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Geometric Rényi divergence: A comparative measure with applications to atomic densities

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(Received 18 May 2011; published xxxxx)

An alternative one-parameter measure of divergence is proposed, quantifying the discrepancy among general probability densities. Its main mathematical properties include (i) comparison among an arbitrary number of functions, (ii) the possibility of assigning different weights to each function according to its relevance on the comparative procedure, and (iii) ability to modify the relative contribution of different regions within the domain. Applications to the study of atomic density functions, in both conjugated spaces, show the versatility and universality of this divergence.

DOI: 10.1103/PhysRevA.00.002500

PACS number(s): 31.10.+z, 31.15.-p, 02.50.Cw

I. INTRODUCTION

Many information-theoretic divergence measures between 16 two probability distributions have been introduced and ex-17 tensively studied from their mathematical properties [1-5]. 18 The applications of these measures can be found in the 19 analysis of contingency tables [6], the approximation of 20 probability distributions [7], signal processing [8], inference 21 problems [9], pattern recognition [10], biodiversity [11], 22 classification [12], homology [13], neural networks [14], 23 computational linguistics [15], study of electronic densities 24 [16–20], molecular similarity [21,22], texture and image 25 registration [23], sequence analysis [24], machine learning [25], artificial intelligence [26], fuzzy set theory [27], and 27 quantum-information theory [28], in particular as a measure 28 of entanglement [29]. 29

Among the proposed measures, the best known is the 30 Kullback-Leibler [30] divergence based on Shannon entropy 31 [31]. Since then, many other measures of divergence have 32 been proposed and studied, in particular by using both 33 local (Fisher) [32,33] and global (Shannon) [31] theoretic-34 information magnitudes. Some generalized entropies such as 35 the Rényi one [34] have also been used to formulate deeper 36 or more precise measures of discrepancy or distinguishability 37 [35]. Applications of similarity and divergence measures to the 38 study of atomic systems have been carried out in recent years, 39 including the use of the quantum similarity index (QSI) [18] 40 and the Jensen-Shannon divergence (JSD) [36]. 41

The recent development in knowledge-based chemical 42 research has created a surge of interest in chemical similarity or 43 dissimilarity. Molecular modeling, molecular similarity [37], 44 and quantitative structure activity relationship (QSAR) are 45 simple examples of such an interest [38]. More recently the 46 molecular quantum similarity framework has been used to 47 provide a new set of quantum quantitative structure-properties 48 relationship procedures (QQSPR) [39]. 49

The aim of this work is to propose, study, and apply a new one-parameter generalized divergence measure, the geometric Rényi divergence (GRD^(q)), which has important advantanges over other studied divergences. Such improvement mainly arises from the capability of $\text{GRD}^{(q)}$ to modify, by means of its characteristic parameter q, the relative contribution of relevant specific regions of the probability densities. The mathematical definition and properties of $\text{GRD}^{(q)}$ allow us to deal with arbitrary probability distributions, independently of their meaning or the specific fields of research, including all those previously mentioned.

We show the main properties of this divergence by compar-61 ing and studying a simple but highly hierarchical and organized 62 set of quantum systems. We study the one-particle densities 63 of atomic systems, in both conjugated spaces, which contain 64 all the physical and chemical information through density-65 functional theory [40]. The obvious motivation is that the 66 differences in the electronic charge densities of these species 67 could be related to the differences in their respective physi-68 cal and chemical properties, according to density-functional 69 theory and the Hohenberg-Kohn theorem [41]. 70

In this sense, especially remarkable are the applications 71 carried out in this work by means of $GRD^{(q)}$, namely, 72 (i) comparison among neutral atoms and interpretation in terms 73 of shell-filling-patterns, (ii) study of ionization processes by 74 analyzing the geometric divergence between the initial and 75 final systems (neutral and cation) and its connection with 76 the value of the ionization potential, (iii) study of divergence 77 among densities, for a given system, computed with different 78 models, and (iv) discrimination of whether an atom belongs to 79 a set of systems with identical nuclear charges. The results here 80 3 provided improve some of the aforementioned applications 81 performed by using other measures, such as the quantum 82 similarity index [18] or the Jensen-Shannon divergence [36]. 83 Further applications to other systems and/or processes of 84 physicochemical relevance (e.g., molecules and reactions) will 85 be provided elsewhere. 86

The paper is organized as follows. In Sec. II we define the geometric Rényi divergence, showing its main mathematical properties. Section III is devoted to the application of $GRD^{(q)}$ to the study of one-particle densities of atomic systems, and in Sec. IV we summarize the main results of this work.

II. GEOMETRIC RÉNYI DIVERGENCE

The so-called Jensen-Rényi divergence $(JRD^{(q)})$ was first onceived [42] as a measure of dissimilarity or divergence

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between two distribution functions, say $\rho_1(\vec{r})$ and $\rho_2(\vec{r})$, both of which are defined over the same d-dimensional domain 96 $\Delta \in \mathbb{R}^d$. In doing so, the nonlinearity of the Rényi entropy [34] 97

$$R^{(q)}(\rho) \equiv \frac{1}{1-q} \ln \omega^{(q)}(\rho), \qquad (1$$

according to the properties of the *q*th-order frequency moments 99

$$\omega^{(q)}(\rho) \equiv \int_{\Delta} \rho^{q}(\vec{r}) \, d\vec{r}, \qquad (2)$$

was taken into account. In this way, the deviation from linearity 100 allows us to define the Jensen-Rényi divergence between two 101 distributions as [42] 102

$$\operatorname{JRD}^{(q)}(\rho_1, \rho_2) = R^{(q)} \left(\frac{\rho_1 + \rho_2}{2}\right) - \frac{1}{2} [R^{(q)}(\rho_1) + R^{(q)}(\rho_2)],$$
(3)

which constitutes the difference between the Rényi entropy of the arithmetic mean and the arithmetic mean of the respective 104 Rényi entropies of ρ_1 and ρ_2 . Generalizations of this diver-105 gence have been provided very recently [35] by considering 106 mean values for an arbitrary number of distributions and their 107 associated weights: 108

$${}^{*}\mathrm{JRD}^{(q)}(\rho_{1},\ldots,\rho_{n})=R^{(q)}\left(\sum_{k=1}^{n}\alpha_{k}\rho_{k}\right)-\sum_{k=1}^{n}\alpha_{k}R^{(q)}(\rho_{k}),$$
(4)

with the weights verifying $\sum_{k=1}^{n} \alpha_k = 1$. 109

In what follows, the integration domain Δ will be omitted 110 in the notation unless necessary, for the sake of simplicity. We 111 will deal with normalized-to-unity distributions, a condition 112 which can be expressed as $\omega^{(1)}(\rho) = 1$. 113

Regarding the definition of JRD^(q), any order $0 < q \neq 1$ 114 can be considered, as far as the involved frequency moments 115 converge. The limiting case $q \rightarrow 1$ provides the so-called 116 Jensen-Shannon divergence [43,44], $JSD = JRD^{(1)}$, defined 117 as above but in terms of the Shannon entropy $S(\rho) \equiv$ 118 $-\int \rho(\vec{r}) \ln \rho(\vec{r}) d\vec{r}$ [31] instead of the Rényi one. This is due 119 to the limiting equality $S = R^{(1)}$ among entropies. 120

However, an essential constraint in performing studies 12 by means of $JRD^{(q)}$ has been the necessary condition of 122 considering the order q not above unity. The reason is that 123 the non-negativity of JRD^(q) is guaranteed only for $q \leq 1$, 124 while for q > 1 it does not have a definite sign. According 125 to the interpretation of $JRD^{(q)}$ as a measure of distance or 126 divergence among distributions, we must avoid values below 127 zero, as usually done for arbitrary metrics in a given space. 128

Let us recall Eqs. (1) and (4). We can express $JRD^{(q)}$ in 129 terms of frequency moments as 130

$$JRD^{(q)}(\rho_{1},...,\rho_{n}) = \frac{1}{1-q} \ln \frac{\omega^{(q)} \left(\sum_{k=1}^{n} \alpha_{k} \rho_{k}\right)}{[\omega^{(q)}(\rho_{1})]^{\alpha_{1}} \cdots [\omega^{(q)}(\rho_{n})]^{\alpha_{n}}}.$$
(5)

The non-negativity of JRD^(q) for q < 1 arises from the value 131 above unity of the fraction within the logarithm. The same 132 property of JRD^(q) for q > 1 would be verified in case of the 133 fraction being below unity, what is not necessarily true. 134

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To get a Rényi-like divergence measure, non-negative for 135 arbitrary order, we apply a different procedure in the present 136 work. The well-known generalized Hölder's inequality [45] 137 establishes that 138

$$\left[\int (f_1 f_2)^m d\vec{r}\right]^{1/m} \leqslant \left[\int f_1^s d\vec{r}\right]^{1/s} \left[\int f_2^t d\vec{r}\right]^{1/t}$$
(6)

for any m, s, t > 0 verifying $\frac{1}{m} = \frac{1}{s} + \frac{1}{t}$. An iterative use of 139 the above inequality allows us to assert that

$$\left[\int (f_1\cdots f_n)^m d\vec{r}\right]^{1/m} \leqslant \left[\int f_1^{p_1} d\vec{r}\right]^{1/p_1}\cdots \left[\int f_n^{p_n} d\vec{r}\right]^{1/p_n},$$
(7)

with $\sum_{i=1}^{n} \frac{1}{p_i} = \frac{1}{m}$. Through the identities $f_i = \rho_i^{q/p_i}$ for a 141 given q > 0, we obtain 142

$$\int (g_1^{\lambda_1} \cdots g_n^{\lambda_n})^q \, d\vec{r} \leqslant \left(\int g_1^q d\vec{r}\right)^{\lambda_1} \cdots \left(\int g_n^q d\vec{r}\right)^{\lambda_n}, \quad (8)$$

where $\lambda_i \equiv m/p_i$ summing up to unity as $\sum_{i=1}^{n} \lambda_i = 1$. We the matrix of the provide, for arbitrary q > 0, a quotient above unity the statement of and consequently with its logarithm being above zero. The 145 logarithm of the quotient is expressed in terms of frequency 146 moments as 147

$$\lambda_1 \ln \omega^{(q)}(\rho_1) + \dots + \lambda_n \ln \omega^{(q)}(\rho_n) - \ln \omega^{(q)} \left(\rho_1^{\lambda_1} \cdots \rho_n^{\lambda_n} \right) \ge 0,$$
(9)

or in terms of the Rényi entropies defined in Eq. (1) as

$$\operatorname{GRD}^{(q)}(\rho_1, \dots, \rho_n) \equiv (q-1) \left[R^{(q)} \left(\rho_1^{\lambda_1} \cdots \rho_n^{\lambda_n} \right) - \sum_{i=1}^n \lambda_i R^{(q)}(\rho_i) \right] \ge 0, \quad (10)$$

where the quantity $\text{GRD}^{(q)}$ will be referred to as the geometric 149 Rényi divergence of order q for the set of distributions $\{\rho_i\}$ 150 with weights $\{\lambda_i\}$. 151

Some comments are in order:

152 (1) Let us notice the strong resemblance between the terms 153 within brackets in Eq. (10) and those of the definition of 154 the Jensen-Rényi divergence $(JRD^{(q)})$ in Eq. (4). In fact, all 155 terms associated with individual distributions are identical, the 156 difference between both expressions being determined by the 157 multicomponent term. That term corresponds to the frequency 158 moment of the arithmetic mean of the distributions in the 159 $JRD^{(q)}$ case, while the geometric mean, instead, in $GRD^{(q)}$. 160

(2) The additional factor (q-1) guarantees the non-161 negativity of $\text{GRD}^{(q)}$ for any q > 0, including the nonzero 162 and finite-valued limiting case q = 1. Adding the same factor 163 in the definition of $JRD^{(q)}$ would not solve the problem of the 164 indefiniteness of sign for q > 1, as will be shown in Sec. III A. 165

(3) A particular case of physical relevance is obtained for 166 q = 2: 167

$$\operatorname{GRD}^{(2)}(\rho_1,\ldots,\rho_n) = \ln \frac{[D(\rho_1)]^{\lambda_1}\cdots[D(\rho_n)]^{\lambda_n}}{D(\rho_1^{\lambda_1}\cdots\rho_n^{\lambda_n})}, \quad (11)$$

where the functional $D(\rho)$ is the so-called disequilibrium, a 168 measure of departure of the distribution from uniformity [46]. 169

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¹⁷⁰ So, GRD⁽²⁾ for a set of distributions is expressed in terms of ¹⁷¹ the quotient between the geometric mean of their respective ¹⁷² disequilibria and the disequilibrium of the geometric mean ¹⁷³ of the distributions. Let us mention that the disequilibrium ¹⁷⁴ plays a relevant role also in what concerns the concept of ¹⁷⁵ shape complexity [47,48] and its physical interpretation for ¹⁷⁶ atomic [49] and molecular [50] systems.

(4) For clarity, we give below the simplest case of twodensities with uniform weights, namely,

$$GRD^{(q)}(\rho_1, \rho_2) = (q - 1) \{ R^{(q)}(\sqrt{\rho_1 \rho_2}) - \frac{1}{2} [R^{(q)}(\rho_1) + R^{(q)}(\rho_2)] \}, \quad (12)$$

¹⁷⁹ to be compared with Eq. (3). The arithmetic mean is replaced ¹⁸⁰ by the geometric one, obtaining a non-negative divergence ¹⁸¹ measure after including the factor (q - 1).

(5) GRD^(q) keeps other relevant properties of JRD^(q),
including (i) invariance under exchange of distributions,
(ii) additivity, and (iii) reaching the minimal value zero if
and only if all distributions are identical.

(6) Nevertheless, $GRD^{(q)}$ possesses an additional property 186 not shared with $JRD^{(q)}$. The geometric divergence of a set 187 of distributions is independent of the normalization of each 188 one within the set. Such an invariance under changes of 189 normalization also holds for $JRD^{(q)}$ as far as those changes 190 are identical for all distributions. In this sense, the comparison 191 among distributions established by means of $\text{GRD}^{(q)}$ is based 192 on a dissimilarity according to the shapes of the distributions, 193 rather than on sizes, masses, charges, or any other quantity for 194 which normalization is relevant. 195

(7) The main usefulness of the geometric Rényi divergence arises from its ability to modify the relative contribution of specific regions within the domain of definition in obtaining the divergence value, by varying appropriately the order q. This is a fundamental feature in applications to atomic systems, as will be discussed in the numerical analysis performed in the next section.

An illustrative example will allow us to understand better 203 the role played by the order q of GRD. Let us consider 204 two one-dimensional Gaussians, one of them centered at the 205 origin, $f(x) = e^{-x^2}$, and the other one centered at an arbi-206 trary point, $g(x) = e^{-(x-a)^2}$. Both have identical long-range 207 behaviors, but short-range dissimilarity will be determined 208 by the amount of the shift a. We compute straightforwardly 209 $\text{GRD}^{(q)}(f,g) = a^2 q/4$. We notice that for fixed $a \neq 0$, the 210 geometric divergence increases as q does, because of the 21 emphasis in the comparison based on short-range values. For 212 any fixed q, the saturation $\text{GRD}^{(q)}(f,g) = 0$ occurs for a = 0, 213 that is, f = g. 214

215 III. NUMERICAL ANALYSIS WITH ATOMIC 216 ONE-PARTICLE DENSITIES

The geometric divergence introduced in this work possesses useful features, especially relevant when compared to previous measures of divergence. Let us remark that, on the one hand, the characteristic parameter q (order) enables us to modify the relative contribution of specific regions for the comparative process among densities. On the other hand, its non-negativity makes possible the interpretation as a "mean distance" (not in

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a strict mathematical sense) among the distributions under comparison. The latter is true for any q > 0. Such is not the case for the pioneering measure of divergence built up by means of the Rényi entropy, namely, the Jensen-Rényi divergence. In Sec. II we mentioned that its non-negativity (necessary to be interpreted as a divergence) is guaranteed only for $q \leq 1$.

For illustration, both the Jensen-Rényi and the geometric 231 Rényi divergences between the one-particle densities of neutral 232 atoms He and Fr are displayed in Fig. 1 for $0 < q \leq 6$, in both 233 position and momentum spaces. The one-particle densities 234 of *N*-electron systems are defined from the wave function 235 $\Psi(\vec{r}_1, \ldots, \vec{r}_N)$ and its Fourier transform $\tilde{\Psi}(\vec{p}_1, \ldots, \vec{p}_N)$ as 236 follows: 237

$$\rho(\vec{r}) = \int |\Psi(\vec{r}, \vec{r}_2, \dots, \vec{r}_N)|^2 d\vec{r}_2 \cdots d\vec{r}_N$$
(13)

in position space, and

$$\gamma(\vec{p}) = \int |\tilde{\Psi}(\vec{p}, \vec{p}_2, \dots, \vec{p}_N)|^2 d\vec{p}_2 \cdots d\vec{p}_N \qquad (14)$$

in momentum space. Computations of $\rho(\vec{r})$ and $\gamma(\vec{p})$ for ²³⁹ neutral and ionized atomic systems will be done, throughout ²⁴⁰ this section, by means of accurate near-Hartree-Fock wave ²⁴¹ functions [51,52]. Atomic units (a.u.) will be used. ²⁴²

It is observed in Fig. 1 that, as we should expect, 243 $GRD^{(q)}(He,Fr)$ remains positive (in both spaces) within the 244 whole interval, in fact, for any q > 0. However, JRD^(q)(He,Fr) 245 reaches negative values for values of the order q above unity. 246 In this example, negativity of the Jensen-Rényi divergence is 247 observed for $q \ge 1.26$ in position space, and $1.08 \le q \le 3.00$ 248 in the momentum one. Let us notice the existence of values 249 of q for which $JRD^{(q)}(He,Fr) = 0$, in spite of dealing with 250 two different distributions. So, the requirement of having null 251 divergence if and only if the distributions under comparisons 252 are identical is also violated. 253

FIG. 1. Jensen-Rényi $(JRD_r^{(q)})$ and geometric Rényi $(GRD_r^{(q)})$ divergences between charge densities of He and Fr neutral atoms, for q = 0.4 and q = 2.



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FIG. 2. $\text{GRD}_r^{(q)}(\text{Ar}, Z)$ and $\text{GRD}^{(q)}(\text{Ca}, Z)$ in position space, for q = 0.4 and q = 2 of both argon and calcium with respect to neutral atoms $1 \leq Z \leq 103$.

A. Neutral atoms

The purpose of a study based on the divergence among 255 atomic one-particle densities is to give an answer to the follow-256 257 ing question: to what extent is the similarity or divergence of those densities related to how similar or different the physical 258 and chemical properties of the corresponding atomic systems 259 are? The same question is appropriate in the frameworks of 260 a great variety of scientific and technological fields, such as 261 molecular systems, reaction processes, image registration, and 262 analysis of DNA sequences. 263

Let us consider, at a first stage, two significantly different 264 atoms, such as argon (a noble gas, nuclear charge Z = 18) 265 and calcium (an alkaline earth metal, Z = 20). We compare, 266 in Fig. 2, each of their charge densities $\rho(\vec{r})$ with all those of 267 neutral atoms throughout the whole Periodic Table (Z = 1– 268 103). In doing so, the uniformly weighted geometric Rényi 269 divergence (GRD^(q)) in Eq. (12) is employed for orders q =270 0.4 and q = 2. Differences among the results obtained for each 271 value of q are apparent: very "soft" and almost identical curves 272 for both Ar and Ca are obtained with q = 2, while numerous 273 local extrema appear for q = 0.4 with the structures of the 274 curves being extremely different from one another. 275

To justify these results from a physical point of view, 276 it is worth remarking that the main atomic physical and 277 chemical properties are determined by the shell structure 278 and, in particular, by the characteristics (quantum numbers, 279 occupancy, etc.) of the outermost subshell (valence region). 280 The computation of $\text{GRD}^{(q)}$ requires the computation of the 281 qth-order frequency moments of each density and also of their 282 geometric mean. Due to the exponential long-range behavior 283 of the atomic charge densities, the relative contribution of the 284 outermost region to the computation of the integrals involved 285 is very small compared to that of the core. Such a contribution 286 can be enhanced by raising the density to a relatively small 287 power, as done when considering frequency moments of lower 288 orders. Diminishing the value of q = 2 up to q = 0.4 allows 289 us to gain enough information regarding valence features such 29 that GRD^(q) reveals in most cases whether the systems under 29



FIG. 3. $\text{GRD}_r^{(q)}(Z, Z')$ of order q = 0.4, in position space, of each alkali metal (Z' = 3, 11, 19, 37, 55, 87) and neutral atoms $1 \le Z \le 103$.

comparison share the above-mentioned features (e.g., if they 292 belong to the same group of the Periodic Table). However, 293 the closeness between both curves for q = 2 is due to the 294 similar values of their nuclear charges (18 and 20), together 295 with the enhancement, for the computation of integrals, of 296 the surroundings of the nuclei, where the attractive potential 297 governed by the nuclear charge Z determines (roughly) the 298 shape and magnitude of the electronic cloud. A detailed 299 discussion on the patterns for the appearance of extrema is 300 carried out in the next figure. 301

Six curves are drawn in Fig. 3, corresponding to the 302 position-space $\text{GRD}_r^{(q)}$ with q = 0.4 between each alkaline 303 metal (group IA) and all neutral atoms with $1 \leq Z \leq 103$. 304 The similar structure of all curves, appearing almost perfectly 305 embedded, is clearly observed. A detailed analysis of the 306 location of maxima and minima results in the following 307 observations: 308

(1) An almost systematic appearance of local minima occurs 309 when comparing any of the above-mentioned systems with an-310 other one belonging to its own group (Z = 3, 11, 19, 37, 55, 87). 311 These minimum values should be interpreted as a low 312 divergence among systems that share the fundamental features 313 at the valence region and, consequently, have similar physic-314 ochemical properties. Those minima correspond to the main 315 6 ones observed in Fig. 3. 316

(2) The opposite occurs when comparing alkali metals with 317 noble gases, with higher values (local maxima) of divergence. 318 Let us recall the predisposition of alkali metals for reactivity, 319 while noble gases (Z = 2, 10, 18, 36, 54, 86) are conformed 320 so as to keep their closed-shell structure. According to the 321 meaning of the divergence measure here considered, a high 322 divergence should be expected, based on the one-particle 323 densities, when comparing a pair of systems that are so 324 different from a physical point of view. The appearance of 325 local maxima when comparing alkali-metal-noble-gas atoms 326 is absolutely systematic now. 327 7

(3) A number of additional extrema, not so relevant as ³²⁸ for the above discussed, appear in each curve. The systems ³²⁹ corresponding to minima can be classified, roughly, in two ³³⁰

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³³¹ different groups: (i) non-alkali-metal systems with a unique ³³² electron at the valence subshell (Z = 13,31,49,81), and ³³³ (ii) systems suffering from anomalous shell filling (Z =³³⁴ 29,79,93). This similarly occurs for maxima, some of ³³⁵ them corresponding to (i) closed-subshell systems (Z =³³⁶ 12,30,48,80) and (ii) anomalous shell filling again (Z =³³⁷ 42,44,46,58,64,90,97).

In comparing a given system with all others throughout the 338 Periodic Table, the structural features of the curves in position 339 space, in what concerns the number and enhancement of 340 extrema, are very apparent as far as q decreases. The opposite 341 trend is observed in the momentum-space comparison, in the 342 sense of having curves with a higher structure as far as q343 becomes higher. The reason for those trends in opposite spaces 344 requires us again to consider the enhancement of the relative 345 contributions of the valence and core regions. 346

B. Ionization processes

Our next purpose is to analyze the effects arising from 348 the physical process of atomic ionization, attending to the 349 changes experienced by the one-particle densities of the system 350 considered. In doing so, we employ the geometric Rényi 35 divergence in order to compare the respective densities of 352 the initial and final products (that is, the neutral atom and 353 the singly charged cation) involved in this physical process. 354 Within this context, we employ the notation $\text{GRD}^{(q)}(\text{NC})$ for 355 the neutral-cation comparison in a given space. 356

For illustration, we consider the analysis in position 357 space, i.e., for the quantity $\text{GRD}_r^{(q)}(\text{NC})$, with NC pairs of 358 nuclear charges $3 \leqslant Z \leqslant 55$, and consequently each system 359 containing a number of electrons up to 54. This quantity is 360 displayed in Fig. 4 for different values of q, together with an 361 algebraic function of the atomic ionization potential (AIP). 362 This function of AIP is considered, instead of the actual AIP, 363 in order to make easier the interpretation of the correlation 364

³⁶⁵ observed among the divergence and AIP values.

In what concerns $\text{GRD}^{(q)}(\text{NC})$ for the considered q's, some comments are in order:

(1) Systems displaying (in Fig. 4) higher values (local
maxima) of divergence between the neutral and ionized species
can be classified as follows:

- (a) Z = 3,11,19,37,55 (alkali metals) for which the ionization left empty the valence *s* subshell of the neutral atom, and the resulting cation possesses a closed-shell structure. These maxima occur in all curves with the exception of q = 2, a value too high to avoid the masking effect arising from the relatively sparse information on the valence features compared to the core ones.
- ³⁷⁸ (b) Similarly for Z = 5, 13, 31, 49, but with the *p* subshell ³⁷⁹ disappearing. The previous comment regarding the excep-³⁸⁰ tion q = 2 applies also to these systems. Additionally, a *d* ³⁸¹ subshell becomes empty for Z = 39, but a value as low as ³⁸² q = 0.2 is needed r to detect it as a local maximum. Each ³⁸³ of these systems provides (or not) a maximum according ³⁸⁴ to the value of q.
- (c) Z = 8,16,34,52 correspond to systems for which the outermost *p* subshell becomes half-filled. In this sense, we should emphasize the capability of $\text{GRD}^{(q)}(\text{NC})$ to discriminate systems with hall-filled valence subshells

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FIG. 4. $\text{GRD}_r^{(q)}(\text{NC})$ between a neutral atom (N) and its singlycharged cation (C) with $3 \le Z \le 55$, and phenomenological correspondence with the atomic ionization potential (AIP) of the neutral system.

from others with a number of electrons (there) different ³⁸⁹ 11 from half the occupation number. These systems are ³⁹⁰ displayed as maxima for all q < 1, while none for q = 2. ³⁹¹ (d) Additional maxima are found for Z = (23 or 24), ³⁹²

(d) Additional maxima are found for Z = (23 or 24), 392 (one of 27,28,29),42,45,47, depending on the curve. All 393 these systems are characterized by an ionization process 394 with the ejection of an electron from an inner *s* subshell, 395 instead of the outermost one (3*d* or 4*d*). The only ones 396 associated with maxima for q = 2 are Z = 23,27,42. The 397 others require values of *q* below unity. 398

(2) The display of low divergence (some local minima) of 399 divergence in Fig. 4 corresponds to closed-shell and closed-400 subshell systems (Z = 4, 10, 12, 18, 30, 3648, 54), the range of 401 q for which they appear as minima depends on the specific 402 systems considered. The subshell from which the electron is 403 ejected remains occupied in the cation, and, consequently, 404 changes in one-particle densities arising from the ionization 405 are not so strong because of the presence of exactly the same 406 occupied orbitals in the neutral atoms and its cation. 407

(3) There exists a clear resemblance between the divergence 408 of pairs NC and the value of the AIP of the neutral system. 409 The complete list of the 15 local minima of AIP for the 410 systems here considered (displayed in Fig. 5 as maxima in 411 the corresponding curve, due to the functional fit employed) is 412 Z = 3,5,8,13,16,19,23,28,31,34,37,47,49,55. Let us notice 413 that all these systems are included in the total list of high-414 divergence pairs. 415

To justify these results, let us notice that most systems with low AIP possess a valence subshell (independent of being the outermost one or not) containing a unique electron. Their ionization provokes the disappearance of that subshell, which translates in terms of changes experienced by the one-particle densities into a high value of the neutral-cation divergence. 421

Regarding the ionization analysis, we finally mention that similar conclusions to those here discussed, on the basis of the position-space densities, are obtained from the same analysis in momentum space. 422

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FIG. 5. $\text{GRD}_{*}^{(q)}(Z^+, Z^{2+}, Z')$ among singly and doubly charged cations with nuclear charge $3 \le Z \le 12$, together with a neutral system of nuclear charge $1 \leq Z' \leq 103$. A threshold of GRD values appears amplified in the inset.

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C. Further applications

1. Computational models

We consider the extent to which the use of more simplified 428 or sophisticated models for computing the wave function 429 provokes more or less significant differences among the 430 corresponding one-particle densities. To give a well-posed 431 answer, it is first necessary to establish a quantitative measure 432 of difference among densities. The $\text{GRD}^{(q)}$ divergence has 433 been employed, both theoretically and numerically through 434 this work, with the aim of quantifying how different two (or 435 more) densities are. 436

In this sense, we could assert with a quantitative basis if, for 437 instance, taking into account relativistic effects or correlations 438 is worth doing in the study of multielectronic systems in terms 439 of one-particle densities. Perhaps differences could be relevant 440 when comparing wave functions, but not so important when 441 dealing with densities. Similar analyses would be useful also 442 for a comparative study of relevant distributions in physical 443 systems (e.g., molecules and clusters), arising within different 444 theoretical and/or numerical frameworks. 445

Let us analyze the effect of the interelectronic repulsion in 446 the structural properties of the atomic charge and momentum 447 densities. In doing so, we compute the densities using two 448 different models: the accurate near-Hartree-Fock (HF) one 449 employed for previous applications in this work, and the 450 so-called bare Coulomb field (BCF) model [54], in which the 45 interelectronic repulsive term of the Hamiltonian is neglected. 452 This simplification provides a description of the multielec-453 tronic system as a superposition of hydrogenlike orbitals, in 454 both spaces. The BCF system consists of a number of electrons 455 within the attractive nuclear attraction, but noninteracting 456 among themselves via repulsive forces. 457

Neglecting the interelectronic repulsion will provoke more 458 or less significant changes in going from the HF situation 459 to the BCF one. According to the previous description of 460 these models, one should expect a more significant divergence 461 among the HF and BCF densities as the number of electrons 462

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N increases (with N = Z for neutral atoms, that is, those here 463 considered). This would result from the much higher neglect 464 of interelectronic repulsive forces that occurs for high N. 465 14

Certainly an increasing trend is observed for the HF-BCF 466 divergence curves. However, none is strictly increasing, but 467 local extrema appear whose number and enhancement depend 468 15 on the order q considered. Locations of maxima and minima 469 are determined by the shell structure, as also observed in 470 the two previous applications. These comments apply in both 471 spaces. 472

The main conclusion regarding the present comparison 473 among densities computed within the HF and BCF models 474 is that the effects of the interelectronic repulsion on the atomic one-particle densities depend not only on the total number of 476 electrons but also on the shell-filling features of the systems 477 considered. 478

2. Discrimination of nuclear charges

It is worth remembering the capability of the geometric 480 Rényi divergence to quantify the divergence of a number 481 of functions higher than 2. The interpretation as a "mean 482 distance" among two or more functions remains, independent 483 of the number of densities considered. For simplicity, we 484 restricted all previous applications in this work to one-to-one 485 comparisons. 486

Nevertheless, there exist additional applications of $\text{GRD}^{(q)}$ 487 among a set of distributions. We find it interesting to show one 488 of them in the present work, but additional applications will 489 be provided elsewhere. 490

Let us consider a number of atomic one-particle densities 491 corresponding to systems sharing a specific property. Now we 492 include in that set an additional distribution. A new question 493 appears appropriate within this context: could we determine, 494 in terms of the $\text{GRD}^{(q)}$ values, if the system added to the initial 495 set shares the specific features which characterize the initial 496 set? We provide here an example for which $GRD^{(q)}$ appears 497 16 able to discriminate if the system added belongs or not to the 498 initial set according to the features which characterize the set. 499

Consider a pair of cations with identical nuclear charge Z, one of them singly charged and the other doubly charged. 501 We denote them as Z^{+1} and Z^{+2} , where the superscripts 502 correspond to the respective global charges. Let us notice that 503 a pair of systems as chosen above share the property of having 504 the same nuclear charge Z. Now we add to this two-element 505 set a third system: a neutral atom (global charge zero) with 506 nuclear charge Z'. To perform the study of the uniformly 507 weighted three-density divergence $\text{GRD}_r^q(Z^{+1}, Z^{+2}, Z')$, we 508 choose q = 2 for illustration. For the doubly charged ion, 509 we use the near-Hartree-Fock wave functions of Ref. [53] 510 17 for isoelectronic series with a number of electrons N = 2-10. 511 They allow us to consider, for the present comparative purpose, 512 values of the nuclear charges in the range Z = 3-12 for the 513 systems comprising the initial set. 514

In Fig. 5, each curve corresponds to the election of Z for 515 the initial two cations. Consequently, ten curves are displayed 516 (Z = 3-12), each one as a function of $1 \leq Z' \leq 103$, the 517 nuclear charge of the neutral atom added to the previous set. 518 The first observation from Fig. 5 is the unimodal shape of 519 all curves, decreasing quickly as Z' increases, until reaching 520

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a minimum value (which is shown amplified in the inset) 521 and increasing hereinafter. It is observed that the absolute 522 minima occur when Z' = Z in each curve. The horizontal 523 line establishes a threshold in the following sense: values 524 of $\text{GRD}_r^{(2)}(Z^{+1}, Z^{+2}, Z')$ above the aforementioned threshold 525 allow us to assert that the neutral system added does not share 526 the nuclear charge of the first two cations, that is, $Z' \neq Z$. 527 However, any value below the line corresponds, necessarily, 528 to the comparison of three systems with the same nuclear 529 charge, which means that Z' = Z. 530

Summarizing this application, $\text{GRD}^{(q)}$ has been shown to 53 be a useful tool for discriminating atomic systems, in the sense 532 of the ability to determine if a system added to a set of atoms 533 characterized by some physical properties should belong to 534 that set, or, in other words, if the new atom included in the set 535 shares the properties common to all the others. 536

Further applications will be provided elsewhere. They 537 should include (i) the use of different values of q, 538 (ii) employment of weights other than the uniform ones, and 539 (iii) a study based on properties (e.g., long-range behaviors) 540 associated with the outermost regions, instead of the inner ones 541 as done here. 542

IV. CONCLUSIONS AND OPEN PROBLEMS 543

An alternative measure of dissimilarity among probability 544 distributions, the geometric Rényi divergence has been intro-545 duced in the present work. It is expressed in terms of the Rényi entropy, as also happens with the well-known Jensen-Rényi 547 divergence. Both measures include a positive characteristic 548 parameter in their definitions. The interpretation of JRD as a 549 divergence measure constrains the parameter to values below 550 unity, while no constraints at all are imposed on the GRD 551 divergence. 552

The GRD statistical measure of divergence is used to 553 compare atomic one-particle densities. The capability of GRD 554 to gain physical insight into the structural properties of 555 many-electron systems has been shown. In doing so, we have 556 taken advantage of its characteristic parameter in order to 557 enhance or diminish the short- and long-range contributions in 558 a divergence-based analysis. The geometric Rényi divergence 559 allows us to deal with a set of an arbitrary number of

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density functions, assigning different weights to each one in 561 accordance with their roles within the comparative purpose 562 considered. For atomic systems, a study based on one-particle 563 densities in both position and momentum spaces provides 564 clearly an interpretation by means of shell structure. 565

A detailed numerical analysis clearly established the re-566 lationship between valence subshell properties of the systems 567 under comparison and the GRD values, as well as the detection 568 of the presence of systems suffering from anomalous shell 569 filling. The usefulness of the tool here defined has been shown 570 in the study of ionized systems, by considering the analysis 571 of atomic neutral-cation pairs. A strong resemblance appears 572 among the extrema of divergence and those of the atomic ionization potential, mostly determined by occupancy numbers of the outermost subshell in neutral and cationic systems. 575 Further applications of the generalized index, arising from its 576 rigorous mathematical properties here described, have been 577 carried out in this work, including studies (i) on the ability 578 in comparing different quantum models, and (ii) detection of 579 systems which do or do not share specific physical properties 580 **18** with their partners within an atomic set. 581

Additional studies are planned to be performed in a near 582 future: (i) use of more sophisticated atomic models including 583 relativistic effects and/or correlations, (ii) comparing more 584 that two functions, e.g., sequence anion-neutral-cation, groups 585 or periods of the Periodic Table, isoelectronic series, and subsystems of a given composite system, (iii) assigning 587 appropriate weights to each system according to relevant 588 physical and/or chemical properties, such as mass, number of 589 electrons, and volume, and (iv) other quantum systems (e.g., 590 molecules) and processes (reaction or excitation). It is worth 591 remarking that the universality of GRD, in what concerns its 592 definition and mathematical properties, allows its use in a wide 593 variety of fields. systems, and processes, far beyond atoms, 594 molecules, or reactions. 595

ACKNOWLEDGMENTS

This work was supported in part by the Spanish MICINN Project FIS-2008-02380, and the Grants No. FQM-4643 and 598 No. FQM-2445 of Junta de Andalucía. The authors belong to 599 the Andalusian research group FQM-020. 600

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