \cdots & \cdots & \cdots & \cdots & \cdots & \cdots & \cdots \\ -\frac{A}{2i} & \frac{1}{2} & c_{-1} & \frac{1}{2} & 0 & 0 & 0 \\ 0 & -\frac{A}{2i} & \frac{1}{2} & c_{0} & \frac{1}{2} & 0 & 0 \\ 0 & 0 & -\frac{A}{2i} & \frac{1}{2} & c_{1} & \frac{1}{2} & 0 \\ 0 & 0 & 0 & -\frac{A}{2i} & \frac{1}{2} & c_{2} & \frac{1}{2} \\ \cdots & \cdots & \cdots & \cdots & \cdots & \cdots \end{pmatrix}$$
(18)

and $c_k = -(k\omega - \Omega)^2 + i(k\omega - \Omega)\beta + A/(2i)$. The solution gives the spectrum of the perturbation.

In the region of $\omega \gg 1$, the frequency modes with $k = 0, \pm 1$ are dominant and higher harmonics may be truncated. We obtain a second-order equation for Ω :

$$\Omega^{2} + i\beta\Omega = \frac{A}{2i} + \frac{1}{2\omega^{2}} = \frac{C_{s}N}{(C_{s}N+1)}\frac{1}{2\omega^{2}},$$
 (19)

with solutions

$$\Omega = \frac{-i\beta \pm \sqrt{-\beta^2 + \frac{2C_s N}{(C_s N + 1)\omega^2}}}{2}.$$
 (20)

We see that the uniform oscillations are always stable for nonzero C_s in the region of $\omega \gg 1$. In the limit $\omega \approx I_B/\beta \rightarrow \infty$, the largest Floquet exponent approaches zero, and the solution becomes neutrally stable.

Near the stability boundary where the largest Im(Ω) changes sign, one has to keep higher harmonics in Eq. (16) because $\omega \sim 1$. But for $C_s N \gg 1$, one can still use the linear expansion in Eq. (12). Under these conditions, the stability boundary can be determined by the numerical calculation of det $\mathbf{D} = 0$.

B. The Floquet theory

Equation (10) can also be interpreted as a particle moving in a periodic potential with period T. Then we can apply the Floquet theorem (Bloch theorem) to extract the exponents. The solution has the form

$$\Delta(t) = \exp(\lambda_1 t) y_1(t) + \exp(\lambda_2 t) y_2(t), \qquad (21)$$

where $y_1(t)$ and $y_2(t)$ are periodic functions with period *T*, and the exponents λ_1 and λ_2 follow $\lambda_1 + \lambda_2 = -\beta$ according to the Floquet theorem.⁴⁰ When no dissipation is present $\beta =$ 0, the dynamics is time reversal and $\lambda_1 + \lambda_2 = 0$. When the dissipation is involved, the volume of phase space is shrinking with a rate β ; thus the two exponents follow $\lambda_1 + \lambda_2 = -\beta$.

The exponents can be computed numerically as follows. We first calculate the trajectory of ϕ_0 in Eq. (8). Then we calculate two trajectories of $\Delta_a(t)$ and $\Delta_b(t)$ with two different initial conditions $\Delta_a(t_0) = 0$, $\dot{\Delta}_a(t_0) = 1$ and $\Delta_b(t_0) = 1$, $\dot{\Delta}_b(t_0) = 0$. These two trajectories obey⁴⁰

$$\begin{pmatrix} \Delta_a(t+T), & \Delta_b(t+T) \\ \dot{\Delta}_a(t+T), & \dot{\Delta}_b(t+T) \end{pmatrix} = \mathbf{F}(T) \begin{pmatrix} \Delta_a(t), & \Delta_b(t) \\ \dot{\Delta}_a(t), & \dot{\Delta}_b(t) \end{pmatrix},$$
(22)

with **F** being a coefficient matrix, which can be evaluated by inverting Eq. (22) because the trajectories of Δ_a and Δ_b are known. λ_1 and λ_2 are just the eigenvalues of the matrix **F**. We



FIG. 2. (Color online) The largest Floquet exponent calculated by det $\mathbf{D} = 0$ with \mathbf{D} given by Eq. (18) (red line), and by numerical calculation using the Floquet theory in Eq. (21) (symbols). For the exponent smaller than 0, the uniform oscillations are stable.

have compared the results obtained by Eq. (22) and those by analytical calculations. Both methods give consistent results as shown in Fig. 2.

C. Stability diagram

The stability analysis above does not tell us what the final state is when the uniform solution becomes unstable. To answer this question, we solve Eqs. (5) and (6) with $I_{k}^{n} = 0$ directly by numerical simulation. The stability diagram then is constructed, and is depicted in Fig. 3. For a sufficiently large I_B thus $\omega \gg 1$, the uniform solution is stable as described by Eq. (20). For a small β , upon decreasing I_B , the uniform oscillations become unstable below the retrapping current $I_r < I_c$ and the system evolves into zero-voltage state. For a large β , the uniform oscillation loses stability at $I_s > I_c$, where no zero-voltage state is available for the system to go to. In this case, the system becomes partially synchronized with a fraction of junctions oscillating in-phase, while the others do out-of-phase oscillation. When I_B is reduced further, the partial synchronization becomes unstable and the system is retrapped into the zero-voltage state at $I_B = I_c$.

Let us discuss the transition from the complete synchronization to the partial synchronization when β is large. To characterize the partially synchronized state, we introduce the order parameter which is widely used in the literature:³⁰

$$r(t)\exp[i\theta(t)] = \frac{1}{N}\sum_{j}^{N}\exp(i\phi_{j}).$$
 (23)

Here *r* is positively defined. We compute the average of r(t),

$$\langle r \rangle = \frac{1}{t_f} \int_0^{t_f} dt \ r(t), \tag{24}$$

and take $t_f \to +\infty$.

The *I*-*V* and the corresponding order parameter are shown in Fig. 4. When the complete synchronization becomes unstable, a sharp jump of voltage is observed, associated with decrease



FIG. 3. (Color online) Stability diagram of the uniform solution in the absence thermal fluctuations. Light blue/pink/orange region denotes complete synchronization/zero-voltage state/partial synchronization. The blue line is the stability boundary of the uniform solution calculated by the Floquet theory I_s , and the open red circle is the retrapping current I_r determined by direct calculations of Eqs. (5)–(7). The dashed line shows the retrapping current determined by Eq. (8) while the dotted line shows the retrapping current for a single junction. Here $C_s = 3/N$.

of the order parameter. The reduction of voltage when the system becomes partially synchronized can be understood as follows. At a given voltage, the shunt capacitor reduces the plasma oscillation amplitude depending on the number of the synchronized junctions, as described by Eq. (13). For the uniform oscillations, the suppression is largest and the dc current induced by the Josephson oscillation is reduced significantly according to Eq. (14). For the partial synchronized oscillations, the dc current is larger than that of the uniform oscillations. Therefore when one biases the array with a fixed current, the voltage of the uniform state increases compared with that in the partial synchronized state.



FIG. 4. (Color online) *I-V* curve (black) and dependence of the order parameter on the voltage (red) for $\beta = 2.0$ and $C_s = 3/N$.

D. Retrapping current

According to Eqs. (13) and (14) the amplitude of the Josephson oscillation increases with decreasing I_B . To achieve the strongest oscillation, one would like to know how small a current one can achieve in order to support the resistive state.

For a single junction, the dynamics is equivalent to a particle sliding down in the damped inclined washboard potential. It shows hysteretic behavior for small β ; i.e., the system remains resistive even when $I_B < I_c$. The system evolves into the superconduction state at a current $I_r > 0$, where the input power is insufficient for the phase particle to move in the damped tilted washboard potential. The retrapping current for a weak damping is given by $I_r \approx 1.48\beta$.⁴¹ On the other side, the dynamics becomes overdamped for a large β , and the system comes back to the zero-voltage state once $I_B < I_c$. The dependence of I_r on β for a single junction is shown by the dotted curve in Fig. 3.

For the junction array shown in Fig. 1, if the uniform solution is always stable in the whole current region, the retrapping current will be the same as in a single-junction case with an effective $\beta' = \beta/\sqrt{C_s N + 1}$ normalized by the shunt capacitor (dashed line in Fig. 3). In fact, the uniform solution loses stability at I_s (blue line in Fig. 3) and the system evolves into the zero-voltage state. Therefore I_s is the genuine retrapping current for the present junction array, and can be measured experimentally.

How does one decrease I_s , or is it possible to shift the stability boundary in Fig. 3 leftward? One recalls that the shunt capacitor induces interaction between junctions. By increasing the coupling constant C_s , one would expect that the stable region enlarges and the stability boundary shifts leftward. We study the dependence of I_s on C_s , and the results are presented in Fig. 5. For $\beta \gtrsim 0.5$, the retrapping current decreases with C_s , while it increases with C_s for smaller β . A qualitative picture for this unexpected nonmonotonic dependence is as follows.



FIG. 5. (Color online) Dependence of the boundary retrapping current I_r on the shunt capacitance for several β 's. Lines are obtained with the Floquet theory and symbols are direction simulations of Eqs. (5)–(7). The region above the line corresponds to the uniform oscillations while zero-voltage state below the line. Here N = 200.



FIG. 6. (Color online) *I*-*V* curves for (a) $\beta = 0.02$ and (b) $\beta = 1.0$ for several typical values of C_s . Here N = 200.

Equations (8) and (10) with $C_s = 0$ can also describe the stability of the resistive state for a single junction, where the retrapping current is enhanced by the dissipation as shown by the dotted line in Fig. 3. We rewrite Eq. (8) to a form equivalent to the single junction case by rescaling the time $t \leftarrow \sqrt{NC_s + 1}t'$, and with an reduced dissipation $\beta' = \beta/\sqrt{NC_s + 1}$. The dynamics of the perturbations Eq. (10) then acquire a form

$$\frac{1}{NC_s+1}\ddot{\Delta} + \beta'\dot{\Delta} + \cos(\phi_0)\Delta = 0.$$
(25)

Thus the presence of a shunt capacitor reduces both the effective mass of perturbations and the damping coefficient. The reduction of the mass makes the system more vulnerable to the oscillatory potential $\cos(\phi_0)\Delta^2/2$ and therefore tends to increase the retrapping current. For the junction array with weak damping, the effect of the reduction of mass dominates and the retrapping current is increased by the shunt capacitor. On the other hand, for the junction array with strong damping, the reduction of the damping by the shunt capacitor dominates and the retrapping current is decreased.

The *I-V* curves for several typical values of C_s are shown in Fig. 6. As seen in the figure, the *I-V* curves with $C_s = 0$ deviate from the asymptotic linear behavior $I_B \approx \omega/\beta$ at small ω , which indicates strong plasma oscillations according to Eq. (14). For $\beta = 0.02$ the *I-V* curves in Fig. 6(a) behave differently near the trapping point for $C_s = 0$ and for nonzero C_s , where in the latter case the *I-V* is linear down to the retrapping current. This linear dependence near the retrapping point with $\omega \sim 1$ is due to the suppression of the oscillation amplitude by the shunt capacitor C_s . However, for $\beta = 1.0$ the *I-V* curves remain nonlinear near the retrapping point even for the same C_s . For a large β , the retrapping voltage is much smaller than that of small β and thus results in stronger plasma oscillations.

E. RC circuit

In real devices, the shunt circuit also carries finite resistance. We perform similar analysis of the stability diagram and the retrapping current, when a resistor with resistance R is serially connected to the capacitor in the load circuit. A new term $\dot{Q}R$ should be added to the right-hand side of Eq. (6).

The resulting stability diagram is qualitatively the same as Fig. 3. For a given *R*, the retrapping current increases with C_s for a small β while decreasing for large β , as depicted in Fig. 7.



FIG. 7. (Color online) Same as Fig. 5 but with a shunt RC circuit. Parameters are indicated in the figures.

Comparing Fig. 7 with Fig. 5, we can see that the shunt resistor increases the retrapping current, because the dissipation of the system is increased by the resistor.

F. LRC circuit

Another interesting case is an array of Josephson junctions shunted by a LRC circuit, which introduces a characteristic frequency $\omega_c = 1/\sqrt{L_s C_s}$. The LRC circuit can represent the cavity intrinsically formed by the single crystal of BSCCO.^{12,13,42,43}

The stability of the uniform oscillations can be obtained similarly. We consider the case with $\omega \gg 1$ and $\beta \ll 1$ so the analysis in Sec. III A is applicable. The dynamics for small perturbations is still given by Eqs. (10) and (12) with a modified amplitude

$$A = \frac{l}{-\omega^2 + i\beta\omega - \frac{N\omega^2}{L_s(\omega_s^2 - \omega^2) + \omega iR}}.$$
 (26)

The stability is determined by Eq. (19) and the results are shown in Fig. 8. When $\omega \ll \omega_c$, the LRC circuit behaves as a RC circuit, which always stabilizes the uniform solution for a small *R* as given by Eq. (20). On the other hand, for $\omega \gg \omega_c$, the LRC circuit behaves as a LR circuit which makes the uniform solution unstable for a large L_s . When $\omega \sim \omega_c$, the stability depends on the quality factor *R* of the LRC circuit. A small quality factor (large *R*) makes the synchronization difficult.

IV. EFFECT OF THERMAL NOISE

Real circuits inevitably involve noise because of resistivity caused by quasiparticles. This leads to diffusive dynamics in the phase space and destroys the synchronization at a certain critical point. To study the effect of noise, knowledge of attractors in the phase space is necessary. An attractor attracts trajectories nearby and the volume of phase space that the attractor attracts defines the basin of attraction of the attractor. The phase space is covered by basins of attraction and the boundary between basins of attraction is called the



FIG. 8. (Color online) Stability of the uniform oscillations when an array of Josephson junctions are shunted by an LRC circuit. The regions below lines are stable.

separatrix. For a small β , we have already identified two attractors with one being the zero-voltage state, and the other uniform-oscillation state. For a large β , an additional attractor with partial synchronous oscillations appears.

Suppose the system is initially at the uniform-oscillation state, and then we turn on thermal noise. The noise perturbs the system away from the uniform state. However, the deviation from the attractor is penalized by the action S. The comparison of the action S for the system moving from the attractor to the separatrix with the noise strength defines three distinct regions:

(1) $k_b T \ll S$. In this case the possibility of thermal escape is extremely small and this region is described by the reactionrate theory.⁴⁴ Especially, when the thermal activation between two attractors a and b is asymmetric, that is, the action $S_a \gg$ S_b , the system will spend a much longer time in the attractor b. This is the situation of retrapping from resistive state to zero-voltage state for small $\beta \ll 1$ discussed before. When the bias current I_B is close to the retrapping current $I_B - I_r \ll 1$, the resistive state is about to lose stability. So the presence of weak noise will destabilize the resistive state and the system evolves into the zero-voltage one. On the other hand, the energy barrier for the system to transform from zero-voltage state to resistive one again is large when $I_B \ll I_c$, and the noise is not strong enough to promote such a transition. So the system remains zero voltage. Thus the thermal noise increases the retrapping current.45

(2) $k_b T \gg S$. In this region the thermal energy is large enough to kick the system off the attractor of the coherent oscillation, and the synchronization is destroyed. The temperature at which the synchronization is destroyed is the synchronization-desynchronization transition temperature T_m .

(3) For $T < T_m$, the uniform oscillations survive. The noise current excites perturbations and the system frequently deviates from the attractor. The dynamics of the perturbations are described by Eq. (9). These perturbations broaden the linewidth of the frequency spectrum. The linewidth at $\omega \gg 1$ can be estimated as follows. For $\omega \gg 1$, the *I*-V is linear, so



FIG. 9. (Color online) Dependence of the order parameter on temperature with different system sizes. Inset is a double-logarithm plot of the reduced temperature $T_m - T$ and order parameter. Here $I_B = 1.5$, $\beta = 1.0$, and $C_s = 3.0/N$.

the noise current I^n induces a noise voltage I^n/β . From the ac Josephson relation $\partial_t \phi = 2eV/\hbar$, one easily obtains that the linewidth increases linearly with *T* for Gaussian white noise.

In the presence of noise, the equations of motion become stochastic, and it is natural to describe the dynamics in term of a probability density in the phase space. The flow of the probability density is governed by the Fokker-Planck equation. However analytical calculations of the coupled nonlinear partial differential Fokker-Planck equation is difficult. In this section we will use numerical simulations as the main workhorse, and we will also provide qualitative analysis to understand the numerical results. We first consider the desynchronization transition of the synchronous state and the critical behavior at the transition. We then find a correlation between the largest Floquet exponent and the transition temperature. Finally a stability diagram of the uniform oscillations with respect to noise is constructed.

A. Synchronization-desynchronization transition

To study the synchronization-desynchronization transition, we evaluate the order parameter defined in Eqs. (23) and (24), and its standard deviation

$$\sigma_r = \langle r^2 \rangle - \langle r \rangle^2, \tag{27}$$

which is similar to the susceptibility defined in spin systems.

We solve numerically Eqs. (5), (6), and (7), and derive $\langle r \rangle$ and σ_r at different *T*. The results are presented in Figs. 9 and 10. We also check the finite-size effect with different *N*'s. The finite size effect is prominent around T_m . The synchronized oscillations are continuously suppressed by the thermal fluctuations. At T_m the synchronized oscillations become unstable, and the system undergoes a continuous transition into random oscillations. Since σ_r serves as a measure of the fluctuation effect, it reaches maximum at T_m , as shown in Fig. 10. Practically σ_r provides a convenient way to determine T_m especially for a small system where the transition is obscured by the finite-size effect.



FIG. 10. (Color online) Dependence of the fluctuations σ_r on the temperature. Here $I_B = 1.5$, $\beta = 1.0$, and $C_s = 3.0/N$.

Once we identify the desynchronization transition as a critical phenomenon, we can define the exponent

$$\langle r \rangle \sim (T_m - T)^{\beta_c}.$$
 (28)

In Fig. 9, we obtain $\beta_c \approx 1/2$ which is consistent with the mean-field theory.

We then study which factors determine T_m and how to enhance T_m . As discussed at the beginning of this section, T_m is given by the action for the system moving out of the attractor. Thus knowledge about the whole basin of attraction is needed. However, it is still conceivable that the local slope near the attractor may to a certain extent reflect the global structure of the basin. The local slope is just the largest Floquet exponent obtained in the previous section. Therefore one expects that the smaller the exponent, the higher the T_m . We find numerically that this is indeed the case, as shown in Fig. 11.

The correlation between the largest Floquet exponent and T_m can be understood in terms of the local stability analysis. The small perturbations to the uniform oscillation decay $\tilde{q} \sim \exp(\lambda_2 t)$ with $\lambda_2 < 0$ being the largest Floquet exponent. This is equivalent to the relaxation of a particle in the parabolic potential $\partial_t \tilde{q} = -\partial V/\partial \tilde{q}$ with $V(\tilde{q}) = -\lambda_2 \tilde{q}^2/2$. The slope $-\lambda_2 > 0$ measures the depth of the potential. Thus it is more robust against noise for a larger $-\lambda_2$.

B. Stability phase diagram with noise

Based on the previous analysis, we discuss the stability phase diagram of the synchronization in the presence of thermal noise. For a given C_s , when the bias current is increased, the system approaches the synchronous state, where the associated Floquet exponent changes from positive to negative at the stability boundary. If the current increases further, it reaches the maximal value $-\beta/2$. For a sufficient large current, the system becomes neutral stable according to Eq. (20). Therefore the critical temperature first increases and then decreases with the current. The corresponding stability diagram is shown in Fig. 12(a). Meanwhile, the shunt capacitance plays a role of coupling strength, so T_m increases with C_s . Keep in mind that the current at the stability boundary is the retrapping current. At a given T, the retrapping current increases with C_s for a small β , while it decreases for a large β . Based on these observations, we construct the phase diagram of the coherent oscillations for a given β , which is sketched in Fig. 12(b). The region enclosed with the green surface represents a stable synchronization.

To enhance T_m a larger β is helpful since the maximal Floquet exponent is $-\beta/2$. One should also adjust the current accordingly to ensure that the maximum is reached. For a



FIG. 11. (a1), (b1), and (c1): Dependence of T_m on the bias current, shunt capacitance, and β , respectively. (a2), (b2), and (c2) are the corresponding largest Floquet exponent. Other parameters used are shown in the figure.



FIG. 12. (Color online) Possible stability diagram of the uniform solution (a) at a given C_s , and (b) at a given β . The region inside the green surface corresponds to stable uniform oscillations.

given operating frequency, one may increase C_s to enhance the thermal stability, at sacrifice of the oscillating amplitude.

V. DYNAMIC RELAXATION

So far we have concentrated on the stability of the uniform oscillation, and investigated the dynamics of perturbations around the uniform state. However, in most applications, the initial condition cannot be guaranteed as the state of uniform oscillations. For instance, when we ramp up the current and bias all junctions in the resistive state, the initial state may be far away from the uniform state in the phase space. Therefore it is important to understand how the system approaches the uniform state. In the present study, we focus on the relaxation from the disordered state (all junctions oscillate out-of-phase) into the ordered state (all junctions oscillate uniformly). For a system whose final ordered state is in *equilibrium*, this is a phase-ordering phenomenon. The kinetics of phase ordering has been extensively studied decades ago in spin systems, and they can be described by universal scaling behavior.⁴⁶ However the relaxation dynamics is not very clear when the final state is *out of equilibrium*.

To reach the uniform state, the initial state must be in the basin of attraction of the uniform state. This can be realized by operating all junctions at the resistive state. We prepare the initial state with arbitrary nonzero $\langle r \rangle \ll 1$. We also give initial velocity to all junctions; as such the system falls into the basin of attraction of the uniform state. Let us first consider dynamical relaxation obtained by computer simulation. We introduce the distribution of the phase difference between junctions

$$P(\phi) = \sum_{i,j} \delta(\phi - \Delta_{ij})$$
(29)

with $\Delta_{ij} = \phi_i - \phi_j$. The time evolution of $P(\phi)$ is depicted in Fig. 13. Initially the distribution is flat indicating a disordered phase. This flat distribution does not change with time too much at the beginning, but then it suddenly becomes sharp. Finally it reaches a steady distribution with finite width depending on the temperature.

A qualitative picture of the relaxation can be obtained based on the local stability analysis presented in Sec. III. Suppose we have a small synchronized cluster of junctions with population N_i and the rest of the junctions oscillate randomly. This small cluster serves as a seed of the nucleation and delivers energy into the shunt capacitor, which in turn attracts nearby outof-phase oscillators into the cluster. The growth rate of the synchronized population can be estimated by the local stability analysis by replacing N with n(t), where n(t) is size of the cluster at time t. The time evolution of the population of the cluster follows

$$n(t+dt) = n(t)\exp(-\lambda dt) \approx n(t)[1-\lambda(n)dt], \quad (30)$$



FIG. 13. (Color online) Time evolution of the distribution of phase difference Eq. (29), starting from completely random state at several temperatures. Here $\beta = 0.02$, $I_B = 1.5$, and $C_s = 3/N$.



FIG. 14. (Color online) (a) Dependence of the relaxation time on the system size with different temperatures. Symbols are numerics and lines are the best fitting. (b) Dependence of the relaxation time on the temperature with the system size of N = 200 and with different shunt capacitance. (c) Speedup of the relaxation by increasing the shunt capacitance. Here the system size is N = 200 and temperature T = 0.002. All these results are obtained with $\beta = 0.02$ and $I_B = 0.15$.

where dt is a small time step and $\lambda(n) < 0$ is the largest Floquet exponent with cluster size of n. Then the time required for the system to achieve global synchronization is

$$\tau_g = -\int_{N_i}^N dn \frac{1}{n\lambda(n)}.$$
(31)

Several observations are in order. First, the synchronization time τ_g increases with the total number of junctions N. Second, since $\lambda(n) < 0$ decreases monotonically with n and then saturates at $-\beta/2$ [see Eq. (20)], the initial relaxation is slow and it gradually speeds up, in accordance with Fig. 13. Third, in the presence of thermal fluctuations, thermal noise may kick oscillators out of the synchronized cluster. Thus the increase rate is reduced and the relaxation time increases.

To quantify the relaxation process, we define the linear relaxation function 4^{47}

$$A(t) = \frac{\langle r(t) \rangle - \langle r(\infty) \rangle}{\langle r(0) \rangle - \langle r(\infty) \rangle}.$$
(32)

It starts from unity at t = 0 and decays to 0 in the steady state. The relaxation time is defined as

$$\tau = \int_0^\infty A(t)dt.$$
 (33)

For an exponential decay, the definition above is equivalent to the conventionally defined relaxation time. Two-stage relaxation for A(t) is found at T = 0. First *r* increases from 0 to a value close to 1, where the local stability theory applies. Then the system relaxes into the ordered state exponentially with the exponent given by the Floquet exponents. Thermal fluctuations smear the distinction of the two-stage relaxation. We numerically calculate A(t) and compute τ . The dependence of τ on the number of junctions N, temperature, and shunt capacitor is plotted in Fig. 14. τ increases with N as expected from the qualitative estimate above. Furthermore the relaxation time follows a power law $\tau \sim N^{z'}$. The exponent z'(T) increases with T. τ increases with temperature. At T_m it diverges and then drops. (The relaxation time above T_m is not very meaningful because the final state is also disordered.) Critical behavior is also identified for τ near T_m . On the other hand, τ decreases with C_s which suggests a practical way to speed up the relaxation. This can be explained by regarding C_s as a coupling strength of the system. A larger C_s therefore increases the rigidity of the uniform solution.

VI. CONCLUSION

In short, we have studied the synchronization of a onedimensional array of point Josephson junctions coupled to a shunt capacitor. In the case of a noise-free system, a stability phase diagram of the uniform oscillation is constructed. For strong damping, after the uniform solution becomes unstable, the system evolves into a partially synchronized state. When the bias current is reduced below the Josephson critical current, the system becomes zero voltage. For weak damping or moderate damping, after the instability of the uniform solution, the system evolves into the zero-voltage state. At transition the current is the experimentally measurable retrapping current. The retrapping current is increased by the shunt capacitor for weak damping ($\beta \leq 0.5$), while it decreases for moderate and strong damping ($\beta \gtrsim 0.5$). Thus transport measurement provides a convenient probe of the underlying dynamics. Similar results are obtained when a resistor is serially connected to the shunt capacitor.

In the presence of strong thermal noise, the coherent oscillation is destroyed through a second-order phase transition. The critical exponent for the order parameter is 1/2 in accordance with the mean-field theory. We also find the fluctuations of the order parameter r showing a maximum at the transition, which may serve as a convenient quantity to locate the transition temperature. For a smaller relaxation time in the case of weak perturbations, the transition temperature is higher. The results suggest several possible ways to enhance the thermal stability.

The dynamic relaxation from a disordered phase to ordered state is then investigated. The relaxation time increases with the system size by a power law. It also increases when the system approaches the transition temperature from below. One may speed up the relaxation with a larger shunt capacitance.

Finally, a possible phase diagram of the uniform solution is proposed when thermal fluctuations are involved. Our results are of importance for the design of useful superconducting devices based on Josephson junction arrays.

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