Localization and subdiffusive transport in quantum spin chains with dilute disorder

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It is widely believed that many-body localization in one dimension is fragile and can be easily destroyed by thermal inclusions; however, there are still many open questions regarding the stability of the localized phase and under what conditions it breaks down. Here I construct models with dilute disorder, which interpolate between translationally invariant and fully random models, in order to study the breakdown of localization. This opens up the possibility to controllably increase the density of thermal regions and examine the breakdown of localization as this density is increased. At strong disorder, the numerical results are consistent with commonly used diagnostics for localization even when the concentration of thermalizing regions is high. At moderate disorder, I present evidence for slow dynamics and subdiffusive transport across a large region of the phase diagram, suggestive of a "bad metal" phase. This suggests that dilute disorder may be a useful effective model for studying Griffiths effects in many-body localization, and perhaps also in a wider class of disordered systems.

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I. INTRODUCTION

The study of many-body quantum systems which fail to thermalize is a major frontier in modern condensed matter physics, and by now there are many examples of scenarios where thermalization may be avoided, most commonly through the addition of some form of disorder [1–9], but also even in a variety of disorder-free systems [10–18]. Similar effects can even be achieved even by preparing certain systems in finely tuned initial states without any form of disorder, as in the case of quantum many-body scars [19].

The focus of this work is many-body localization [4–9], the interacting variant of Anderson localization [1,2] where an isolated many-body quantum system can become localized at all energy scales via the addition of a random onsite chemical potential or magnetic field [3]. Recent years have seen huge progress in understanding many-body localization, particularly from the point of view of local integrals of motion [7,20–25], as well as in establishing under what conditions it can and cannot exist. Remarkably, there is even a class of spin chains for which an analytical proof of many-body localization exists [6], subject to the assumption of limited level attraction, which is widely considered to be a reasonable assumption. Behavior consistent with many-body localization has been experimentally observed in a variety of one- and even two-dimensional systems [26–32], though its stability remains under intense discussion. In particular, it is widely believed that many-body localization is stable only in one-dimensional systems with short-range couplings, as otherwise localization has been argued to be unstable due to what is now known as the avalanche effect, where rare regions of anomalously low disorder can form ergodic bubbles which can grow and eventually cause the entire system to thermalize [33].

Recently, however, the stability of many-body localization even in one dimension has come into question, with some works suggesting that the localization transition takes place at a much higher disorder strength than previously expected [34], and others suggesting that there may be no transition at all in the thermodynamic limit [35-39]. It is therefore of great interest to study in more detail the breakdown of many-body localization and characterize just how robust this phase really is. Whether or not it constitutes a stable phase in the thermodynamic limit, it is clear that upon increasing the disorder strength the relaxation dynamics of the system enters a regime that either does not thermalize at all, or does so only on extremely long times. In the following I shall refer to this regime as "many-body localized," and to the onset of these slow dynamics as the "many-body localization transition." In particular, there has been a great deal of work studying the transport properties close to the many-body localization (MBL) transition, with a large body of evidence pointing towards the presence of a Griffths-type subdiffusive regime and other anomalous transport properties both in microscopic models of many-body systems [40-46] and proxy models which investigate MBL via Anderson localization in Fock space [47–54]. Gaining further insights these anomalous transport properties could lead to an improved understanding of the many-body localization transition itself.

In this work I take a different approach to studying the breakdown of the many-body localized phase. I construct a model in which homogeneous thermalizing regions can be controllably added, and ask what happens to many-body localization as the density of these thermalizing regions is varied. Previous work [33,55] has suggested that rare thermalizing regions should play a key role close to the transition. These models allow us to investigate the effects of both rare thermal regions and rare impurities, which in one dimension can form large bottlenecks that can have a significant effect on the transport properties of the system, even if the majority

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of lattice sites are in locally ergodic regions. This form of disorder may be a useful toy model for Griffiths effects [56] and rare region physics that are believed to play an important role in the many-body localization transition in systems with conventional random disorder [50,57], as well as in other paradigmatic examples of disordered phases of matter such as the Bose glass [58].

II. MODEL

I will focus on the XXZ model of strongly interacting spins in one dimension with nearest-neighbor interactions, subject to two different choices of onsite potential. The Hamiltonian for a chain of length L with open boundary conditions is given by

$$H = \sum_{i} h_{i} S_{i}^{z} + J_{0} \sum_{i} \left(S_{i}^{x} S_{i+1}^{x} + S_{i}^{y} S_{i+1}^{y} \right) + J_{z} \sum_{i} S_{i}^{z} S_{i+1}^{z}.$$

$$\tag{1}$$

In the following, all Hamiltonian parameters will be measured in units of $J_0 = 1$, and I will set $J_z = J_0$. All calculations will be performed in the zero magnetization sector. I shall consider the onsite terms h_i drawn from two different distributions. The first case, which I shall call dilute random disorder, is described by a potential which is randomly chosen to be either equal to a uniform value or drawn randomly from a box distribution of width 2d:

$$h_i = \begin{cases} 1, & \text{with probability } (1-p) \\ \in [-d, d], & \text{with probability } p. \end{cases}$$
 (2)

In the limit $p \to 1$, this model reduces to the "standard model" of MBL, namely, a fully random system with a completely disordered onsite potential, which has been widely studied in the literature and its properties are by now well established [59–62]. In the opposite limit of $p \to 0$, the model instead becomes a translationally invariant integrable system, the properties of which are also well established. By varying p, it is possible to interpolate between these two limits and examine at which point localization breaks down. For a given value of p, the chance of a region of length L which is completely homogeneous decays exponentially with the length of the region, and is given by $(1-p)^L$. Conversely, the chance to find a region of length L which is entirely random is p^L , and for p = 0.5 at fixed L both types of region are equally likely to occur. The expected size of the largest disordered region is given by $R_L(p) \approx \log_{1/p}[L(1-p)] =$ $\log[L(1-p)]/\log(1/p)$, however, due to the skewness of the distribution, the largest disordered region can in fact be much larger than this expectation might suggest [63]. Further details on the distribution of rare regions are given in the Appendix. It is important to note that by the nature of random systems, it is possible (indeed, inevitable) that these random regions can themselves include rare regions of anomalously low disorder which are approximately homogeneous and consequently favor thermalization, however, I will not consider the effect of these regions in detail here. Note that while the homogeneous regions would in isolation be integrable, as a consequence of the disorder-free XXZ model also being integrable, this is not expected to have a significant effect except in the limit of $p \to 0$, similarly to the $d \to 0$ limit of the conventionally disordered XXZ chain.

The second case, which I shall call dilute binary disorder, is similarly dependent on a probability p but in this case can take only two values, denoted W_0 and d:

$$h_i = \begin{cases} W_0, & \text{with probability } (1-p) \\ d, & \text{with probability } p. \end{cases}$$
 (3)

For p=0.5, this reduces to a straightforward bimodal distribution (similar to others studied in the context of MBL [64]), while in the limits $p\to 0$ and $p\to 1$ the model is translationally invariant and integrable. We can anticipate that the choice p=0.5 will be the most likely value to host a stable localized phase, however, we shall see later that in fact the hallmarks of localization exist over a wider region of parameter space than one might expect. In the following I set $W_0=1$ throughout, and vary d.

The effects of dilute regions have been studied previously in the context of MBL in the case of both rare strongly disordered impurities [38] and small thermalizing regions [65,66] or baths [39,67]; however, this work takes a somewhat different approach. Rather than studying the effect of a single anomalous region on the rest of the spin chain, as in previous works, here I look at the effect of changing the density of such thermalizing regions in a way that aims to mimic Griffiths-type effects close to the localization transition. In particular, here the transition will be driven by tuning the distribution of thermalizing regions, rather than by tuning the bandwidth of the disorder distribution (i.e., disorder strength) as is more conventionally done. This provides a controllable way of introducing the resonant regions which are critical for the many-body delocalization transition [33].

III. METHODS

I will employ full exact diagonalization using the QUSPIN package [68,69], and will examine both the nonequilibrium dynamics and the level-spacing statistics. Both are considered standard measures of localization effects in many-body quantum systems. In all of the following, the exact diagonalization results have been averaged over a minimum of $N_s = 512$ disorder realizations (with up to $N_s = 4096$ for the smallest system sizes used in this work).

The first quantity of interest is the disorder-averaged level-spacing ratio, which is by now a standard measure of investigating localization and chaos in quantum systems [70]. It is defined as

$$\delta_{\alpha} = |\varepsilon_{\alpha} - \varepsilon_{\alpha+1}|,\tag{4}$$

$$r_{\alpha} = \min(\delta_{\alpha}, \delta_{\alpha+1}) / \max(\delta_{\alpha}, \delta_{\alpha+1}),$$
 (5)

where the ε_{α} are the energy eigenvalues and δ_{α} is the difference between successive energy levels. This quantity takes the value $r\approx 0.53$ in a delocalized phase (following Wigner-Dyson statistics, indicative of level repulsion), and $r\approx 0.39$ in a localized phase (following Poisson statistics, indicative of a random distribution of energy levels).

I will investigate the nonequilibrium dynamics of the imbalance following a quench from a Néel state of the form $|1010...\rangle$, where $|1\rangle = |\uparrow\rangle$ and $|0\rangle = |\downarrow\rangle$. The imbalance

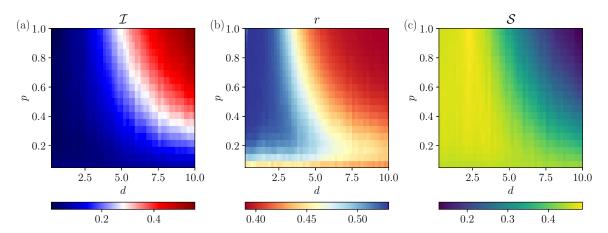


FIG. 1. Numerical results for the case of dilute random disorder, for a system size L=14 and averaged over $N_s=512$ disorder realizations. (a) The imbalance \mathcal{I} long after a quench ($tJ_0=10^3$) from a Néel state. (b) The averaged level-spacing statistics r, which vary from $r\sim0.39$ in a localized phase to $r\sim0.53$ in an ergodic phase. (c) The long-time behavior of the entanglement entropy \mathcal{S} , again at a time $tJ_0=10^3$ following a quench. In all plots, the upper left corner is chaotic, while the upper right corner is localized. The lower left corner is chaotic, except for close to p=0 where integrability is approximately restored. The lower right corner exhibits a small persistent imbalance, level statistics that are close to Poisson, and an entanglement entropy that grows slower than expected in a chaotic system. All of these are suggestive of a "bad metal" regime existing over an extended region of the phase diagram.

(staggered magnetization) is defined as

$$\mathcal{I}(t) = \frac{1}{L} \sum_{i} (-1)^{i} \langle S_{i}^{z}(t) \rangle \tag{6}$$

such that $\mathcal{I}(0)=\frac{1}{2}$ and it decays in time. This observable gives us an idea of how much "memory" of its initial state the system has. In order to further investigate the character of the transport on the delocalized side of the transition, I will also compute the infinite-temperature dynamical correlation function

$$C_i(t) = 4\langle S_i^z(t)S_i^z(0)\rangle. \tag{7}$$

The thermal expectation value of an observable O is defined as $\langle O \rangle = \text{Tr}[\exp(-\beta \mathcal{H})O]/\text{Tr}[\exp(-\beta \mathcal{H})]$, where $\beta = 1/T$ is the inverse temperature. In the limit of infinite temperature, this becomes $\langle O \rangle = \text{Tr}[O]/D$, where D is the Hilbert space dimension. It has been shown, however, that rather than performing the trace over all basis states, we can make use of *dynamical quantum typicality* [71–78] to replace this with an expectation value with respect to a single randomly chosen pure state of the form $|\psi\rangle = C\sum_k (a_k + ib_k)|\phi_k\rangle$, where C is a normalization constant, a_k and b_k are chosen randomly from Gaussian distributions of mean zero¹, and the $|\phi_k\rangle$ are the basis states. This state can be considered a "typical" state of the desired ensemble, and the properties of this state representative of the full trace over the entire Hilbert space. The resulting expectation value with respect to this "typical" state then becomes

$$C_i(t) = 4\langle \psi | S_i^z(t) S_i^z(0) | \psi \rangle + \epsilon, \tag{8}$$

where the final term is an error which has zero mean and a standard deviation that scales as $\propto 1/\sqrt{D}$ where D is the

Hilbert space dimension. For many-body systems, D is exponentially large in the system size, guaranteeing that statistical fluctuations vanish rapidly as the system size increases. A different random state is chosen for each disorder realization. In the following, I shall set $C(t) \equiv C_{L/2}(t)$, such that boundary effects are minimized.

In a phase with diffusive transport, one would expect to see this correlation function decay like $C(t) \sim 1/\sqrt{t}$, whereas if the transport is subdiffusive it will instead decay like $C(t) \sim t^{-\alpha}$ with $\alpha < \frac{1}{2}$. It has been shown in Refs. [41,57] that at infinite temperature the exponent α is linked to the behavior of the optical conductivity $\sigma(\omega) \sim \omega^{\beta}$ via the relation $\beta + 2\alpha = 1$, therefore, knowledge of this correlation function also gives us information about the optical conductivity. It was also demonstrated in Ref. [57] that it is extremely challenging to reliably extract an exponent $\alpha = \frac{1}{2}$ in the diffusive regime due to significant finite-size effects, and that extrapolation to the $L \to \infty$ limit is required in order to recover the expected value of $\alpha = \frac{1}{2}$. I shall make use of a similar procedure below.

I will also compute the bipartite von Neumann entanglement entropy density S(t) across a cut in the center of the chain:

$$S(t) = -\frac{2}{L} \text{Tr}_{\mathcal{A}} \{ \rho_A(t) \log[\rho_A(t)] \}, \tag{9}$$

where $\rho_A(t) = \text{Tr}_{\mathcal{B}}[|\psi(t)\rangle\langle\psi(t)|]$ is the reduced density matrix of one-half of the chain (subsystem \mathcal{A} , with length L/2) after tracing out the remaining sites in subsystem \mathcal{B} . The entanglement entropy has previously been shown to increase logarithmically in time in the MBL phase [60,79], in contrast to the much faster growth expected in an ergodic system, and provides an important indicator of the slow dynamics characteristic of MBL. In particular, unlike local observables such as a persistent density imbalance, the entanglement entropy is capable of clearly distinguishing true many-body localization from Anderson localization.

¹The distributions used in this work have a variance of $\frac{1}{2}$.

IV. RESULTS

A. Dilute random disorder

A summary of the results for dilute random disorder is shown in the phase diagrams of Fig. 1. First, the behavior in both limits $p \to 0$ and $p \to 1$ is as expected, yielding a vanishing imbalance in the former case (characteristic of the diffusive transport expected in the integrable XXZ model [80]) and a localization transition in the latter case, located at approximately $d_c \approx 3.7$ [62]. As this transition has been widely studied elsewhere, I do not linger on it, nor attempt to locate it any more precisely than has already been done in other works. For our purposes, it is sufficient to note that there is a localization transition and ask what happens to it as p is changed.

The most interesting physics occurs at disorder strengths $d > d_c$ when p is reduced from unity, and one can examine what happens to the localization transition. Figure 1(a) shows that the transition shifts to larger values of d as more homogeneous regions are added, which makes intuitive sense as these regions act to favor thermalization. The smaller p becomes, the larger these thermalizing regions are and the stronger their effects. Remarkably, however, signatures of a finite imbalance persist even to small values of $p \approx 0.2$. This effect is even more starkly revealed in the level-spacing statistics, shown in Fig. 1(b), where at strong disorder there are no areas of the phase diagram where r takes on the Wigner-Dyson value of ~ 0.53 which would be characteristic of a chaotic ergodic phase. This this may be due to rare but strong impurities acting as bottlenecks, or simply a consequence of the finite resolution of the data shown in Fig. 1.

More information about how the system approaches its long-time state can be extracted from the evolution of these observables, rather than just their long-time limits. Figure 2 shows the evolution of the imbalance for a variety of different disorder strengths and choices of the dilution parameter p, on a double-logarithm scale with power-law fits to the late-time behavior indicated by black dashed lines. In all figures, the uncertainty shown for each observable $\mathcal O$ is obtained by computing the mean $\overline{\mathcal O}$ and the variance $\sigma^2(\mathcal O)$, and plotting the range given by $\overline{\mathcal O} \pm \sigma^2(\mathcal O)$ as a translucent shaded area: in the present figure, the uncertainty is close to the linewidth.

At low disorder (i.e., in the delocalized phase), the imbalance decays like a power law at long times. This persists to intermediate disorder (d=3.0) although the slope of the power law is significantly reduced, implying a slower decay. At the two highest disorder strengths shown in Fig. 2, the imbalance appears to saturate at late times and does not exhibit power-law decay, although it must be noted that for small values of p the imbalance does indeed saturate close to zero, which is inconsistent with a fully many-body localized phase.

This behavior can be corroborated via the correlation function, shown in Fig. 3, which exhibits qualitatively similar behavior. Following Ref. [57], here the fits are performed over an intermediate window in time before the correlation function saturates to its long-time value. Again, there is a power-law decay at low disorder but a clear plateau at large disorder strengths, even for small values of the dilution parameter p, indicating that the long-time behavior of the system

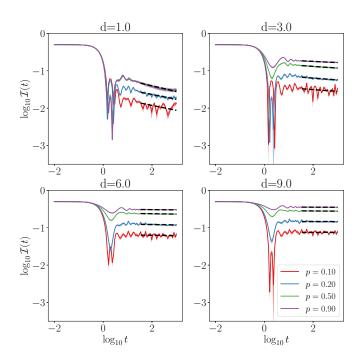


FIG. 2. The decay of the imbalance (staggered magnetization) following a quench from an initial Néel state, for L=16 and averaged over $N_s=1024$ disorder realizations. The four panels show four different disorder strengths, and the colored lines each show different values of p=0.1,0.2,0.5,0.9. The black dashed lines are power-law fits to the long-time behavior, shown here as guides to the eye. The translucent shaded area around each line represents the uncertainty: note that in many cases it is roughly the same as the linewidth. (The data for p=0.1 with d=1.0 have been smoothed by convolution with a Gaussian filter of width 1σ .)

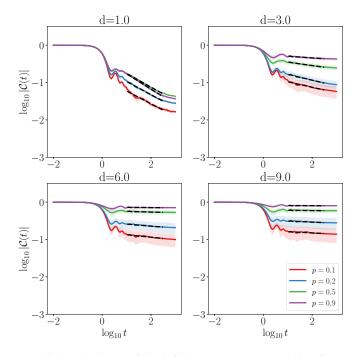


FIG. 3. The decay of the infinite-temperature correlation function for L=16 with $N_s=512$, again for four different disorder strengths and varying values of the dilution p. As before, the shaded area represents the uncertainty, and the dashed lines are power-law fits shown as guides to the eye.

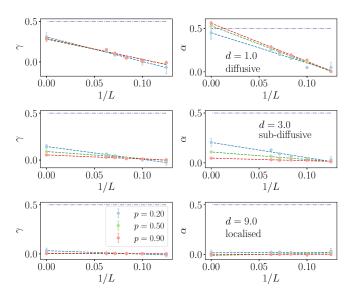


FIG. 4. Decay exponents from fits to the imbalance $\mathcal{I}(t) \propto t^{-\gamma}$ and infinite-temperature correlation function $C(t) \propto t^{-\alpha}$, respectively, shown for three different disorder strengths (d=1.0,3.0,9.0, top to bottom) and three different values of the dilution parameter p. The dashed lines show the linear extrapolation to the infinite-systemsize limit, where for diffusive transport one would expect to find $\alpha=\frac{1}{2}$, indicated by the purple dotted-dashed line. For weak disorder, the results are consistent with diffusive transport, but as the disorder is increased, the decay becomes significantly slower with $\alpha, \gamma \to 0$, suggestive of nondiffusive transport at intermediate disorder and full localization at strong disorder. Error bars reflect the uncertainty in the fits, and are in many cases smaller than the plot markers.

is strongly affected by the presence of these rare yet large bottlenecks.

It is possible to extract decay exponents from the imbalance $\mathcal{I}(t) \propto t^{-\gamma}$ and correlation function $C(t) \propto t^{-\alpha}$, respectively, as shown in Fig. 4. While the decay of the imbalance is not directly related to the diffusion exponent α , it is nonetheless instructive as it displays the same qualitative behavior. In some cases, it has even shown to exhibit quantitatively similar behavior. The decay exponent for the correlation function approaches the diffusive value of $\alpha = \frac{1}{2}$ in the thermodynamic limit, as expected, however, convergence as a function of system size is extremely slow and extracting reliable exponents is challenging. Nonetheless, the results indicate that for weak disorder (d = 1.0), the decay of the correlation function is consistent with diffusive behavior, as expected. In all cases, the imbalance exhibits a smaller exponent $\gamma < \alpha$, perhaps due to finite-size effects or the specific choice of initial state. For intermediate disorder (d = 3.0) the decay is significantly and visibly slower, consistent with subdiffusive transport. It is also interesting to note that the exponent is suppressed at large values of p, vanishing almost entirely for p = 0.9, and becoming much larger as the density of homogeneous regions is increased, confirming that the dilution parameter p strongly changes the character of the transport in this model. At the largest disorder strength shown in Fig. 4 (d = 9.0), the exponents are both effectively zero for all values of p, suggestive of localization, although it is not possible to rule out the possibility of extremely slow transport that cannot be resolved

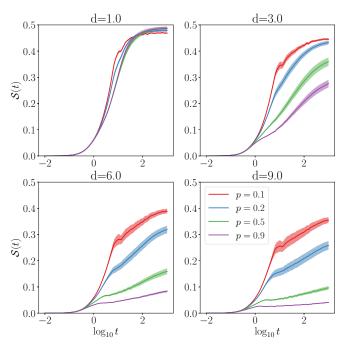


FIG. 5. Growth of the entanglement entropy following a quench from an initial Néel state, again for four different disorder strengths and varying values of dilution p, computed for L=16 using exact diagonalization. The shaded area around each curve again represents the uncertainty (variance). For the strongest disorder strength (d=9.0), even at the weakest value of the dilution (p=0.1) there is still a slow logarithmic growth of the entanglement entropy at late times, suggesting that the rare impurities act as significant bottlenecks to the growth of entanglement.

at these system sizes and evolution times [81]. In fact, it is very likely that this is the case, based upon the high density of thermalizing regions which would by design overwhelm conventional perturbative arguments for the stability of MBL [6]. It should be noted, however, that the local integrability of the inclusions in this model could play a role in allowing signatures of localization to persist to long times.

In addition, Fig. 5 shows the growth of the half-chain entanglement entropy S(t) following the quench, again for a variety of disorder strengths and values of the dilution parameter. At weak disorder, the entanglement entropy grows rapidly and quickly saturates for all values of the dilution parameter p, while at intermediate disorder the dynamics separates into an initial transient period of fast growth followed by a slower logarithmic increase that persists to late times. Notably, this feature is also present at strong disorder and small values of dilution, for example, d = 9.0 and p = 0.2, where the impurities are strong yet rare. This confirms again that the presence of even very rare disordered regions is enough to lead to the emergence of standard MBL phenomenology which predicts $S(t) \sim \log(t)$ [60,79]. The long-time values of $S(t = 10^3)$ are shown in Fig. 1(c), where it is clear that the entanglement in the localized region is significantly smaller than elsewhere in the phase diagram. The fast linear growth of the entanglement entropy at short times results from the nearly free transport of spin over a region set by the localization length (for $p \to 1$) or the size of the homogeneous regions

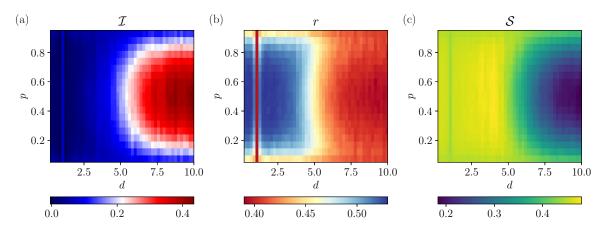


FIG. 6. Numerical results for the case of dilute binary disorder, for a system size L=14 and averaged over $N_s=512$ disorder realizations. (a) The imbalance long after a quench from a Néel state ($tJ_0=10^3$). (b) The averaged level-spacing statistics, which vary from $r\sim0.39$ in a localized phase to $r\sim0.53$ in an ergodic phase. (c) The entanglement entropy a long time after the quench. Note the singular behavior along the integrable line $W_0=d=1$, clearly visible in all three panels as a vertical line.

 $(p \rightarrow 0)$, and consequently grows more for small values of the dilution parameter p where spin transport over larger distances is possible. At later times, however, the disordered regions always appear to dominate the dynamics even for small values of p, leading to the slow logarithmic growth characteristic of MBL.

B. Dilute binary disorder

I now contrast the results shown in the previous section with the corresponding results for dilute binary disorder, which are summarized in Fig. 6. In the limits $p \to 0$ and $p \to 1$ the system behaves in an integrable manner, with vanishing imbalance and a level-spacing parameter consistent with Poisson level statistics, as expected for an integrable system. At the maximally disordered value of p=0.5, there is a transition or crossover between an ergodic and a localized phase at a critical $d_c \approx 4$, similarly to the $p \to 1$ limit of the model with dilute random disorder. Moving away from this point, as $\delta p = |0.5 - p|$ increases from zero, the localized phase is quickly destabilized; however, once again the level statistics do not significantly deviate from their Poisson value of $r \sim 0.39$ despite the imbalance vanishing, consistent with a crossover from a disordered to an integrable regime.

Note that along the line $W_0 = d = 1$, the system is integrable for all values of p and displays a rapid transition to a chaotic ergodic phase as $\delta W = |W_0 - d|$ becomes non-zero. This is not an error, and is simply a reflection that there is no 'disorder' to speak of along this line, as the system is translationally invariant (and integrable) regardless of the value of p.

As before, I compute the same set of observables, beginning with the imbalance following a quench from a Néel state, shown in Fig. 7. The results are qualitatively similar to the case of dilute random disorder, showing a power-law decay of the imbalance at intermediate disorder and a flat "frozen" imbalance at large disorder strengths, suggestive of localization. The value d = 1.0 considered in the previous section is replaced here with d = 0.0, as the system is integrable at d = 1.0 for all values of p (as $W_0 = d = 1.0$ and so

the behavior is qualitatively different here than for all other choices of d). Figure 8 shows the decay of the dynamical correlation function, and again it exhibits familiar behavior consistent with slow transport at intermediate disorder and localization at higher disorder strengths. The extracted decay exponents are shown in Fig. 9. At d=3.0, transport is subdiffusive for $\delta p \approx 0$, crossing over to diffusive for $\delta p \rightarrow 0.5$. At stronger disorder (d=6.0), transport is (weakly) subdiffisive for all values of p, where "weakly" in this context means

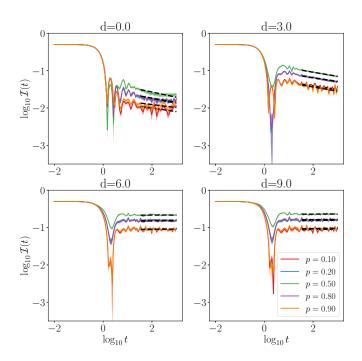


FIG. 7. The decay of the imbalance (staggered magnetization) following a quench from an initial Néel state in the case of dilute binary disorder, for L=16 and $N_s=1024$. Note that the p=0.2 and 0.8 lines lie almost on top of each other due to the symmetry of the phase diagram, as do the lines for p=0.1 and 0.9. (For d=0.0, the p=0.1 and 0.9 data have been smoothed by convolution with a Gaussian filter.)

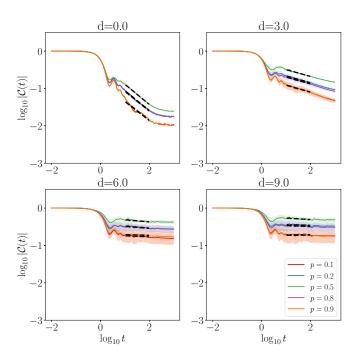


FIG. 8. The decay of the correlation function following a quench from an initial Néel state in the case of dilute binary disorder, for L=16 with $N_s=512$, again for four different disorder strengths and varying values of the dilution p. As before the shaded area represents the uncertainty. Again, the p=0.2 and p=0.8 lines overlap due to the symmetry of the phase diagram, as do the lines for p=0.1 and p=0.9.

that the exponent is close to zero. Again, the transport is slowest for p = 0.5, where the effects of disorder are most strongly felt. The effect of disorder is qualitatively similar as in the dilute random case, with strong disorder ultimately suppressing transport regardless of the value of the dilution p. Finally, Fig. 10 shows the entanglement entropy, where the behavior is qualitatively consistent with the other observables, at large disorder strengths exhibiting a slow logarithmic growth around p = 0.5, and a faster growth for $\delta p \to 0.5$ with latetime behavior that appears to weakly saturate. Interestingly, even for values of $\delta p \approx 0.4$, the growth of the entanglement entropy remains slow for a long period of time, although the growth appears to undergo a weak crossover to faster than logarithmic at late times. This suggests that even very rare impurities can be significant bottlenecks to transport, provided they are large enough, and could indicate the formation of a metastable or prethermal phase which appears localized on intermediate timescales, before eventually thermalizing.

V. DISCUSSION AND CONCLUSION

In this work I have studied two unconventional choices of disordered potentials and examined the stability of many-body localization in both cases. The results indicate that localization appears to be surprisingly robust towards the addition of homogeneous regions which should favor thermalization, with signatures of localization persisting to very long timescales. Even in parameter regimes where disordered regions are much smaller (on average) than homogeneous

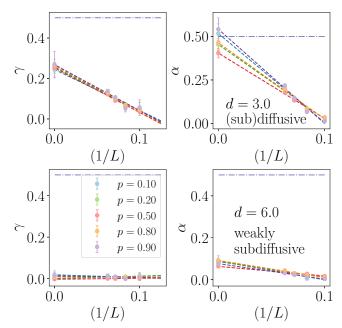


FIG. 9. Decay exponents from fits to the imbalance $\mathcal{I}(t) \propto t^{-\gamma}$ and correlation function $C(t) \propto t^{-\alpha}$, respectively, shown for two different disorder strengths (d=3.0 and 6.0) and three different values of the dilution parameter p. The dashed lines show the linear extrapolation to the infinite-system-size limit, with the diffusive value $\alpha = \frac{1}{2}$ indicated by the purple dotted-dashed line. For d=3.0 the results are consistent with diffusive transport in the limits of $p \to 0$ and $p \to 1$, with subdiffusive transport in-between, with the smallest value of α occurring for p=0.5. For d=6.0, the imbalance suggests that transport is almost entirely absent, but the correlation function indicates that slow subdiffusive transport persists.

regions, localization effects persist to the largest system sizes and longest times studied here. Based on analytical arguments regarding the stability of many-body localization [33], it is very likely that the localization phenomena observed over much of the phase diagrams shown in this work will not survive in the limit of large systems and very long times; however, it is striking that in many ways, these regions appear just as stable as the conventionally studied localized regime. The indistinguishability of localization in the dilute and fully random regimes (i.e., p=1 for dilute random disorder) suggests that extremely slow mechanisms for delocalization cannot be captured by numerically exact simulations on such small system sizes.

These numerical simulations will serve as a useful road map for future studies examining further exotic properties of spin chains with dilute disorder. Here I have established the broad structure of the phase diagram and a few key properties, but there are many interesting open questions which dilute disorder may be able to shed some light on. In this work, I have focused on small system sizes and numerically exact methods in order to establish the broad properties of these disorder distributions in the regime most commonly studied by the many-body localization community. Further studies using tensor network techniques to access larger system sizes may be able to contrast the finite-size scaling behavior of dilute and fully random disorder distributions in order to see

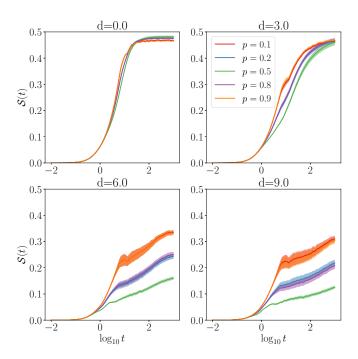


FIG. 10. Growth of the entanglement entropy following a quench from an initial Néel state in the case of dilute binary disorder, again for four different disorder strengths and varying values of dilution p, computed for L=16 using exact diagonalization. Note that the results for p=0.1 and 0.9 are quantitatively very similar, as are the results for p=0.2 and 0.8, mirroring the symmetry of the phase diagrams shown in Fig. 6.

whether the behavior in the thermodynamic limit continues to behave indistinguishably, or whether the localization in the presence of dilute disorder will be destabilized more easily. While the latter scenario is more likely, the former would have interesting implications for the stability of MBL in the thermodynamic limit. This work has not looked in detail at the universal properties of dilute disorder, nor whether it strongly modifies any critical properties of the phase transition. Future works using techniques such as real-space renormalization group may be able to establish whether the localization transition triggered by changing p at fixed d is in the same universality class as the localization transition studied in conventional random potentials. It would also be interesting to see if future analytical studies will be able to rigorously establish some of the numerical properties observed in this work, as to date few analytical works have considered dilute disorder. Being able to controllably add "rare" regions may offer an additional parameter for analytical works to study the destabilization of localization by carefully controlling the properties of these inclusions in a more systematic way than is possible in conventional random potentials.

While undoubtedly somewhat finely tuned and unlikely to exist in nature, the potentials introduced in this work offer a way to controllably add thermalizing regions into an otherwise disordered sample and may offer a novel path forward for the study of Griffiths-type effects in disordered systems by allowing "rare regions" to be included in a more controlled manner than in purely random systems. They are also entirely within the realm of current generation experiments, partic-

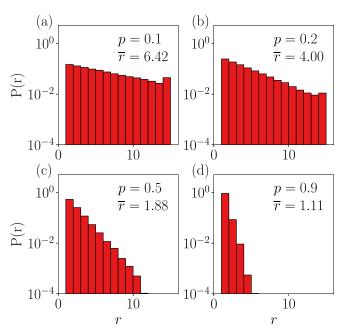


FIG. 11. Normalized distributions P(r) of the homogeneous (nondisordered) regions in the case of dilute random disorder, for various values of probability p, obtained for system size L=16 and averaged over $N_s=20\,000$ randomly generated values of the potential. The mean length of homogeneous regions \bar{r} is indicated in each panel. Note that the largest regions can be significantly larger than the mean value.

ularly ultracold atomic gas platforms, where these tailored potentials can be realized, for example, using a spatial light modulator or digital mirror device. This could also allow the effects of these potentials to be experimentally investigated in two dimensions, where the existence of MBL is not yet firmly established and the fragile nature of the putative localized phase should be much more vulnerable to the controlled addition of thermal inclusions as proposed in this work. It would be interesting to see if subdiffusive transport also emerges in this situation, or if the presence of any finite concentration of thermal inclusions is sufficient to immediately induce conventional diffusive transport in greater than one spatial dimension. The disorder distributions studied in this work aimed to smoothly interpolate between disorder-free and fully random models; however, as a consequence of the use of the "standard model" of MBL, the physics at low dilution is close to integrable. In future work, it would be a useful next step to investigate dilute disorder in a model which explicitly breaks integrability in the $p \to 0$ limit. Another possible avenue of investigation would be to study the local integrals of motion in systems with dilute disorder, and specifically their distribution, as slow transport has previously been linked to a broad distribution of local integrals of motion in a noninteracting system [82]. Given the key role that local integrals of motion play in MBL phenomenology, and their link with anomalous transport properties such as those studied here, it seems likely that the distribution of local integrals of motion in systems with dilute disorder may be a fruitful direction for further study.

All data and code are available at [83,84].

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APPENDIX: DISTRIBUTION OF RARE REGIONS

The problem of analyzing the distribution of rare regions can be mapped onto the equivalent problem of studying the results of coin tosses of a biased coin. For example, in the case of dilute random disorder, we can label the homogeneous lattice sites (which occur with probability 1-p) as "heads," and the random sites (which occur with probability p) as "tails." This has been extensively analyzed in Ref. [63] and is a surprisingly rich problem despite its apparent simplicity. Here we focus on the probability P(r) to obtain a homogeneous

region of length r. Numerical results are shown in Fig. 11, for dilute random disorder with four different values of the probability p. The disorder strength is set to d = 9, however, its precise value is irrelevant here, as all we care about is whether the potential at a lattice site is random or otherwise (i.e., heads or tails). Here I average over $N_s = 20\,000$ randomly generated values of the potential for a system size L = 16, consistent with the size used in the main text. (Note that simply computing the properties of the rare regions does not require fully diagonalizing the Hamiltonian, only computing the onsite potentials, and therefore a very large number of samples can be used.) To a good approximation, the probability to obtain a homogeneous region of size r typically decays exponentially, $P(r) \sim \exp(-r)$. The expected value for the largest homogeneous region is approximately given by $R_L(p) \approx \log_{1/p}[L(1-p)]$, however, the probability distribution for the size of the largest region (not shown) has a long tail, and in a given disorder realization, the largest homogeneous region may be significantly larger [63]; therefore, one must carefully consider the entire distribution of rare and homogeneous regions rather than only looking at averaged properties. A similar analysis can be conducted for dilute binary disorder, which I do not show here.

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