



**THE GENERAL PREFERENTIAL
ATTACHMENT GROWTH MODEL AND
NONEXTENSIVE STATISTICAL MECHANICS**

L. R. da Silva

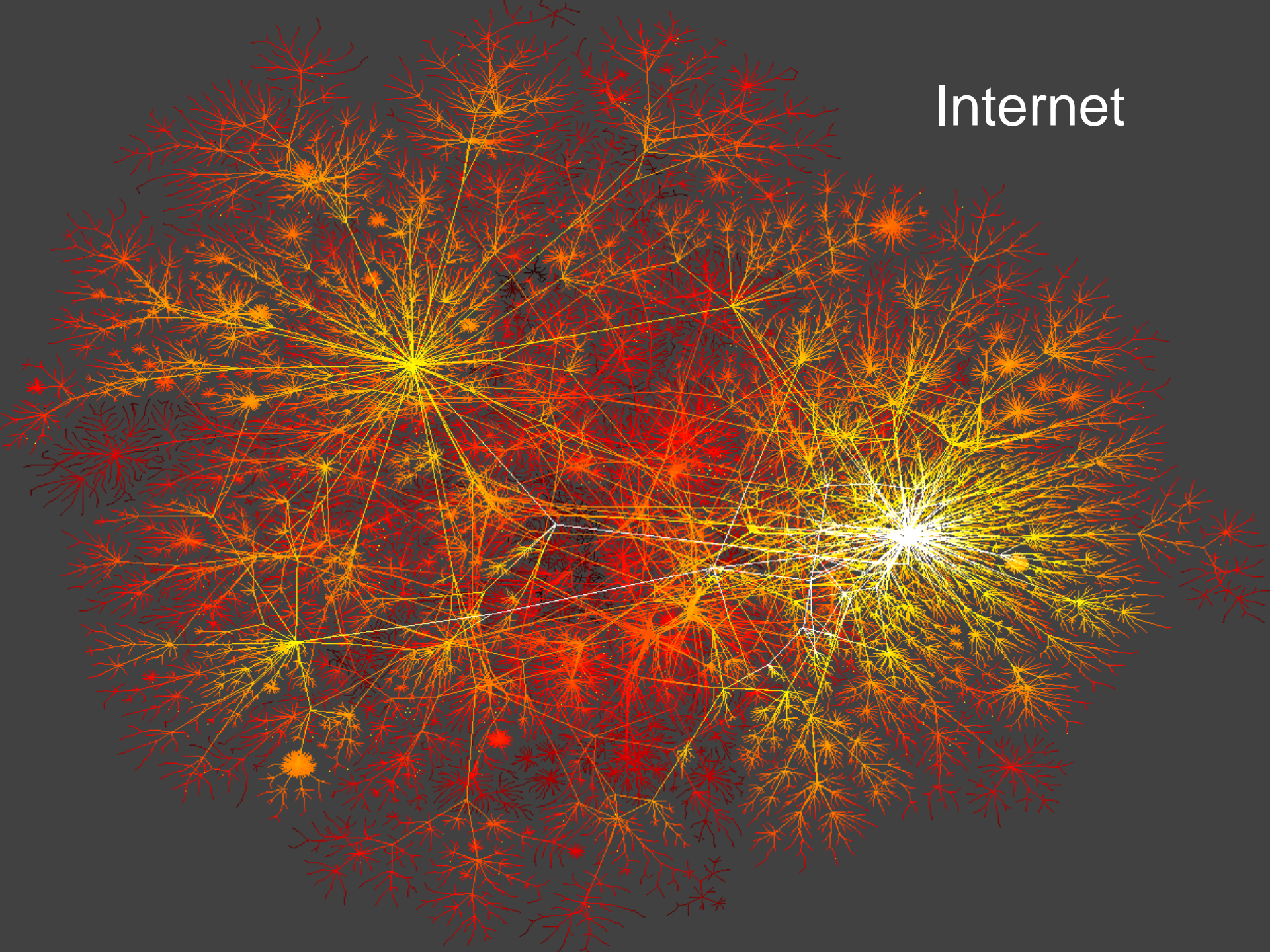
UFRN – DFTE – Natal – Brazil

10/29/13

OUR GOALS

- Growth of an asymptotically scale-free network including metrics.
- Growth of a geographically localized network (around its baricenter).
- To exhibit effects of competition between metrical neighborhood, connectivity and fitness.
- Last but not least, to exhibit the connection between scale-free networks and **nonextensive statistics**.

Internet

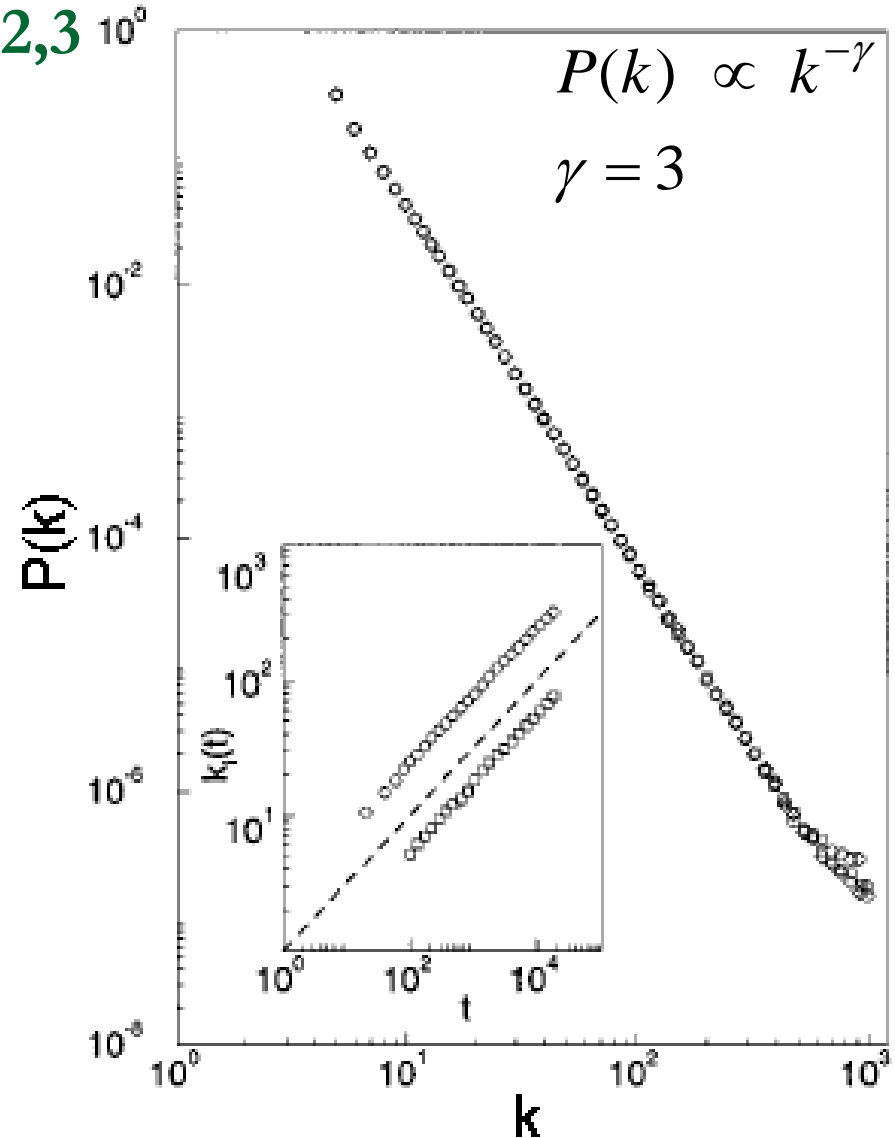


Scale-free Networks^{1,2,3}

- Barabási and Albert¹;

$$\Pi(k_i) = \frac{k_i}{\sum_{j=1}^{N'} k_j} \quad (01)$$

$$\langle k_i \rangle = \left(\frac{t}{i} \right)^\beta \quad (02)$$



¹Science **286**, 509 (1999) ; Rev. Mod Phys. **74**, 47 (2002)

²M. Boguñá and R. Pastor-Satorras, Physical Review E **68**, 036112 (2003)

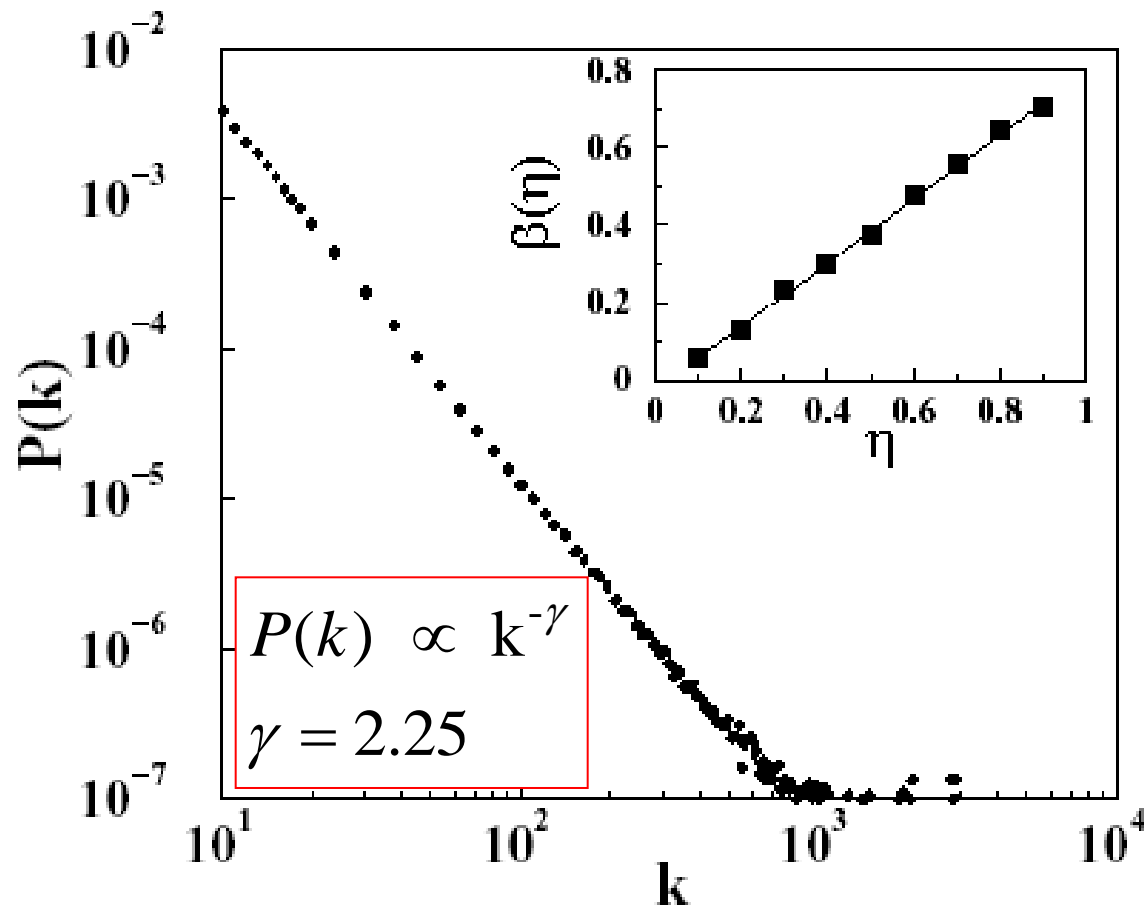
³S. Thurner and C. Tsallis, Europhys Letters **72**, 197 (2005)

Fitness Model

- Bianconi and Barabási⁴;
- Albert and Barabási⁵;

$$\Pi(k_i) = \frac{k_i \eta_i}{\sum_{j=1}^{N'} k_j \eta_j} \quad (04)$$

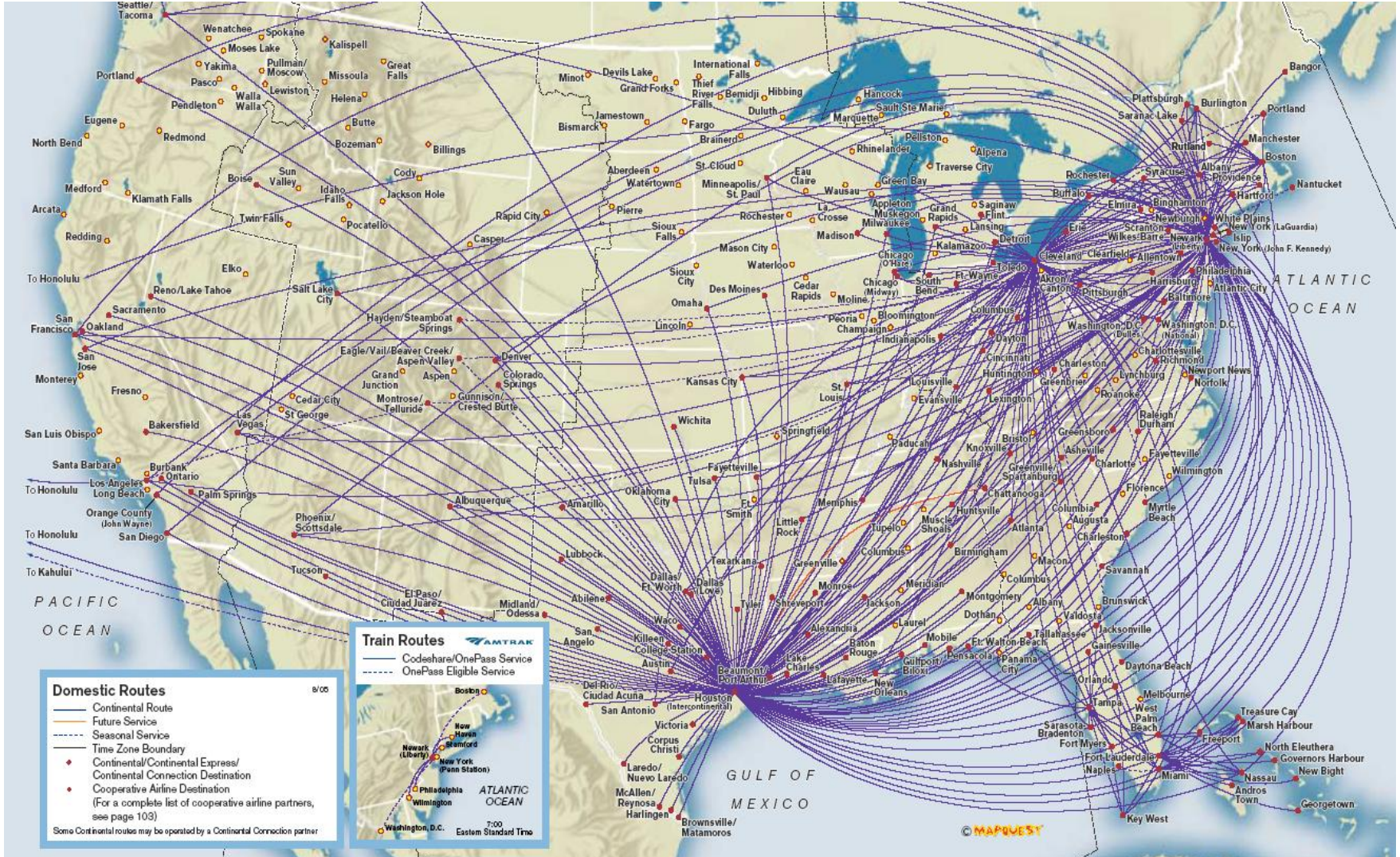
$$\langle k_i \rangle = \left(\frac{t}{i} \right)^{\beta(\eta_i)} \quad (05)$$



⁴Europhys. Lett. **54**,436 (2001) ; ⁵Rev. Mod Phys. **74**, 47 (2002)

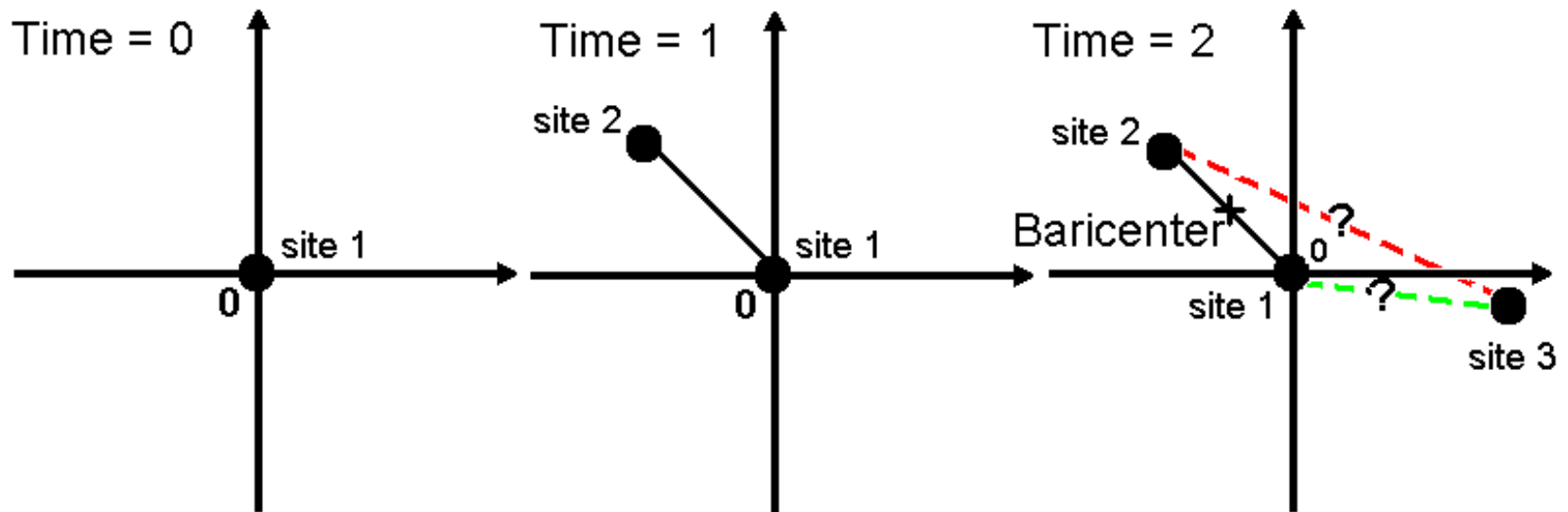
COMPLEX SYSTEMS: FOUNDATIONS AND APPLICATIONS

Geographic Model



Barabási-Albert Model with Euclidean Distance

Power-law Distributed Network Construction:



$$r = (1 - \xi')^{-(2 + \alpha_G)}$$

$$\theta = 2\pi\xi''$$

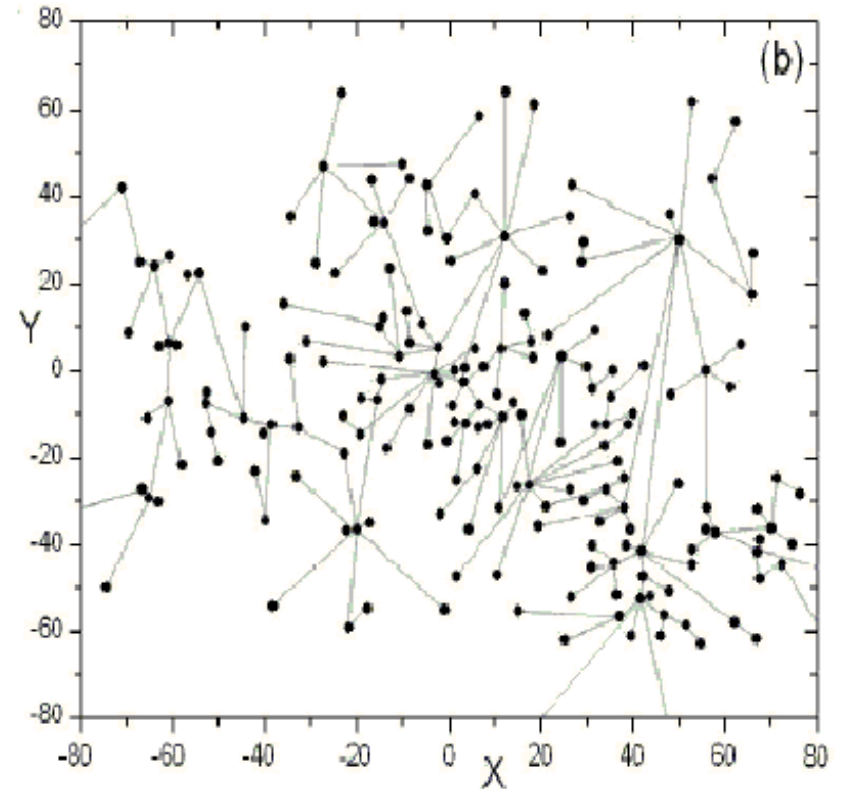
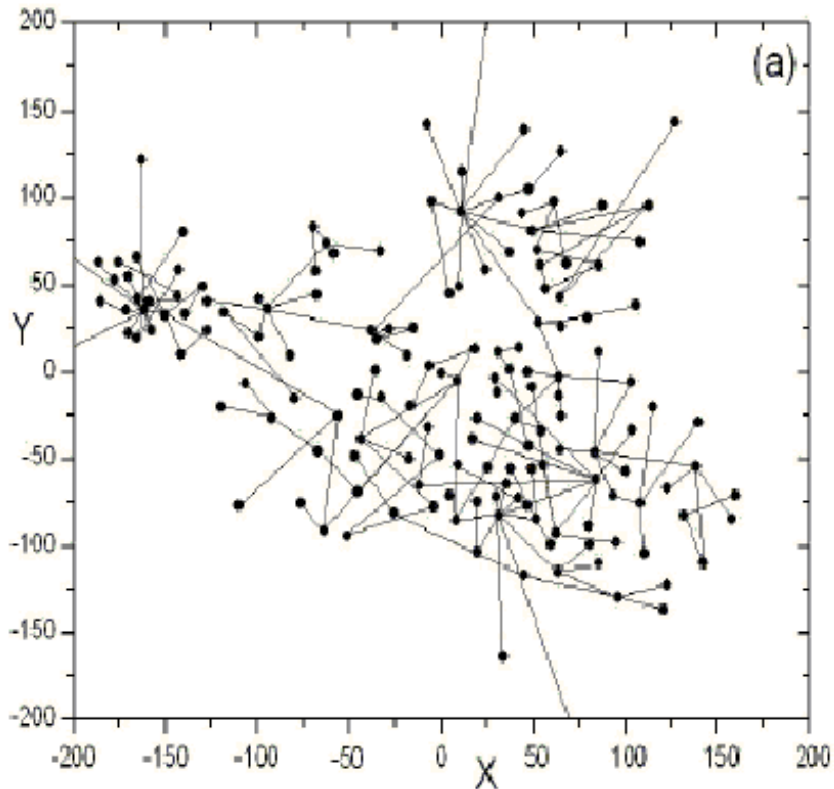
$$\alpha_G > 0$$

$$P(r) \propto r^{-\gamma_G}$$

$$\gamma_G > 1$$

$$\Pi(k_i) = \frac{k_i / r_i^{\alpha_A}}{\sum_{j=1}^{N'} k_j / r_j^{\alpha_A}}$$

Examples

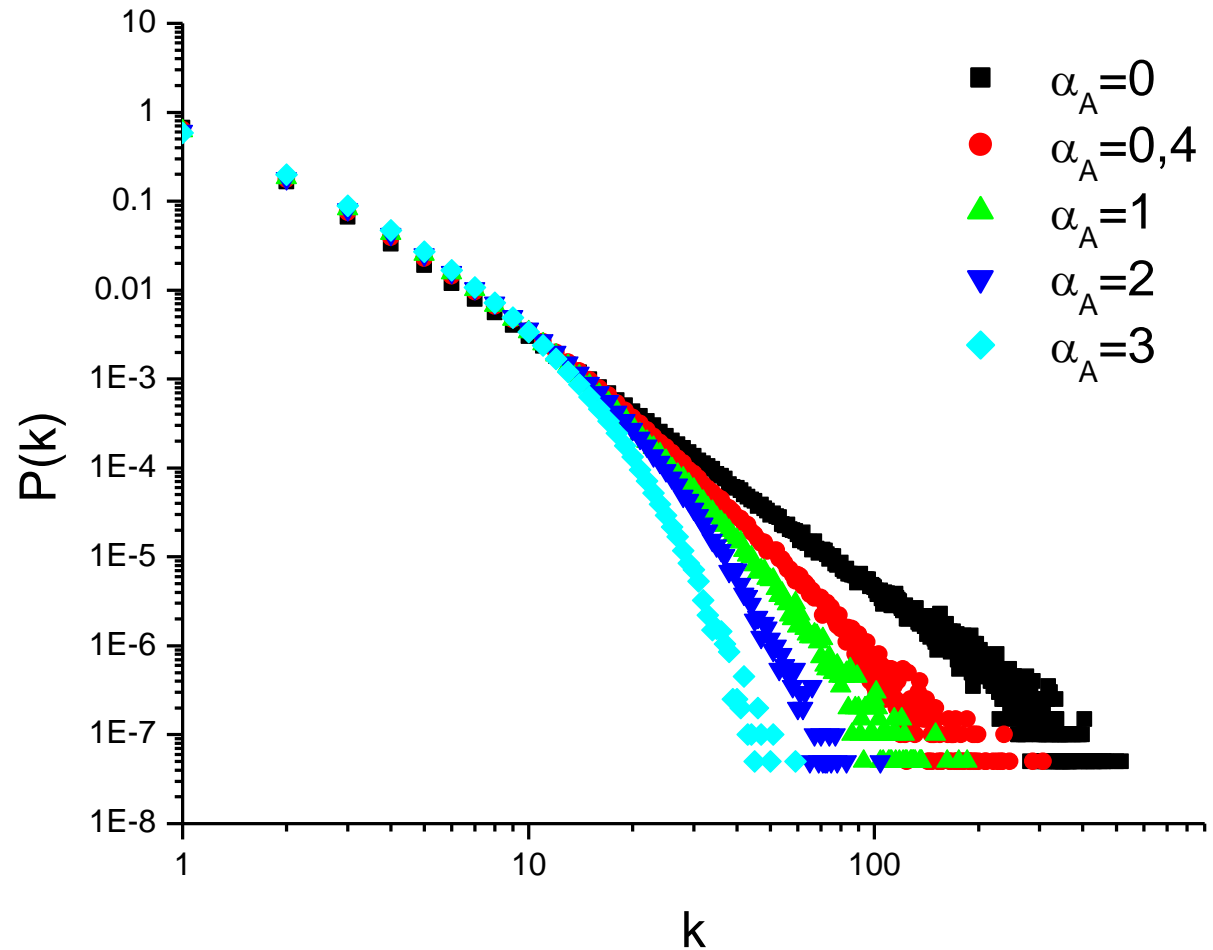


$N = 250$ nodes (a) $(\alpha_G, \alpha_A) = (1, 0)$ and (b) $(\alpha_G, \alpha_A) = (1, 4)$.

The starting site is at $(X, Y) = (0, 0)$. Notice the spontaneous emergence of hubs.

Barabási-Albert Model with Euclidean Distance Power-law Distributed

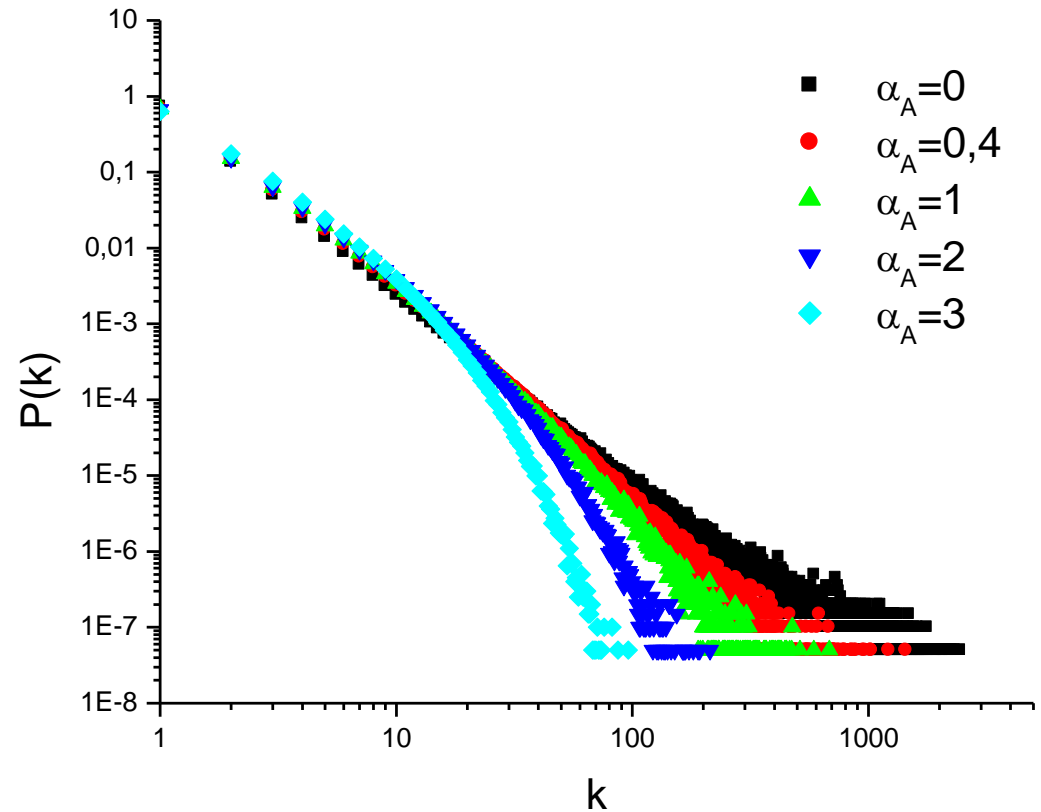
$$\Pi(k_i) = \frac{k_i / r_i^{\alpha_A}}{\sum_{j=1}^{N'} k_j / r_j^{\alpha_A}} \quad (03)$$



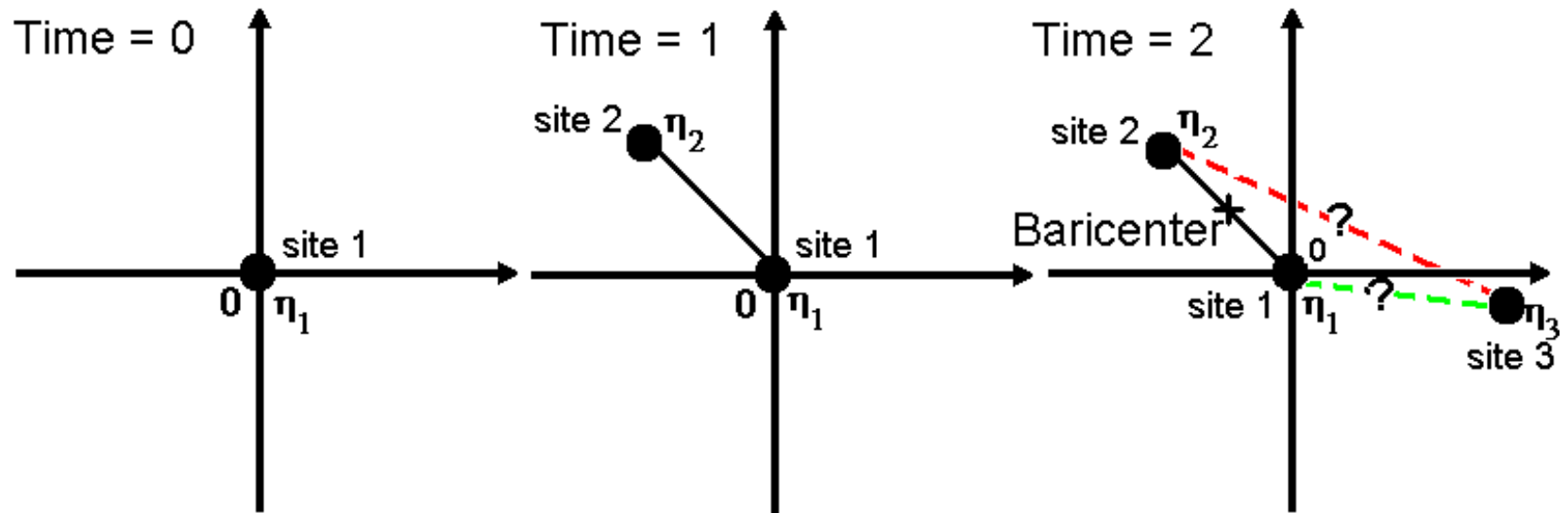
Fitness Model with Euclidean Distance Power-law Distributed

- Inspired in the works of Soares, Tsallis, Mariz and da Silva³, and Bianconi and Barabasi⁴.

$$\Pi(k_i) = \frac{k_i \eta_i / r_i^{\alpha_A}}{\sum_{j=1}^{N'} k_j \eta_j / r_j^{\alpha_A}} \quad (06)$$



Network Construction



Tsallis Nonextensive Statistical Mechanics

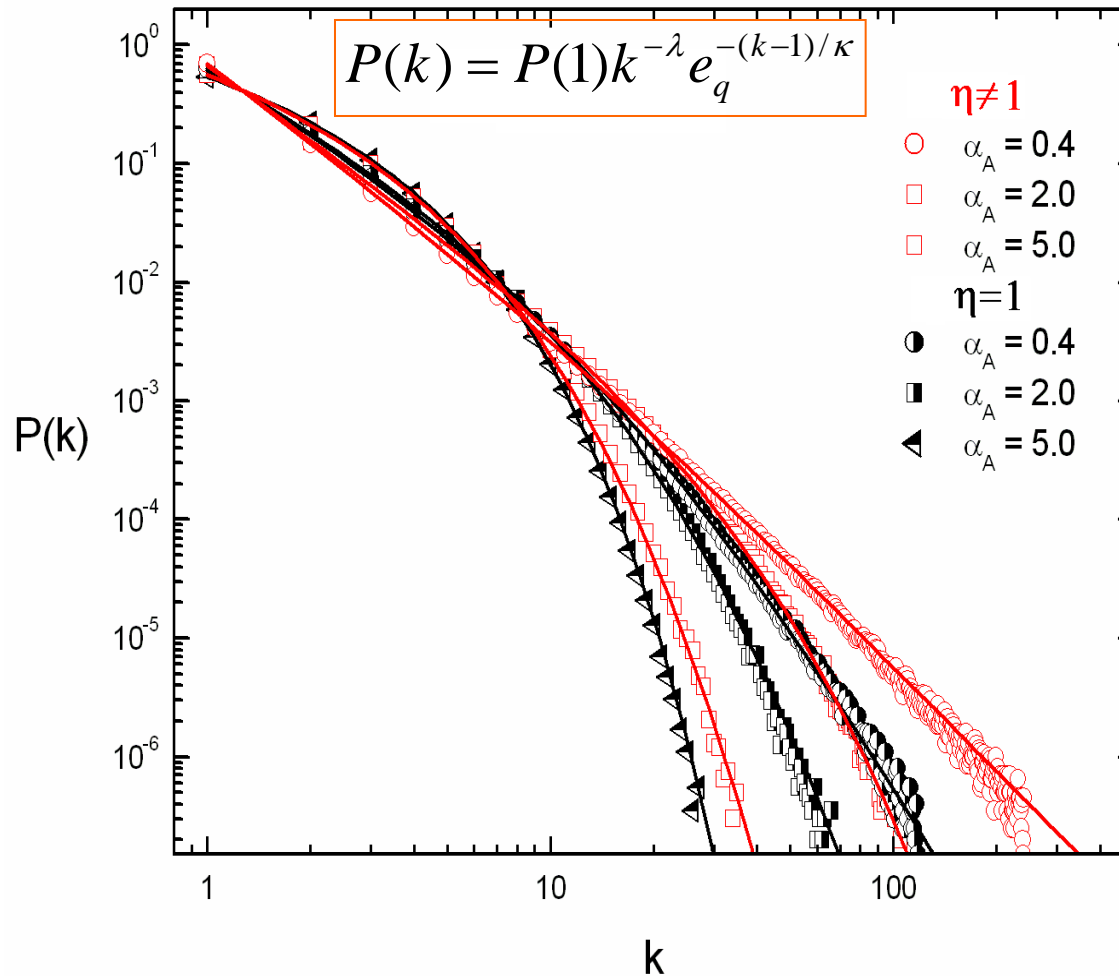
$$S_q = \frac{1 - \int dk [P(k)]^q}{q-1} \quad (q \in \mathfrak{R}; S_1 = S_{BG})$$

$$\sum_i p_i = 1 \quad \text{and} \quad \frac{\sum_i p_i^q \varepsilon_i}{\sum_i p_i^q} = U_q.$$

$$P(k) = P(1)k^{-\lambda} e_q^{-(k-1)/\kappa}$$

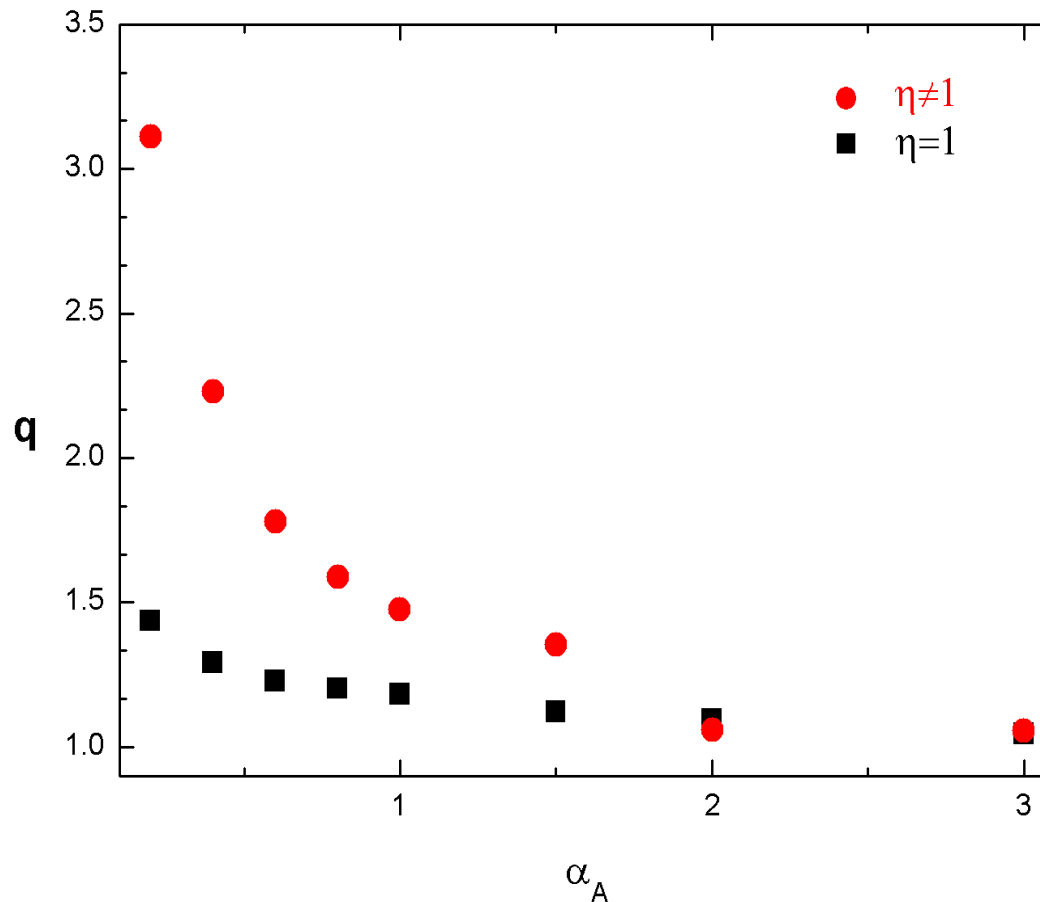
$$e_q^x \equiv [1 + (1-q)x]^{1/(1-q)}$$

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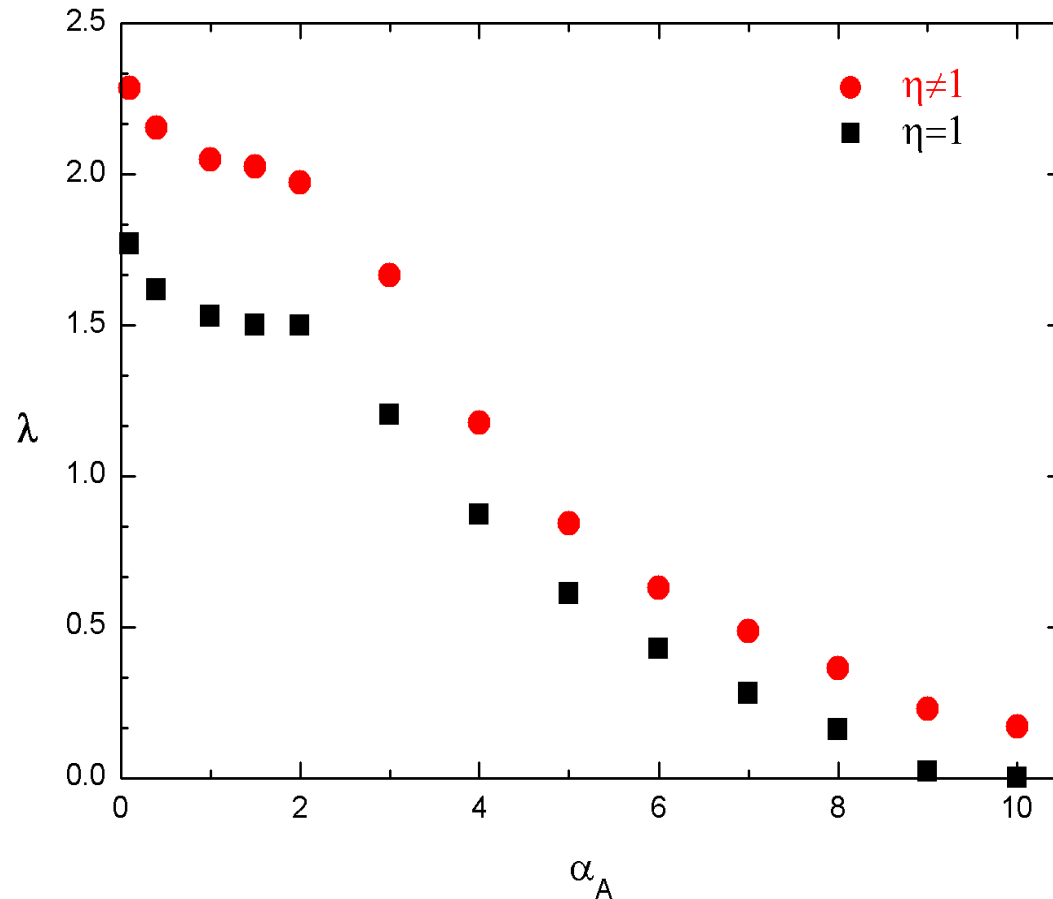
Connectivity distribution $P(k)$ for typical values α_A for $\eta \neq 1$ and $\eta = 1$ models. The symbols are numerical results and continuous lines are the best fits according to $P(k)$.

COMPLEX SYSTEMS: FOUNDATIONS AND APPLICATIONS



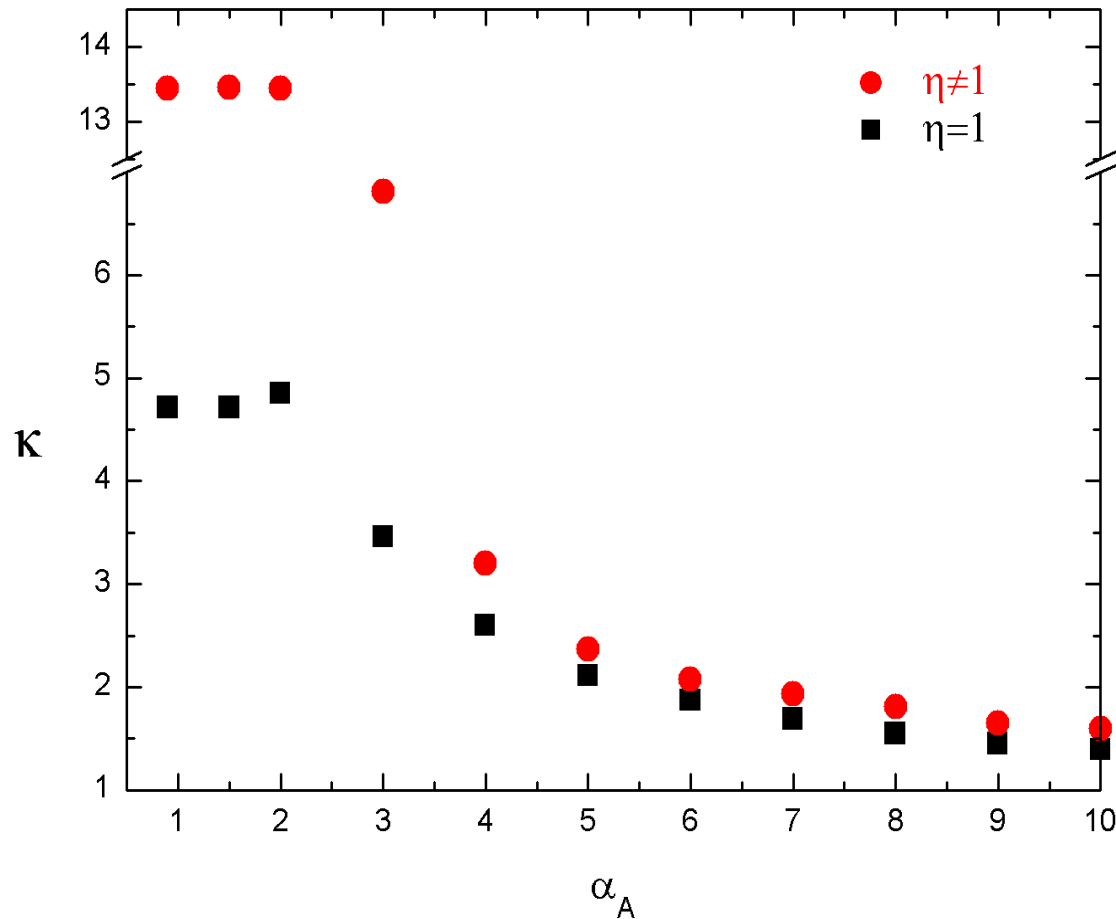
α_A -dependence of q for both $\eta \neq 1$ and $\eta = 1$ models. In this graph we observe some kinds of changes of regimes at $\alpha_A = 2$ (which coincides with the space dimensionality).

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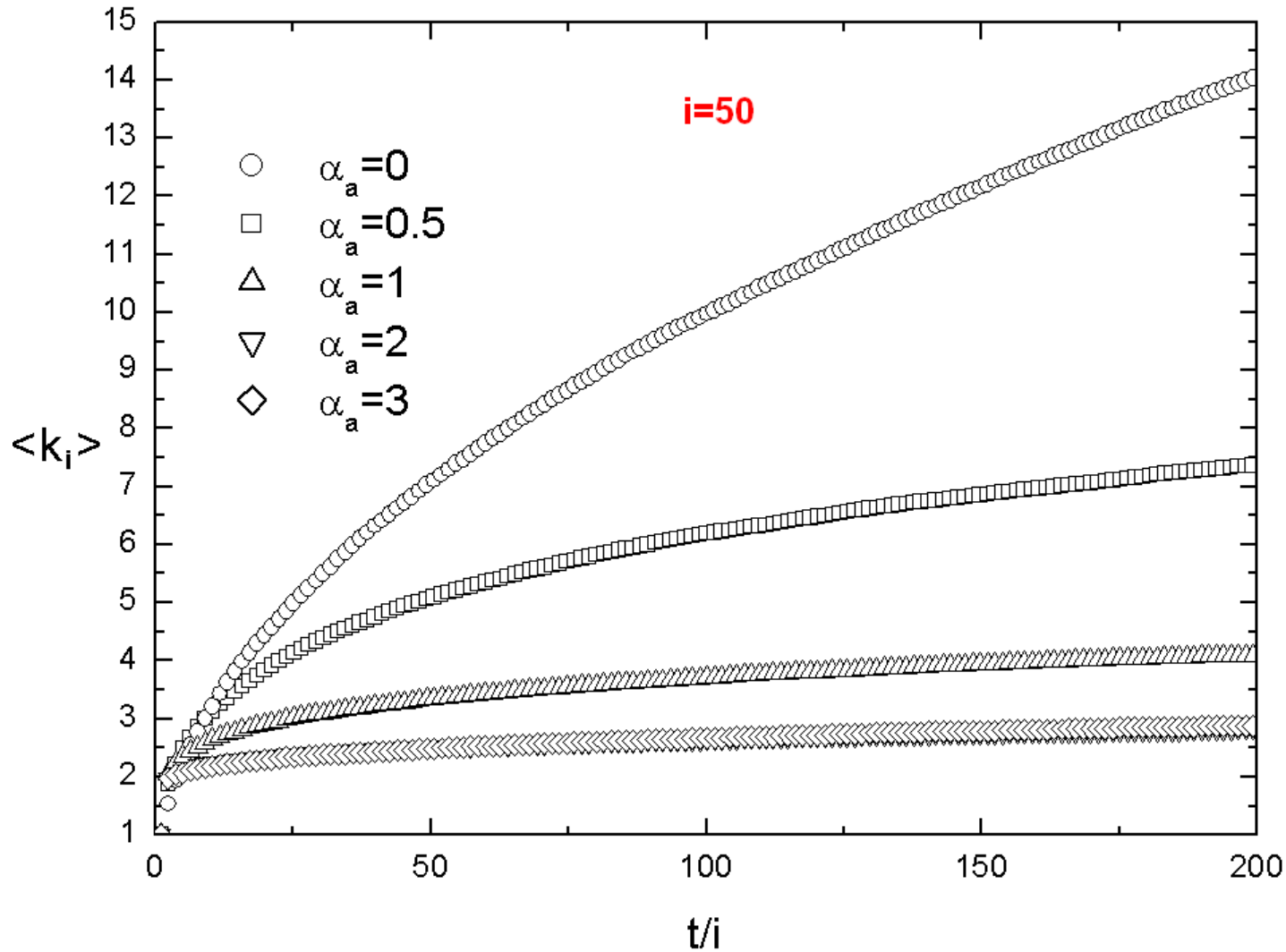
α_A -dependence of λ for both $\eta \neq 1$ and $\eta = 1$ models. In this graph we observe some kinds of changes of regimes at $\alpha_A = 2$ (which coincides with the space dimensionality).

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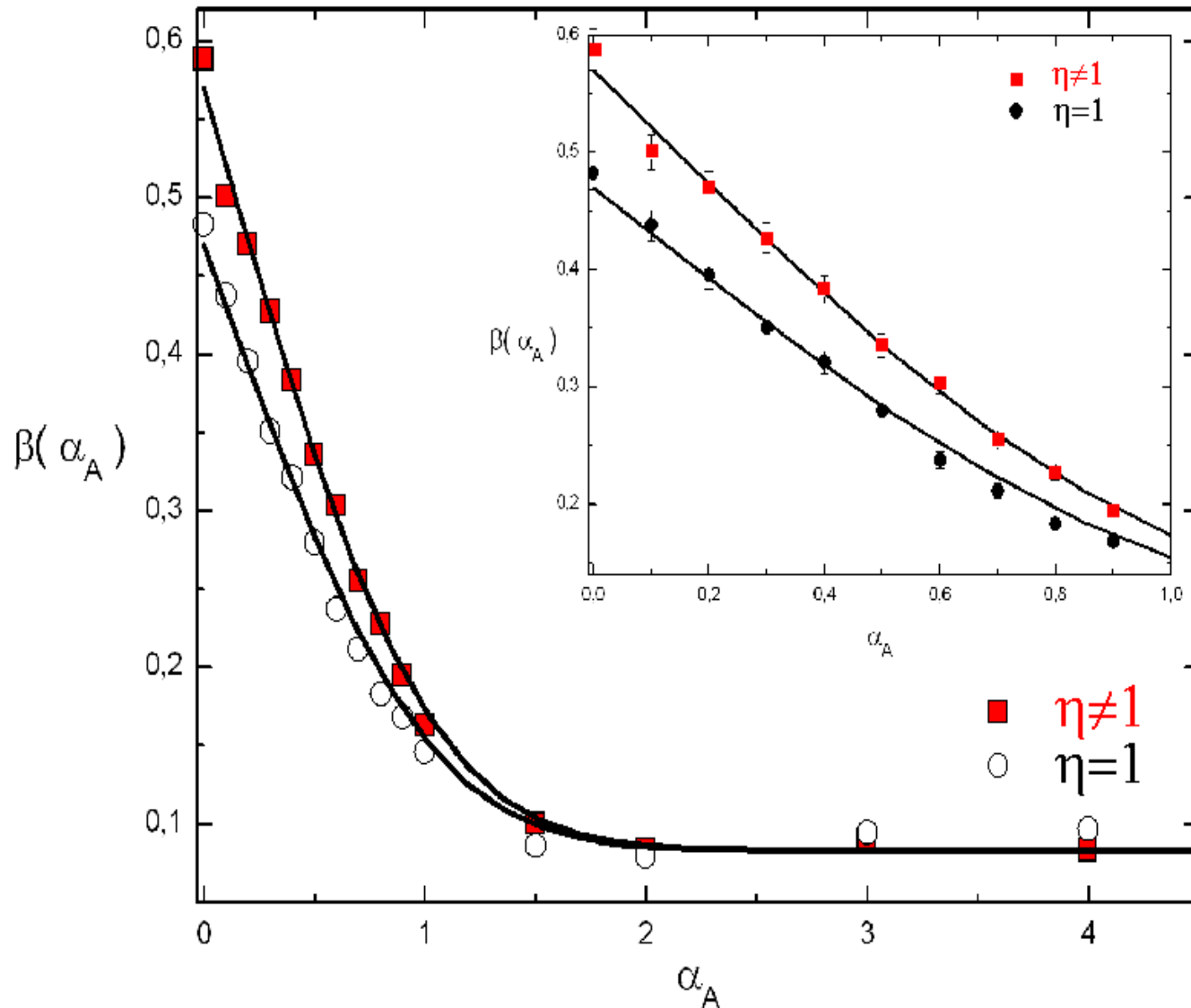
α_A -dependence of q for both $\eta \neq 1$ and $\eta = 1$ models. In this graph we observe some kinds of changes of regimes at $\alpha_A = 2$ (which coincides with the space dimensionality).

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Temporal dependence of the average connectivity for $\eta \neq 1$, in 2000 samples.

COMPLEX SYSTEMS: FOUNDATIONS AND APPLICATIONS



Average connectivity exponent for α_A values relative to measures on node $i = 50$.

COMPLEX SYSTEMS: FOUNDATIONS AND APPLICATIONS

- The **generalized model** contains the five previous models:

Model	CONNECTIVITY	FITNESS	METRIC
Barabási-Albert	YES	NO	NO
Bianconi et al	YES	UNIFORM	NO
Soares et al	YES	NO	POWER-LAW
Meneses et al	YES	UNIFORM	POWER-LAW
Mendes et al	YES	POWER-LAW	NO
Generalized	YES	POWER-LAW	POWER-LAW

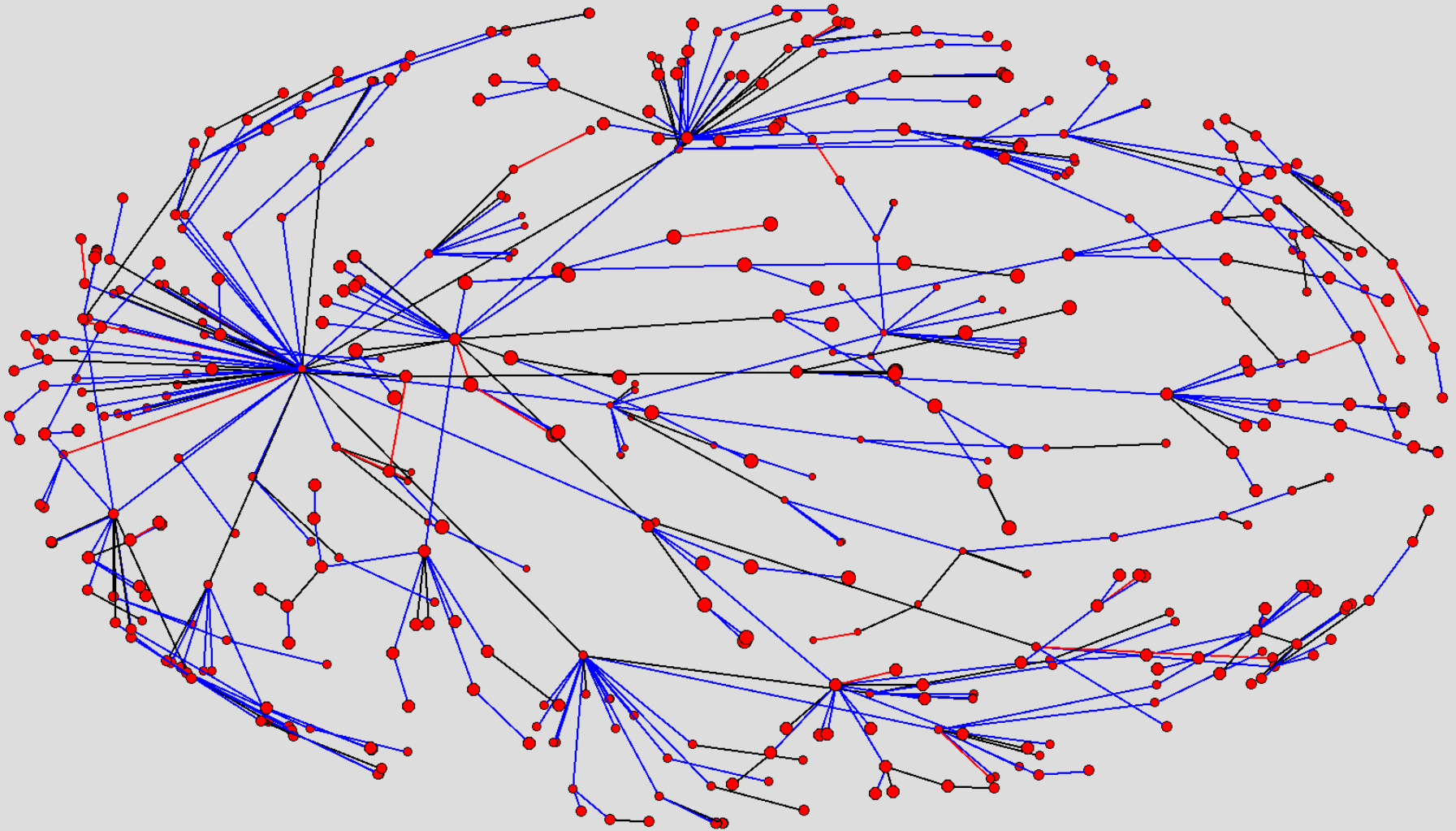
Affinity Model

- Inspired in the works of Bianconi and Barabási; G.A. Mendes and L.R. da Silva.
- The links between similar sites are favored.

$$\Pi_{i \rightarrow j} \sim k_j \left(1 - |\eta_i - \eta_j|\right)$$

COMPLEX SYSTEMS: FOUNDATIONS AND APPLICATIONS

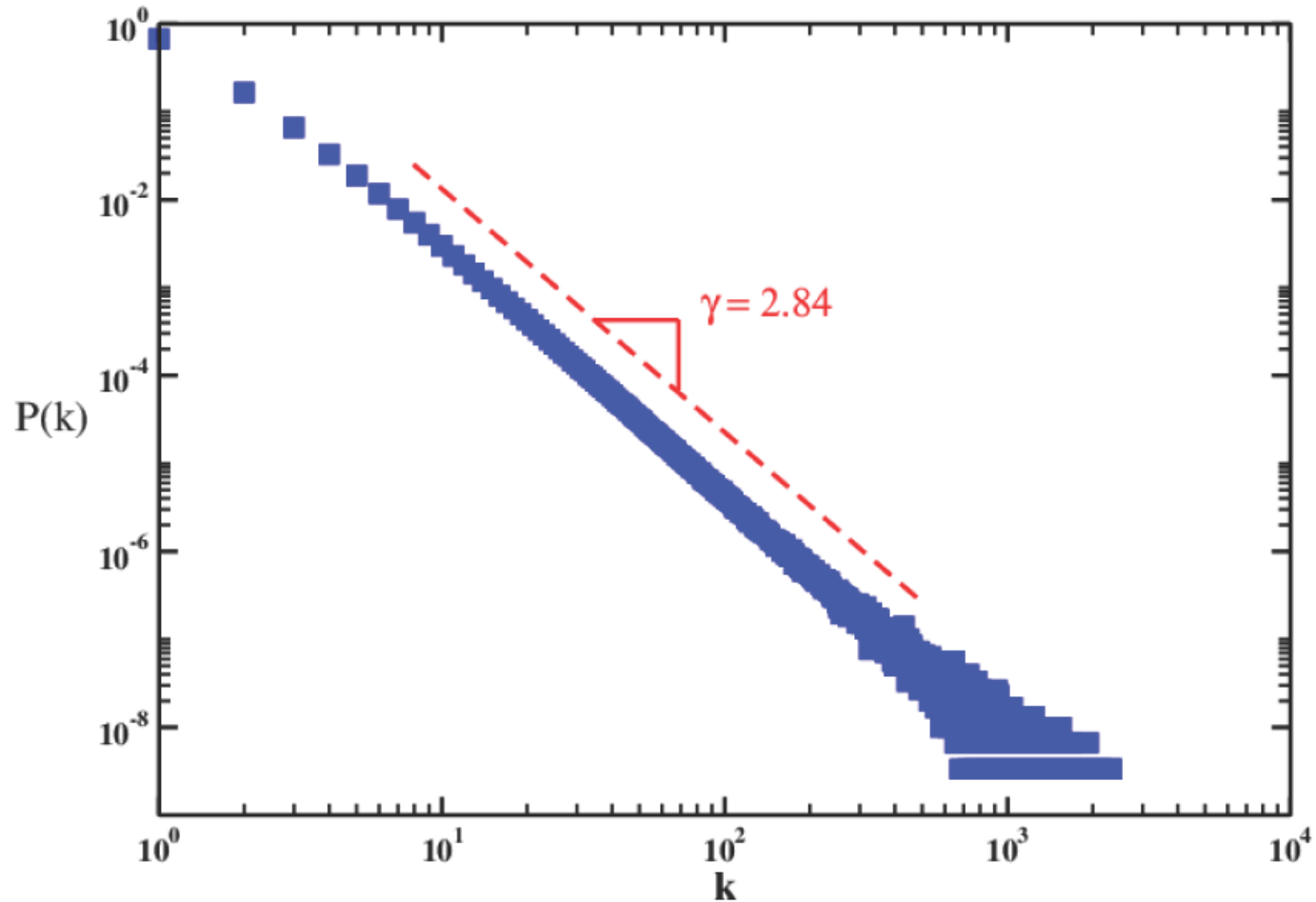
blue: big affinity; black: medium affinity; red: small affinity



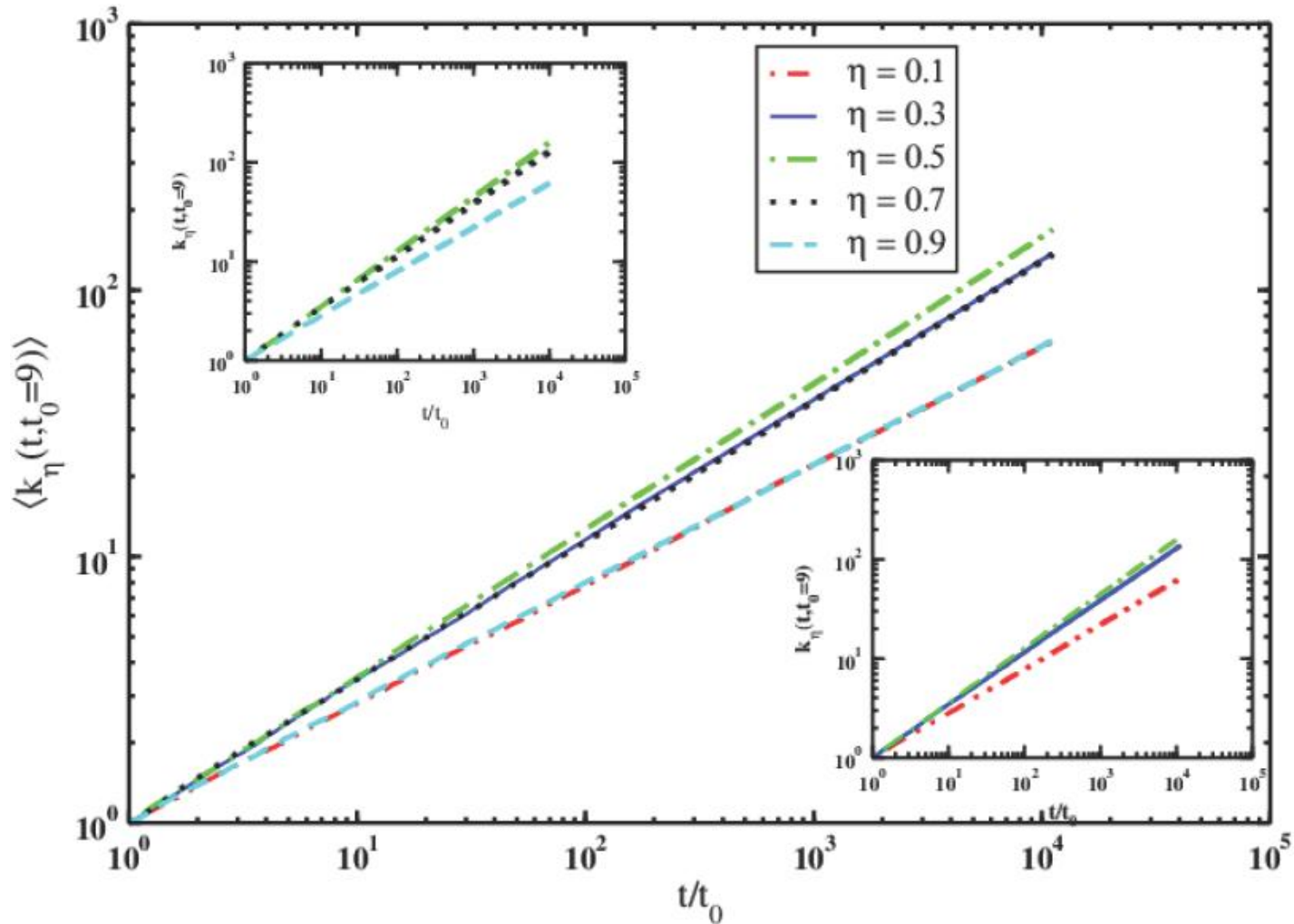
$$\Pi_{i \rightarrow j} \sim k_j (1 - |\eta_i - \eta_j|)$$

Affinity Model

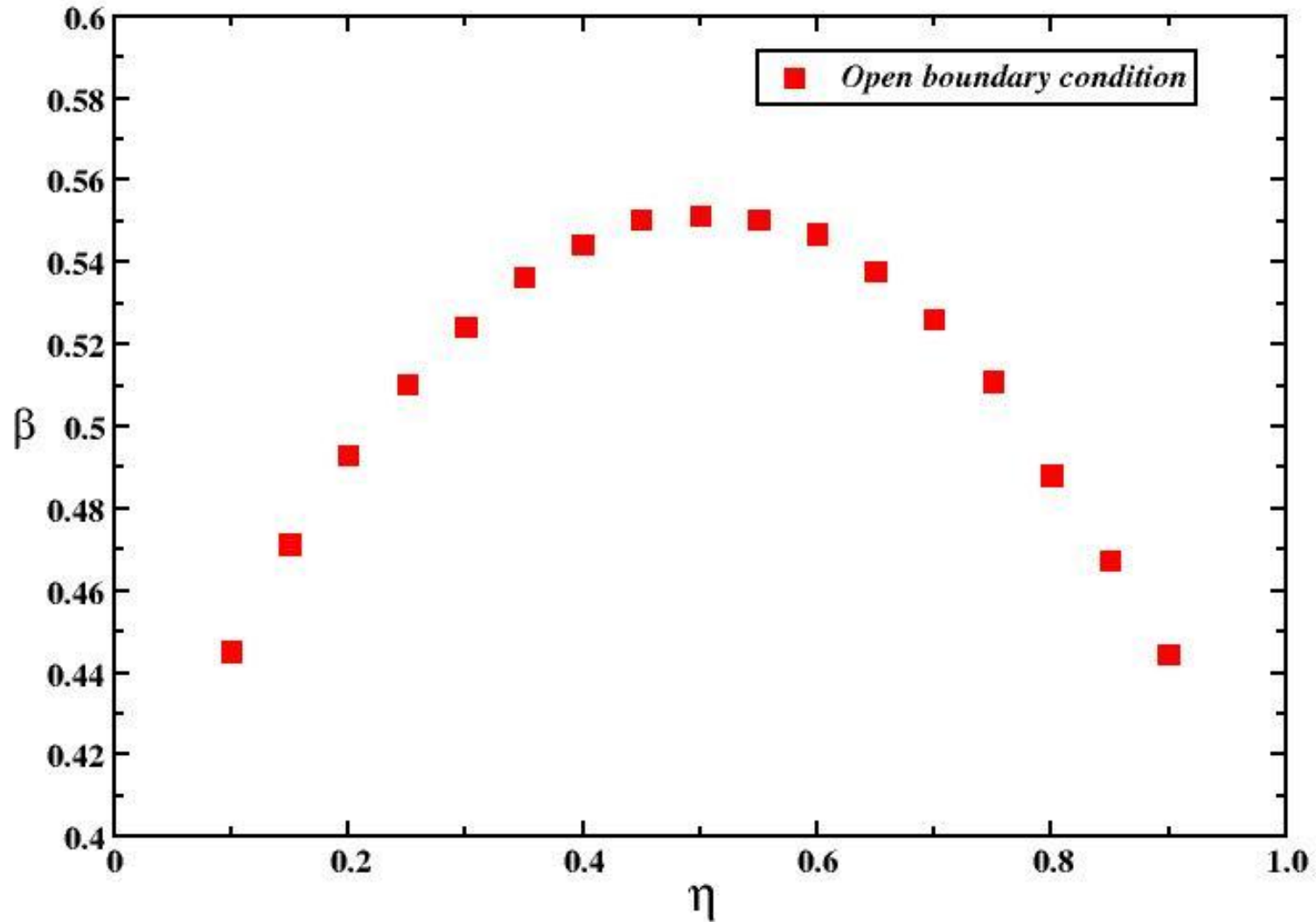
$$\Pi_{i \rightarrow j} \sim k_j (1 - |\eta_i - \eta_j|)$$



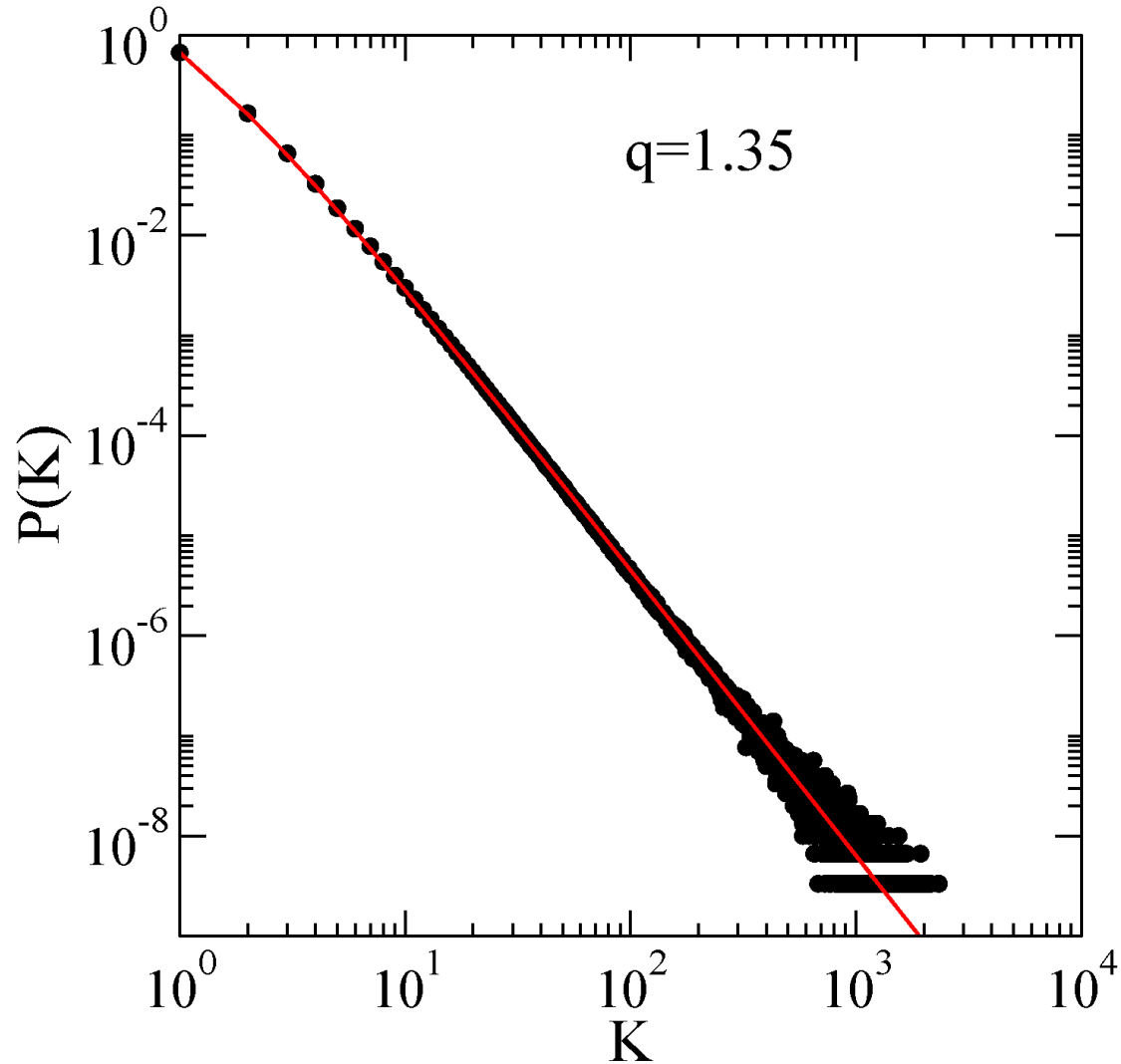
Affinity Model: Connectivity Time Evolution



Affinity Model



Affinity Model: Tsallis Statistics



NATAL MODEL: 1D^{*}, 2D, 3D^{*}

Brito, da Silva and Tsallis

^{*} Work in progress

Natal Model 1D^{*}, 2D, 3D^{*}

Preferential attachment

$$\Pi_i = \frac{k_i r_{ij}^{-\alpha_A}}{\sum_j k_j r_{ij}^{-\alpha_A}}$$

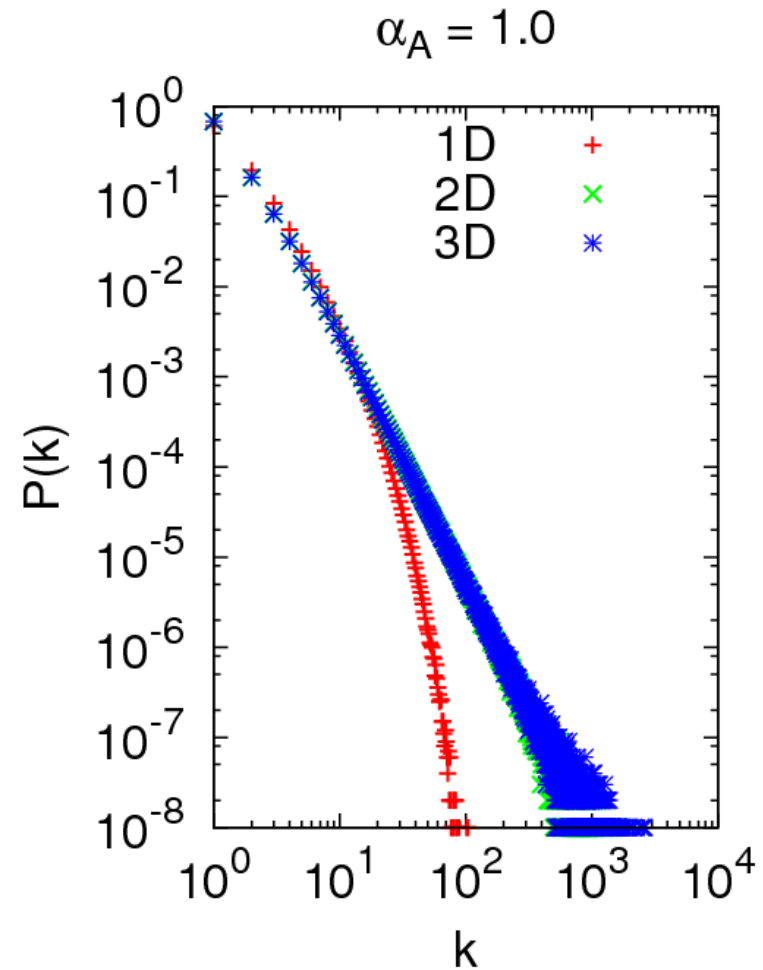
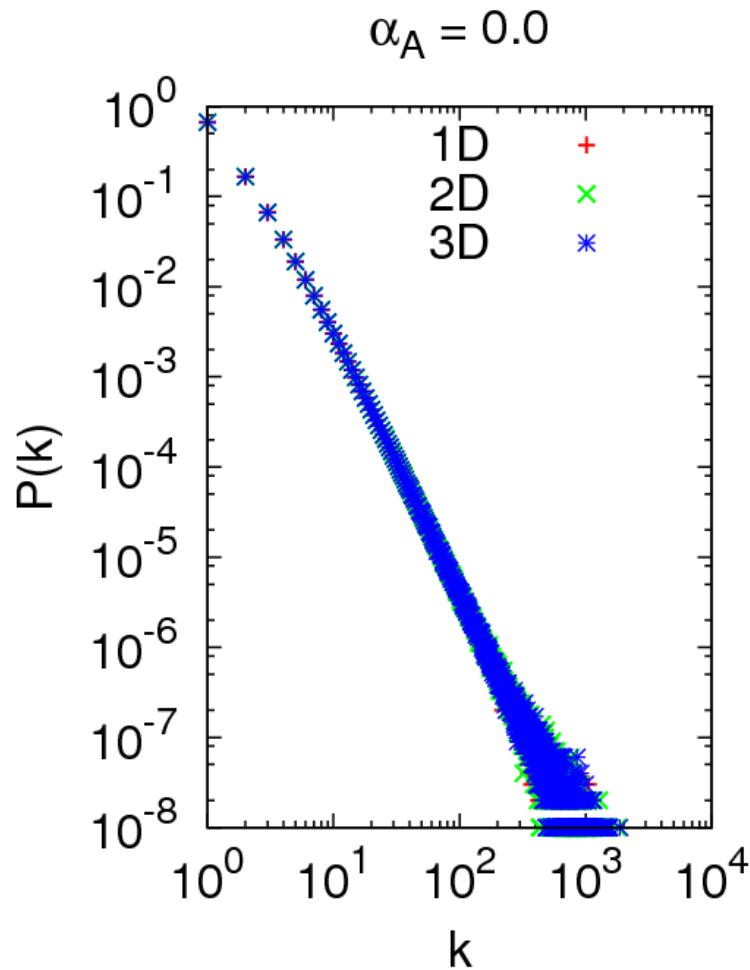
Distance distribution

$$P(r) \propto \frac{1}{r^{2+\alpha_G}}$$

$$\alpha_G = 2$$

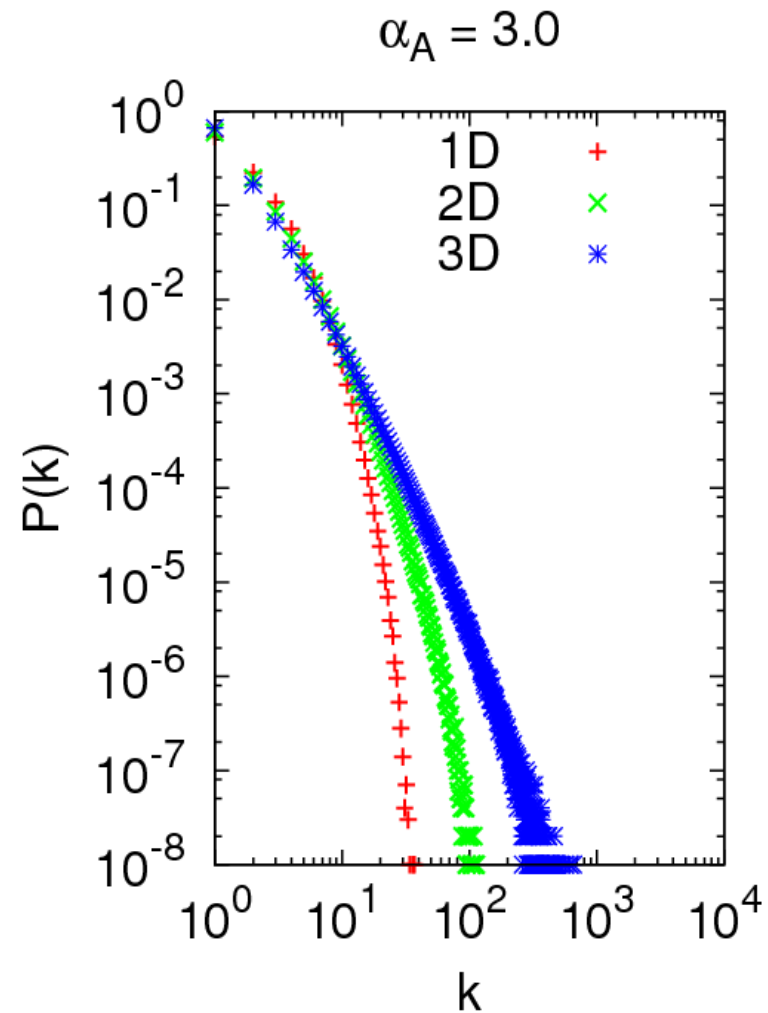
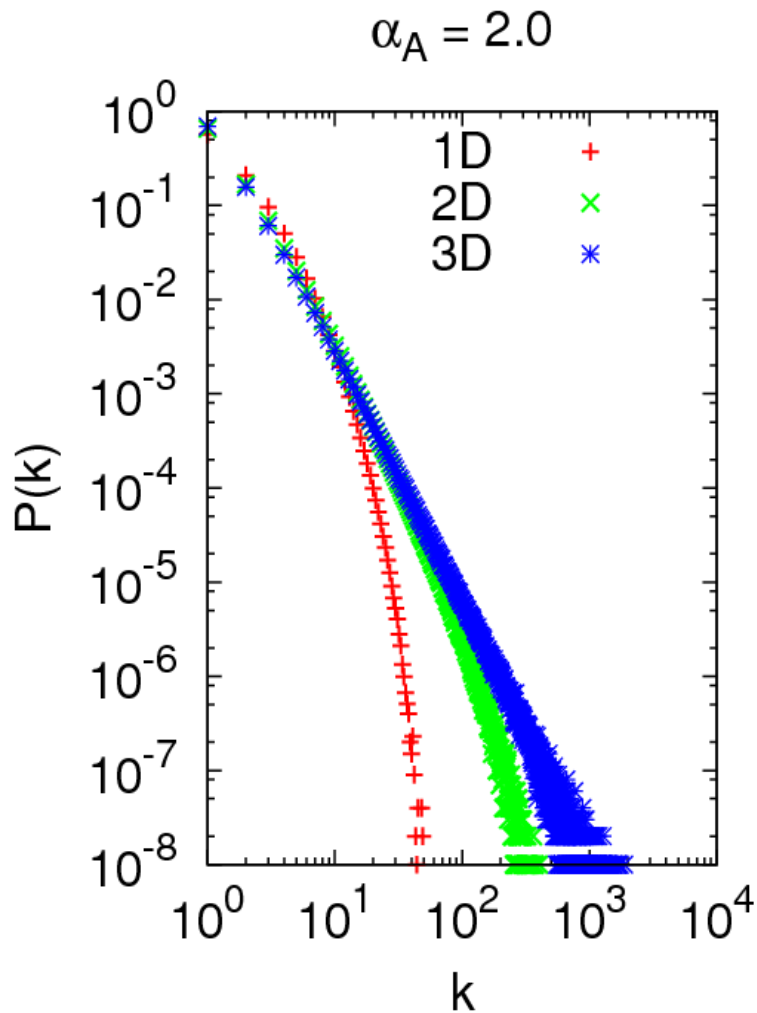
Degree distribution

Natal Model 1D, 2D e 3D



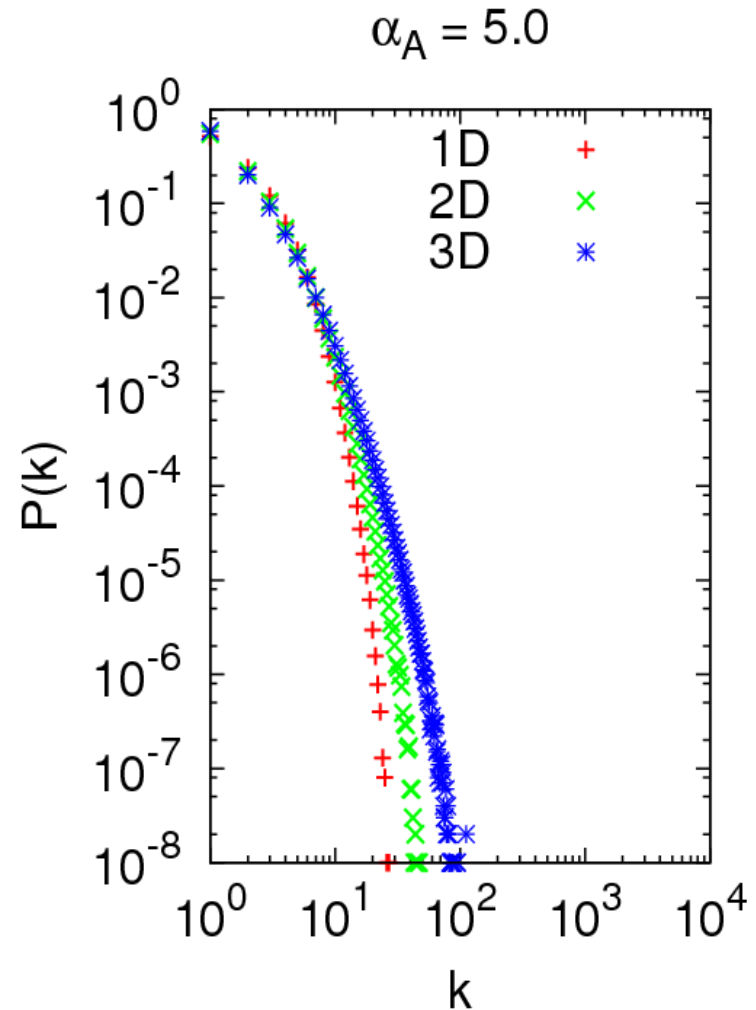
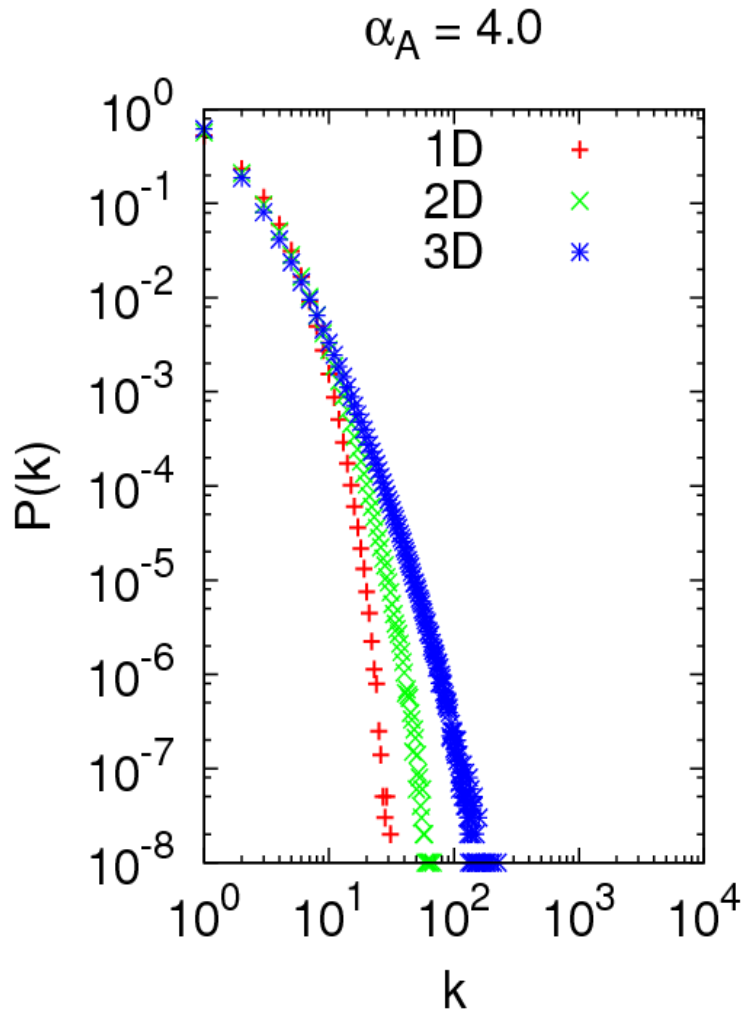
Degree distribution

Natal Model 1D, 2D e 3D



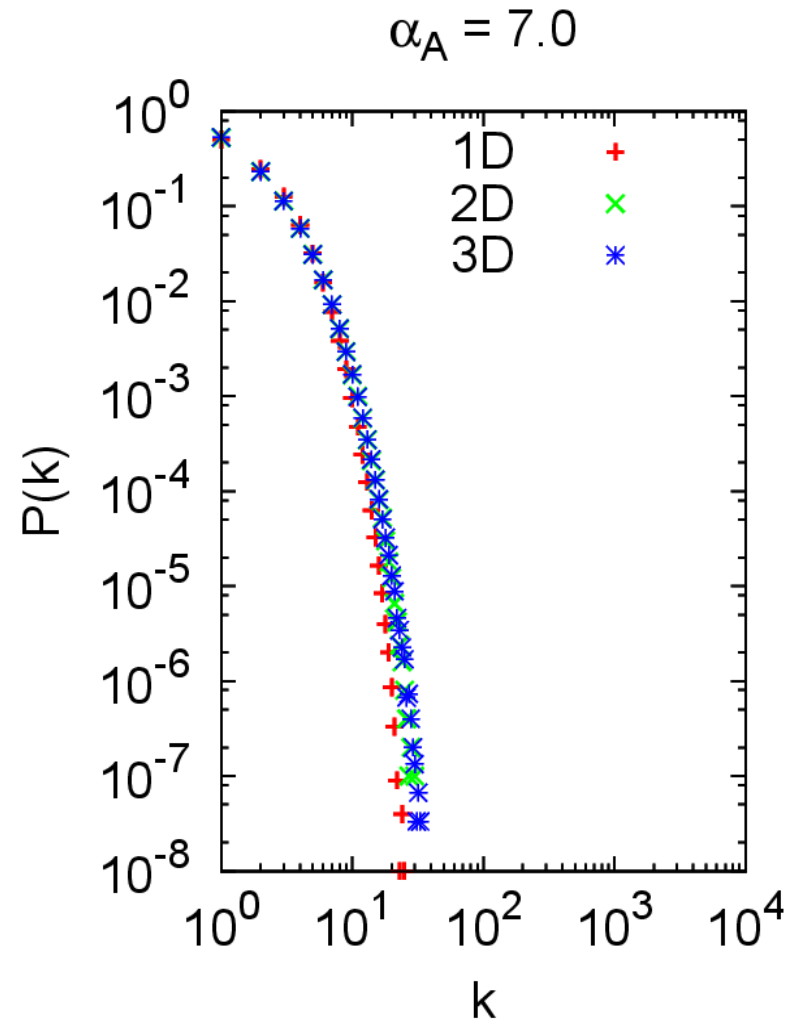
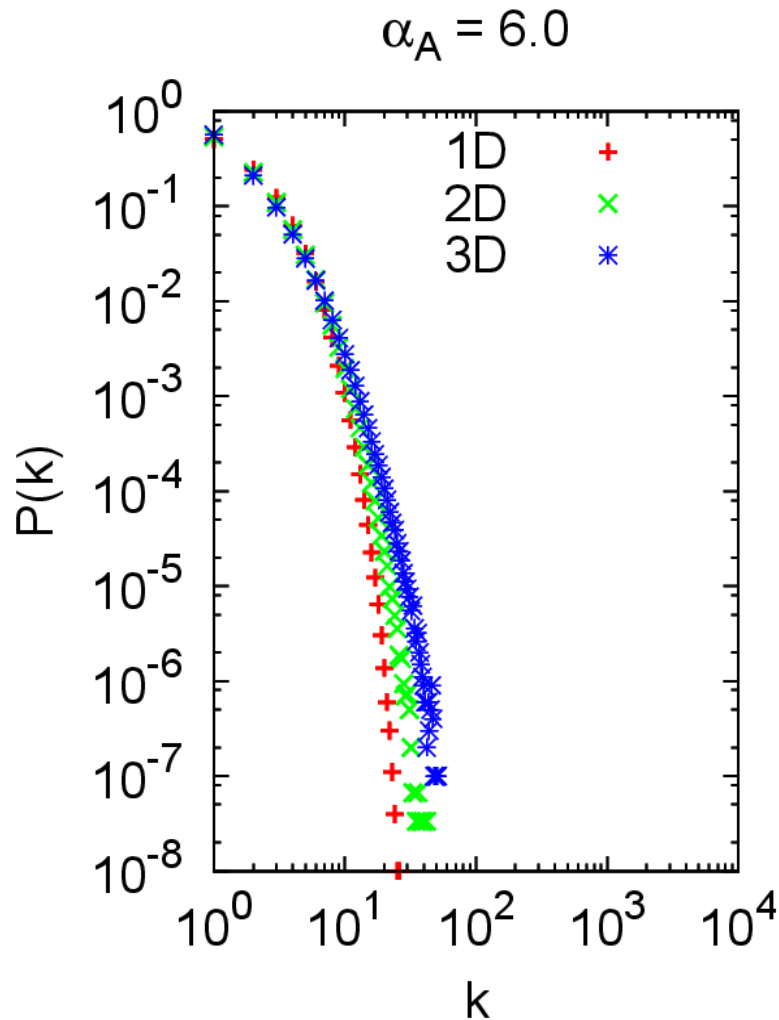
Degree distribution

Natal Model 1D, 2D e 3D



Degree distribution

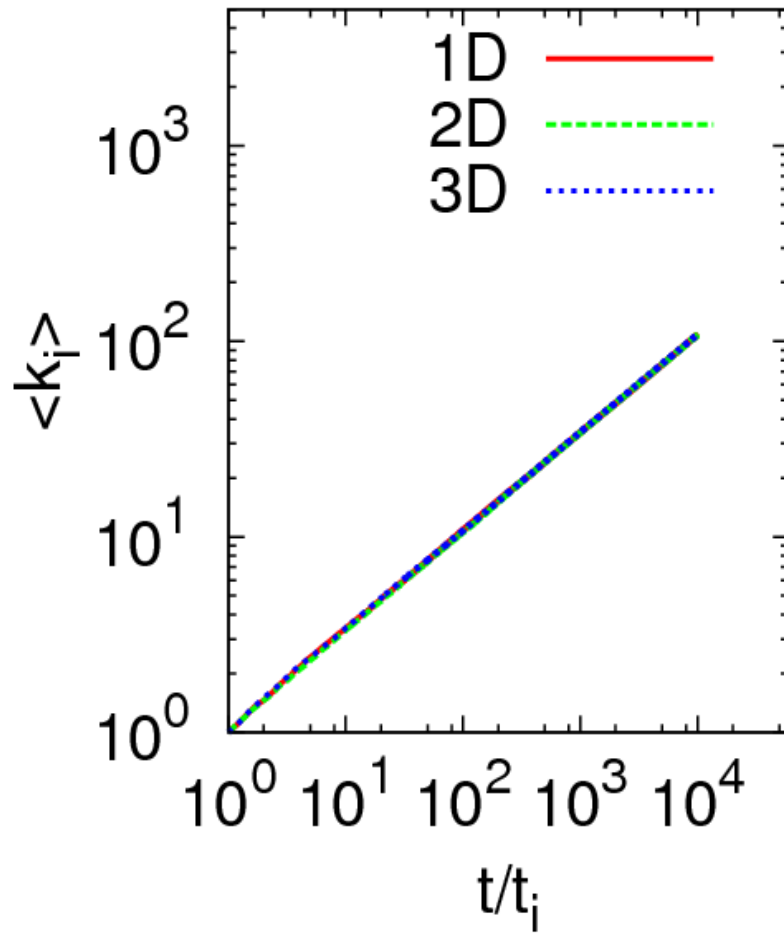
Natal Model 1D, 2D e 3D



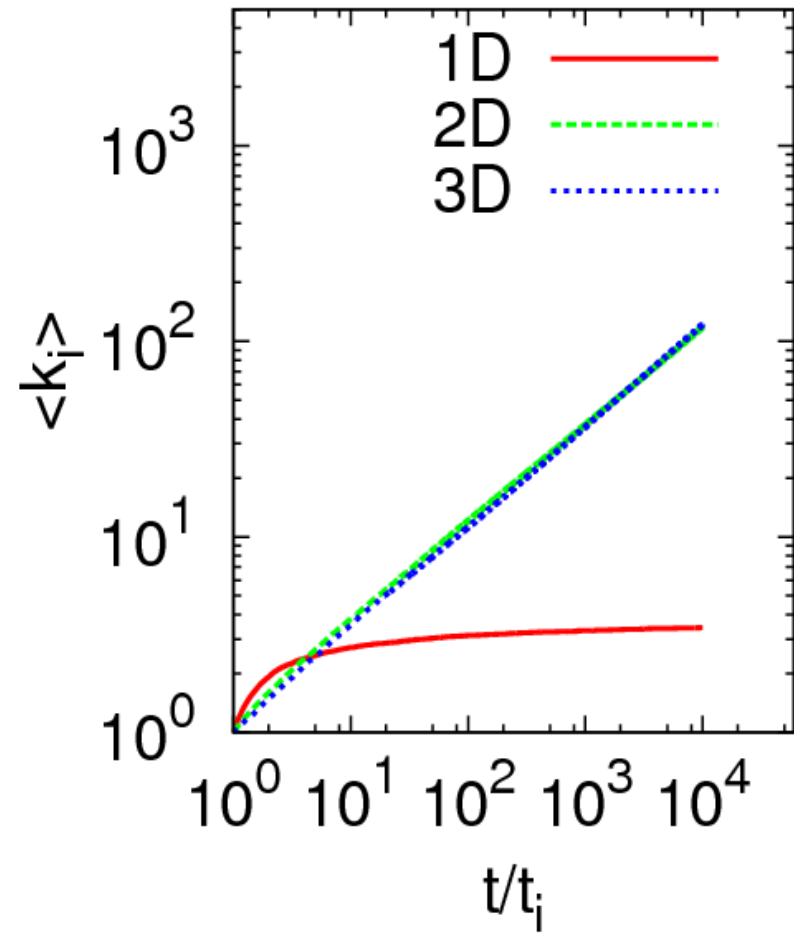
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Connectivity Time Evolution – Natal Model 1D, 2D, 3D

$\alpha_A = 0.0$



$\alpha_A = 1.0$



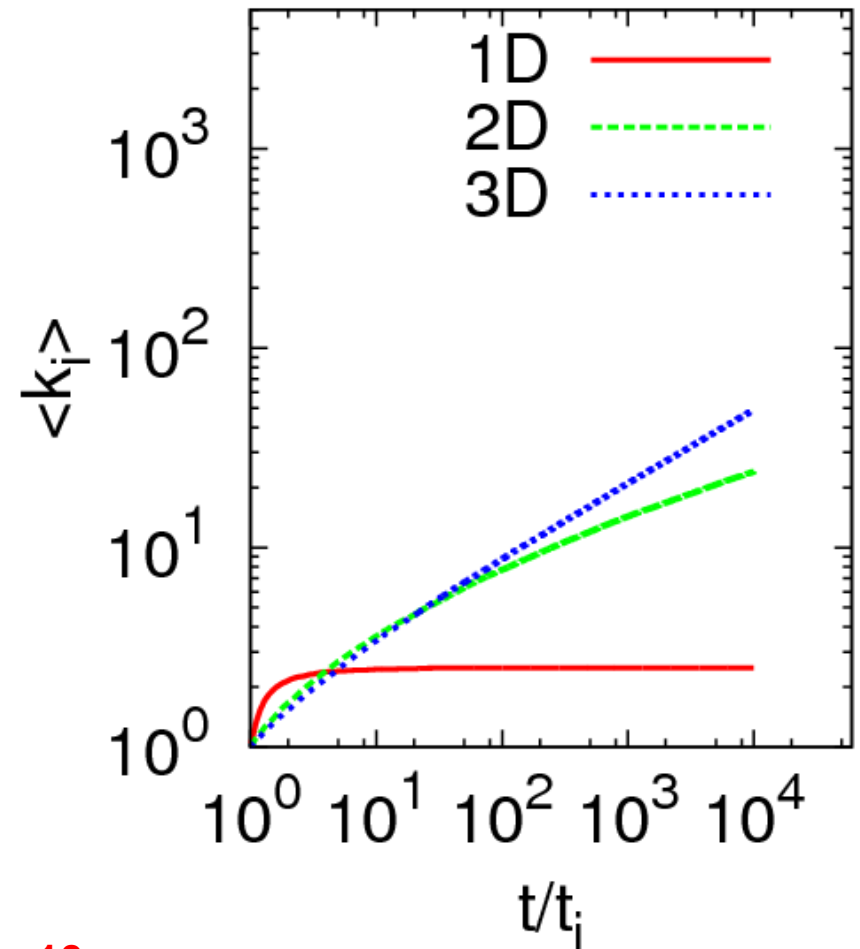
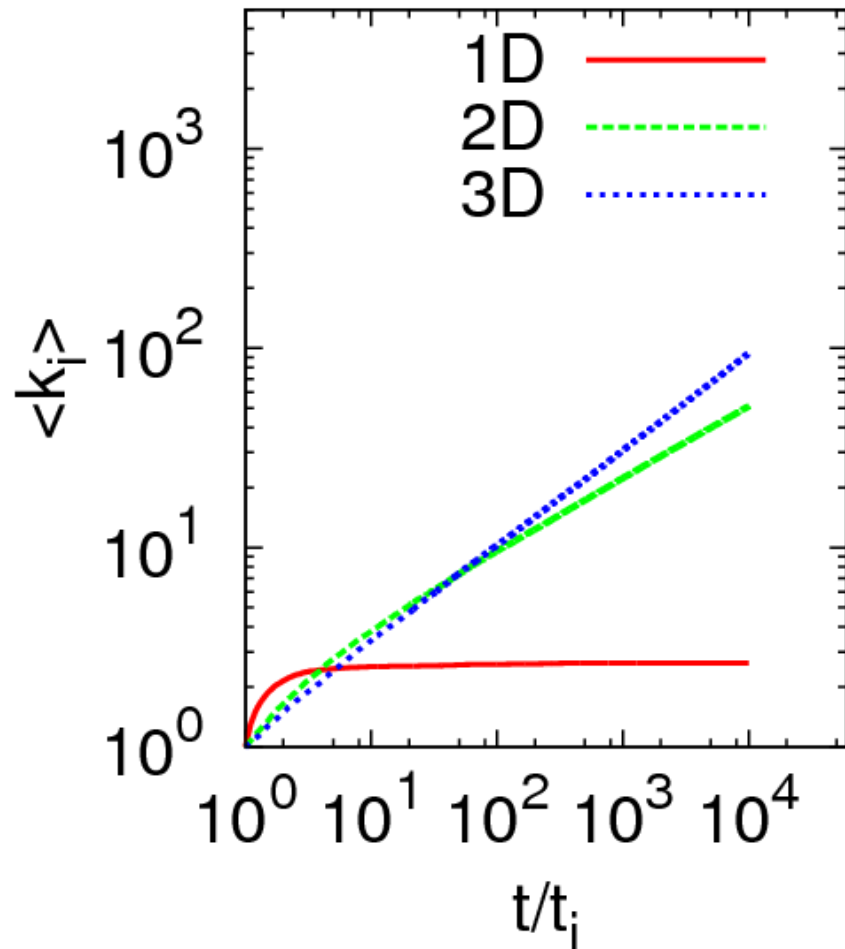
$i = 10$

COMPLEX SYSTEMS: FOUNDATIONS AND APPLICATIONS

Connectivity Time Evolution – Natal Model 1D, 2D, 3D

$$\alpha_A = 2.0$$

$$\alpha_A = 3.0$$

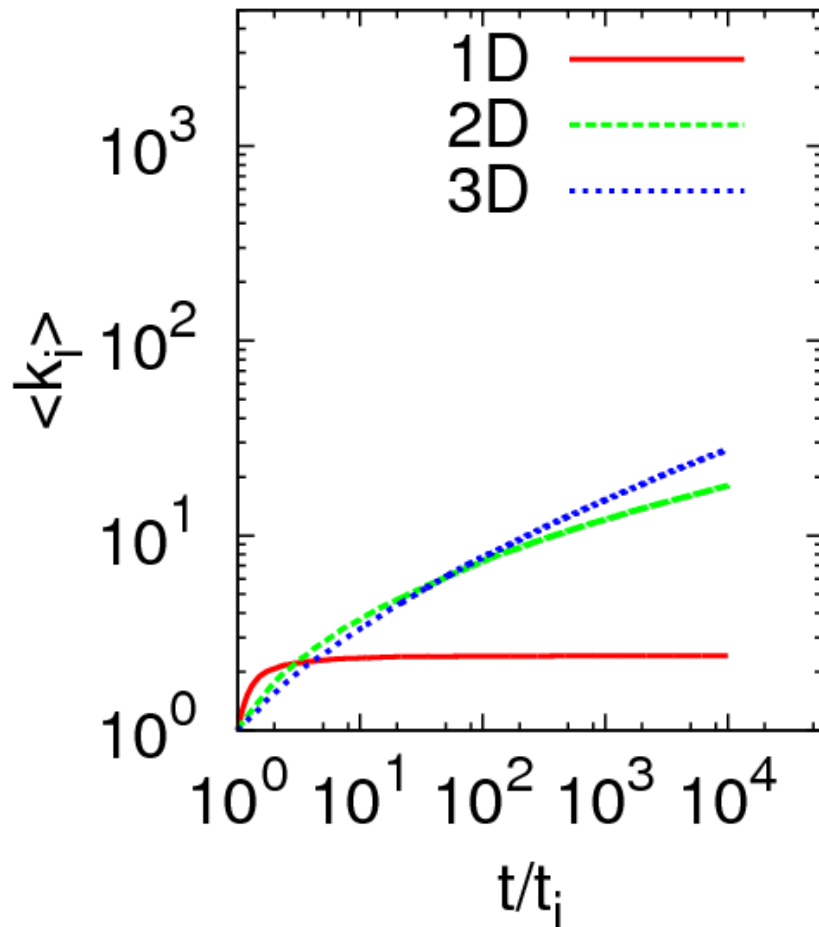


$i = 10$

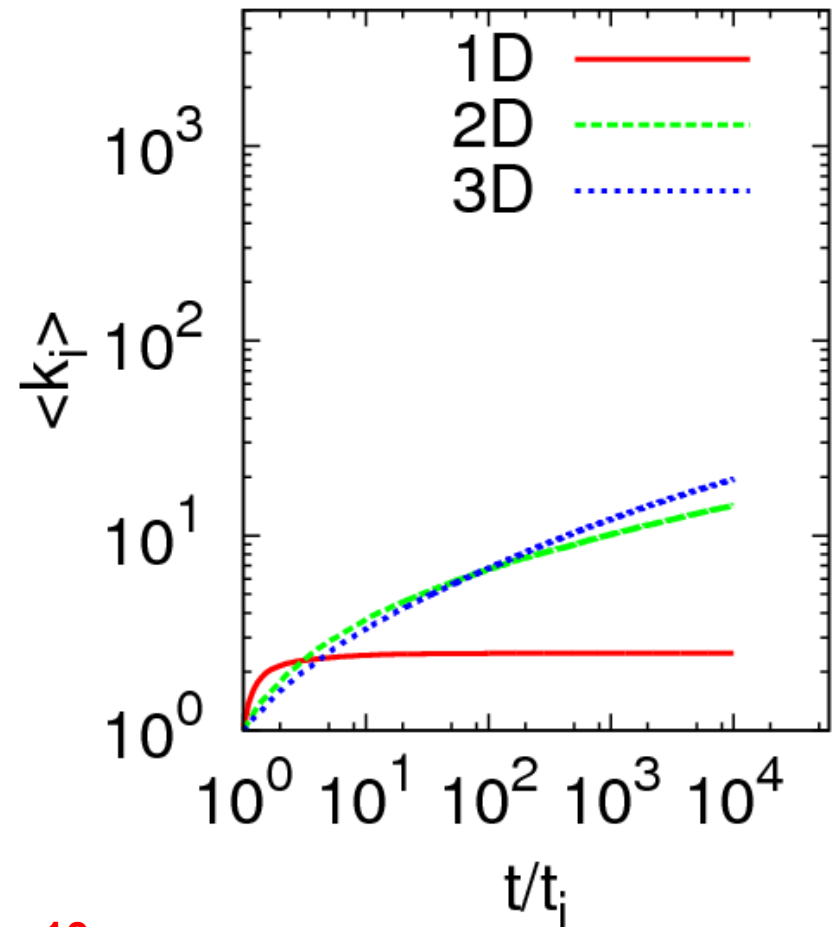
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Connectivity Time Evolution – Natal Model 1D, 2D, 3D

$$\alpha_A = 4.0$$

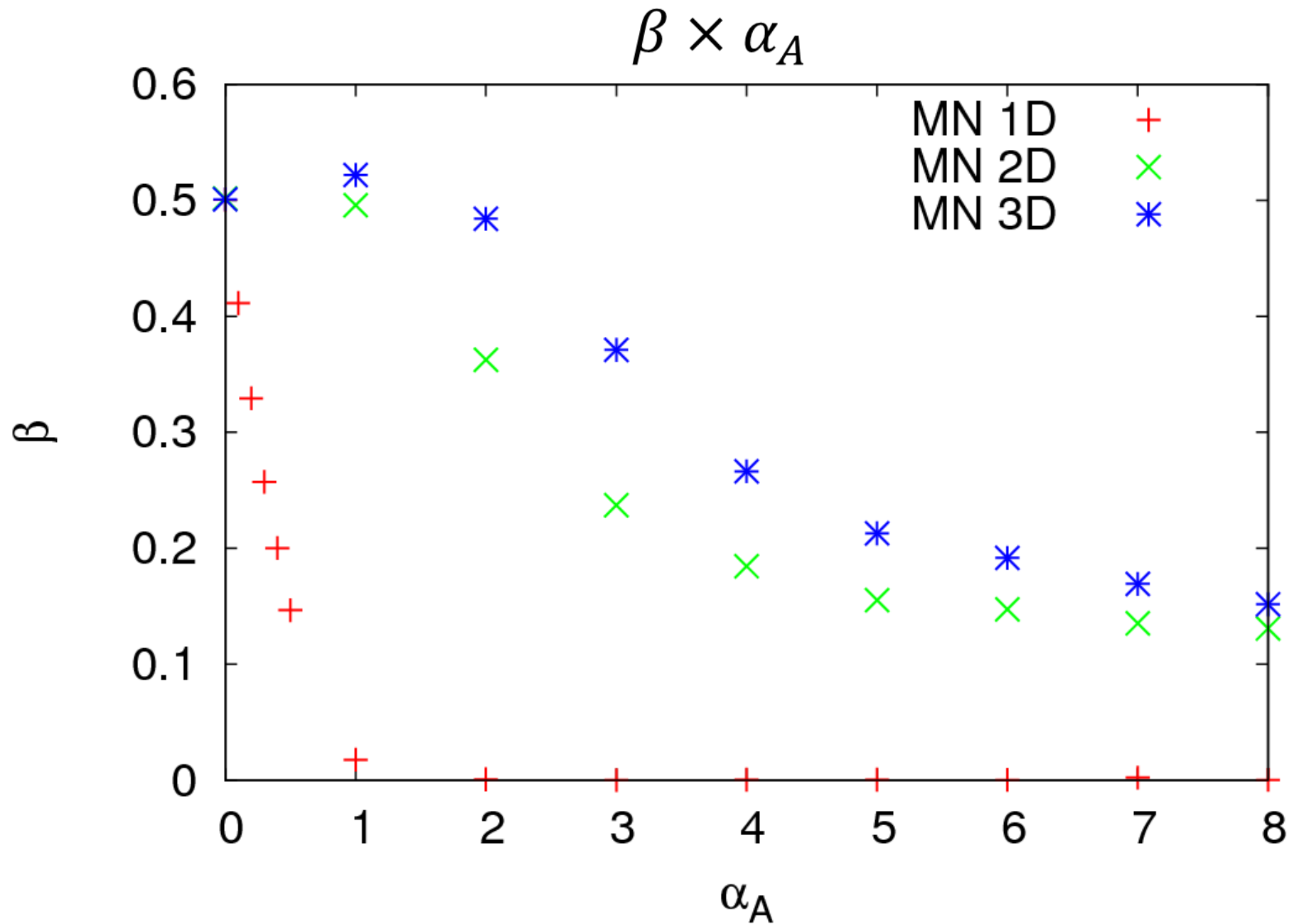


$$\alpha_A = 5.0$$



$i = 10$

COMPLEX SYSTEMS: FOUNDATIONS AND APPLICATIONS

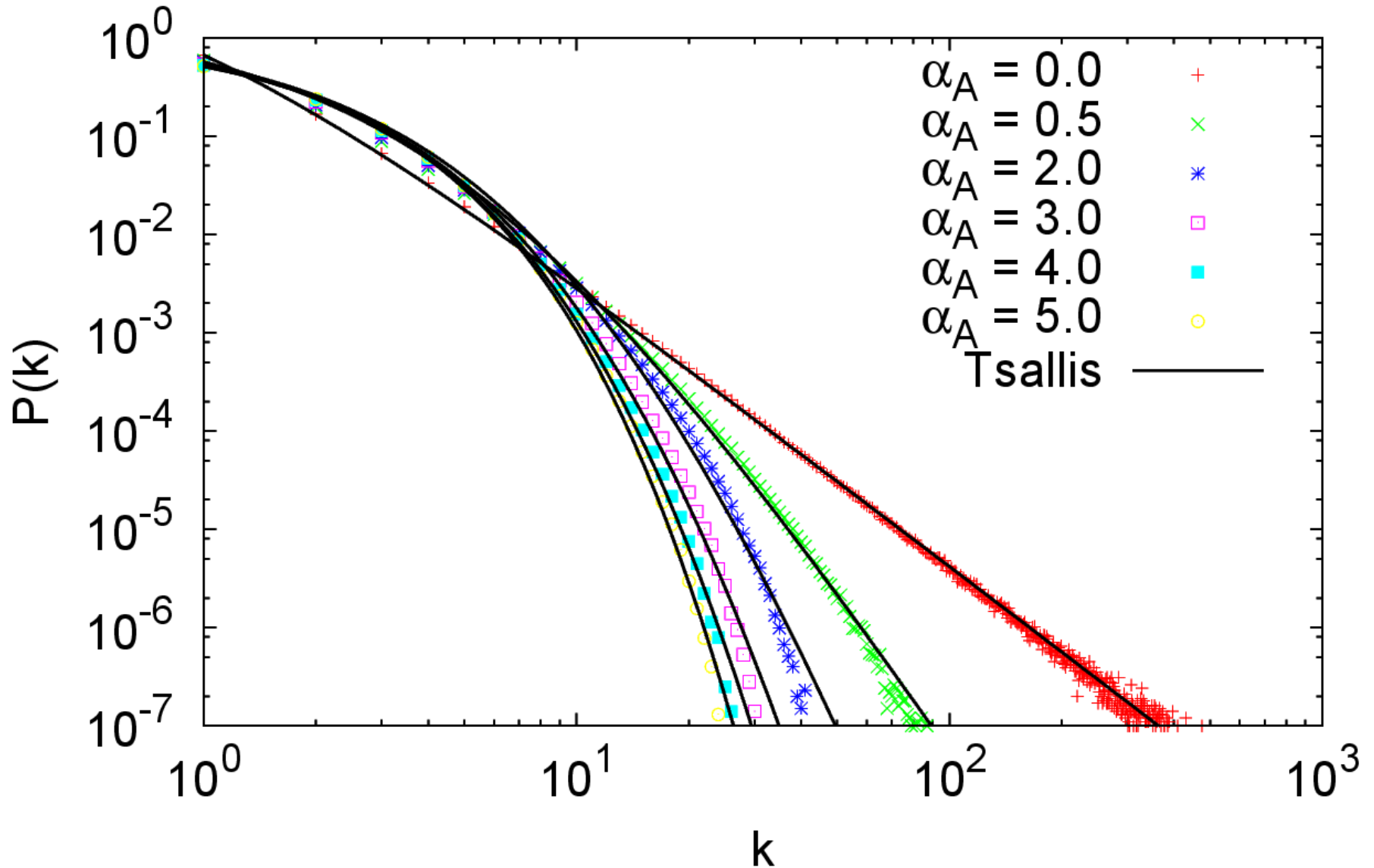


Tsallis Proposal

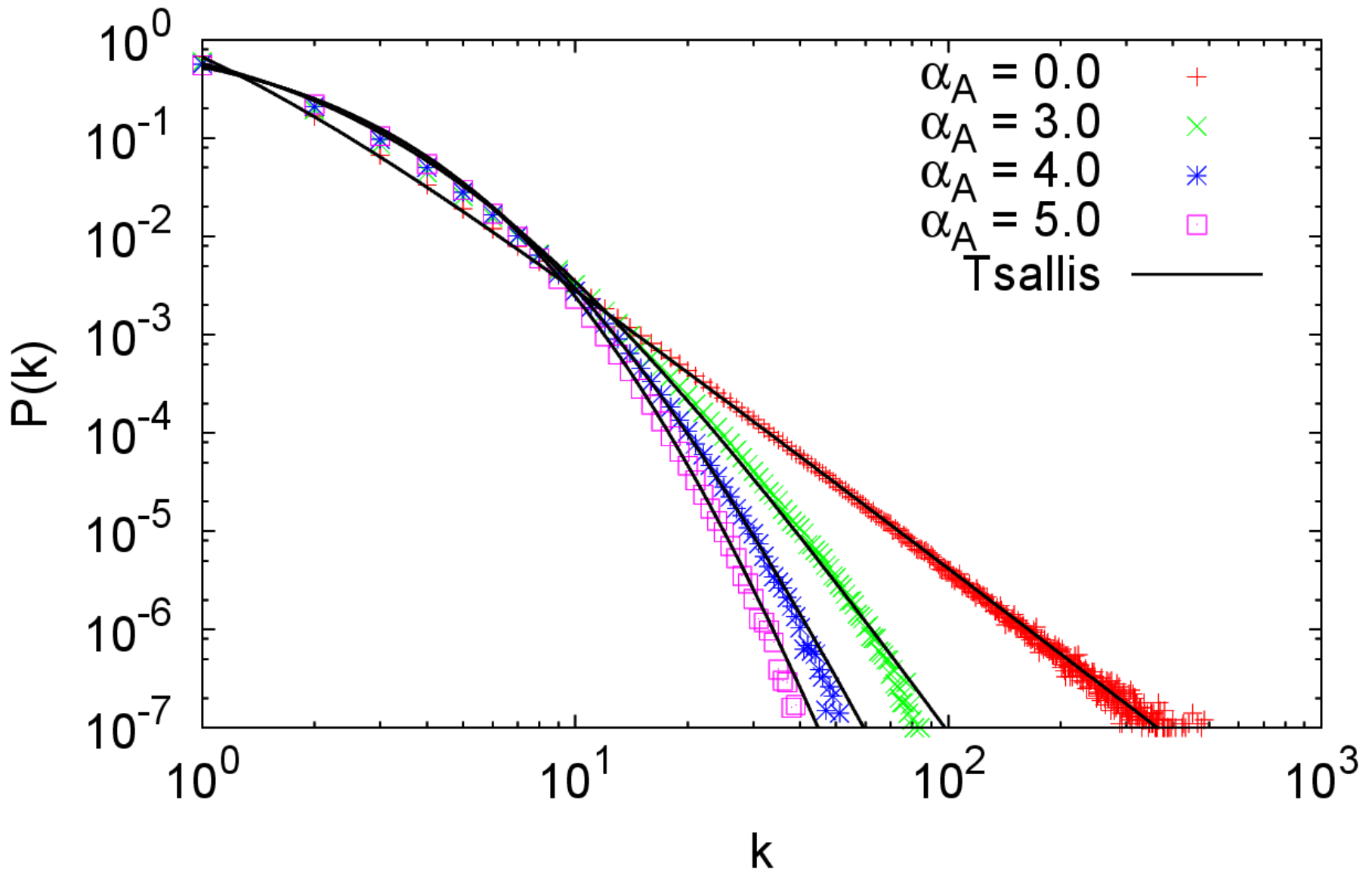
$$P(k) = P_0 e_q^{-k/\kappa}$$

$$e_q^x \equiv [1 + (1 - q)x]^{1/(1-q)}$$

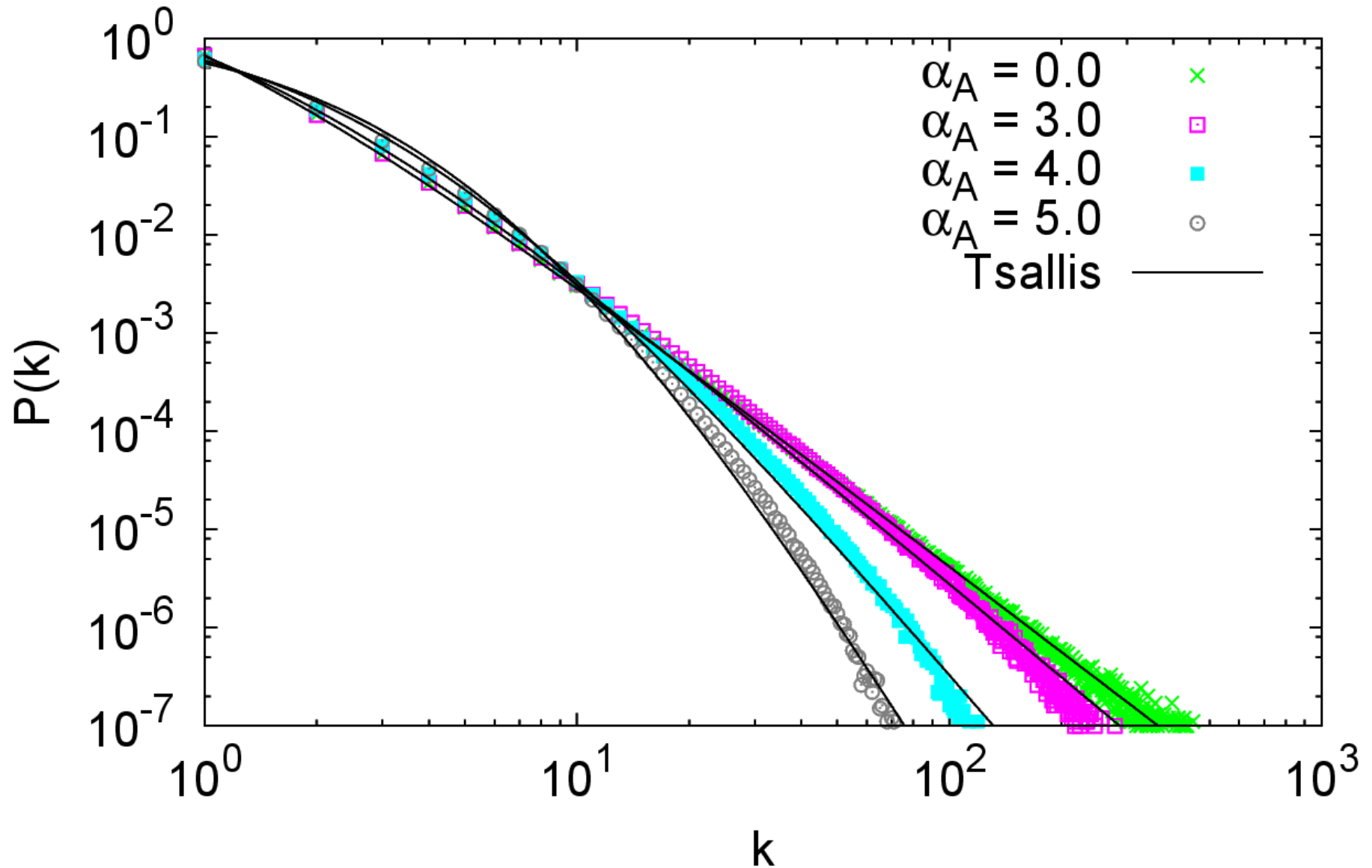
Natal Model 1D



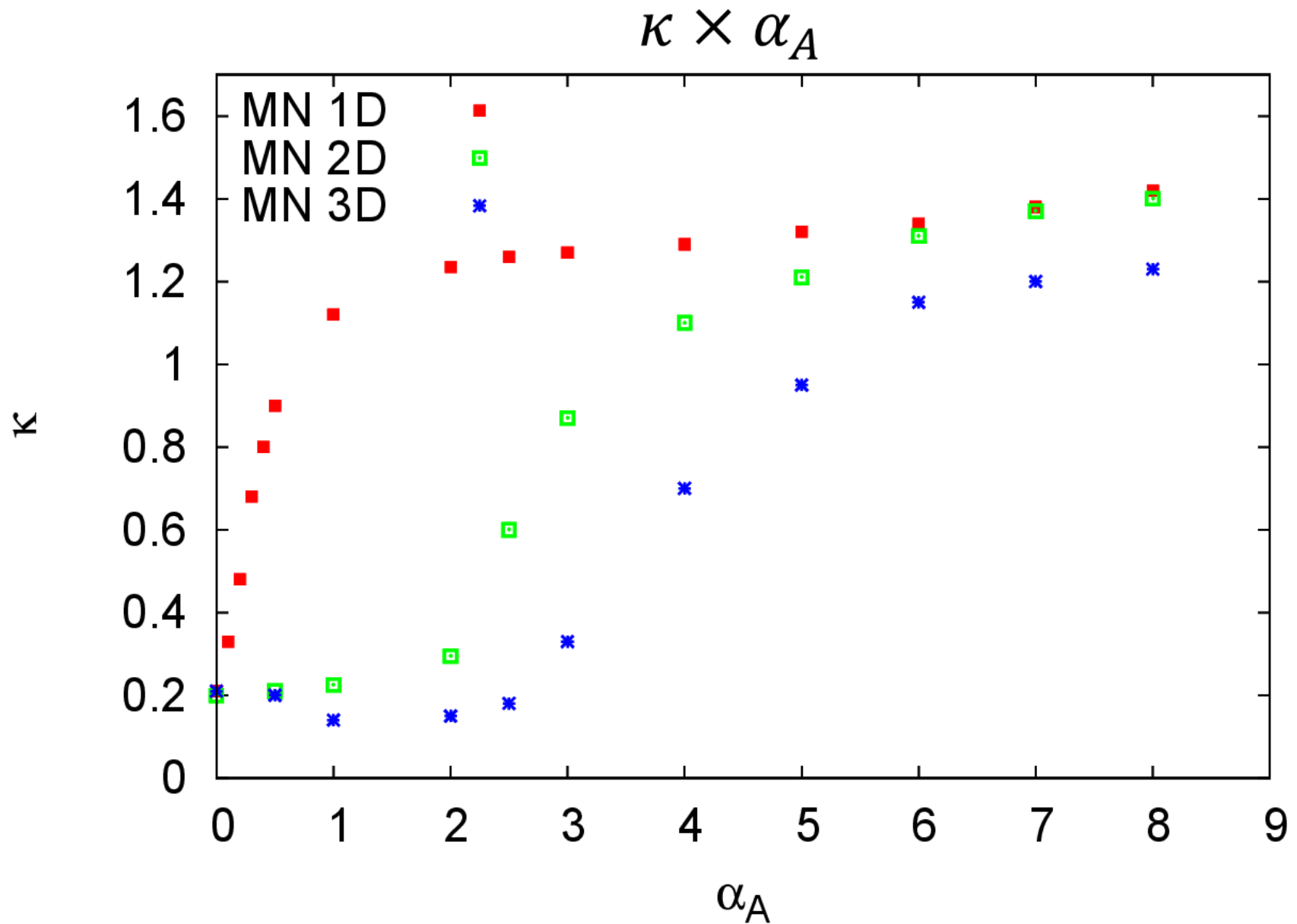
Natal Model 2D



Natal Model 3D

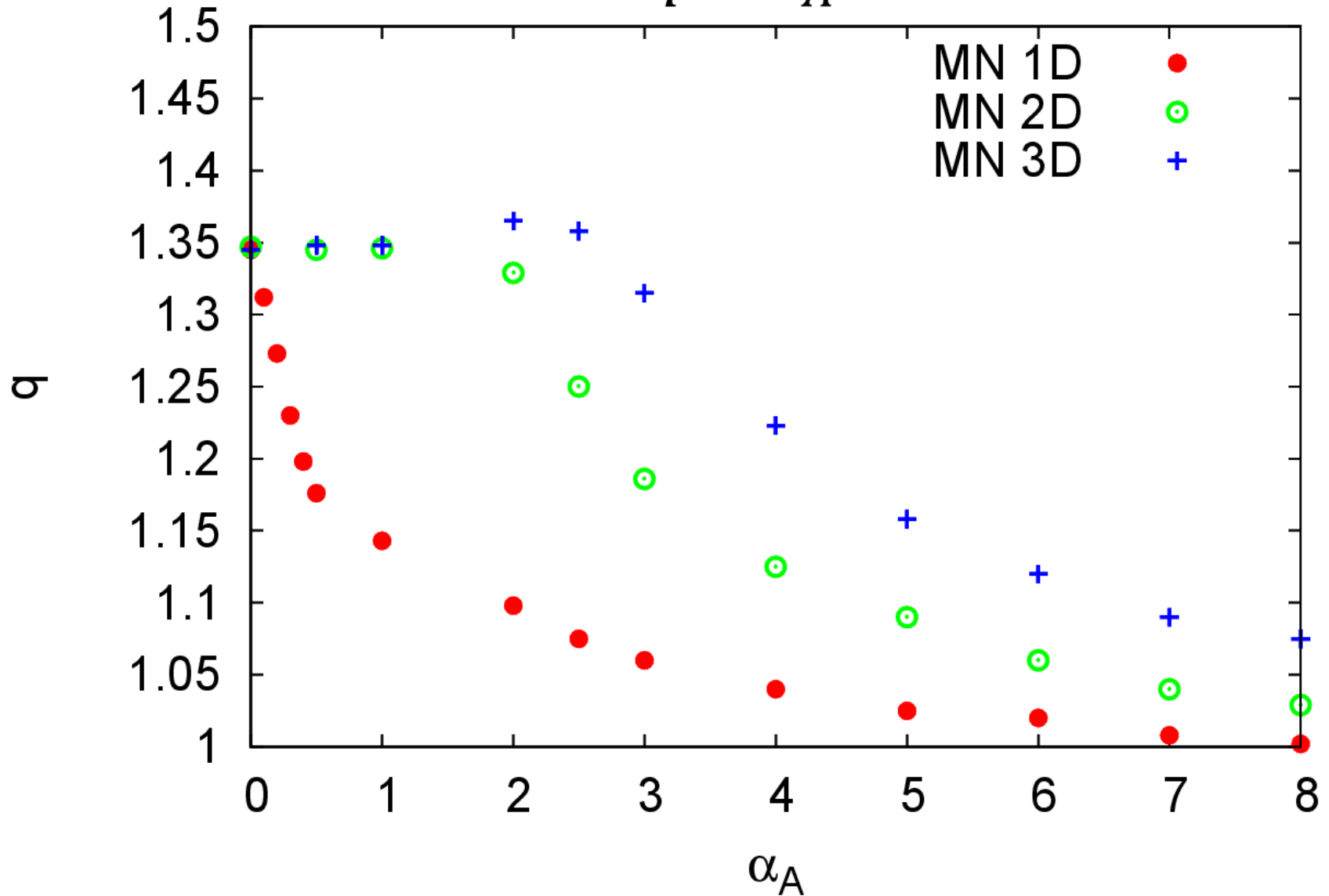


COMPLEX SYSTEMS: FOUNDATIONS AND APPLICATIONS

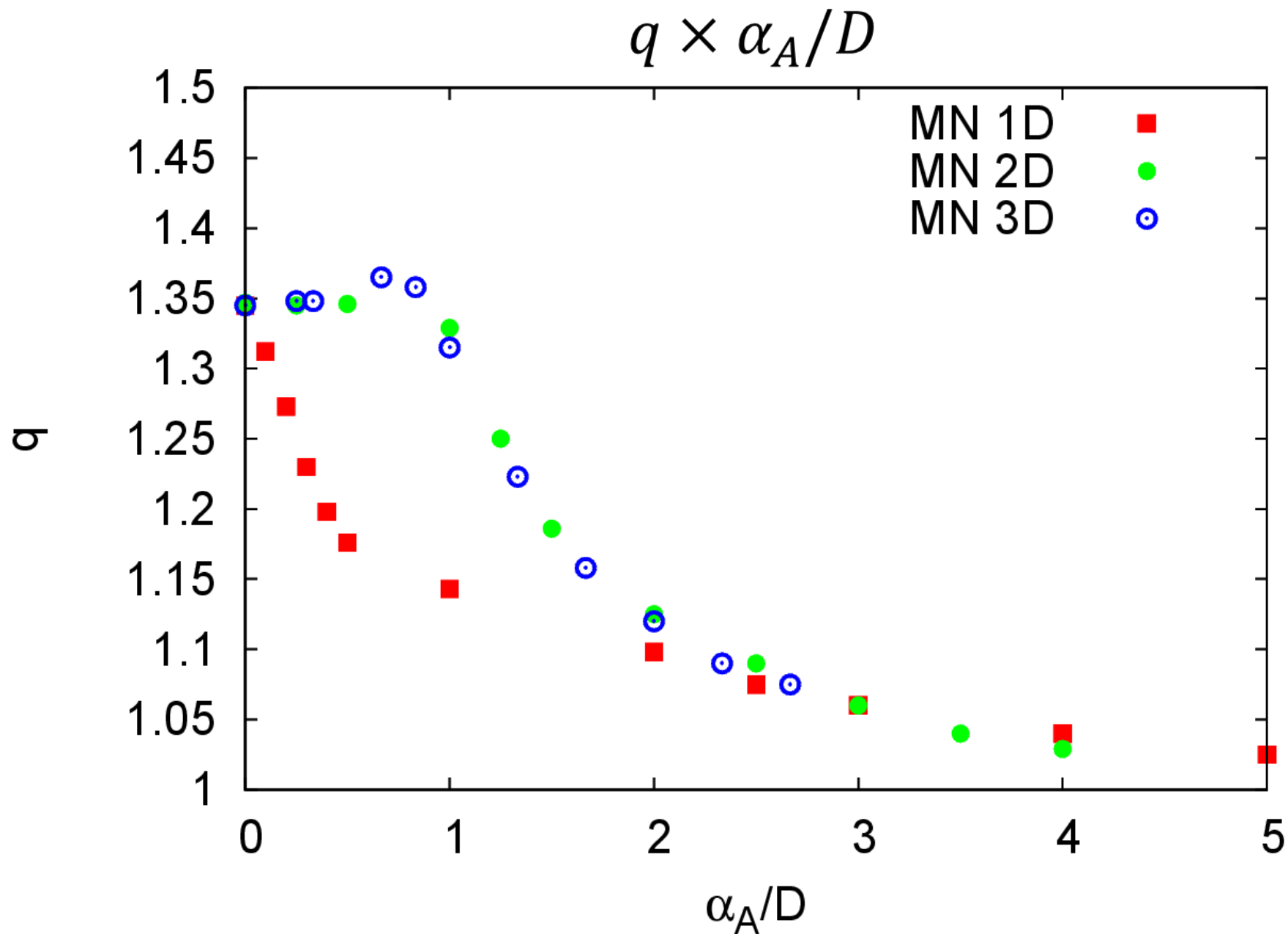


COMPLEX SYSTEMS: FOUNDATIONS AND APPLICATIONS

$$q \times \alpha_A$$



COMPLEX SYSTEMS: FOUNDATIONS AND APPLICATIONS



Summary

(a)

- We study the effect of competition between the relevant variables: connectivity k , fitness η and metrics r .
- The fitness may give the possibility to the younger nodes to compete equally with the older ones, when the younger node gets a high fitness.
- By including metrics favors the linking between first neighbors.
- The degree distribution $P(k)$ of the present generalized model appears to be the q -exponential function that emerges naturally within Tsallis nonextensive statistics.

Summary

- We modify the rule of the preferential attachment of the Bianconi-Barabasi model including a factor which represents similarity of the sites.
- The term that corresponds to this similarity is called the affinity and is obtained by the modulus of the difference between the fitness (or quality) of the sites.
- This variation in the preferential attachment generate very unusual and interesting results.
- We extend the Natal Model (**Geographic Model**) for $d=1$ e $d=3$. We calculated $P(k)$ and the respective exponents. We verify $P(k)$ as a Tsallis Statistics approach and we observed a scale law for q versus α/d

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“Preferential Attachment Growth Model and non-Gaussian Statistics”

Physics Letters A **377** 842 (2013)

70th birthday of Prof. Constantino Tsallis

- It was very fortunate for me to have met Prof. Constantino in 1977 when I arrived in Rio de Janeiro.
- While I came from Natal, he came from Brasília. Since that time my professional and personal life never was the same because one thing is correlated to the other.
- I have no doubt that my life is divided in two parts:
B. C. and A. C.
- Congratulations **Mr. q** and have a very, very, very good time in the future!!! You deserve it !!!

THANK YOU VERY
MUCH!