

# **Border effects in ad-hoc networks**

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## Outline

1. Random geometric graph model of wireless networks
2. Connectivity in convex domains  
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3. Non-convex domains

# Random geometric graphs

Introduced in 1961 by E. N. Gilbert:

*Recently random graphs have been studied as models of communications networks. Points (vertices) of a graph represent stations; lines of a graph represent two-way channels. . . . To construct a random plane network, first pick points from the infinite plane by a Poisson process with density  $D$  points per unit area. Next join each pair of points by a line if the pair is separated by distance less than  $R$ .*

Then:

**Communications networks** Many authors, since 1980s

**Connectivity threshold** Penrose (1997), Gupta & Kumar (1999)

**Books:**

**Meester & Roy (1996)** Continuum percolation

**Penrose (2003)** Random geometric graphs

**Franceschetti & Meester (2008)** Random networks for communication

**Walters (2011)** Random geometric graphs (survey article)

**Haenggi (2012)** Stochastic geometry for wireless networks

## Network considerations

**Mesh architectures** Multihop connections rather than direct to a base station: Reduces power requirements, interference, single points of failure.

**Random node locations** In many applications (sensor, vehicular, swarm robotics, disaster recovery, ...) device locations are unplanned and/or mobile.

**Network characteristics** Full connectivity, k-connectivity (resilience; OG, CPD and JPC, EPL 2013), betweenness centrality (importance, overload; A.P. Giles, OG and CPD, ICC 2015), algebraic connectivity (synchronisation).

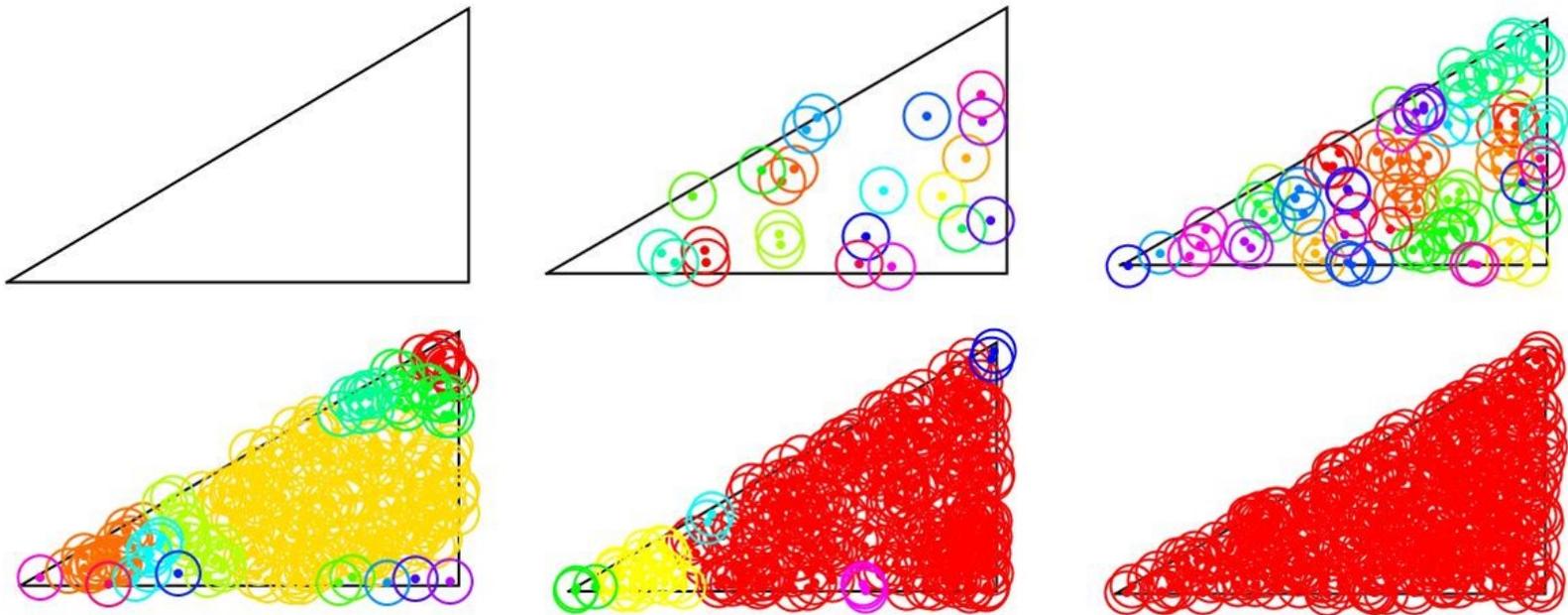
Useful extensions:

**Random connection models** Extra randomness: Form a link with (iid) probability  $H(r) \in [0, 1]$ , a function of the mutual distance  $r$ .

**Line of sight condition** Impenetrable and/or reflecting boundaries: Particular relevance to networks using millimetre waves.

**Etc** : Interference (later) anisotropic connections (OG, CPD and JPC, TWC 2014), heterogeneous networks, mobility, dynamic networks, trust...

## Example: A triangle



Isolated nodes occur mostly near the corners...

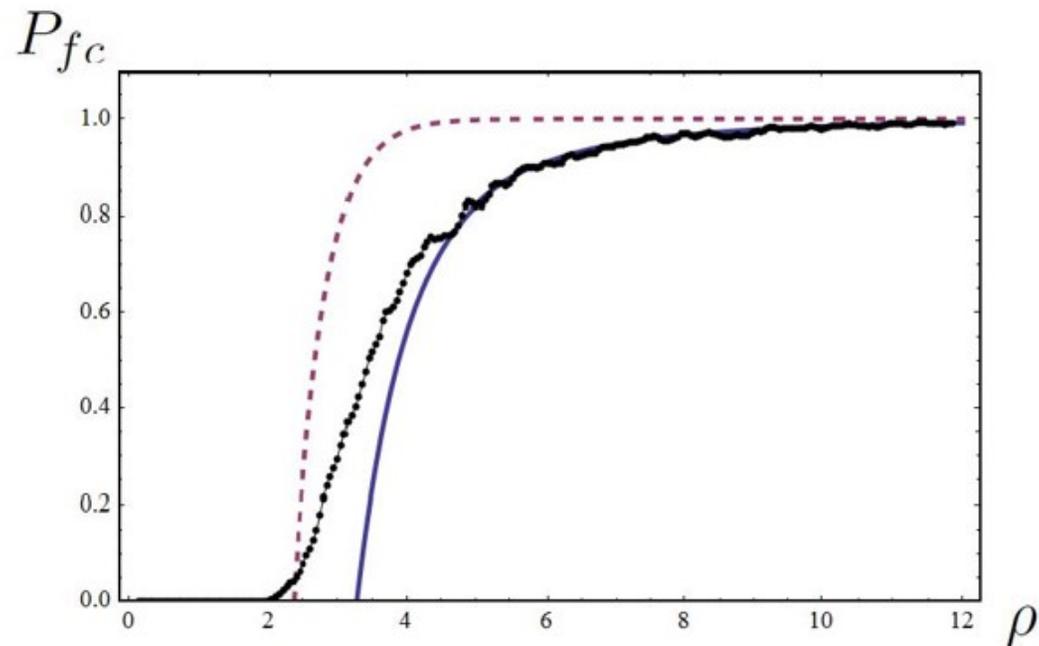
## Dependence on density and geometry

We see two main transitions as density increases:

**Percolation** Formation of a cluster comparable to system size:  
Largely independent of geometry.

**Connectivity** All nodes connected in multi-hop fashion:  
Strongly dependent on geometry.

What is the full connection probability as a function of density and geometry?



## Previous results

Mathematically rigorous results are in the limit of many nodes, taking appropriate scaling for  $r_0$ ,  $L$  and/or  $\rho$ .

For the random geometric graph in dimension  $d \geq 2$ , it was shown by Penrose, and by Gupta & Kumar, that the  $r_0$  threshold for **connectivity** is almost always the same as for **isolated nodes**.

In turn, isolated nodes are local events, so described by a limiting Poisson process: The probability of a node having degree  $k$  is given by

$$P(k) = \frac{\mathcal{K}^k}{k!} e^{-\mathcal{K}}$$

where  $\mathcal{K}$  is the mean degree, equal to  $\rho\pi r_0^2$  for the 2D RGG. This leads to

$$P_{fc} \approx \exp \left[ -\rho V e^{-\rho\pi r_0^2} \right]$$

where  $V$  is the “volume” (ie area) of the domain.

At fixed probability,  $V$  needs to increase exponentially with  $\rho$

## Random connection models

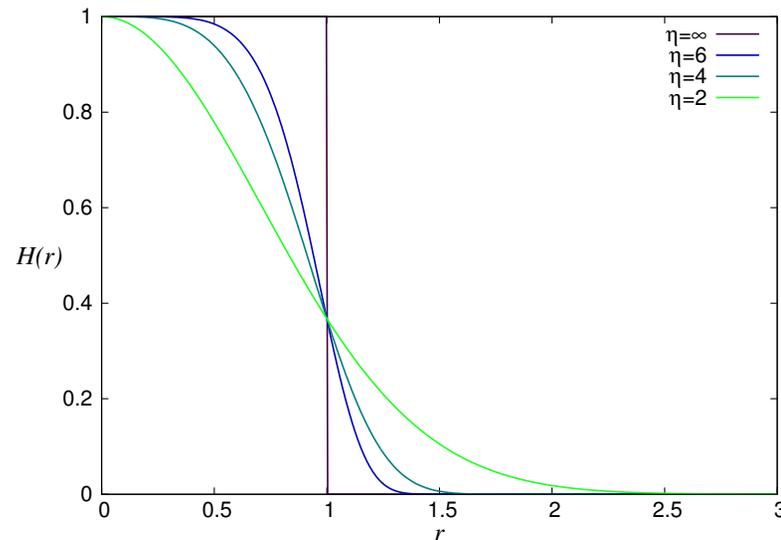
The connection function is the complement of the outage probability,

$$H(r) = \mathbb{P}(\log_2(1 + SNR |h|^2) > R_0)$$

neglecting interference, with  $SNR \propto r^{-\eta}$ , path loss exponent  $\eta \in [2, 6]$ , rate  $R_0$ . Simplest is Rayleigh fading (diffuse signal), for which the channel gain  $|h|^2$  is exponentially distributed, giving

$$H(r) = \exp[-(r/r_0)^\eta]$$

Similar, though more involved: MIMO, Rician (specular plus diffuse), ...



# Connectivity in the random connection model

The formula generalises naturally

$$P_{fc} \approx \exp \left[ - \int \rho e^{-\rho \int H(r_{12}) d\mathbf{r}_1} d\mathbf{r}_2 \right]$$

where  $\rho$  is the density, and the integrals are over the domain  $\mathcal{V} \subset \mathbb{R}^d$ . It has been proved under specific conditions (see Penrose, 2015):

- In the limit of infinitely many nodes
- Isolated nodes are approximately Poisson for a large class of connection functions (not annulus).
- Connectivity is equivalent to absence of isolated nodes for a smaller class (in particular, compact support).
- The domain is a  $d$ -dimensional cube.

We assume the above expression provides a useful approximation  $P_{fc}$  when these assumptions are relaxed, ie finite density, exponentially decaying connection functions, general convex domains in two or three dimensions.

**Open problem:** 1D networks with the random connection model.

## Convex polyhedra, etc

For large  $\rho$ , we expect the domination by the regions of small connectivity mass

$$M(\mathbf{r}_2) = \int H(r_{12}) d\mathbf{r}_1$$

Exactly on the boundary, this is given by

$$M_B = H_{d-1} \omega_B$$

where

$$H_m = \int_0^\infty H(r) r^m dr$$

is the  $m$ th moment, and  $\omega_B$  is the (solid) angle associated with the boundary component  $B$ , eg  $\pi/2$  for a right angled corner,  $\pi$  for an edge. We analyse the vicinity of boundaries more carefully to obtain...

## General formula

$$P_{fc} \approx \exp \left[ - \sum_B \rho^{1-i_B} G_B V_B e^{-\rho \omega_B H_{d-1}} \right]$$

where  $i_B$  is the boundary codimension,  $V_B$  is its  $d - i$  dimensional volume, and  $G_B$  is the geometrical factor

$G_B$	$i = 0$	$i = 1$	$i = 2$	$i = 3$
$d = 2$	1	$\frac{1}{2H_0}$	$\frac{1}{H_0^2 \sin \omega}$	
$d = 3$	1	$\frac{1}{2\pi H_1}$	$\frac{1}{\pi^2 H_1^2 \sin(\omega/2)}$	$\frac{4}{\pi^2 H_1^3 \omega \sin \omega}$

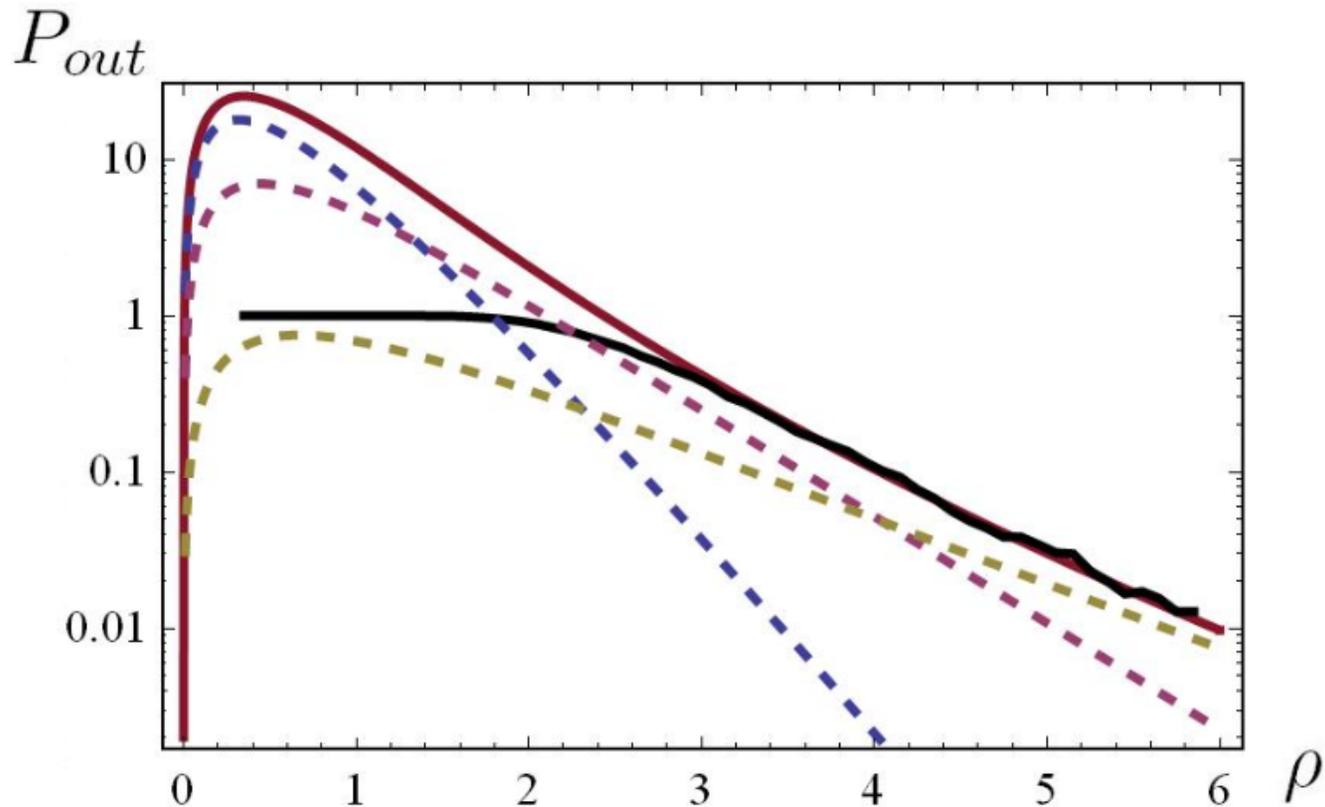
where the 3D corner has a right angle.

**Curved boundaries?** To leading order, curvature can be neglected.

## Example: A square

The previous formula gives

$$1 - P_{fc} \approx L^2 \rho e^{-\pi\rho} + \frac{4L}{\sqrt{\pi}} e^{-\frac{\pi\rho}{2}} + \frac{16}{\pi\rho} e^{-\frac{\pi\rho}{4}}$$



## Higher order terms

Expanding around the boundary points yields higher terms as well. In 2D:

**Bulk**

$$\rho A e^{-2\pi\rho H_1}$$

**Edge**

$$L e^{-\rho\pi H_1} \left[ \frac{1}{2H_0} - \frac{\tilde{H}_{-2}}{8\rho^2 H_0^4} + \dots \right]$$

**Corner, angle  $\omega$**

$$e^{-\rho\omega H_1} \left[ \frac{1}{\rho H_0^2 \sin \omega} - \frac{H(0)(2 \cos \omega + 1)}{\rho^2 H_0^4 \sin^2 \omega} - \frac{2\tilde{H}_{-2}}{\rho^3 H_0^5 \sin \omega} + \dots \right]$$

where  $\tilde{H}_{-2}$  is a regularised negative second moment, equal to

$$\int_0^\infty \frac{H'(r)}{r} dr + \sum_k \frac{H(r_k^+) - H(r_k^-)}{r_k}$$

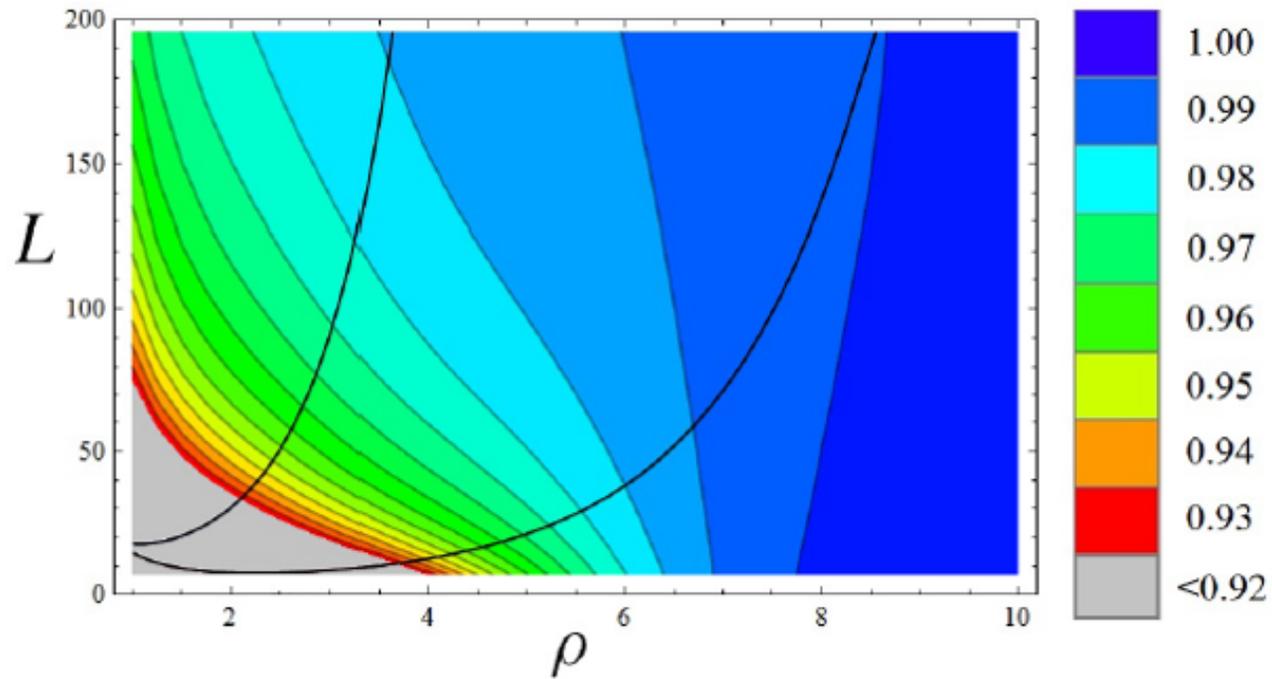
if the integral converges, where  $k$  sums over discontinuities.

There are similar results for 3D.

# Phase diagram

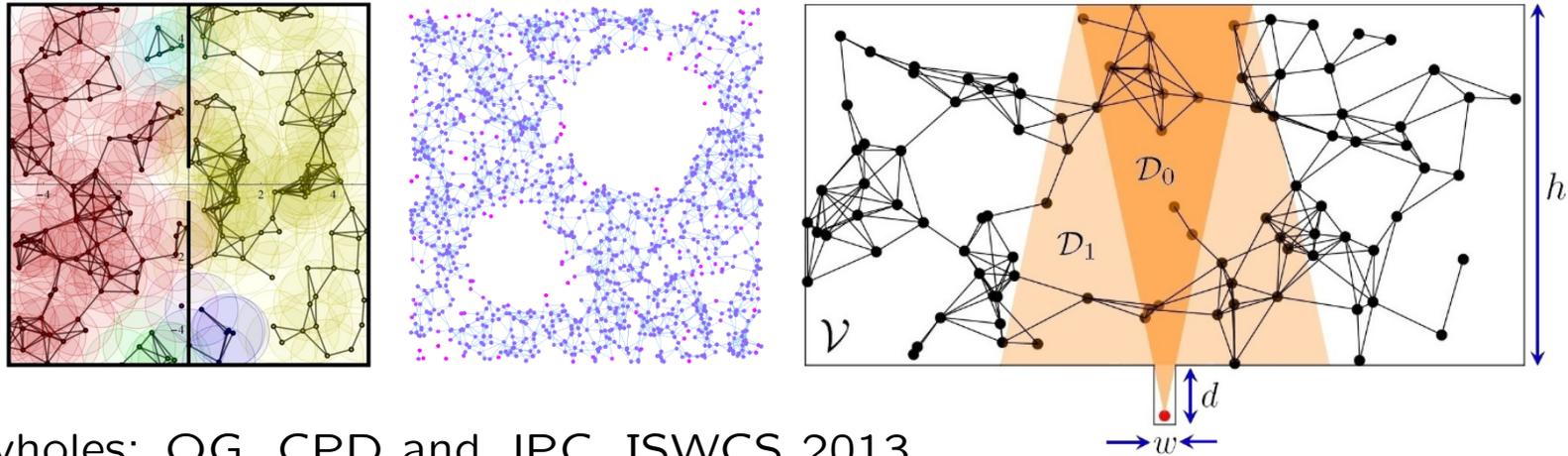
Testing convergence of

$$\frac{1 - P_{fc}}{\sum_B \dots}$$



# Non-convex geometries

These ideas can be extended to non-convex domains...



Keyholes: OG, CPD and JPC, ISWCS 2013

Obstacles and curved boundaries: A. P. Giles, OG and CPD, arxiv:1502.05440

Reflections: OG, M. Z. Bocus, M. R. Rahman, CPD, JPC, IEEE Commun Lett 2015

Fractal boundaries: CPD, OG and JPC, ISWCS 2015

