### Transitions and phase transitions

#### Nati Linial, Hebrew U. with L. Aronshtam, T. Luczak, R. Meshulam, Y. Peled

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- ► G(n, M) Uniform choice among all graphs with M edges.
- G(n, p) For every pairs of vertices x, y pick the edge xy independently with probability p.
- The evolution of random graphs. Start with no edges. Sequentially add edges at random.

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- What is the critical number of edges M in the G(n, M) model for the transition between connected/disconnected?
- What is the critical edge density p in the G(n, p) model?
- Hitting time version: At which moment does the evolving graph become connected?

### Corollary

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The easy part - If  $p < (1 - \epsilon) \frac{\log n}{n}$ , then with almost certainty the graph is not only disconnected, it even has isolated vertices.

It takes some work to show that for  $p > (1 + \epsilon) \frac{\log n}{n}$ , the graph is asymptotically almost surely connected.

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Graphs are the ideal tool for modeling large systems that are governed by pairwise interactions, and simplicial complexes can play a similar role in dealing with systems whose constituents exhibit multiway interactions.

Let V be a finite set of vertices. A collection of subsets  $X \subseteq 2^{V}$  is called a simplicial complex if it satisfies the following condition:

$$A \in X$$
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The dimension of X is the largest dimension of a face in X and a d-dimensional simplicial complex is often called a d-complex.

# A simple but crucial observation

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### Simplicial complexes as geometric objects

We view  $A \in X$  and |A| = k + 1 as a k-dimensional simplex.



# Putting simplices together properly

The intersection of every two simplices in X is a common face.



Combinatorially different complexes may correspond to the same geometric object (e.g. via subdivision)



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#### $\quad \text{and} \quad$



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are two different combinatorial descriptions of the same geometric object



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We want to develop a theory of random complexes, in the general spirit of random graph theory. In order to get started we need

- A higher-dimensional analog to G(n, p).
- A dictionary to translate basic graph-theoretic terms to the realm of high-dimensional simplicial complexes.

Then we can take whatever we know about G(n, p) graphs and seek the high-dimensional counterparts.
## Our lingua franca - Linear algebra spoken here

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### Our lingua franca - Linear algebra spoken here

- To say that G = (V, E) is connected we use  $A = A_G$ , the incidence matrix of G.
- It is a V × E matrix, indexed by vertices resp. edges. If e = [i, j] ∈ E, then

 $a_{i,e}=1, \quad a_{j,e}=-1 \quad \forall k \neq i, j \quad a_{i,k}=0.$ 

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- Likewise, if S is the vertex set of a connected component of G, then  $\mathbf{1}_S A = 0$ .
- ▶ It is not hard to see that *G* is connected if and only if the left kernel of *A* is one-dimensional.

This brings us back to topology

The linear transformation corresponding to the matrix A is the boundary operator, usually denoted by  $\partial$  and the condition that it has just the trivial left kernel means that the zeroth homology of G vanishes.

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### Our paper with Roy Meshulam ('06) introduces $X_d(n, p)$ , a *d*-dimensional analog of G(n, p).

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Our paper with Roy Meshulam ('06) introduces  $X_d(n, p)$ , a *d*-dimensional analog of G(n, p). This is a *d*-dimensional complex on *n* vertices. It has a full (d - 1)-dimensional skeleton. Namely, every face of dimension  $\leq d - 1$  is present. Our paper with Roy Meshulam ('06) introduces  $X_d(n, p)$ , a *d*-dimensional analog of G(n, p). This is a *d*-dimensional complex on *n* vertices. It has a full (d - 1)-dimensional skeleton. Namely, every face of dimension  $\leq d - 1$  is present. Every *d*-face is joined in independently with probability *p*. Our paper with Roy Meshulam ('06) introduces  $X_d(n, p)$ , a *d*-dimensional analog of G(n, p). This is a *d*-dimensional complex on *n* vertices. It has a full (d - 1)-dimensional skeleton. Namely, every face of dimension  $\leq d - 1$  is present. Every *d*-face is joined in independently with probability *p*. Note that  $X_1(n, p)$  is identical with G(n, p).

# The full *d*-dimensional boundary operator $\partial_d$ is an $\binom{n}{d} \times \binom{n}{d+1}$ matrix indexed by subsets of [n] of cardinalities *d* and *d* + 1 resp.

The full *d*-dimensional boundary operator  $\partial_d$  is an  $\binom{n}{d} \times \binom{n}{d+1}$  matrix indexed by subsets of [n] of cardinalities *d* and *d* + 1 resp. If  $R \subset S$ , with  $S \setminus R = \{x\}$  the (R, S) entry is  $(-1)^i$  where *x* is the *i*-th largest element of *S*. In linear algebra terms, to sample a graph from G(n, p) we start from the above-mentioned  $n \times \binom{n}{2}$  matrix and pick each column independently and with probability p.

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In general, to sample a *d*-complex from  $X_d(n, p)$  we start from the above  $\binom{n}{d} \times \binom{n}{d+1}$  and pick each column independently with probability *p*.

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In general, to sample a *d*-complex from  $X_d(n, p)$  we start from the above  $\binom{n}{d} \times \binom{n}{d+1}$  and pick each column independently with probability *p*.

We can now spell out in elementary terms what it means that the (d - 1)-st homology vanishes.

It is easy to verify that

$$\partial_{d-1}\partial_d = 0$$

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It is easy to verify that

$$\partial_{d-1}\partial_d = 0$$

and the left kernel of  $\partial_d$  is the row space of  $\partial_{d-1}$ . Clearly if  $p \to 1$ , then the same should also hold for Y's boundary operator. On the other hand, if  $p \to 0$ , the left kernel gets larger. Specifically, if p is small enough so there is a all-zero row, then we clearly get new vectors in the left kernel. Note that for d = 1 an all-zero row corresponds to an isolated vertex. So we are considering the critical density for the existence of isolated vertices.

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In this respect the high-dimensional answer is consistent with the one-dimensional case. Namely,

Theorem (Linial-Meshulam '06, Meshulam-Wallach '09)

The threshold for the vanishing of the (d - 1)-st homology in  $X_d(n, p)$  over any finite ring of coefficients is

$$p=(1+o(1))\frac{d\ln n}{n}.$$

Again it's easy to see that for  $p < (1 - \epsilon)\frac{d \ln n}{n}$  the (d - 1)-st homology is nonzero, since we get an all-zero row in Y's boundary operator.

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The proof shows that in the complementary range  $p > (1 + \epsilon) \frac{d \ln n}{n}$  there is nothing additional in the left kernel of Y's boundary operator.

## Another good story we must skip (intended for the mavens)

It is conjectured that  $p = \frac{d \ln n}{n}$  is also the threshold for the vanishing of the (d-1)-st homology over  $\mathbb{Z}$ .

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It is also known up to a constant factor for all *d* (Hoffman, Kahle, Paquette '14+).

### Phase transition in G(n, p)

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Namely, for every  $\epsilon > 0$  there is  $1 > q(\epsilon) > 0$ , such that the probability for a  $G(n, \frac{1-\epsilon}{n})$  graph to be a forest is  $(1 + o_n(1))q(\epsilon)$ , but a graph in  $G(n, \frac{1+\epsilon}{n})$  is almost surely not a forest.

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#### At around this time a giant component emerges.

At around this time a giant component emerges. Namely, almost every graph graph in  $G(n, \frac{1+\epsilon}{n})$  has a connected component on  $c(\epsilon) \cdot n$  vertices, where  $c(\cdot)$  is some well-specified function.

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A forest is just an acyclic graph. We know what cycles are in all dimensions. Agree?

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- ► But one thing is certainly a problem There is no obvious notion of connected components in dimensions d ≥ 2.

- A forest is just an acyclic graph. We know what cycles are in all dimensions. Agree? Well, not so fast. We'll see.
- ► But one thing is certainly a problem There is no obvious notion of connected components in dimensions d ≥ 2. So how should we proceed?

#### Definition The cycle space of a simplicial complex is the right kernel of the corresponding boundary operator.

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TFAE for an n-vertex graph G = (V, E) with n - 1 edges.

- It is connected.
- It is acyclic.
- It is collapsible.

Actually collapsibility is not usually discussed in undergraduate class, although it's completely elementary.

## Collapsibility

#### Definition

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- General d. Let σ be a (d 1)-dimensional face that is contained in a single d-dimensional face τ. In the corresponding elementary collapse step we delete both σ and τ from the complex.

#### Definition

A *d*-dimensional simplicial complex is said to be *d*-collapsible if it is possible to eliminate all its *d*-dimensional faces by a series of elementary collapses.

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It is easy to see, using either very elementary topological or combinatorial arguments that:

#### Proposition

A d-collapsible d-dimensional complex is acyclic.

## A little surprise



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### A little surprise



The triangulation of the projective plane is non-collapsible but is  $\mathbb{R}$ -acyclic (and  $\mathbb{F}_2$ -cyclic...).

## Questions that suggest themselves

- What is the threshold for *d*-collapsibility in X<sub>d</sub>(n, p)?
- For acyclicity (= the vanishing of the *d*-th homology)?
- Clearly p<sub>collapsibility</sub> ≤ p<sub>acyclicity</sub>, but is the inequality strict?

#### The short answer

#### Theorem

There are explicit constants  $\gamma_d$  and  $c_d$  for all  $d \ge 2$ , such that in  $X_d(n, p)$ 

- The threshold for d-collapsibility is  $p = \frac{\gamma_d}{n}$ .
- The threshold for acyclicity is  $p = \frac{c_d}{n}$ .

The asymptotics in d are

$$\gamma_d = (1 + o(1)) \log d$$

and

$$c_d = d + 1 - o(1)$$

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The k-core of a graph G is the largest induced subgraph in which every vertex has degree > k. You can find it by repeatedly removing from G every vertex of degree < k. If this process reminds you of the concept of collapsing, you are right. It was a major achievement of random graph theory to determine when the k-core emerges in the evolution of random graphs. Indeed ideas from that domain have played a crucial role for us.

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# Some ideas around the *d*-collapsibility threshold

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# Some ideas around the *d*-collapsibility threshold

A key idea in the study of *k*-cores and other problems in random graph theory is to consider the local structure of the graph that's being generated. This is often done using the machinery of Galton-Watson trees. Here we do something analogous with complexes. More generally, the idea of weak local limits is crucial for the whole line of research.

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It is a simple linear-algebra observation that a *d*-complex with more *d*-faces than (d-1)-faces is cyclic. This implies immediately that  $c_d < d + 1$ . But more is true: Being acyclic is a topological property, so it's not affected by collapse steps. Moreover, the above observation remains valid if we eliminate every (d-1)-face that is not contained in any *d*-face. This argument, when formalized, gives the right value of  $c_{d}$ .

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### Shadows in higher dimension

# Let X be a d-complex and $\sigma$ is a d-face that is not in X.

#### Let X be a d-complex and $\sigma$ is a d-face that is not in X. We say that $\sigma$ is in X's shadow if its addition to X creates new cycles in X.

An easy but crucial observation: In the evolution of random graphs, around time n/2 the following things happen more-or-less simultaneously:

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- The graph almost surely has a cycle.
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- The shadow attains its asymptotic full size of Θ(n<sup>2</sup>) edges.

#### As part of our main theorem we prove that

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#### As part of our main theorem we prove that The threshold for cyclicity coincides with the emergence of the giant shadow of $\Theta(n^{d+1})$ *d*-faces.

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### But there is a difference

## A view of phase transition in G(n, p)



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## Phase transition in $X_2(n, p)$ complexes



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- is discontinuous at the critical point.
- We can now prove it.
- But don't worry, there are still many mysteries in this territory.

## Mazal Tov Avi

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