# Can You Feel the Double Jump?

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#### **ABSTRACT**

When p = c/n and c goes from less than one to greater than one, the random graph G(n, p) experiences the double jump. The first order language is too weak to recognize this change while there are properties expressable in the second order monadic language for which the change is clear. © 1994 John Wiley & Sons, Inc.

### 1. SUMMARY OF RESULTS

In their fundamental work, Paul Erdős and Alfred Renyi [2] considered the evolution of the random graph G(n, p) as p "evolved" from 0 to 1. At p = 1/n a sudden and dramatic change takes place in G. When p = c/n with c < 1 the random G consists of small components, the largest of size  $\Theta(\log n)$ . But by p = c/n with c > 1 many of the components have "congealed" into a "giant component" of size  $\Theta(n)$ . Erdős and Renyi called this the *double jump*, the terms phase transition (from the analogy to percolation) and Big Bang have also been proferred. We use Bollobás [1] as the natural reference.

Now imagine an observer who can only see G through a logical fog. He may refer to graph theoretic properties A within a limited logical language. Will he be able to detect the double jump? The answer depends on the strength of the language. Our rough answer to this rough question is: the double jump is not detectable in the First Order Theory of Graphs, but it is detectable in the Second Order Monadic Theory of Graphs. These theories will be described below. We use the abbreviations fotog and somtog for these two theories, respectively.

For any property A and any c > 0 we define

$$f(c) = f_A(c) = \lim_{n \to \infty} \Pr[G(n, c/n) \models A]$$

Here  $G \models A$  means that G satisfies property A. Beware, however, that we cannot presuppose the existence of f(c) as the limit might not exist. When f(c) = 1 we say A holds almost surely.

**Theorem 1** (Lynch [3]). Let A be a fotog sentence. The  $f_A(c)$  exists for all c and  $f_A$  is an infinitely differentiable function. Moreover  $f_A$  belongs to the minimal family of functions  $\mathcal{F}$  which contain the functions 0, 1 and c, are closed under addition, subtraction, and multiplication by rationals and are closed under base e exponentiation so that  $f \in \mathcal{F} \Rightarrow e^f \in \mathcal{F}$ .

This result is discussed in Section 2.

Examples. Let A be "there exists a triangle." Then  $f(c) = e^{-c^3/6}$ . Let B be "there exists an isolated triangle," i.e., a triangle with none of the three vertices adjacent to any other vertices besides themselves. Then

$$f_B(c) = e^{-c^3 e^{-3c/6}}$$

Finally, call a triangle x, y, z unspiked if there is no point w which is adjacent to exactly one of x, y, z and no other point. Let C be the property that there is no unspiked triangle. Then

$$f_C(c) = e^{-c^3 e^{-3ce^{-c}/6}}$$

Since c = 1 is not a special value for these f we say, roughly, that the double jump is not detectable in fotog. Our remaining results all concern somtog.

**Theorem 2.** There is a somtog A with

$$f_A(c) = \begin{cases} 0 & \text{if } c < 1 \\ 1 & \text{if } c > 1 \end{cases}$$

**Theorem 3.** For all somtog A and c < 1 the value  $f_A(c)$  is well defined.

**Theorem 4.** For all c > 1 there is a somtog A with  $f_A(c)$  not defined.

**Theorem 5.** For any c < 1 and  $\epsilon > 0$  there is a decision procedure that will determine  $f_A(c)$  within  $\epsilon$  for any somtog A.

**Theorem 6.** Let c > 1. Then there is no decision procedure that separates the somtog A with  $f_A(c) = 0$  from those with  $f_A(c) = 1$ .

Theorems 3 and 5 are given in Section 3, Theorem 2 later in this section, and Theorems 4 and 6 in Section 4, with random graph calculations placed in Section 5. Certainly the situation with c = 1 is most interesting but we do not discuss it in this article.

Description of Theories. The First Order Theory of Graphs (fotog) consists of an infinite number of variable symbols (x, y, z ...) equality (x = y), and adjacency (denoted  $x \sim y$ ) symbols, the usual Boolean connectives  $(\land, \lor, \neg ...)$  and

universal and existential quantification  $(\forall_x, \exists_y, \ldots)$  over the variables which represent vertices of a graph. Second Order Monadic Theory of Graphs (somtog) also includes an infinite number of set symbols  $(S, T, U, \ldots)$  which represent subsets of the vertices and membership  $(\in)$  between vertices and sets  $(x \in S)$ . The set symbols may be quantified over  $(\forall_S, \exists_T, \ldots)$  as well as the variables. As an example, in fotog we may write

$$\forall_x \forall_y \exists_z \exists_w [x \sim z \land z \sim w \land w \sim y]$$

which means that all pairs of vertices are joined by a path of length three. However, one cannot say in fotog that the graph is connected. In somtog we define path(x, y, S) to be that  $x, y \in S$  and every  $z \in S$  is adjacent to precisely two other  $w \in S$  except for x and y which are each adjacent to precisely one point of S. This has the interpretation that S gives an induced path between x and y. The statement  $\exists_S path(x, y, S)$  holds if and only if x and y lie in the same component since if they do a minimal path S would be an induced path. We write conn(x, y, R) for  $\exists_S S \subset R \land path(x, y, S)$  which means that in the restriction to R, x and y lie in the same component. The property "G is connected" is represented by the somtog sentence  $\forall_x \forall_y \exists_S path(x, y, S)$ . This ability to express x and y being joined by some path of arbitrary size seems to give the essential strength of somtog over fotog. Now we can prove Theorem 2. Let circ(S) be the sentence that S is connected and that every  $v \in S$  is adjacent to precisely two  $w \in S$ . Consider the sentence

$$A: \exists_{S,T,R} circ(S) \land circ(T) \land S \cap T = \emptyset \land S \subset R \land T \subset R \land \forall_{x,y \in R} conn(x, y, R)$$
.

This has the interpretation that the graph contains a component (R) with two disjoint circuits. For this A it is well known ([1] or the original [2]) that  $f_A(c) = 0$  when c < 1 and  $f_A(c) = 1$  when c > 1.

## 2. THE FIRST ORDER WORLD

The results of this section were done independently and in more complete detail in Lynch [3]. Here we attempt to give a more impressionistic picture of G(n, c/n) through First Order glasses.

Let R be an arbitrary but fixed positive integer. Call two non-negative integers R-same if they are equal and/or both are greater than R. We first make an excursion into the world of rooted trees (T, x). The terms child and descendent have natural meaning. For any  $y \in T$ ,  $T_y$  denotes the tree of descendents of y, including y itself, rooted at y. For  $i \ge 0$  we define by induction on i an (R, i) equivalence relation on the class of rooted trees. For i = 0 all rooted trees are equivalent. Call (T, x), (T', x') (R, i + 1)-equivalent if for every (R, i)-equivalence class  $\lambda$ , x and x' have the R-same number of children y with  $T_y$  of class  $\lambda$ . Thus the (R, 1) class of (T, x) is determined by the number of children of x, be it  $0, 1, \ldots, R-1$  or "many." As an example, a (10, 2) class is determined by saying that the root has precisely three children with precisely five children, many children with precisely four children, precisely seven children with many children and no other children. Here "many" means more than ten.

Suppose a random rooted tree is generated be a pure birth process, the number of children of any person having a Poisson distribution with mean c. The possible

(R,1) classes have probabilities  $(c^u/u!)e^{-c}$ , for precisely u children, and  $1-\sum_{u< R}(c^u/u!)e^{-c}$  for having many children. Let there be s different (R,i) equivalence classes with probabilities  $p_1,\ldots,p_s$ . Now consider (R,i+1) equivalence classes. The number of children of the root who will generate a rooted tree of (R,i) type j is Poisson with mean  $cp_j$  and, moreover, these numbers are independent over the different j. The chance of having precisely u children of type j is then  $(c^up_j^u/u!)e^{-cp_j}$  and having many children is similar. An (R,i+1) class is given by telling how many children generate rooted trees of each type j and the probability of that occurring is simply the product over the different j. By induction all such probabilities lie in the class of functions  $\mathcal{F}$  defined for Theorem 1.

Returning to G(n, c/n), let B(x, R) denote the R-neighborhood of x. To check the veracity of a fotog A one needs only examine the B(x, R), and further one needn't be able to count higher than R. (Here R is dependent only on the particular A.) Every possible (R, R) equivalence class of rooted tree occurs with a positive probability from any particular x and almost surely occurs for many x. The nontrivial probabilities come from B(x, R) being unicyclic. Consider unicyclic graphs H consisting of a cycle on vertices  $x_1, \ldots, x_l$  with  $l \le R$  and, from each  $x_i$  a rooted graph of depth at most R with (R, R) class  $\lambda_i$ . The R-type of H can be considered determined by  $(\lambda_1, \ldots, \lambda_l)$ .

We basically think of the distribution of these H as follows. The number of cycles of length l is Poisson with mean  $c^l/2l$ . Given a cycle on  $x_1, \ldots, x_l$  rooted trees grow off each  $x_i$  asymptotically as independent pure birth models and the probability of  $x_i$  growing a tree of a given type  $\lambda_i$  is a  $p(\lambda_i)$  which lies in  $\mathcal{F}$ . The expected number of cycles with a particular R-type is then  $c^l/2l$  times the product of terms in  $\mathcal{F}$  times a constant for automorphisms—hence lies in  $\mathcal{F}$ . The number of such cycles is Poisson and independent over the different types. There is a finite list  $1, \ldots, s$  of R-types. The probability that for each  $1 \le j \le s$  there are either a given number  $c_j$  of such unicyclic neighborhoods or many—more than R—such neighborhoods is then still in  $\mathcal{F}$ . These numbers determine the veracity of A.

#### 3. THE SECOND ORDER MONADIC WORLD BEFORE THE DOUBLE IUMP

Here we prove Theorem 5 and hence the weaker Theorem 3. Fix c < 1 and  $\epsilon > 0$ . From [2] almost surely all components are trees or unicyclic. From [1, V.2, Theorem 7] the expected number of points in unicyclic components is O(1), say less than c. Taking  $L = c\epsilon^{-1}$  the probability that more than L points lie in nontree components is less than  $\epsilon$ . Let nt(G) be the union of those components of G which are not trees. Let G be a union of unicyclic graphs with f vertices and, perforce, f edges (including the possibility f and consider the limiting probability that f and f we need that this may be calculated to arbitrary precision.

Let a be the number of automorphisms of H. There are  $(n)_v/a$  possible copies of H. Each has the edges of H with probability  $(c/n)^v$ . Each almost surely has no other edges inside of H. Each has probability  $(1-c/n)^{v(n-c)} \sim e^{-cv}$  of having no

edges from inside H to outside H. Then

$$\Pr[nt(G) \cong H] \sim a^{-1}c^v e^{-cv}\beta$$

where  $\beta$  is the probability that the random graph on n-v vertices, p=c/n has no unicyclic components of size at most L. From [1, V.4, Theorem 22]  $\beta \sim e^{-\mu}$  where  $\mu$  is the expected number of such components. The asymptotic value of  $\mu$ , and hence  $\beta$ , and hence  $\Pr[nt(G) \cong H]$  is then given by a finite calculation.

Classic results of M.O. Rabin [4] give a decision procedure for determining whether a monadic second order sentence A is satisfied for some finite tree T. From this one may for each s construct a finite forest  $F_s$  with the same monadic second order properties as the forest consisting of a countable number of copies of all trees. Let A have quantifier depth s. For each H, a union of unicyclic graphs,  $\Pr[A \mid nt(G) \cong H]$  has limiting probability one or zero depending on whether the disjoint union of H and  $F_s$  satisfies A, a finite calculation. We find  $\lim \Pr[G(n, c/n) \models A]$  within  $\epsilon$  by summing, over all such H with limiting probability one that have at most L vertices, the limiting probability that  $nt(G) \cong H$ .

# 4. THE SECOND ORDER MONADIC WORLD AFTER THE DOUBLE JUMP

We prove Theorem 6 by a reduction to the Traktenbrot-Vought Theorem [5], which states that there is no decision procedure which separates those fotog A which hold for some finite graph from those which do not. By a clean topological  $K_k(CTK_k)$  in a graph G we mean an induced subgraph consisting of k vertices, one path between every pair of points, and nothing else. Section 5 we show, for all c > 1 and all integers k, that G(n, c/n) almost surely contains a  $CTK_k$ . For any fotog A we define a somtog  $A^+$  of the form

$$A^+: \exists_{S,T,U} clean(S,T) \wedge A^*$$
.

Here clean(S, T) represents that S is the vertex set of a  $CTK_k$  on T. That is,

- (i)  $S \subset T$ .
- (ii) Every  $x, y \in S$  have a unique  $T_{x,y} \subset T$  with  $path(x, y, T_{x,y})$  and  $T_{x,y} \cap S = \{x, y\}$ .
- (iii) There is no edge between any  $T_{x,y}$  and  $T_{x',y'}$  except at the endpoints.

Now we transform A to  $A^*$  by

- (i) replacing  $\forall_x$  and  $\exists_y$  by  $\forall_{x \in S}$  and  $\exists_{y \in S}$ ;
- (ii) replacing  $x \sim y$  by  $T_{x,y} \cap U \neq \emptyset$ , with  $T_{x,y}$  defined above.

If A holds for no finite graph then  $A^+$  holds for no finite graph. Suppose A holds for a finite graph H on, say, k vertices  $1 \ldots k$ . Almost surely G contains a  $CTK_k$  on vertices T with endpoints S. Label S by  $x_1 \ldots x_k$  arbitrarily. Let U consist of one vertex from  $T_{x_i,x_j}$  (not an endpoint) for each pair  $\{x_i,x_j\}$  with  $\{i,j\} \in H$ . Then  $A^*$  holds. That is,  $A^+$  holds almost surely.

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A decision procedure that could separate somtog B with  $f_B(c) = 1$  from those with  $f_B(c) = 0$  could, when applied to  $B = A^+$ , be used to determine if A held for some finite graph, and this would contradict the Traktenbrot-Vought Theorem.

Nonconvergence. To prove Theorem 4 we use a somewhat complicated graph. Let  $k_1$  be a positive real and K a positive integer.  $(k_1 = 5, K = 100 \text{ is a good }$ example.) We define, for all sufficiently large n, a graph  $H = H(k_1, K, n)$ . Let w be the nearest integer to  $k_1 \log n$  divisible by K (a technical convenience) so that  $w \sim k_1 \log n$ . (Asymptotics are in n for fixed  $k_1$ , K.) Begin with two points S0, S1 and three vertex disjoint paths, each of length w, between them. Call this graph  $H^-$ . Let AR (which stands for arithmetizable) consist of every Kth vertex on each of the paths, excluding the endpoints. Thus AR will have  $\frac{w}{K} - 1$  points from each path, a total of  $w_1 = 3\left[\frac{w}{K} - 1\right]$  points. Order the three paths arbitrarily and order the points of AR on a path from S0 to S1 so that the points of AR are labelled  $1, \ldots, w_1$ . Now, using this labelling, between every pair i, 2i add a path of length w. These paths all use new vertices with no additional adjacencies.) The function tower(i) is defined inductively by tower(1) = 2,  $tower(i+1) = 2^{tower(i)}$ . The function wow(i) is defined inductively by wow(1) = 2, wow(i+1) = tower(wow(i)). Between every pair i,  $2^{i}$  add a path of length w. Between every pair i, tower(i) add a path of length w. Between every pair i, wow(i) add a path of length w. This completes the description of the graph  $H = H(k_1, K, n)$ .

In Section 5 we prove that for every c > 1 there exist  $k_1$ , K so that G(n, c/n) almost surely contains an induced copy of  $H = H(k_1, K, n)$ . We assume that here, and with H in mind construct a somtog sentence  $A = A_K$  which shows nonconvergence.

The sentence  $A = A_K$  will be built up in stages. First we say there exist vertices S0, S1 and sets  $P_1$ ,  $P_2$ ,  $P_3$  so that each  $P_i$  gives a path from S0 to S1, the  $P_i$  overlap only at S0, S1, and there are no edges between  $P_i$  and  $P_j$  except at the endpoints. Second we say there exists a set  $AR \subset P_1 \cup P_2 \cup P_3 - \{S0, S1\}$  so that for any path  $x_1 \ldots x_K$  in any  $P_i$  that AR contains exactly one of the  $x_1, \ldots, x_K$ . (Here the sentence depends on the choice of the fixed integer K.) We define an auxiliary binary relation < on AR. If  $x, y \in AR \cap P_i$  we define x < y by the existence of a subset of  $P_i$  which is a path from S0 to x which does not contain y. If  $x \in AR \cap P_i$  and  $y \in AR \cap P_j$  with  $i \neq j$  we define x < y to be i = 1, j = 2 or i = 1, j = 3 or i = 2, j = 3. On AR we define the auxiliary binary predicate ext(i, j) by  $ext{i} < j$  and there does not exist  $ext{i} \in AR$  with  $ext{i} < k$  and  $ext{i} < j$ . We define the unary predicate  $ext{i} \in AR$  and there is no  $ext{i} \in AR$  and  $ext{i} \in AR$  and

Now to arithmetize AR. We say there exists vertex sets DOUBLE, EXP, TOWER, and WOW. We define auxiliary binary predicate double on AR by double(x, y) if x < y and there is a path from x to y in DOUBLE; and we similarly define binary predicates exp, tower, and wow. We say double(1, 2) and  $double(x, y) \land double(x, z) \rightarrow y = z$  and  $double(x, y) \land next(x, x_1) \land next(y, y_1) \land next(y_1, y_2) \rightarrow double(x_1, y_2)$  and if double(x, y) and  $next(x, x_1)$  and there do not exist  $y_1$ ,  $y_2$  with  $next(y, y_1) \land next(y_1, y_2)$ , and there does not exist z with  $double(x_1, z)$ , and finally if double(x, y) and x' < x, then there exists y' with

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double(x', y'). We say exp(1, 2) and  $exp(x, y) \land exp(x, z) \rightarrow y = z$  and  $exp(x, y) \land next(x, x_1) \land double(y, y_1) \rightarrow exp(x_1, y_1)$ , and if exp(x, y) and  $next(x, x_1)$  and there does not exist  $y_1$  with  $double(y, y_1)$ , then there does not exist z with  $exp(x_1, z)$ , and finally if exp(x, y) and x' < x, then there exists y' with exp(x', y'). The properties for tower are in terms of tower are in terms of tower in the same way.

On AR we define unary predicates even(x) by  $\exists_y double(y, x)$  and invwow(x) by there existing y with wow(x, y) but for all x' > x there do not exist y' with wow(x', y'). The sentence  $A = A_K$  concludes by saying there exists x with  $even(x) \land invwow(x)$ .

Now we show that  $\lim \Pr[G(n, p) \models A_k]$  does not exist, moreover that the  $\limsup$  is one and the  $\liminf$  is zero. On the integers define  $wow^{-1}(y)$  to be the biggest integer x with  $wow(x) \le y$ . First let  $n \to \infty$  through that subsequence for which  $wow^{-1}(w_1)$  is even. (Recall  $w_1 = \Theta(\log n)$  was the size of AR.) Suppose G(n, p) contains an induced copy of H.  $(k_1, K \text{ depend only on } c$  and so are already fixed.) On H there do exist the vertices S0, S1, the sets  $P_1$ ,  $P_2$ ,  $P_3$ , AR, DOUBLE, EXP, TOWER with all the properties of  $A_K$ . (Indeed,  $A_K$  was created with that in mind.) Under the labelling  $1, \ldots, w_1$  the predicates double, . . . correspond to the actual numbertheoretic predicates and the  $x = wow^{-1}(w_1)$  has invwow(x) and even(x) so  $A_K$  holds. But G(n, p) contains an induced copy of H almost surely so the limiting probability on this subsequence is one.

In the other direction, let n go to infinity through a subsequence with the property that for all m with (leaving some room)  $\log \log n < m < n$  the value  $wow^{-1}(m)$  is odd. (Such n exist since  $wow^{-1}$  is constant for such a long time.) Here is the crucial random graph fact: There is a  $\delta = \delta(c)$  so that in G(n, c/n) almost surely all subconfigurations consisting of two vertices and three paths between them have size at least  $\delta \log n$ . (This uses a simple expectation argument. The number of configurations of t vertices and t+1 edges giving the above graph is  $O(n'p^{t+1}) = O(c^{t+1}/n) = o(1)$  when  $t < \delta \log n$ .) Thus almost surely any AR that saitsfies the conditions of  $A_K$  will have  $|AR| = m > \delta' \log n(\log \log n)$ . The conditions on double, . . . force AR to be arithmeticized so that  $\exists_x invwow(x) \cap even(x)$  will not occur when  $wow^{-1}(m)$  is odd. Thus almost surely  $A_K$  will not be satisfied.

#### 5. A VARIANCE CALCULATION

We fix c > 1, set p = c/n and let  $G \sim G(n, p)$ . We consider a graph  $H = H(k_1, K, n)$  as defined in Section 4. We give a description of H suitable for our purposes. Set  $w \sim k_1 \log n$ . Take two vertices and draw three vertex disjoint paths each of length w. This gives a graph  $H^-$ . On  $H^-$  a set of pairs of vertices  $\{a, a'\}$  are specified, no a lying in more than eight such pairs. We let l denote the precise number of such pairs so that  $l \sim \epsilon \log n$ . By making K large we can make  $\epsilon$  as small as desired. Between each such pair a path of length w is placed with new vertices. This gives the graph H. It has  $v = \Theta(\ln^2 n)$  vertices and e edges where  $e = 3w + lw \sim \epsilon k_1 \log^2 n$  and  $e - v = l + 1 \sim \epsilon \log n$ . We denote the vertices of H by  $1, \ldots, v$  and those of  $H^-$  by  $1, \ldots, 3w - 1$ .

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## A. The Second Moment Method

Our object in this section is to show that, for appropriate  $k_1$ ,  $\epsilon$ , the random G(n, p) almost surely contains an induced copy of H. Let X be the number of v-tuples  $(a_1, \ldots, a_v)$  of distinct vertices of G so when  $\{i, j\} \in E(H)$  then  $\{a_i, a_j\} \in E(H)$ . That is, X is a count of copies of H in G though these copies may have extra edges and given copy may be multiply counted if H has automorphisms. Clearly,

$$E[X] = (n)_v p^e \sim n^v p^e = c^e / n^{e-v}$$

which is

$$n^{(\epsilon \log n)(k_1 \log c - 1 + o(1))}$$

from the estimates above. We first require that

$$k_1 \log c > 1$$

which assures that E[X] is a positive power of  $n^{\log n}$ . The crucial calculation will be to show

$$Var[X] = o(E[X]^2)$$
 (V1)

From this, by Chebyschev's Inequality X > .99E[X] (say) almost surely. True, X counts noninduced copies of H. But let  $X^+$  be a count of all copies of any  $H^+$  consisting of H with one additional edge added. There are  $\Theta(\log^4 n)$  choices of that edge and for a given choice the expected number of such copies is pE[X] so that  $E[X^+] = O(\log^4 n/n)E[X] = o(E[X])$ , and so by Markov's Inequality almost surely  $X^+ < E[X]/2$ , say. So almost surely there are more than .99E[X] copies of H and fewer than .5E[X] total copies of graphs containing H and one more edge so therefore there is at least one copy of H with no additional edge, i.e., the desired induced copy.

Hence it suffices to show (V1).

Remark. To illustrate the complexities suppose we condition G(n, p) on a fixed copy of  $H^-$  and let Z be the expected number of extensions to H. The expectation argument above gives that  $E[Z] \sim (n^{w-1}p^w)^l = (c^w/n)^l$  which is  $n^{\Theta(\log n)}$ . However, for there to be any extensions each of the at least l/8 vertices of  $H^-$  that is supposed to have a path coming out of it must have at least one edge besides those of  $H^-$ . Any particular vertex fails this condition with probability  $e^{-c}$  and these events are independent so that  $\Pr[Z \neq 0]$  is bounded from above by  $(1 - e^{-c})^{l/8}$  which is polynomially small. This illustrates that the expected number of objects being large does not a priori guarantee that almost surely there is an object.

Of course, (V1) is equivalent to showing  $E[X^2] \sim E[X]^2$ . By the symmetry of copies,  $E[X^2]$  is E[X] times the expected number of copies of H given the existence of a particular copy of H. We set  $V = \{1, \ldots, m\}$  and specify a particular copy of H on vertex set V with  $1, \ldots, 3w-1$  being the vertices of  $H^-$ .

Let  $G^* = G^*(n, p)$  be the random graph on vertex set  $1, \ldots, n$  where for  $i, j \in V$  and  $\{i, j\} \in E(H)$  we specify that  $\{i, j\} \in E(G)$ , but all other pairs i, j are adjacent in G with independent probabilities p. (Note that even those i, j with  $i, j \in V$  but  $\{i, j\} \not\subseteq E(H)$  have probability p of being in  $G^*$ .) Let  $E^*[X]$  denote the expectation of X in  $G^*$ . Then it suffices to show

$$E^*[X] \sim E[X] \tag{V2}$$

# B. The Core Calculation: Expectation for Paths

We shall work up to  $E^*[X]$  in stages. Let  $P_s(a, b)$  denote the expected number of paths of length s between vertices a, b, with the graph distribution  $G^*(n, p)$ . (As a benchmark note that in G(n, p) this expectation would be  $(n-2)_{s-1}p^s \sim n^{s-1}p^s$ .)  $P_s(a, b)$  is simply the sum over all tuples  $(a_0, \ldots, a_s)$  with  $a_0 = a, a_s = b$  of distinct vertices of G of  $p^a$  where a is the number of edges of the path  $a_0 \cdots a_s$  which are not in G. Let G denote the expected number of such paths where we further require that G is not adjacent to G in G which provide upper bounds to G and G and G denote the further assumption that G denote the same.) We shall define inductively G which provide upper bounds to G and G and G denote the further assumption that G denote the further assum

$$x_{s}^{-} = pnx_{s-1}^{-} + pmx_{s-1}$$

$$x_{s} = x_{s}^{-} + \sum_{k=1}^{s-1} 50kx_{s-k}^{-}$$

We claim such  $x_s$ ,  $x_s^-$  provide the desired upper bounds. To bound  $P_s^-(a, b)$  split paths  $aa_1 \cdots a_{s-1}b$  according to  $a_1 \in V (\le m \text{ possibilities})$  and  $a_1 \not\in V (\le n \text{ possibilities})$ . Note we are excluding the case where  $a, a_1$  are adjacent in H. For a given  $a_1$  the expected number of paths is  $pP_{s-1}(a_1, b)$  (as we must have  $a, a_1$  adjacent). When  $a_1 \not\in V$  this is by induction at most  $px_{s-1}^-$  and when  $a_1 \in V$  this is by induction at most  $px_{s-1}^-$  so  $P_s^-(a, b) \le x_s^-$  by induction. Bounding  $P_s(a, b)$  is a bit more complex. Those paths for which  $a, a_1$  are not adjacent in H contribute at most  $x_s^-$  by induction. Otherwise, let k be the least integer for which  $a_k, a_{k+1}$  are not adjacent in H. (As  $b \not\in V$  this is well defined and  $1 \le k < s$ .) We pause for a technical calculation.

We claim that in H for any  $k \le w$  there are at most 50k paths of length k beginning at any particular vertex v. Suppose  $a \in H^-$ . There are at most four such paths staying in  $H^-$ . Once leaving  $H^-$  the path is determined (since critically  $k \le w$ , the path length) and there are at most 8k ways of determining when and how to leave  $H^-$ . The argument with  $a \not\in H^-$  is similar, we omit the details. Of course 50k is a gross overestimate but we only use that it is a O(k) bound.

Back to bounding  $P_s(a, b)$ . For a given k there are at most 50k choices for  $a_1 \cdots a_k$  and fixing those there is a contribution of  $P_{s-k}^-(a_k, b) \le x_{s-k}^-$  to  $P_s(a, b)$ . Thus  $P_s(a, b) \le x_s$  by induction.

Now to bound the values  $x_s$ ,  $x_s$  given by the inductive formulae. Let L be fixed

(dependent only on c) so that

$$L > 1 + \sum_{k=1}^{\infty} 50kc^{-k}$$

and set

$$X_{s} = Lp^{s}n^{s-1}$$

$$X_{s}^{-} = p^{s}n^{s-1}\left(1 + L\frac{ms}{n}\right).$$

We claim  $x_s \le X_s$  and  $x_s^- \le X_s^-$ . For this we merely check (recall pn = c)

$$X_{s}^{-} + \sum_{k=1}^{s-1} 50kX_{s-k}^{-} \le \left(1 + L \frac{ms}{n}\right) p^{s} n^{s-1} \left(1 + \sum_{k=1}^{s-1} 50 kc^{-k}\right) < Lp^{s} n^{s-1} = X_{s}$$

as Lms/n = o(1) and that

$$pnX_{s-1}^- + pmX_{s-1} = X_s^-$$
.

Thus we have shown

$$P_w(a,b) \leq Ln^{w-1}p^w$$

when  $b \not\subseteq V$  and further

$$P_{w}(a, b) \le n^{w-1} p^{w} \left[ 1 + O\left(\frac{\log^{3} n}{n}\right) \right]$$

when  $a, b \not\in V$ .

Now (thinking of  $a, b \in V$ ) we seek a general bound  $y_s$  for  $P_s(a, b)$ . We set  $y_1 = 1$  (as perhaps a, b are adjacent in H) and define inductively

$$y_s = 3 + pnx_{s-1} + pmy_{s-1} + 50sp + \sum_{k=1}^{s-2} 50k[pnx_{s-k-1} + pmy_{s-k-1}].$$

We claim  $P_s(a,b) \le y_s$  for  $1 \le s \le w$ . Of the potential paths  $aa_1 \cdots a_{s-1}b$  there are at most three which are paths in H and they contribute at most three. There are less than 50s cases where  $aa_1 \cdots a_{s-1}$  is a path in H but  $a_{s-1}$ , b are not adjacent in H and they each contribute p. The cases with  $a_1 \not\in V$  contribute at most  $pnx_{s-1}$ . The cases with  $a_1 \in V$  but not adjacent to a in H contribute at most  $PMY_{s-1}$ . Otherwise let  $1 \le k \le s-2$  be the least k so that  $a_k$ ,  $a_{k+1}$  are not adjacent in H. There are at most 50k choices of  $a_1 \cdots a_k$ . Then there are at most n choices of  $a_{k+1} \not\in V$  and each contributes  $px_{s-k-1}$  and at most m choices of  $a_{k+1} \in V$  and each contributes  $py_{s-k-1}$ .

Now fix a constant M satisfying

$$M > M_1 = L \left[ 1 + \sum_{k=1}^{\infty} 50 \ kc^{-k} \right].$$

We claim that for  $1 \le s \le w$ 

$$P_s(a,b) \leq 4 + Mp^s n^{s-1}.$$

By the previous bounds on  $x_s$  we bound

$$pnx_{s-1} + \sum_{k=1}^{s-2} 50kpnx_{s-k-1} < M_1 p^s n^{s-1}$$
.

We bound 3 + 50 sp < 3.01. By induction we bound

$$pmy_{s-1} + \sum_{k=1}^{s-2} 50kpmy_{s-k-1} < 50s^2pm[4 + Mp^sn^{s-1}] < .01 + (M - M_1)p^sn^{s-1}$$

Since  $50s^2pm = O(\log^4 n/n) = o(1)$ , completing the claim. We are really interested in the case s = w. Note  $p^w n^{w-1} = c^w/n$  is asymptotically a positive power of n by the choice made of  $k_1$  earlier. Thus the +4 may be absorbed in M and we have that

$$P_{w}(a,b) < Mp^{w}n^{w-1}$$

for all a, b while if a,  $b \not\subseteq V$  then we have the better bound

$$P_{w}(a, b) < p^{w} n^{w-1} \left[ 1 + O\left(\frac{\ln^{3} n}{n}\right) \right].$$

## C. Expectation of Copies of H

Now we turn to the full problem of bounding  $E^*[X]$ . Recall we have labelled H so that  $1, \ldots, 3w-1$  are the vertices of  $H^-$ . Recall l denotes the number of w-paths in going from  $H^-$  to H and recall  $l \sim \epsilon \log n$ .  $E^*[X]$  is the sum over all m-tuples  $(a_1, \ldots, a_m)$  of distinct vertices of the probability (in  $G^*(n, p)$ ) that these as (in this order) give a copy of H. For each  $a_1, \ldots, a_{3w-1}$  the contribution of m-tuples with this start is bounded from above by

$$p^{\alpha}[Mp^{w}n^{w-1}]^{l-A}\left[p^{w}n^{w-1}\left[1+O\left(\frac{\ln^{3}n}{n}\right)\right]\right]^{A}.$$

Here  $\alpha$  is the number of adjacencies i, j in  $H^-$  with  $a_i$ ,  $a_j$  not adjacent in H. A is the number of pairs i, j in  $H^-$  which are joined in H by a w-path and for which neither  $a_i$  nor  $a_j$  is in V. l-A is then the remaining number of pairs i, j in  $H^-$  joined in H by a w-path.

To see this note that for fixed  $a_1, \ldots, a_{3w-1}$  and any choice of w-paths  $P_1, \ldots, P_l$  that are vertex disjoint the probability that they are all paths in G is simply the product of the probabilities for each path. Adding over all  $P_1, \ldots, P_l$  is then at most the product over j of adding the probabilities for each  $P_j$ , and these are precisely what the bracketed terms bound. The  $p^{\alpha}$ , of course, is the probability that the  $a_i$  have the proper edges of  $H^-$ .

Now we split the contribution to  $E[X^*]$  into two classes. First consider all

those  $a_1, \ldots, a_{3w-1}$  with no  $a_i \in V$ . There are at most  $n^{3w-1}$  such tuples and each gives  $p^{3w}$  with 3w being the number of edges in  $H^-$ . For each A = l so this gives a

$$\left[p^{w}n^{w-1}\left[1+O\left(\frac{\ln^{3}n}{n}\right)\right]\right]^{l}$$

factor. As  $l = O(\ln n)$ 

$$\left[1 + O\left(\frac{\ln^3 n}{n}\right)\right]^l = 1 + o(1)$$

so this entire contribution is asymptotic to  $n^{3w-1+l(w-1)}p^{3w+lw}$  which is asymptotic to E[X], the expectation in G(n, p). That is, the main contribution (among the  $a_1 \cdots a_{3w-1}$  that don't overlap V) to  $E^*[X]$  is by those copies of H that don't overlap H at all. To show (V2) it now suffices to show that the remaining contributions to  $E^*[X]$  are o(E[X]).

There are  $O(\ln^3 n)$  choices of a pair  $i \le 3w - 1$  and  $a_i \in V$ . (We shall see that this loss of  $n^{-1} \ln^3 n = n^{-1+o(1)}$  as compared with "free choice" is never recovered.) Fix such a pair and consider the contribution to  $E^*[X]$  with  $a_i$  this fixed value. Let  $j \le 3w - 1$  be a vertex at distance w from i in H and let  $H^-$  denote i, j and two vertex disjoint paths of length w from i to j in  $H^-$ . ( $H^-$  consists of S0, S1, and two of the three w-paths between them.) Fix one of the  $\le n$  choices of  $a_j$ . The expected number of copies of  $H^-$  in  $G^*$  is then at most  $P_w(a_i, a_j)^2 \le (Mn^{w-1}p^w)^2$ . The expected number of extensions from a copy of  $H^-$  to a copy of  $H^-$  is then at most  $P_w(a_{S0}, a_{S1}) \le Mn^{w-1}p^w$ . Altogether the expected numbers of copies of  $H^-$  overlapping V is  $O(\ln^3 n)M^3n^{3w-2}p^{3w}$  which is  $n^{-1+o(1)}$  times the expected number of copies of  $H^-$  in G(n, p). Now given a copy  $a_1, \ldots, a_{3w-1}$  of  $H^-$  the expected number of extensions to H in  $G^*(n, p)$  is at most  $M^l$  times what it is in G(n, p), the extreme case when all A = 0, e.g., all  $a_i \in V$ . Thus the total contribution to  $E^*[X]$  from copies in which  $H^-$  overlaps V is at most

$$n^{-1+o(1)}M^lE[X].$$

Recall  $l \sim \epsilon \log n$ . Up to now all constants  $k_1$ , L, M have depended only on c and not  $\epsilon$ . Now (and formally this is at the very start of the proof, in the definition of H) we fix K so large that  $\epsilon$  is so small so that

$$\epsilon(\log M) < 1$$
.

This assures that  $n^{-1+o(1)}M^l$  is n to a negative power. Thus this contribution to  $E^*[X]$  is only o(E[X]). Hence  $E^*[X] \sim E[X]$  which concludes the argument.

## D. Clean Topological k-Cliques

For the proof of Theorem 6 we require that, for every c > 1 and every integer k, G(n, c/n) almost surely contains a  $CTK_k$ . Fix c, k. We fix a real  $k_1$  with

$$k_1 \log c > 1$$
.

Set  $w = \lfloor k_1 \log n \rfloor$ . We define  $H = H(k, k_1, n)$  to consist of k "special" points and between each pair of special points a path of length w. Set  $v = k + \binom{k}{2}(w-1)$ , the number of vertices and  $t = \binom{k}{2} - k$ , e = v + t so that e is the number of edges. Note e,  $v = \binom{k}{2} + o(1) \log n$ . We show that almost surely G(n, c/n) contains a copy of H. As the argument is very similar (and simpler) to that just given, we shall give the argument in outline form. Letting X denote the number of copies of H we have

$$E[X] = (n)_{,v} p^{e} \sim n^{v} p^{e} = c^{e} n^{-t} = n^{k_{1} {k \choose 2} \log c - t + o(1)}$$

which is a positive power of n. Now we need show  $E^*[X] \sim E[X]$  where  $E^*[X]$  is the expected number of copies of H conditioning on a fixed copy of H. Let us specify the fixed copy to be on vertex set  $V = \{1, \ldots, v\}$  with  $1, \ldots, k$  being the special vertices and let  $G^*(n, p)$  be G(n, p) conditioned on this copy. As before we let  $P_w(a, b)$  be the expected number of paths of length w between a, b in  $G^*$ . Then, as before, there is a constant M so that

$$P_{w}(a,b) < Mn^{w-1}p^{w}$$

for all a, b while

$$P_w(a, b) = n^{w-1}p^w(1 + o(1))$$

if both a and b are not in V. (We will not need the more precise error bound for this problem.)

We split the contribution to  $E^*[X]$  into two groups. The  $a_1, \ldots, a_k$  which do not overlap V contribute

$$n^{k}[n^{w-1}p^{2}(1+o(1))]^{\binom{k}{2}}$$

to  $E^*[X]$ . Since k is fixed this is asymptotically  $n^v p^e$  which is asymptotically E[X]. There are only  $n^{k-1+o(1)}$  different  $a_1, \ldots, a_k$  which do overlap V. For each the contribution to  $E^*[X]$  is at most

$$[Mn^{w-1}p^e]^{\binom{k}{2}}.$$

Since M and k are constants this only a constant times the contribution to E[X]. Thus the total contribution from these intersecting  $a_1, \ldots, a_k$  is  $n^{-1+o(1)}E[X]$  and thus  $E^*[X] \sim E[X]$  as required.

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