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Spatio-temporal anomalous diffusion in heterogeneous media by nuclear magnetic resonance

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In this paper, we describe nuclear magnetic resonance measurements of water diffusion in highly confined and heterogeneous colloidal systems using an anomalous diffusion model. For the first time, temporal and spatial fractional exponents, α and μ , introduced within the framework of continuous time random walk, are simultaneously measured by pulsed gradient spin-echo NMR technique in samples of micro-beads dispersed in aqueous solution. In order to mimic media with low and high level of disorder, mono-dispersed and poly-dispersed samples are used. We find that the exponent α depends on the disorder degree of the system. Conversely, the exponent μ depends on both bead sizes and magnetic susceptibility differences within samples. The new procedure proposed here may be a useful tool to probe porous materials and microstructural features of biological tissue. © 2011 American Institute of Physics. [doi:10.1063/1.3610367]

I. INTRODUCTION

In the last few decades, nuclear magnetic resonance (NMR) diffusion measurements of water molecules have been a topic of extensive research, having broad applications across a number of disciplines ranging from material science to biophysics¹ and medicine.² Translational self-diffusion in liquid systems can be measured using pulse field gradient techniques, by applying magnetic gradient pulses (named diffusion gradients) to the system, in addition to the static magnetic field of the instrument itself. The signal attenuation, that depends on both diffusion gradient strength and diffusion time, is simply the Fourier transform (FT) of the *average* motion propagator (MP). When the MP is Gaussian, NMR signal attenuation follows a mono-exponential Stejskal-Tanner decay.³ Conversely, when the motion is described by a non-Gaussian propagator, the signal attenuation deviates from a mono-exponential decay.^{4,5}

Up to now, restricted diffusion methods, based on Gaussian diffusion approximation, have been the most popular and commonly accepted NMR methods to investigate heterogeneous media. In particular, when measured in a porous system, apparent diffusion coefficient, as a function of time,⁶⁻⁹ provides information about pore structure by means of surface to volume ratio and tortuosity. Moreover, the q-space diffusion diffraction studies^{10,11} and their recent developments^{12,13} provide geometrical microstructural characterization and information on pore size of heterogeneous media. In general, all the above methods require *a priori* knowledge (partial or deeper, depending on the method) about the media under investigation. A more sophisticated technique, based on quantum field perturbation theory and valid in the limit of small

amplitude and small correlation length of disorder, has been recently introduced by Novikov and Kiselev.¹⁴

In many practical situations, the dynamics of water in porous media is restricted by confining boundaries. Crowding, caging, and geometrical traps may lead to departures from Gaussian diffusion. Here, we propose a different approach to obtain microstructural information from heterogeneous media by means of diffusion NMR methods based on non-Gaussian diffusion theory. It is well known that Gaussian diffusion predicts a linear relation between mean square displacement (MSD) of diffusing particles and the time during which the diffusion occurs. Conversely, anomalous diffusion (AD) is characterized by a MSD of diffusing particles growing nonlinearly in time, i.e., $\langle [x(t) - x(0)]^2 \rangle \propto t^\nu$ (with $\nu \neq 1$). This is a property of many complex systems and their related phenomena have been observed in various physical and scientific fields.¹⁵⁻²⁰

In this paper, we use the continuous time random walk (CTRW) model developed by Metzler and Klafter,²¹ as an *effective* approach to describe the features of AD. According to these authors, molecular AD in media can be depicted by an *effective* approach for which the MP is described as the solution of fractional diffusion equations, arising from the CTRW model. These equations involve two fractional exponents, α and μ , which are the orders of the time and space fractional derivatives, respectively.²² The theoretical framework of CTRW is well established and has been corroborated by huge amounts of Monte Carlo simulations (see, for example, Ref. 23) together with several experimental studies, mainly obtained by using fluorescent spectroscopy.^{24,25} However, to our knowledge, an experimental α vs μ phase diagram, showing the competition between superdiffusion and subdiffusion of diffusing molecules in heterogeneous media, has never been carried out. Since NMR signal is

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obtained from an *ensemble* of spins as the FT of the *averaged* MP, in our opinion NMR techniques are the best experimental procedures to test the validity of such an *effective* theory.

In this paper, we have experimentally measured the *effective* fractional exponents α and μ by means of NMR methods, based on pulsed gradient spin-echo (PGSE) technique,³ and have provided an evidence of their interplay for the first time.

As it will be explained in Sec. II, in the present study, we use an AD model to describe the behavior of water molecules in porous media characterized by packed micro-beads poly-dispersed in aqueous solution. In Sec. III, materials and methods, used to investigate spatio-temporal anomalous diffusion in heterogeneous media, are described. PGSE NMR experiments were performed in controlled porous media characterized by packed micro-beads of various sizes, mono- and poly-dispersed in aqueous solution. Mono-dispersed (mono-d) and poly-dispersed (poly-d) samples were used to check the potential ability of the exponents α and μ to detect different degrees of system disorder (Sec. III A). Fractional exponent α was measured by collecting the PGSE signal attenuation as a function of diffusion times compared to the asymptotic expression of FT of the MP for subdiffusive regime, obtained from Metzler's review.²¹ Moreover, the exponent μ was extracted by fitting the expression of FT of the MP for superdiffusive regime, obtained again from Metzler's review,²¹ to the PGSE signal attenuation as a function of gradients strength. Because the internal background gradient effect in porous media usually plays an important role in microstructural data interpretation,²⁶ internal magnetic field gradient (G_{int}) measurements were performed to investigate the influence of the magnetic susceptibility differences ($\Delta\chi_m$) on measured α and μ parameters (Sec. III B). In Sec. IV, experimental results are reported and discussed. Our experimental results demonstrate that the exponent α strongly depends on the disorder degree of the system, and it is independent of $\Delta\chi_m$ (Secs. IV A and IV B). Conversely, the exponent μ is strongly correlated with $\Delta\chi_m$ and pore sizes (Secs. IV B and IV C). In summary, mono-d samples are characterized by both ordinary diffusion and spurious magnetic susceptibility effect (Sec. IV C), while poly-d samples show a real *effective* subdiffusion of water molecules in a significant spatio-temporal range.

II. THEORY

Taking into account the CTRW model,²¹ each molecular displacement in a diffusion process can be characterized by two parameters: a waiting time τ elapsing between two consecutive steps, and a variable displacement length ξ . The quantities τ and ξ are usually assumed as independent random variables, distributed according to the probability densities $\psi(\tau)$ and $\lambda(\xi)$. When $\psi(\tau) \simeq \tau^{-1-\sigma}$, with $0 < \sigma < 1$, and $\lambda(\xi)$ is characterized by a finite variance, the characteristic waiting time $T = \int_0^\infty \tau \psi(\tau) d\tau$ diverges and the resulting CTRW is *subdiffusive*. As a consequence, the asymptotic

behaviors of the FT of the MP is characterized by

$$W(q, t) \simeq \begin{cases} e^{-K_\alpha q^2 t^\alpha}, & \text{when } q^2 \ll \frac{1}{K_\alpha t^\alpha}, \\ \frac{1}{K_\alpha q^2 t^\alpha}, & \text{when } q^2 \gg \frac{1}{K_\alpha t^\alpha}, \end{cases} \quad (1)$$

where $\alpha = \sigma$ (if $\sigma \geq 1$, $\alpha = 1$). Moreover, K_α is a generalized diffusion constant. Under these conditions, the MSD grows sublinearly in time, namely $\langle x^2(t) \rangle \simeq t^\alpha$. Vice versa, when $\lambda(\xi) \simeq |\xi|^{-1-\rho}$, with $0 < \rho < 2$, and $\psi(\tau)$ is characterized by a finite mean value, the jump length variance $\Sigma^2 = \int_{-\infty}^\infty \xi^2 \lambda(\xi) d\xi$ diverges and a *superdiffusive* (Levy flight) CTRW is obtained.²⁷ In this case, the behavior of the FT of the MP is given by

$$W(q, t) \simeq e^{-K^\mu |q|^\mu t}, \quad (2)$$

where $\mu = \rho$ (if $\rho \geq 2$, $\mu = 2$). Moreover, K^μ is a generalized diffusion constant. In the case $\alpha < 1$ and $\mu < 2$, when spatio-temporal coupling of jump length and waiting time are taken into consideration, an α vs μ phase diagram can be drawn, as reported by Metzler and Klafter.²¹ In the specific case shown here, i.e., mono-d and poly-d micro bead samples, we can expect to detect subdiffusion (i.e., characterized by $\alpha < 1$ and $\mu = 2$) in poly-d samples and Gaussian (i.e., characterized by $\alpha = 1$ and $\mu = 2$) diffusion in mono-d samples, only.

In NMR spectroscopy, the effect of diffusion on an *ensemble* of N magnetized spins can be described in terms of the behavior of spin phases, $[\Phi(\mathbf{r}_i)]_{i=1, \dots, N}$, subjected to an applied magnetic field gradient.^{6,7} The PGSE NMR technique is characterized by radio frequency pulses together with a couple of magnetic field gradient pulses of duration δ , strength $|\mathbf{g}|$, and separated by a delay time $t = \Delta \gg \delta$. The first gradient pulse effectively phase encodes the molecular spins, according to each molecule position. The second decoding gradient pulse completely reverses the spin phase if and only if the molecule has not diffused during the time Δ . Conversely, if the molecule diffuses, the intensity of the signal due to the molecule will be attenuated because of an incomplete phase reverse. In case of ordinary diffusion, the degree of attenuation is a function of both \mathbf{g} and Δ , and occurs at a rate proportional to the self-diffusion coefficient D . One of the most interesting features of PGSE is that the measured signal, $E_\Delta(\mathbf{k})$, is the FT of the averaged propagator, $\bar{P}_s(\mathbf{R}, \Delta)$, i.e., $E_\Delta(\mathbf{k}) \propto W(\mathbf{k}, \Delta)$. Since Δ defines the time window in which the diffusion processes are observed, PGSE NMR techniques allow the measure of *effective* α and μ values (α_{eff} and μ_{eff}) using the aforementioned expressions (1) and (2), respectively. In particular, α_{eff} is obtained by a fitting procedure of the expression (1) to the experimental data measured by PGSE at different Δ values. The exponent μ_{eff} instead is obtained by a fitting procedure to experimental data at different $\mathbf{q} = 1/2\pi \gamma \mathbf{g} \delta$ values, where $\gamma = 2.675 \times 10^8$ rad Hz T⁻¹ is the nuclear gyromagnetic ratio.²⁸ Taking into account the Δ values usually selected to perform PGSE experiments, we expect to measure $\mu_{eff} = 2$ and $\alpha_{eff} \leq 1$, depending on the investigated heterogeneous sample. However, another peculiar property of the NMR signal in heterogeneous systems

is its dependence on $\Delta\chi_m$ generated at the interface between regions with different χ_m . The presence of different susceptibilities can be quantified through G_{int} measurements, which can be extracted by the signal decay, generated by a spin-echo (SE) NMR sequence.^{6,7,29} As a consequence, both α_{eff} and μ_{eff} could be, in principle, affected by $\Delta\chi_m$.

III. MATERIALS AND METHODS

A. Samples

Eight samples in total were carried out using polystyrene micro-beads (Microbeads AS, Norway) with nominal average diameters of 140, 40, 30, 20, 15, 10, 6, and 0.050 μm and characterized by a $|\Delta\chi_m| = |\chi_m^{\text{H}_2\text{O}} - \chi_m^{\text{polystyrene}}| \sim 1.59 \times 10^{-5}$ in SI units. Six 10 mm NMR tubes were filled up to a volume of approximately 2 cm^3 with beads mono-d in a solution of polyoxyethyle-sorbitan-mono-laurat (Tween 20) 10^{-6} M and deionized water (conductivity $\sim 10^{-6} \Omega^{-1}/\text{cm}$), and investigated four months after their preparation. In order to obtain samples characterized by a highly varying multitude of space configurations, which mimic disordered system, three other poly-d specimens were prepared in a similar way, using equal volume fractions of beads of varying sizes. We mixed equal volume fractions of beads of 140, 40, and 6 μm to introduce disorder in the samples mainly characterized by 6 μm microstructural size. Indeed, by adding microbeads of size larger than 6 μm (as an example 140 μm and 40 μm), it is possible to obtain a broad distribution of pore sizes around 6 μm . As a consequence, an increase of effective porosity p is expected in mixed beads samples. The sample, called 140 + 80 + 40 + 10 + 6 μm , was made with microbeads of 140, 80, 40, 10, and 6 μm , while two other samples were made with microbeads of 140, 40, and 6 μm investigated two months (140 + 40 + 6 μm (2m)) and one and four months (140 + 40 + 6 μm (1m) and 140 + 40 + 6 μm) after their preparation, respectively. Finally, one tube filled up with free water was also used as control.

B. Methods

All measurements were performed on a Bruker 9.4 T Avance system, operating with a micro-imaging probe (10 mm internal diameter bore) and equipped with a gradient unit characterized by a maximum gradient strength of 1200 mT/m, and a rise time of 100 μs . The temperature of each sample was fixed at 291 K. As a first step, relaxation-time NMR measurements were performed to fully characterize the investigated porous samples. In order to determine the effective porosity p , as previously reported,³⁰ a SE imaging version using multi slice multi echo sequence (repetition time $TR = 1500$ ms, matrix 128×128 , slice thickness $STH = 1$ mm, in plane pixel dimension $60 \times 60 \mu\text{m}^2$, number of scan $NS = 8$) at various echo times TE (from 2.8 ms to 300 ms) was used to obtain SE decay in different regions of each sample. Conventional mean diffusion coefficient \bar{D} of water in each sample was measured by means of a spectroscopic pulsed g Gradient stimulated echo (PGSTE, $TE/TR = 1.8/5000$ ms, diffusion gradient pulses delay $\Delta = 80$ ms,

diffusion gradient pulses duration $\delta = 4.4$ ms, and diffusion gradient strength g applied along the x , y , and z axes using 48 gradient amplitude steps from 2.6 to 1000 mT/m). G_{int} along x , y , and z axes was measured by using a spectroscopic SE sequence ($TR = 1500$ ms, $NS = 8$) with $N = 64$ data points (corresponding to 64 echoes refocusing every 2 ms from 1 to 125 ms), as previously described.³³ Mean value of internal magnetic field gradient (MG_{int}) was obtained as the average value along x , y , and z axes. The characteristic diffusion length $\ell_D = (2\bar{D}\Delta)^{1/2}$ and the characteristic length $\ell^* = (\bar{D}/\gamma G_{int})^{1/3}$, as defined by Sen *et al.*³⁴ and Mitchell *et al.*,²⁹ were obtained from these preliminary measurements. In particular, ℓ^* establishes the spatial region around each bead, within which internal gradients act, dephasing the spins. A spectroscopic PGSTE with $\delta = 4.4$ ms, $g = 0.12$ T/m (i.e., $q = 22481$ m^{-1}) along x , y , and z axes, with $TR = 5000$ ms, $NS = 32$, and 48 values of Δ in the range (10/1000) ms was used to collect data either to obtain MSD vs t graphs (following the method described by Angelico *et al.*³⁵ and Scheven *et al.*³⁸) and to fit Eq. (1) to it, in order to extract the α_{eff} value along x , y , and z axes. Vice versa, a spectroscopic PGSTE with $\Delta/\delta = 80/4.4$ ms, $TR = 5000$ ms, $NS = 16$, and 48 gradient amplitude steps from 2.6 to 1000 mT/m along x , y , and z axes was used to collect data in order to fit Eq. (2) to it, thus obtaining a measure of the μ_{eff} value along x , y , and z axes. Moreover, in a second step, μ and α values were also obtained using the BPP-LED PGSTE (bipolar pulse field gradient with eddy current delay) pulse sequence.⁴⁰ The eddy current delay was 5 ms, and all the other sequence parameters were equal to the ones used in PGSTE experiments. The mean values of α_{eff} ($M\alpha_{eff}$) and μ_{eff} ($M\mu_{eff}$) were obtained by averaging $M\alpha_{eff} = 1/3 \sum_{i=x,y,z} (\alpha_{eff})_i$ and $M\mu_{eff} = 1/3 \sum_{i=x,y,z} (\mu_{eff})_i$.

All fitting procedures were performed using the Levenberg-Marquardt algorithm.

IV. RESULTS AND DISCUSSION

A. Preliminary results

Porosity measurements³⁰ underlined that the mean effective porosity, p , of all mono-d samples, is approximately equal to $p = 0.28 \pm 0.03$. As a consequence, water molecules diffuse in porous systems comprising interconnected pores narrowly distributed around the mean diameter greater than the one of cannon-ball packing configuration, i.e., $\ell_s = \sqrt{3} + 1/4d$. On the other hand, 140 + 40 + 6 μm sample is characterized by $p = 0.41 \pm 0.03$, while 140 + 80 + 40 + 10 + 6 μm sample is characterized by $p = 0.31 \pm 0.03$. Porosity measurements indicate that poly-d samples are more disordered than mono-d ones and that 140 + 40 + 6 μm is the most disordered sample. In principle, a Gaussian restricted diffusion behavior of water is expected in mono-d samples being characterized by a single typical length scale. Conversely, it is reasonable to expect a subdiffusive anomalous behavior in poly-d samples due to their multiple characteristic length scales on different orders of magnitude.^{20,31,32} In other words, our reasonable physical topic is that a narrow distribution of pore sizes

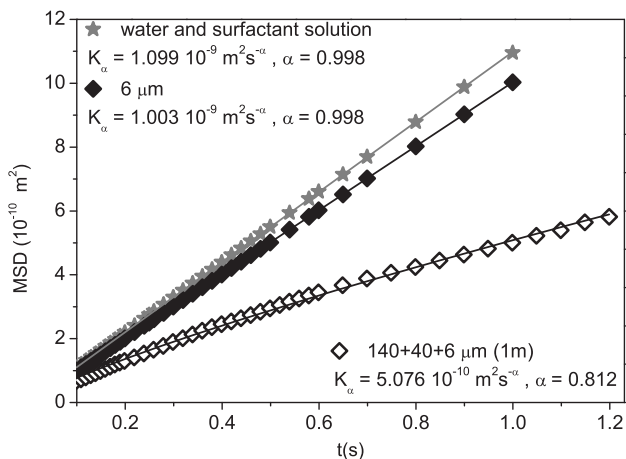


FIG. 1. Plot of MSD as a function of the diffusion time $t = \Delta$ for three different samples: water and surfactant solution, mono-d sample (comprising 6 μm beads size) and a poly-d sample (comprising 140, 40, and 6 μm beads size). Solid lines represent the curves fit: $MSD(t) = K_{\alpha} t^{\alpha}$. Outcomes of the fit procedure are also displayed for each sample. Star symbol represents proper ordinary diffusion regime.

implies a narrow distribution of residence times (mono-d samples). Vice versa, a broad distribution of pore sizes implies a broad distribution of residence times (poly-d samples). Preliminary results test two hypothesis: (1) AD processes occur in phantoms comprising poly-d polystyrene micro-beads, (2) AD process effects can be observed in data collected with PGSE sequence using Δ up to 1300 ms and g strength range from 2.6 to 1000 mT/m. In order to validate these hypothesis, we performed the MSD vs $t = \Delta$ graph shown in Fig. 1, for three different samples: water and surfactant solution, mono-d sample (6 μm), characterized by $p = 0.28 \pm 0.03$ and poly-d sample (140 + 40 + 6 μm), characterized by $p = 0.41 \pm 0.03$. Solid lines in Fig. 1 represent the curves fit: $MSD(t) = K_{\alpha} t^{\alpha}$. As expected, MSD vs t shows a linear growth in water and surfactant solution and mono-d samples characterized by different slopes. In these cases, the diffusion coefficient, $K_{\alpha=1} = D$, associated with aqueous solution and mono-d samples is $D = 1.099 \times 10^{-9} \text{ m}^2/\text{s}$ and $D = 1.003 \times 10^{-9} \text{ m}^2/\text{s}$, respectively. Conversely, a clear departure from linear behavior is found in poly-d sample. These experimental results strongly suggest that an effective AD occurs in poly-d samples in the range of diffusion times from 100 ms to 1300 ms. Indeed, by definition, diffusion is anomalous when the variance of molecular displacement increases as a non-unit power of time. In particular, if the waiting time distribution were completely scale-free, e.g., a power-law distribution with diverging mean, the diffusion would be anomalous on all time scales. However, if the waiting time distribution is characterized by a broad distribution on a finite but large range of scales, as presumed in our samples, then the AD is expected to be restricted to this range of scales and ordinary (Gaussian) diffusion occurs at longer times. This picture is clearly shown in Fig. 1 by the power-law growth of MSD vs t with exponent α smaller than 1, which is related to the large heterogeneity of typical length scales in such disordered system (poly-d sample). In summary, in Fig. 1 we observe in the poly-d sample an *effective* AD which occurs in the diffusion time range (100–

1300) ms) determined by the broad distribution of the corresponding pore sizes. Unfortunately, we cannot probe MSD vs t for larger diffusion time ($\Delta > 1.5$ s) due to T_1 relaxation time signal loss. This is a limit of the PGSTE NMR technique that hampers to detect MSD vs t asymptotically at long times.

B. Experimental CTRW phase diagram

The experimental version of the α versus μ graph suggested by Metzler and Klafter,²¹ for all ten samples investigated, is shown in Fig. 2. Data points obtained from ordered mono-d micro-bead samples (black filled symbols) lie close to the dashed line $\alpha_{eff} = \mu_{eff}/2$, indicating the border line between superdiffusion and subdiffusion regime zones. These points are identified by a similar $M\alpha_{eff}$ value very close to 1, and by different values of $M\mu_{eff}$, ranging from 1.75 to 2, depending on bead sizes. Specifically, data points associated with 0.050 μm , 6 μm , and 10 μm mono-d samples are localized in a subdiffusion regime zone, while 15 μm , 20 μm , and 30 μm ones lie in the superdiffusion regime zone, but all data are close to the border line. The distribution of these data matches the experimental results shown in Fig. 3, where the dynamic feature of water in all mono-d samples is described by the interplay between the characteristic lengths ℓ_D , ℓ_s , and ℓ^* .^{29,34} When $\ell_s < \ell_D$, ℓ^* (i.e., bead size lower than 15 μm in the investigated samples), motional averaging regime occurs and spins explore the entire pore many times before a dephasing arises, so that any local magnetic field (background gradient) variation is averaged out by diffusion. Conversely, when $\ell^* < \ell_D$, ℓ_s (i.e., bead size is equal to and higher than 15 μm in the investigated samples), the slow diffusion case occurs and spins experience a G_{int} , not totally averaged out, which produces an additional spin dephasing.²⁹ Vice versa, data points obtained from disordered poly-d micro-bead samples (empty symbols) lie, as expected, in the subdiffusive region. Specifically, $M\alpha_{eff}$ decreases as the degree of the disorder increases, while $M\mu_{eff}$ does not discriminate between

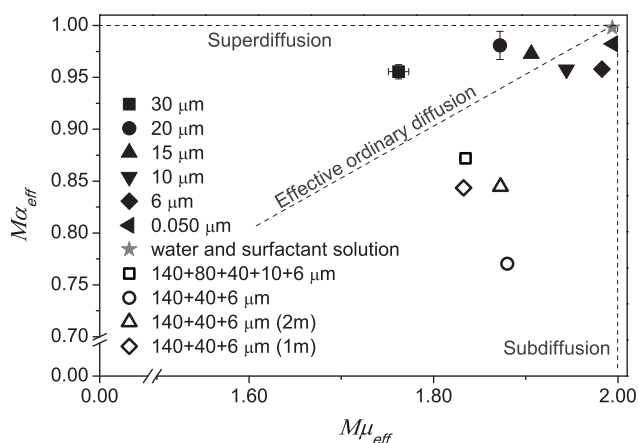


FIG. 2. $M\alpha_{eff}$ vs $M\mu_{eff}$ diagram for ordered samples (black filled symbols), disordered samples (empty symbols) and water and surfactant solution (star symbol). Dashed line $2M\alpha_{eff} = M\mu_{eff}$ represents the effective ordinary diffusion region in which $\langle x(t)^2 \rangle \propto t^{2\alpha/\mu} = t$. The two dashed lines $M\alpha_{eff} = 1$ and $M\mu_{eff} = 2$ delimit the regions of superdiffusion ($2M\alpha_{eff}/M\mu_{eff} > 1$) and subdiffusion ($0 < 2M\alpha_{eff}/M\mu_{eff} < 1$) regimes. Star symbol location ($\alpha = 1$ and $\mu = 2$) indicates proper ordinary diffusion.

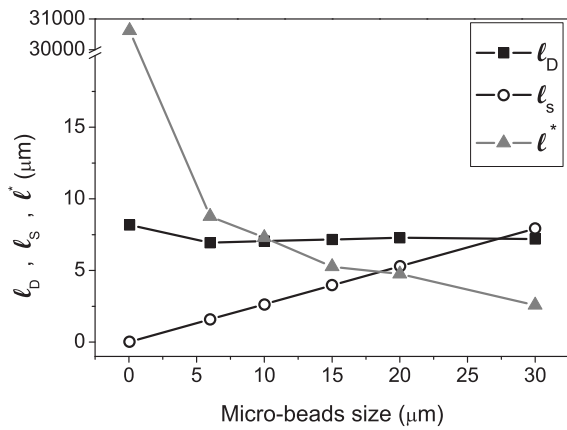


FIG. 3. Characteristic lengths l_D , l_s , and l^* as a function of micro-beads size in mono-d samples. This graph shows the dynamic feature of water in the presence of background gradients.

ordered and disordered samples, and assumes values slightly smaller than 2. Water diffusing in investigated poly-d samples has a non-negligible probability to experience broadly distributed resting times in this spatio-temporal window, resulting in an *effective* anomalous subdiffusive behavior quantified by the decreasing $M\alpha_{eff}$ value from unity, as system disorder degree increases. Because waiting times depend on pore sizes, number, and thickness of interconnections, a broad distribution in pore diameters (obtainable by mixing beads of different size) is expected to cause a broad distribution in *effective* “caging” (i.e., resting) times. It is reasonable to suppose that the power law type distribution of waiting times due to the broad distribution of the pore sizes, makes our investigated systems similar to fractal systems, at least in the range of diffusion times (100–1300) ms investigated. Due to the chemical-physical properties of Tween20 surfactant, a possible surface trapping effect of water molecules due to surfactant cannot be excluded.³⁵ A natural development of this work will be to measure fractal dimension of the porous system following a procedure similar to the one suggested by Özarşlan *et al.*⁵ Indeed, our results are similar in form (e.g., $\alpha = 2/d_w$, where d_w ^{36,37} is the fractal dimension of the Brownian motion path of the random walk) to the ones obtained by Özarşlan *et al.*⁵

In order to understand the physical meaning of the μ_{eff} parameter, which in principle accounts for an effective superdiffusion process, we guessed that the dependence of μ_{eff} on bead size may be spuriously determined by $\Delta\chi_m$ at the interface between beads and diffusing water. To validate this assumption, we obtained the plot of Fig. 4, which shows a strong linear correlation ($R = 0.996$) between $M\mu_{eff}$ and $\ln(MG_{int})$ for all mono-d samples. In particular, the higher the MG_{int} is, the lower the $M\mu_{eff}$ value is. Conversely, $M\alpha_{eff}$ does not depend on $\Delta\chi_m$ quantified by MG_{int} , as shown in Fig. 5.

C. Pseudo-superdiffusion

In the light of the correlations underlined in Sec. IV B, it is reasonable to assume that $M\mu_{eff}$ values less than 2 are spurious due to $\Delta\chi_m$, that introduces a pseudo-absorb/desorb

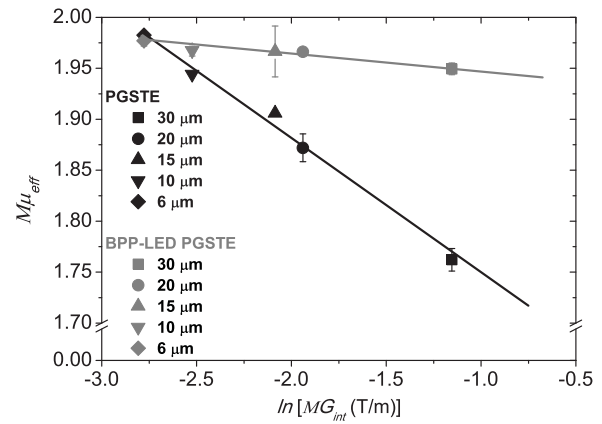


FIG. 4. $M\mu_{eff}$ as a function of MG_{int} , measured by PGSTE (black data points) and BPP-LED PGSTE (gray data points) NMR sequences. Black solid line is the regression line $M\mu_{eff} = (-0.1331 \pm 0.0061) \ln(MG_{int}) + (1.613 \pm 0.016)$, $R = 0.996$, while gray solid line is the regression line $M\mu_{eff} = (-0.0148 \pm 0.0031) \ln(MG_{int}) + (1.9351 \pm 0.0067)$, $R = 0.918$.

process of water molecules at the interface between bead surface and water solution, instead of a real superdiffusion mechanism. This is also shown in Fig. 3, which clearly illustrates that slow diffusion processes become predominant as mean pore diameter l_s increases. In particular, local gradients impart a phase shift to the spins within l^* region that adds up to the phase shift given by the diffusion gradient pulse. When background and diffusion gradients are of the same order of magnitude (as in the case of our samples), some spins contribute to increase the degree of PGSE signal attenuation; other spins, which can be in a very distant zone from the first ones, will acquire a phase which will help to increase the signal. Due to indistinguishable spins associated with water molecules, this scenario mimics a superdiffusion regime of water molecules whose signal disappears in one spot and appears in another one. In other words, we suggest that in the investigated micro-bead samples, the measured μ_{eff} values less than 2 are only due to an artifact effect generated by $\Delta\chi_m$ at the interface between beads and diffusing water. Indeed it is known that water behavior in these kind of interconnected micro-pore systems is Brownian or subdiffusive.^{23,39}

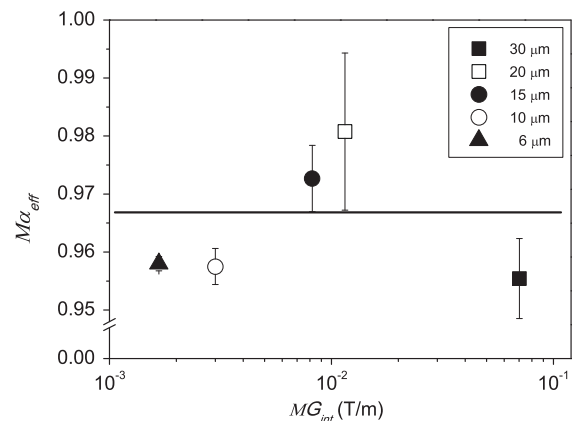


FIG. 5. $M\alpha_{eff}$ as a function of MG_{int} , measured by PGSTE NMR sequence. Solid line is the regression line $M\alpha_{eff} = (0.000 \pm 0.010) MG_{int} + (0.967 \pm 0.022)$, $R = 0.051$.

However, these artifacts, which simulate superdiffusion, provide information about different pore sizes. It is possible to reduce this spurious pseudo-superdiffusion effects, due to the influence of the coupling between the applied diffusion and internal magnetic field gradients, using bipolar instead of monopolar diffusion gradient pulses. Indeed, it is well known that, unlike monopolar, bipolar composite gradient pulses reduce effects of inhomogeneous background gradients.⁴⁰ In Fig. 4, black data points are obtained using monopolar PGSTE, while gray data points are obtained using bipolar diffusion gradients sequence. As expected, gray data are very close to $M\mu_{eff} = 2$ for all samples. As a consequence, Fig. 4 clearly illustrates that using bipolar diffusion gradients it is possible to eliminate, almost completely, any dependence on internal gradient from μ values. However, this also means to drastically reduce or eliminate the dependence of μ on beads size. In the light of these results, in order to study a real superdiffusion process, we suggest to use bipolar sequences, such as background gradient suppression PGSE sequences, recently developed to eliminate the spatially and temporally dependence of G_{int} .^{41–44} Conversely, in micro-structured systems in which anomalous subdiffusive or Gaussian diffusion regimes are expected to be the only possible one, it may be useful to measure μ without using bipolar gradients to maximize the effect of local G_{int} on μ measurements, in order to effectively discriminate samples characterized by different micro-structural size.

These observations give a basis for further investigations on the correlation between μ_{eff} and local G_{int} to obtain information on the microstructural size features in heterogeneous media. In this contest we have developed a μ -weighted NMR imaging protocol that defines interfaces between substances characterized by different $\Delta\chi_m$, better than is currently possible using T_2^* weighted imaging. In order to stress the importance of results illustrated here, we anticipate that the correlation between μ and G_{int} (that we wanted to highlight using PGSTE sequence without bipolar gradients) suggests that diffusion NMR imaging methods, that rely on collecting the signal decay by varying the gradient strength g , are in principle affected by $\Delta\chi_m$ artifacts. In particular, our results strongly suggest that the stretched exponential model recently introduced⁴⁵ to quantify the AD *in vivo*, is actually based on the quantification of the pseudo-superdiffusion, induced by $\Delta\chi_m$.^{46–48} In our opinion, our work explains some apparent inconsistencies between previous AD approaches based on g strength varying^{45,49} or on Δ varying,⁵ allowing a critical revision of previous literature on the AD applied to biological systems.⁴⁶ Last but not least, the correlation between μ and local G_{int} may help to give more insights into inter-molecular multi-quantum coherences (iMQCs) in liquid systems.⁵⁰ Indeed, it has been demonstrated that iMQCs offer a challenge to investigate porous media.^{51,52} However, their dependence on the interplay between internal gradients and molecular diffusion has yet to be clarified.

V. CONCLUSION

In the present paper, the *effective* CTRW model developed by Metzler and Klafter²¹ was used to experimentally

obtain both space and time fractional exponents, α and μ , of water molecules in different porous systems, by using NMR PGSE technique. Magin *et al.*⁵³ also developed a similar approach based on the fractional order differential operators in the Bloch-Torrey equation.⁵³ However, Magin's experimental application are limited to space fractional exponent (which Magin called β , while we call it μ) measurement only. In our opinion, as the AD approach described here does not require any particular *a priori* knowledge about the geometry and dynamical behavior of the investigated heterogeneous system, it may be a useful tool to probe porous materials and biological tissue microstructural characteristics. Here, we have measured the characteristic parameters of diffusion phase diagram, α and μ , by means of NMR in systems marked by the presence of spatio-temporal competition between effective long rests and apparent long jumps of diffusing molecules. Following the basic common knowledge of complex systems, we made ordered and disordered media using mono- and poly-dispersed micro-beads. We evaluated their disorder degree by measuring the α parameter, which quantifies subdiffusion processes and does not depend on $\Delta\chi_m$. Moreover, we highlighted that the real physical mechanism, which gives rise to an apparent superdiffusion, is due to $\Delta\chi_m$ between the solid and liquid phase in heterogeneous samples. Due to the peculiar ability of μ parameter of probing local $\Delta\chi_m$ to discriminate different microstructural sizes in heterogeneous media, the development of imaging methods based on μ contrast may be a new useful tool to study materials and biological tissues. Last but not least, inferring disorder features in heterogeneous media by NMR spectroscopic and imaging techniques may be of paramount value in a variety of applications from oil-well logging and dynamics of polymers to the diagnosis and monitoring *in vivo* of many diseases in the human body.

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