## STATISTICAL MECHANICS AT THE EDGE OF CHAOS

- HIGH ENERGY PHYSICS AND PLASMAS


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## Ettore MAJORANA

The value of statistical laws in physics and social sciences.
Original manuscript in Italian published by G. Gentile Jr. in Scientia 36, 58 (1942); translated into English by R. Mantegna (2005).

This is mainly because entropy is an additive quantity as the other ones. In other words, the entropy of a system composed of several independent parts is equal to the sum of entropy of each single part. [...]
Therefore one considers ALL possible internal determinations as equally probable. This is indeed a new hypothesis because the universe, which is far from being in the same state indefinitively, is subjected to continuous transformations. We will therefore admit as an extremely plausible working hypothesis, whose far consequences could sometime not be verified, that ALL the internal states of a system are a priori equally probable in specific physical conditions. Under this hypothesis, the statistical ensemble associated to each macroscopic state $A$ turns out to be completely defined.

## ENTROPIC FUNCTIONALS

|  | $\begin{aligned} & p_{i}=\frac{1}{W}(\forall i) \\ & \text { equiprobability } \end{aligned}$ | $\begin{gathered} \forall p_{i}\left(0 \leq p_{i} \leq 1\right) \\ \left(\sum_{i=1}^{W} p_{i}=1\right) \end{gathered}$ | additive <br> Concave <br> Extensive <br> Lesche-stable |
| :---: | :---: | :---: | :---: |
| $\begin{aligned} & \text { BG entropy } \\ & \qquad(q=1) \end{aligned}$ |  | $-k \sum_{i=1}^{W} p_{i} \ln p_{i}$ | Lesche-stable <br> Finite entropy production per unit time <br> Pesin-like identity (with largest entropy production) |
| Entropy $S q$ <br> ( $q$ real) <br> Possible | $k \frac{W^{1-q}-1}{1-q}$ | $k \frac{1-\sum_{i=1}^{W} p_{i}^{q}}{q-1}$ | largest entropy production) <br> Composable (unique trace form; Enciso-Tempesta) <br> Topsoe-factorizable (unique) <br> Amari-Ohara-Matsuzoe conformally invariant geometry (unique) |
| Boltzmann | Gibbs statistical me Phys. 52, 479 (1988 | hanics <br> ) <br> nona | Biro-Barnafoldi-Van thermostat universal independence (unique) ditive (if $q \neq 1$ ) |

DEFINITIONS : $q$-logarithm: $\ln _{q} x \equiv \frac{x^{1-q}-1}{1-q} \quad\left(x>0 ; \ln _{1} x=\ln x\right)$

$$
q-\text { exponential : } \quad e_{q}^{x} \equiv[1+(1-q) x]^{\frac{1}{1-q}} \quad\left(e_{1}^{x}=e^{x}\right)
$$

Hence, the entropies can be rewritten :

|  | equal probabilities | generic probabilities |
| :--- | :---: | :---: |
| BG entropy <br> $(q=1)$ | $k \ln W$ | $k \sum_{\mathrm{i}=1}^{\mathrm{W}} p_{i} \ln \frac{1}{p_{i}}$ |
| entropy $S_{q}$ <br> $(q \in R)$ | $k \ln _{q} W$ | $k \sum_{\mathrm{i}=1}^{\mathrm{W}} p_{i} \ln \frac{1}{p_{i}}$ |

Various!
Santos 1997 theorem
Abe 2000 theorem
Topsoe 2005
(factorizability in Game Theory)
Amari-Ohara-Matsuzoe 2012
(conformally invariant geometry)
Biro-Barnafoldi-Van 2015
(thermostat universal independence)
Enciso-Tempesta 2017 theorem

## Enciso-Tempesta 2017 theorem:

- An entropic functional is trace-form if it can be written as

$$
S\left(\left\{p_{i}\right\}\right)=k \sum_{i} f\left(p_{i}\right)=k \sum_{i} p_{i} \frac{f\left(p_{i}\right)}{p_{i}} \equiv k \sum_{i} p_{i} \ln _{G} \frac{1}{p_{i}}=\left\langle\sigma\left(p_{i}\right)\right\rangle
$$

where $\sigma\left(p_{i}\right) \equiv \ln _{G} \frac{1}{p_{i}} \equiv$ generalized surprise (or generalized unexpectedness) [ $\sigma(p)$ increases monotonically from $\sigma(1)=0$ to its maximal value $\sigma(0)]$

- An entropic functional is composable if, for independent $A$ and $B$,

$$
\frac{S(A+B)}{k}=\Phi\left(\frac{S(A)}{k}, \frac{S(B)}{k} ;\{\eta\}\right)
$$

where $\Phi(x, y ;\{\eta\})$ is a smooth enough function satisfying

$$
\begin{array}{lc}
\Phi(x, y ;\{0\})=x+y & \text { (additivity) } \\
\Phi(x, 0 ;\{\eta\})=x & \text { (null-composability) } \\
\Phi(x, y ;\{\eta\})=\Phi(y, x ;\{\eta\}) & \text { (symmetry) } \\
\Phi(x, \Phi(y, z ;\{\eta\}) ;\{\eta\})=\Phi(\Phi(x, y ;\{\eta\}), z ;\{\eta\}) & \text { (associativity) }
\end{array}
$$

$\mathrm{S}_{q}$ is the unique entropic functional which simultaneously is trace-form, composable and includes $\mathrm{S}_{B G}$ as particular case.


ADDITIVITY: O. Penrose, Foundations of Statistical Mechanics: A Deductive Treatment (Pergamon, Oxford, 1970), page 167

An entropy is additive if, for any two probabilistically independent systems $A$ and $B$,

$$
S(A+B)=S(A)+S(B)
$$

Therefore, since

$$
\frac{S_{q}(A+B)}{k}=\frac{S_{q}(A)}{k}+\frac{S_{q}(B)}{k}+(1-q) \frac{S_{q}(A)}{k} \frac{S_{q}(B)}{k}
$$

$S_{B G}$ and $S_{q}^{\text {Renyi }}(\forall q)$ are additive, and $S_{q}(\forall q \neq 1)$ is nonadditive .

$$
\text { Equivalently, } \quad S_{q}(A+B)=S_{q}(A)+S_{q}(B)+\frac{1-q}{k} S_{q}(A) S_{q}(B)
$$

## EXTENSIVITY:

Consider a system $\Sigma \equiv A_{1}+A_{2}+\ldots+A_{N}$ made of $N$ (not necessarily independent) identical elements or subsystems $A_{1}$ and $A_{2}, \ldots, A_{N}$.
An entropy is extensive if

$$
0<\lim _{N \rightarrow \infty} \frac{S(N)}{N}<\infty \text {, i.e., } S(N) \propto N(N \rightarrow \infty)
$$

EXTENSIVITY OF THE ENTROPY $(N \rightarrow \infty)$
$W \equiv$ total number of possibilities with nonzero probability, assumed to be equally probable
$\begin{array}{rlrl}\text { If } W(N) & \sim \mu^{N} \quad(\mu>1) \Rightarrow S_{B G}(N)=k \ln W(N) \propto N & O K! \\ \text { If } W(N) & \sim N^{\rho} \quad(\rho>0) & \\ & \Rightarrow S_{q}(N)=k \ln _{q} W(N) \propto[W(N)]^{1-q} \propto N^{\rho(1-q)} & \\ & \Rightarrow S_{q=1-1 / \rho}(N) \propto N & O K!\end{array}$
If $W(N) \sim v^{N^{\gamma}} \quad(v>1 ; 0<\gamma<1)$

$$
\Rightarrow S_{\delta}(N)=k[\ln W(N)]^{\delta} \propto N^{\gamma \delta} \Rightarrow S_{\delta=1 / \gamma}(N) \propto N \quad O K!
$$

If $W(N) \sim D \ln N \quad(D>0)$

$$
\begin{aligned}
& \Rightarrow S_{\lambda}^{C}(N)=k\left[e^{\lambda W(N)}-e^{\lambda}\right] \Rightarrow S_{\lambda}^{C}(N) \sim k N^{\lambda D} \\
& \Rightarrow S_{\lambda=1 / D}^{C}(N) \propto N
\end{aligned}
$$

IMPORTANT: $\mu^{N} \gg v^{N^{\gamma}} \gg N^{\rho} \gg \ln N$ if $N \gg 1$
All happy families are alike; each unhappy family is unhappy in its own way.
Leo Tolstoy (Anna Karenina, 1875-1877)

| SYSTEMS $W(N)$ (equiprobable) | ENTROPY $S_{B G}$ <br> (ADDITIVE) | $\begin{gathered} \text { ENTROPY }_{q} \\ (q \neq 1) \\ \text { (NONADDITIVE) } \end{gathered}$ | $\begin{aligned} & \text { ENTROPY } S_{\delta} \\ & \quad(\delta \neq 1) \\ & \text { (NONADDITIVE) } \end{aligned}$ | $\begin{gathered} \text { ENTROPY } S_{\lambda}^{\mathrm{C}} \\ (\lambda>0) \\ (\text { NONADDITIVE) } \end{gathered}$ |
| :---: | :---: | :---: | :---: | :---: |
| $\sim A \mu^{N}(A>0, \mu>1)$ | EXTENSIVE | NONEXTENSIVE | NONEXTENSIVE | NONEXTENSIVE |
| $\sim B N^{\rho}(B>0, \rho>0)$ | NONEXTENSIVE | EXTENSIVE $(q=1-1 / \rho)$ | NONEXTENSIVE | NONEXTENSIVE |
| $\sim C V^{N^{\gamma}}(C>0, v>1,0<\gamma<1)$ | NONEXTENSIVE | NONEXTENSIVE | EXTENSIVE $(\delta=1 / \gamma)$ | NONEXTENSIVE |
| $\sim D \ln N(D>0)$ | NONEXTENSIVE | NONEXTENSIVE | NONEXTENSIVE | EXTENSIVE $(\lambda=1 / D)$ |

A theory is the more impressive the greater the simplicity of its premises is, the more different kinds of things it relates, and the more extended is its area of applicability. Therefore the deep impression that classical thermodynamics made upon me. It is the only physical theory of universal content concerning which I am convinced that, within the framework of applicability of its basic concepts, it will never be overthrown.

Albert Einstein (1949)

## COMPOSITION OF VELOCITIES OF INERTIAL SYSTEMS ( $\mathrm{d}=1$ )

$$
\begin{array}{ll}
v_{13}=v_{12}+v_{23} & \quad \text { (Galileo }) \\
v_{13}=\frac{v_{12}+v_{23}}{} & (\text { Einstein })
\end{array}
$$

Newton mechanics:
It satisfies Galilean additivity but violates Lorentz invariance (hence mechanics can not be unified with Maxwell electromagnetism)

Einstein mechanics (Special relativity): It satisfies Lorentz invariance (hence mechanics is unified with Maxwell electromagnetism) but violates Galilean additivity

Question: which is physically more fundamental, the additive composition of velocities or the unification of mechanics and electromagnetism?

## Planck 1900:

$$
\begin{aligned}
l_{P} \equiv \text { Planck length } & =\sqrt{\frac{h G}{c^{3}}}=4.13 \times 10^{-33} \mathrm{~cm} \\
m_{P} \equiv \text { Planck mass } & =\sqrt{\frac{h c}{G}}=5.56 \times 10^{-5} \mathrm{~g} \\
t_{P} \equiv \text { Planck time } & =\sqrt{\frac{h G}{c^{5}}}=1.38 \times 10^{-43} \mathrm{~s} \\
T_{P} \equiv \text { Planck temperature } & =\frac{1}{k_{B}} \sqrt{\frac{h c^{5}}{G}}=3.50 \times 10^{32}{ }^{\circ} \mathrm{K}
\end{aligned}
$$

$1 / c \neq 0 \Rightarrow$ Newtonian mechanics $\rightarrow$ Special relativity
[Galileo transformation $\rightarrow$ Lorentz transformation]
$G \neq 0 \quad \Rightarrow$ Special relativity $\rightarrow$ General relativity [emergence of curvature of space-time]
$h \neq 0 \quad \Rightarrow$ Newtonian mechanics $\rightarrow$ Quantum mechanics [not all physical observables can be simultaneously known]
$1 / k_{B} \neq 0 \Rightarrow$ Boltzmann-Gibbs statistical mechanics $\rightarrow$ Nonextensive statistical mechanics [emergence of entropic nonadditivity]

# On a $q$-Central Limit Theorem Consistent with Nonextensive Statistical Mechanics 



Sabir Umarov, Constantino Tsallis and Stanly Steinberg

## JOURNAL OF MATHEMATICAL PHYSICS 51, 033502 (2010)

## Generalization of symmetric $\alpha$-stable Lévy distributions for $q>1$

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(Received 10 November 2009; accepted 4 January 2010; published online 3 March 2010)
$N^{1 /[\alpha(2-q)]}$-scaled attractor $\mathbb{F}(x)$ when summing $N \rightarrow \infty q$-independent identical random variables with symmetric distribution $f(x)$ with $\sigma_{Q} \equiv \int d x x^{2}[f(x)]^{Q} / \int d x[f(x)]^{Q} \quad\left(Q \equiv 2 q-1, q_{1}=\frac{1+q}{3-q}\right)$

|  | $q=1 \quad$ [independent] | $q \neq 1$ (i.e., $Q \equiv 2 q-1 \neq 1) \quad$ [globally correlated] |
| :---: | :---: | :---: |
| $\begin{aligned} & \sigma_{Q}<\infty \\ & (\alpha=2) \end{aligned}$ | $\mathbb{F}(x)=$ Gaussian $G(x)$, with same $\sigma_{1}$ of $f(x)$ <br> Classic CLT | $\mathbb{F}(x)=G_{q}(x) \equiv G_{\left(3 q_{1}-1\right) /\left(1+q_{1}\right)}(x)$, with same $\sigma_{Q}$ of $f(x)$ $G_{q}(x) \sim\left\{\begin{array}{ll} G(x) & \text { if }\|x\| \ll x_{c}(q, 2) \\ f(x) \sim C_{q} /\|x\|^{2 /(q-1)} & \text { if }\|x\| \gg x_{c}(q, 2) \end{array}\right\}$ <br> with $\lim _{q \rightarrow 1} x_{c}(q, 2)=\infty$ <br> S. Umarov, C. T. and S. Steinberg, Milan J Math 76, 307 (2008) |
| $\left\lvert\, \begin{aligned} & \sigma_{Q} \rightarrow \infty \\ & (0<\alpha<2) \end{aligned}\right.$ | $\mathbb{F}(x)=$ Levy distribution $L_{\alpha}(x)$ with same $\|x\| \rightarrow \infty$ behavior $\mathrm{L}_{\alpha}(x) \sim\left\{\begin{array}{l} G(x) \\ \text { if }\|x\| \ll x_{c}(1, \alpha) \\ f(x) \sim C_{\alpha} /\|x\|^{1+\alpha} \\ \text { if }\|x\| \gg x_{c}(1, \alpha) \end{array}\right.$ <br> with $\lim _{\alpha \rightarrow 2} x_{c}(1, \alpha)=\infty$ <br> Levy-Gnedenko CLT | $\mathbb{F}(x)=L_{q, \alpha}$, with same $\|x\| \rightarrow \infty$ asymptotic behavior <br> S. Umarov, C. T., M. Gell-Mann and S. Steinberg J Math Phys 51, 033502 (2010) |

## J.W. GIBBS

Elementary Principles in Statistical Mechanics - Developed with Especial Reference to the Rational Foundation of Thermodynamics
C. Scribner's Sons, New York, 1902; Yale University Press, New Haven, (1981), page 35

In treating of the canonical distribution, we shall always suppose the multiple integral in equation (92) [the partition function, as we call it nowadays] to have a finite valued, as otherwise the coefficient of probability vanishes, and the law of distribution becomes illusory. This will exclude certain cases, but not such apparently, as will affect the value of our results with respect to their bearing on thermodynamics. It will exclude, for instance, cases in which the system or parts of it can be distributed in unlimited space [...]. It also excludes many cases in which the energy can decrease without limit, as when the system contains material points which attract one another inversely as the squares of their distances. [...]. For the purposes of a general discussion, it is sufficient to call attention to the assumption implicitly involved in the formula (92).

CLASSICAL LONG-RANGE-INTERACTING MANY-BODY HAMILTONIAN SYSTEMS

$$
V(r) \sim-\frac{A}{r^{\alpha}} \quad(r \rightarrow \infty) \quad(A>0, \quad \alpha \geq 0)
$$

$$
\begin{array}{cr}
\text { integrable if } \quad \alpha / d>1 & \text { (short-ranged) } \\
\text { non-integrable if } 0 \leq \alpha / d \leq 1 & \text { (long-ranged) }
\end{array}
$$



## Validity and failure of the Boltzmann weight

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## d-DIMENSIONAL XY MODEL


L.J.L Cirto, A. Rodriguez, F.D. Nobre and C.T., EPL 123, 30003 (2018)

## d-DIMENSIONAL XY MODEL



## Fermi-Pasta-Ulam model with long-range interactions: Dynamics and thermostatistics

H. Christodoulidi ${ }^{1}$, C. Tsallis $^{2,3}$ and T. Bountis ${ }^{1}$


Fig. 8: (Colour on-line) A unified overview of the crossover frontier of fig. 7(b), combining the $b$ values. The fitting straight line is $1 / N=D b^{\delta} / t_{c}^{\gamma}$, with $D=2.3818 \times 10^{4}, \delta=0.27048$, and $\gamma=1.365$.

Europhys. Lett., 70 (4), pp. 439-445 (2005)
DOI: 10.1209/epl/i2004-10506-9

# Dynamical correlations as origin of nonextensive entropy 

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## LINEAR TRANSPORT PHENOMENA

Newton's law of viscosity (1686)
Fourier's law for heat conduction (1822)
Ohm's law for charge conduction (1827)
Fick's law for diffusion (1855)

## First-principle validation of Fourier's law in $d=1,2,3$

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(Dated: May 2, 2022)


## XY MODEL

(1 ${ }^{\text {st }}$ neighbors)


thermal conductivity





## thermal conductivity

$\stackrel{\dot{\sigma}}{ }(T, L) L^{\delta(d)}=A(d) e_{q(d)}^{-B(d)\left[T L^{\gamma(d)}\right]^{\eta(d)}}$
$L \rightarrow \infty \Rightarrow \sigma(T, L) \propto \frac{1}{L^{\rho_{\sigma}(d)}}$ with $\rho_{\sigma}(d) \equiv \frac{\gamma(d) \eta(d)}{q(d)-1}+\delta(d)$

| $d$ | $A$ | $q$ | $B$ | $\gamma$ | $\delta$ | $\eta$ | $\rho_{\sigma}=\frac{\gamma \eta}{q-1}+\delta$ | $\rho_{\kappa}=\rho_{\sigma}-d$ |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| 1 | $0.191 \pm 0.005$ | $1.70 \pm 0.05$ | $0.60 \pm 0.05$ | $0.30 \pm 0.03$ | 0 | $2.36 \pm 0.06$ | $1.01 \pm 0.06$ | $0.01 \pm 0.06$ |
| 2 | $0.23 \pm 0.05$ | $3.49 \pm 0.15$ | $0.010 \pm 0.002$ | $0.40 \pm 0.09$ | 1 | $5.90 \pm 0.31$ | $1.96 \pm 0.31$ | $-0.05 \pm 0.31$ |
| 3 | $0.16 \pm 0.05$ | $3.78 \pm 0.13$ | $0.0013 \pm 0.002$ | $0.45 \pm 0.09$ | 2 | $6.02 \pm 0.43$ | $2.98 \pm 0.43$ | $-0.02 \pm 0.43$ |

[see also Y Li, N Li, U Tirnakli, Li and C T, EPL 117, 60004 (2017)]


Yo soy yo y mi circunstancia José Ortega y Gasset (1883-1955)

## INDICES $q$ :

## FIRST-PRINCIPLE CHARACTERIZATION OF UNIVERSALITY CLASSES, OR JUST EFFICIENT FITTING PARAMETERS ?

Newton theory for the motion of the planetary system has no fitting parameter other than $G$
But requires the knowledge of all masses and initial conditions

+ unthinkable computational facilities!
On the other hand, it easily predicts
the elliptic form of the planetary orbits and Kepler's laws!
Nonextensive statistical mechanics has no fitting parameter other than $\boldsymbol{k}_{B}$
But requires the knowledge of the first-principle
probabilities/dynamics of the system
+ overcoming their usual mathematical intractability!
On the other hand, it easily predicts
the ubiquitous $q$-exponential functional form!


# Nonadditive entropy reconciles the area law in quantum systems with classical thermodynamics 

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The Boltzmann-Gibbs-von Neumann entropy of a large part (of linear size $L$ ) of some (much larger) $d$-dimensional quantum systems follows the so-called area law (as for black holes), i.e., it is proportional to $L^{d-1}$. Here we show, for $d=1,2$, that the (nonadditive) entropy $S_{q}$ satisfies, for a special value of $q \neq 1$, the classical thermodynamical prescription for the entropy to be extensive, i.e., $S_{q} \propto L^{d}$. Therefore, we reconcile with classical thermodynamics the area law widespread in quantum systems. Recently, a similar behavior was exhibited in mathematical models with scale-invariant correlations [C. Tsallis, M. Gell-Mann, and Y. Sato, Proc. Natl. Acad. Sci. U.S.A. 10215377 (2005)]. Finally, we find that the system critical features are marked by a maximum of the special entropic index $q$.

Block entropy for the $d=1+1$ model, with central charge $c$, at its quantum phase transition at $T=0$ and critical transverse "magnetic" field


Self-dual $Z(n)$ magnet ( $n=1,2, \ldots$ )
[FC Alcaraz, JPA 20 (1987) 2511]

$$
\rightarrow c=\frac{2(n-1)}{n+2} \in[0,2]
$$

$S U(n)$ magnets $(n=1,2, \ldots ; m=2,3, \ldots) \quad$ [FC Alcaraz and MJ Martins, JPA 23 (1990) L1079]

$$
\rightarrow c=(n-1)\left[1-\frac{n(n+1)}{(m+n-2)(m+n-1)}\right] \in[0, n-1]
$$

# New type of equilibrium distribution for a system of charges in a spherically symmetric electric field 

Gabriela A. Casas ${ }^{1}$, Fernando D. Nobre ${ }^{1,2}$ and Evaldo M. F. Curado ${ }^{1,2}$<br>${ }^{1}$ Centro Brasileiro de Pesquisas Físicas - Rua Dr. Xavier Sigaud 150, 22290-180 Rio de Janeiro, Brazil<br>${ }^{2}$ National Institute of Science and Technology for Complex Systems - Rua Dr. Xavier Sigaud 150, 22290-180 Rio de Janeiro, Brazil

## Spherical capacitor (overdamped colloid)


G.A. Casas, F.D. Nobre and E.M.F. Curado (2019)
[see also P. Quarati and A. Scarfone, Astrophys. J. 666, 1303 (2007)]

SIMPLE APPROACH: TWO-DIMENSIONAL SINGLE RELATIVISTIC FREE PARTICLE
C.Y. Wong, G. Wilk, L.J.L. Cirto and C. T.,

EPJ Web of Conferences 90, 04002 (2015), and PRD 91, 114027 (2015)


# Equilibrium Distribution of Heavy Quarks in Fokker-Planck Dynamics 

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We obtain an explicit generalization, within Fokker-Planck dynamics, of Einstein's relation between drag, diffusion, and the equilibrium distribution for a spatially homogeneous system, considering both the transverse and longitudinal diffusion for dimension $n>1$. We provide a complete characterization of the equilibrium distribution in terms of the drag and diffusion transport coefficients. We apply this analysis to charm quark dynamics in a thermal quark-gluon plasma for the case of collisional equilibration.


FIG. 1. Calculated data (diamonds) and linear fit for the ratio in Eq. (25) for a charmed quark $m_{c}=1.5 \mathrm{GeV}$ thermalizing in gluon background at $T_{b}=500 \mathrm{MeV}$. Dashed line: result expected for a Boltzmann-Jüttner distribution, $T=T_{b}$.

# Fractals, nonextensive statistics, and QCD 

Airton Deppman© ${ }^{1,2, *}$ Eugenio Megías © ${ }^{2}$ and Debora P. Menezes $\odot^{3}$<br>${ }^{1}$ Instituto de Física, Rua do Matão 1371-Butantã, São Paulo-SP, CEP 05508-090 Brazil<br>${ }^{2}$ Departamento de Física Atómica, Molecular y Nuclear and Instituto Carlos I de Física<br>Teórica y Computacional, Universidad de Granada, E-18071 Granada, Spain<br>${ }^{3}$ Depto de Física, CFM—Universidade Federal de Santa Catarina Florianópolis, SC-CP. 476-CEP 88.040-900, Brazil

(0) (Received 15 January 2020; accepted 24 January 2020; published 19 February 2020)

In this work, we analyze how scaling properties of Yang-Mills field theory manifest as self-similarity of truncated n-point functions by scale evolution. The presence of such structures, which actually behave as fractals, allows for recurrent nonperturbative calculation of any vertex. Some general properties are indeed independent of the perturbative order, what simplifies the nonperturbative calculations. We show that for sufficiently high perturbative orders a statistical approach can be used, the nonextensive statistics is obtained, and the Tsallis index, $q$, is deduced in terms of the field theory parameters. The results are applied to QCD in the one-loop approximation, where $q$ can be calculated, resulting in a good agreement with the value obtained experimentally. We discuss how this approach allows us to understand some intriguing experimental findings in high energy collisions, as the behavior of multiplicity against collision energy, long-tail distributions, and the fractal dimension observed in intermittency analysis.

First-principle Yang-Mills/QCD grounds yields

$$
\frac{1}{q-1}=\frac{11}{3} N_{c}-\frac{2}{3} N_{f} \quad \text { (Deppman, Megias and Menezes PRD 2020) }
$$

where $\quad N_{c} \equiv$ number of colors

$$
N_{f} \equiv \text { number of flavors }
$$

hence

$$
\left(N_{c}, N_{f}\right)=(3,6) \Rightarrow q=\frac{8}{7} \simeq 1.14
$$

(Deppman, Megias and Menezes PRD 2020)

$$
\left(N_{c}, N_{f}\right)=(3,3) \Rightarrow q=\frac{10}{9} \simeq 1.11
$$

(Walton and Rafelski PRL 2000; C.T. 2022)

## Generalized statistical mechanics of cosmic rays: Application to positron-electron spectral indices

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Cosmic ray energy spectra exhibit power law distributions over many orders of magnitude that are very well described by the predictions of $q$-generalized statistical mechanics, based on a $q$-generalized Hagedorn theory for transverse momentum spectra and hard OCD scattering processes. QCD at largest center of mass energies predicts the entropic index to be $q=\frac{13}{11}$. Here we show that the escort duality of the nonextensive thermodynamic formalism predicts an energy split of effective temperature given by $\Delta k T= \pm \frac{1}{10} k T_{H} \approx \pm 18 \mathrm{MeV}$, where $T_{H}$ is the Hagedorn temperature. We carefully analyse the measured data of the AMS-02 collaboration and provide evidence that the predicted temperature split is indeed observed, leading to a different energy dependence of the $e^{+}$and $e^{-}$spectral indices. We also observe a distinguished energy scale $E^{*} \approx 50 \mathrm{GeV}$ where the $e^{+}$and $e^{-}$spectral indices differ the most. Linear combinations of the escort and non-escort $q$-generalized canonical distributions yield excellent agreement with the measured AMS-02 data in the entire energy range.


Figure 3. The measured AMS-02 data are very well fitted by linear combination of escort and $n$ distributions (solid lines).
with $q_{1}=13 / 11=1.1818 \ldots$
and $\quad q_{2}=\frac{1}{2-q}=11 / 9=1.2222 \ldots$

The book is devoted to the mathematical foundations of nonextensive statistical mechanics. This is the first book containing the systematic presentation of the mathematical theory and concepts related to nonextensive statistical mechanics, a current generalization of Boltzmann-Gibbs statistical
 mechanics introduced in 1988 by one of the authors and based on a nonadditive entropic functional extending the usual Boltzmann-Gibbsvon Neumann-Shannon entropy. Main mathematical tools like the q-exponential function, q-Gaussian distribution, q-Fourier transform, q -central limit theorems, and other related objects are discussed rigorously with detailed mathematical rational. The book also contains recent results obtained in this direction and challenging open problems. Each chapter is accompanied with additional useful notes including the history of development and related bibliographies for further reading.

## Mathematical Foundations of Nonextensive Statistical Mechanics

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