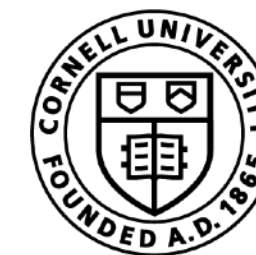




Network Diffusion & Cascades (2)

NETWORKS INFO 2040 / CS 2850 / ECON 2040 / SOC 2090



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- Read Chapters 19 (Mon & Wed) & 22 (Fri)
- PS 7 out (due on Thur): answers typed, assign page numbers
- Q4c-d: It's fine to just calculate “the number of” (instead of fraction)

(c) Power law distribution has a nice property that it is scale-free – if we upscale or downscale a power law distribution by some magnitude, we will still observe a similar distribution. As an illustrative example, let us consider a new index – the *popularity index* (p) of news article, which is approximately half of the raw view counts v . The exact relationship between popularity p and view count v is defined as

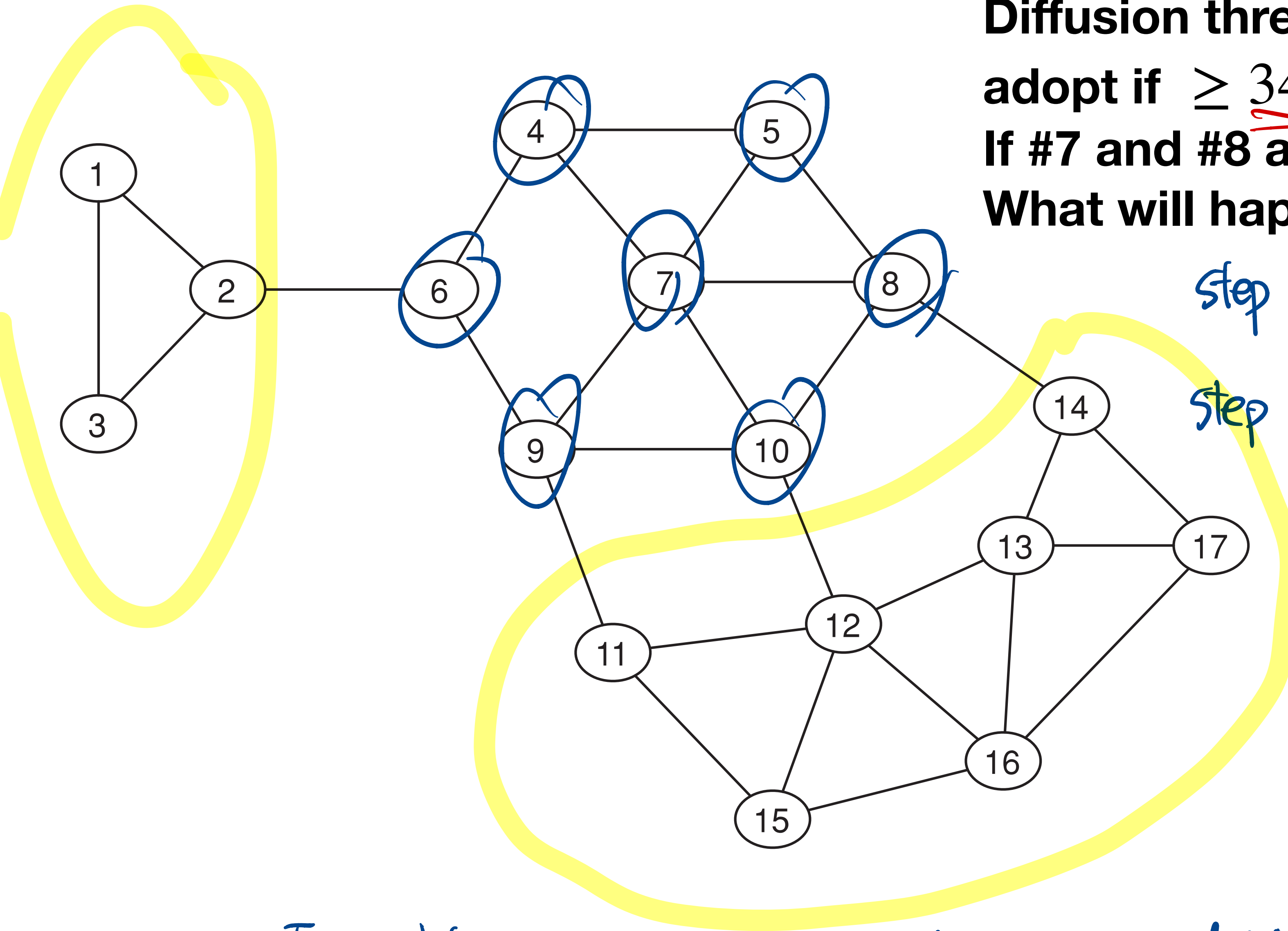
$$p = \begin{cases} v/2, & v = 0, 2, 4, \dots \\ (v-1)/2, & v = 1, 3, 5, \dots \end{cases} \quad (1)$$

Now let us consider $h(p)$, which is defined as the **fraction** of articles with a popularity index value p . Given that the number of articles each day that receive k views is c/k^α , can you write $h(p)$? You may express your answer in terms of c and α .

(d) Given that $h(p)$ approximately follows another power law d/p^β , can you determine the parameters d and β ? You may express your answer in terms of c and α .

Hint: For question (d) we are primarily interested in popular articles with high k , where you can use the approximation $x^{-\alpha} \approx (x+1)^{-\alpha}$.

**Diffusion threshold 0.34 (a person will adopt if $\geq 34\%$ of their friends have done so)
If #7 and #8 are the initial adopters ("seeds"),
What will happen?**



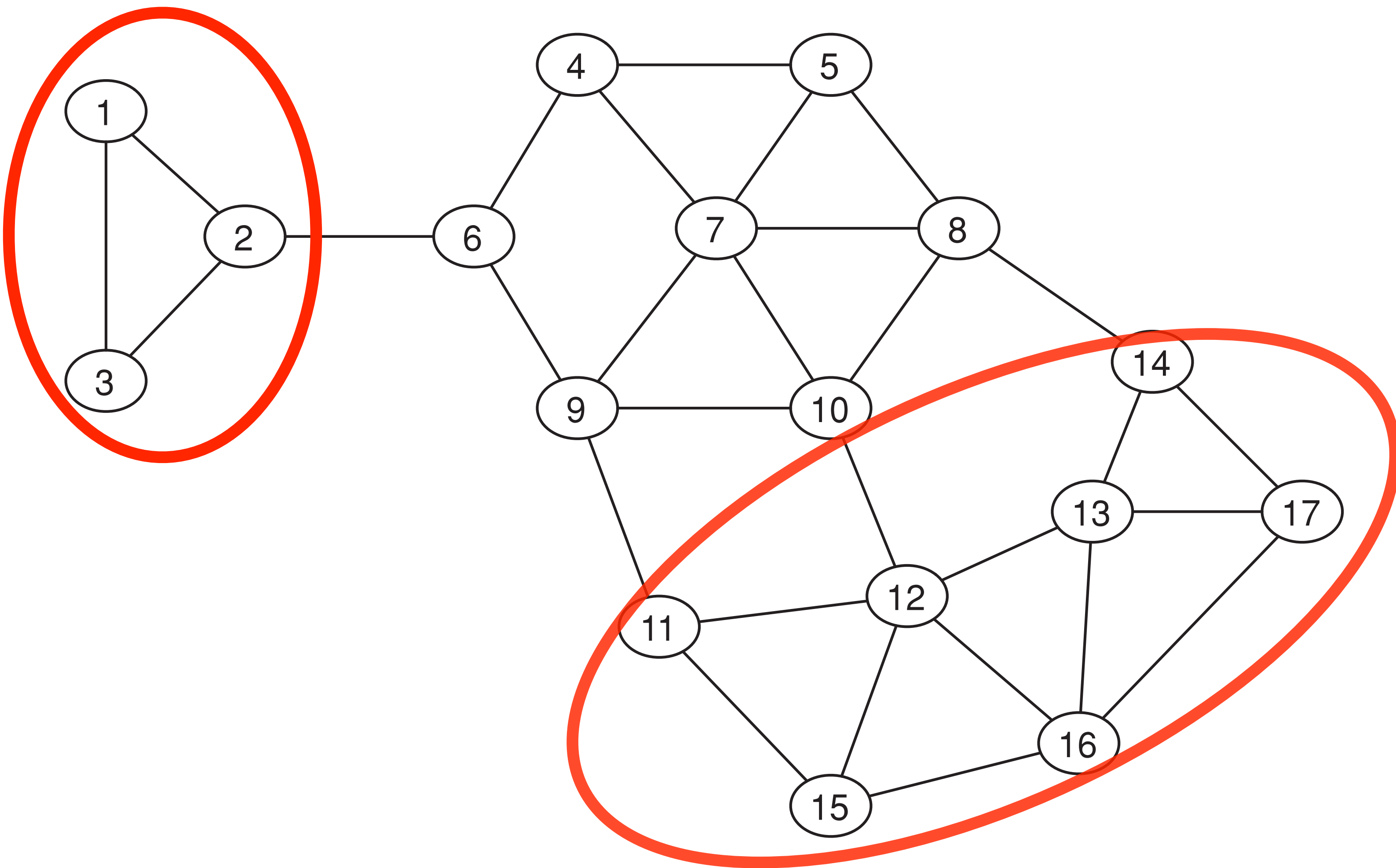
Step 0: #7 #8

Step 1: #5 #10

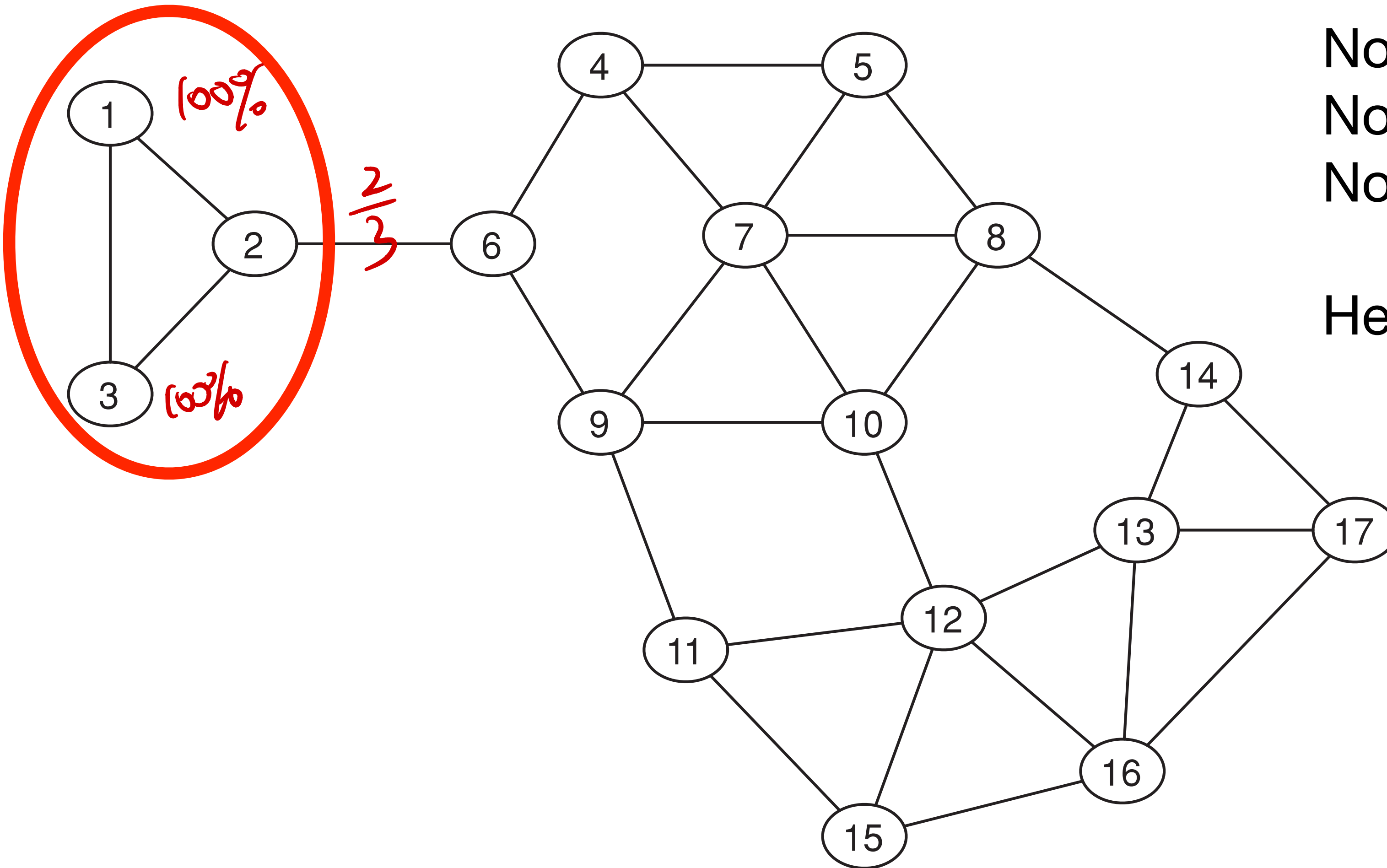
Step 2: #4 #9

Step 3: #6

Incomplete cascade: Some nodes eventually did NOT adopt



$$\text{Min} \{1, 1, \frac{2}{3}\} = \frac{2}{3}$$

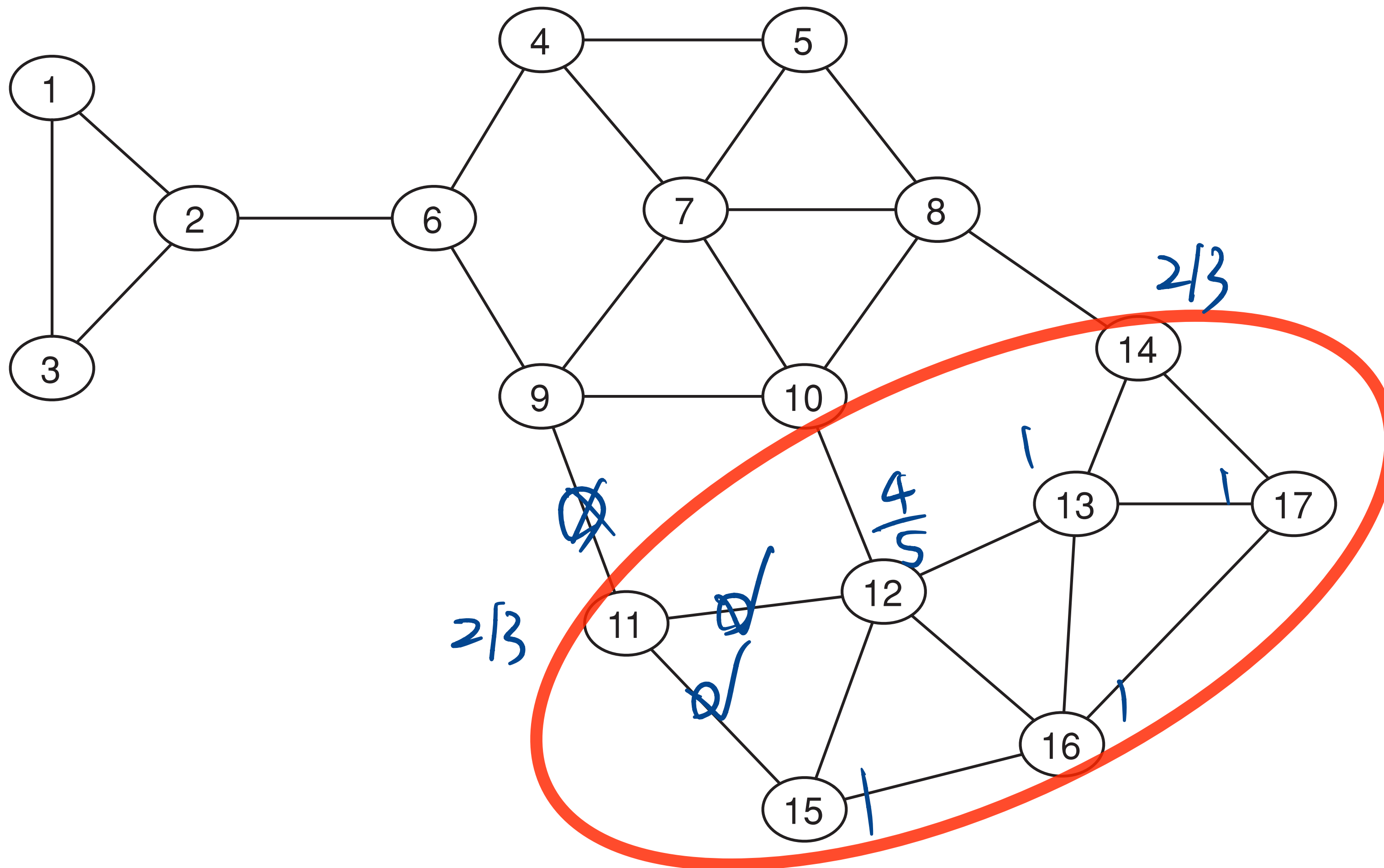


Node 1 has **2/2** neighbors in the subset
Node 2 has **2/3** neighbors in the subset
Node 3 has **2/2** neighbors in the subset

Hence {1,2,3} is a cluster of density **2/3**

We say a set of nodes X is a cluster of density p if
each node in X has at least fraction p of its network neighbors in X

iclicker question



**Subset {11,12,13,14,15,16,17},
is a cluster of density ...?**

A. $1/2$

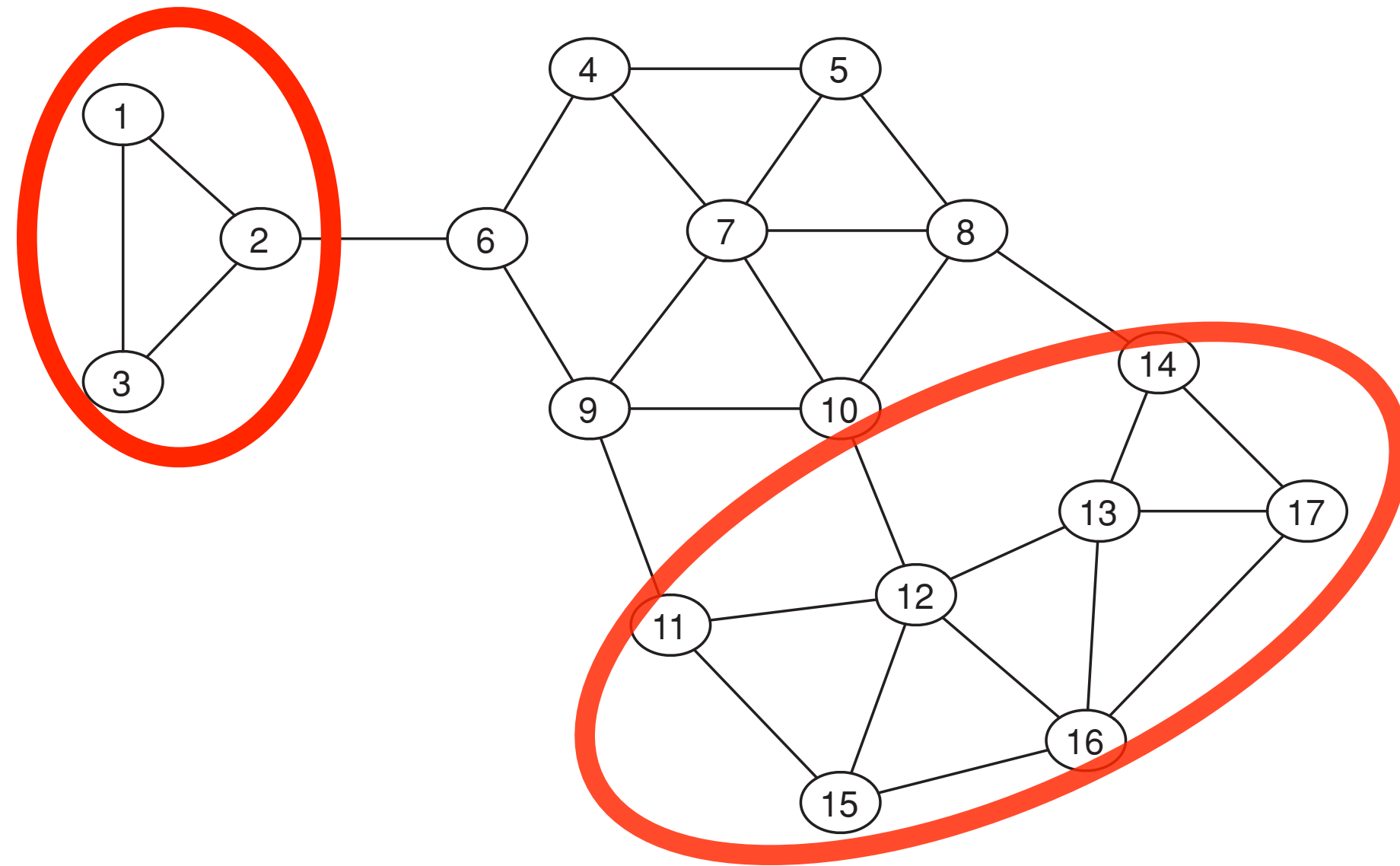
B. $1/3$

C. $2/3$

D. $3/4$

**We say a set of nodes X is a cluster of density p if
each node in X has at least fraction p of its network neighbors in X**

Cluster and cascades



Cluster with high density d (w.o. seeds)

≈ 0.667

Complete cascade with high threshold q

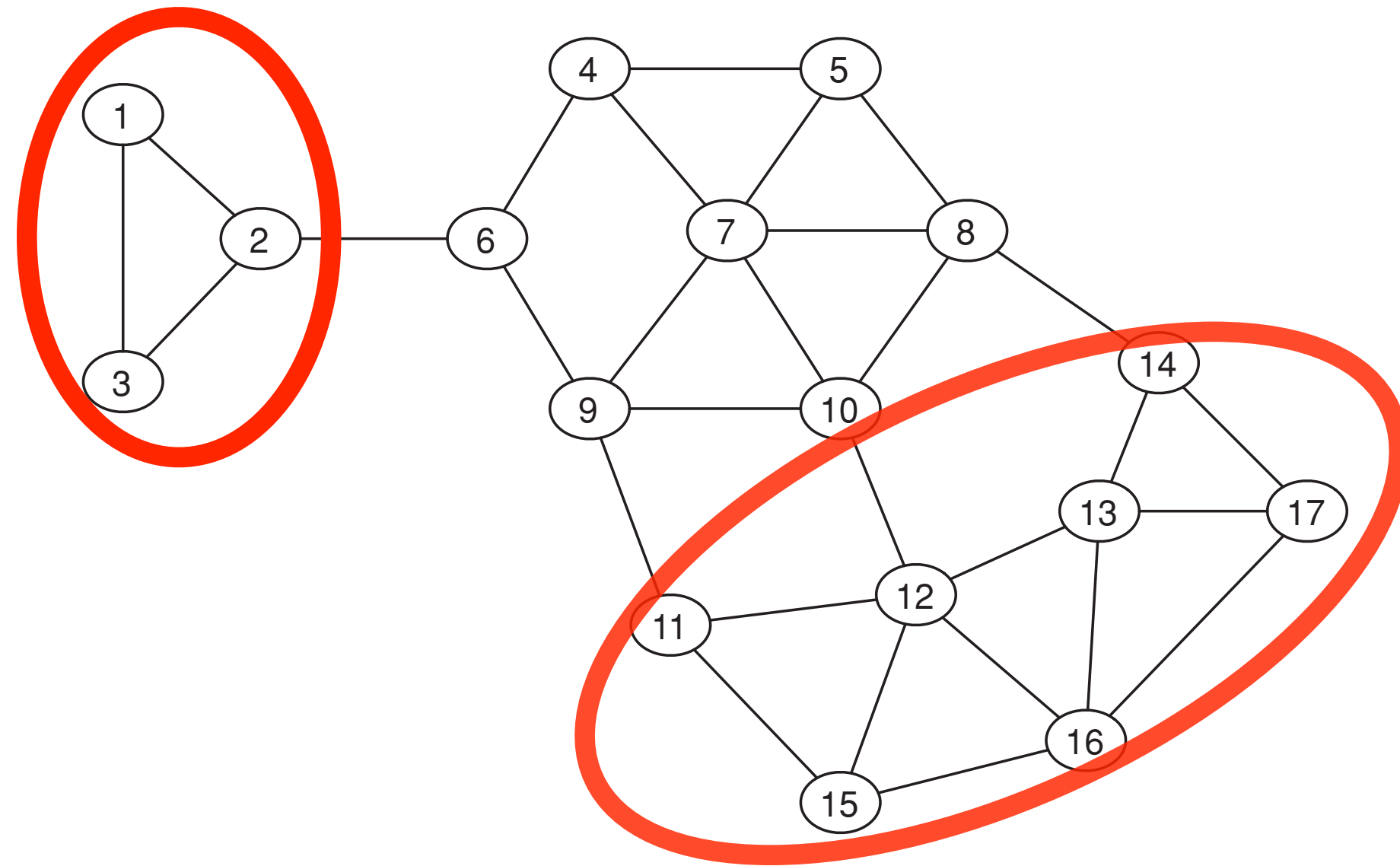
≈ 0.34

Consider a set of initial adopters of behavior A , with a threshold of q for nodes in the remaining network to adopt behavior A .



Why don't they "Drop the gun" (behavior A)

Cluster and cascades



Cluster with density $d > 1 - q$ (w.o. seeds)

X Complete cascade with threshold q

Consider a set of initial adopters of behavior A, with a threshold of q for nodes in the remaining network to adopt behavior A.

(i) If the remaining network contains a cluster of density greater than $1 - q$, then the set of initial adopters will not cause a complete cascade.

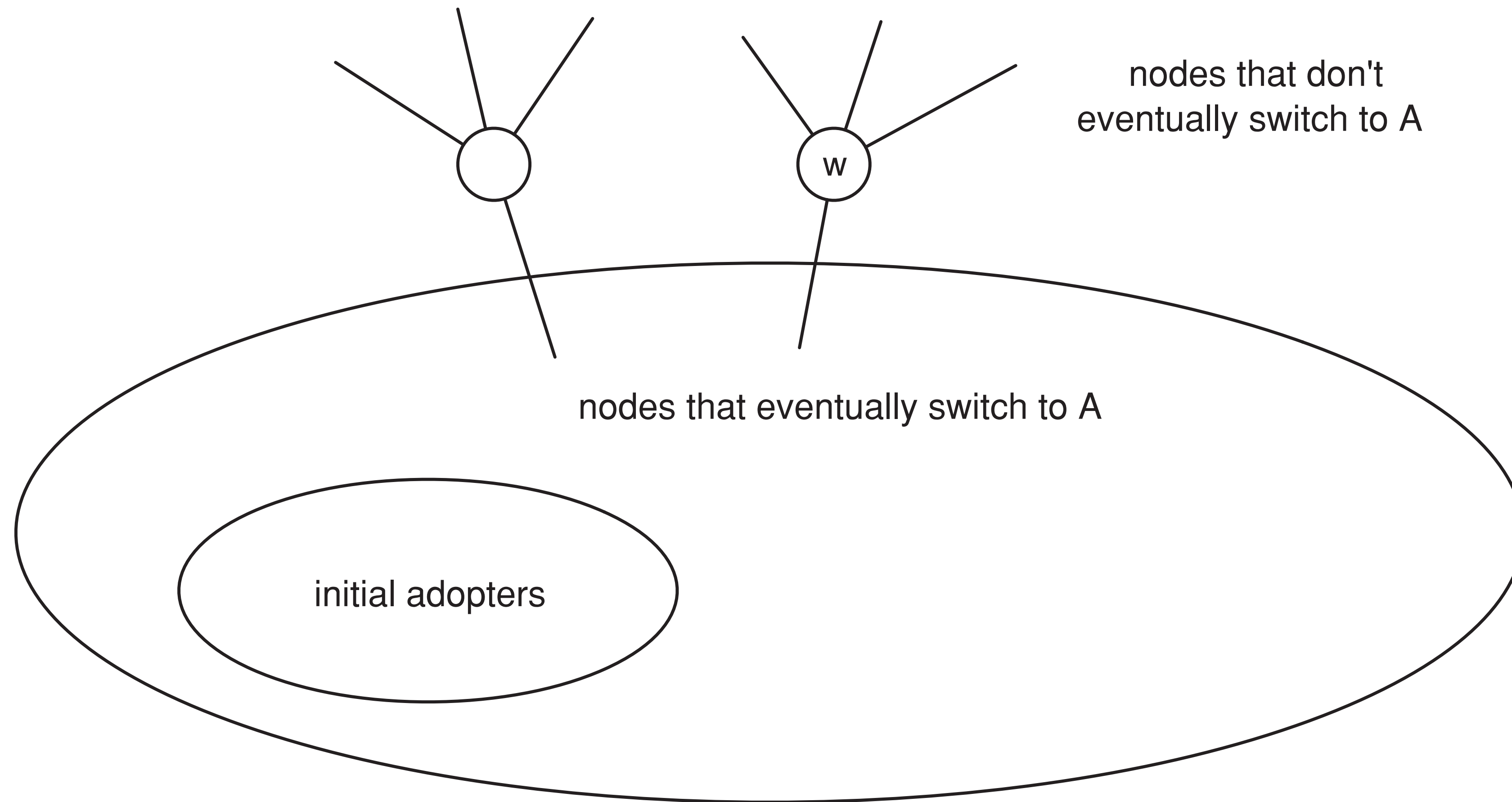
(ii) If a set of initial adopters does not cause a complete cascade with threshold q , the remaining network is a cluster of density greater than $1 - q$.

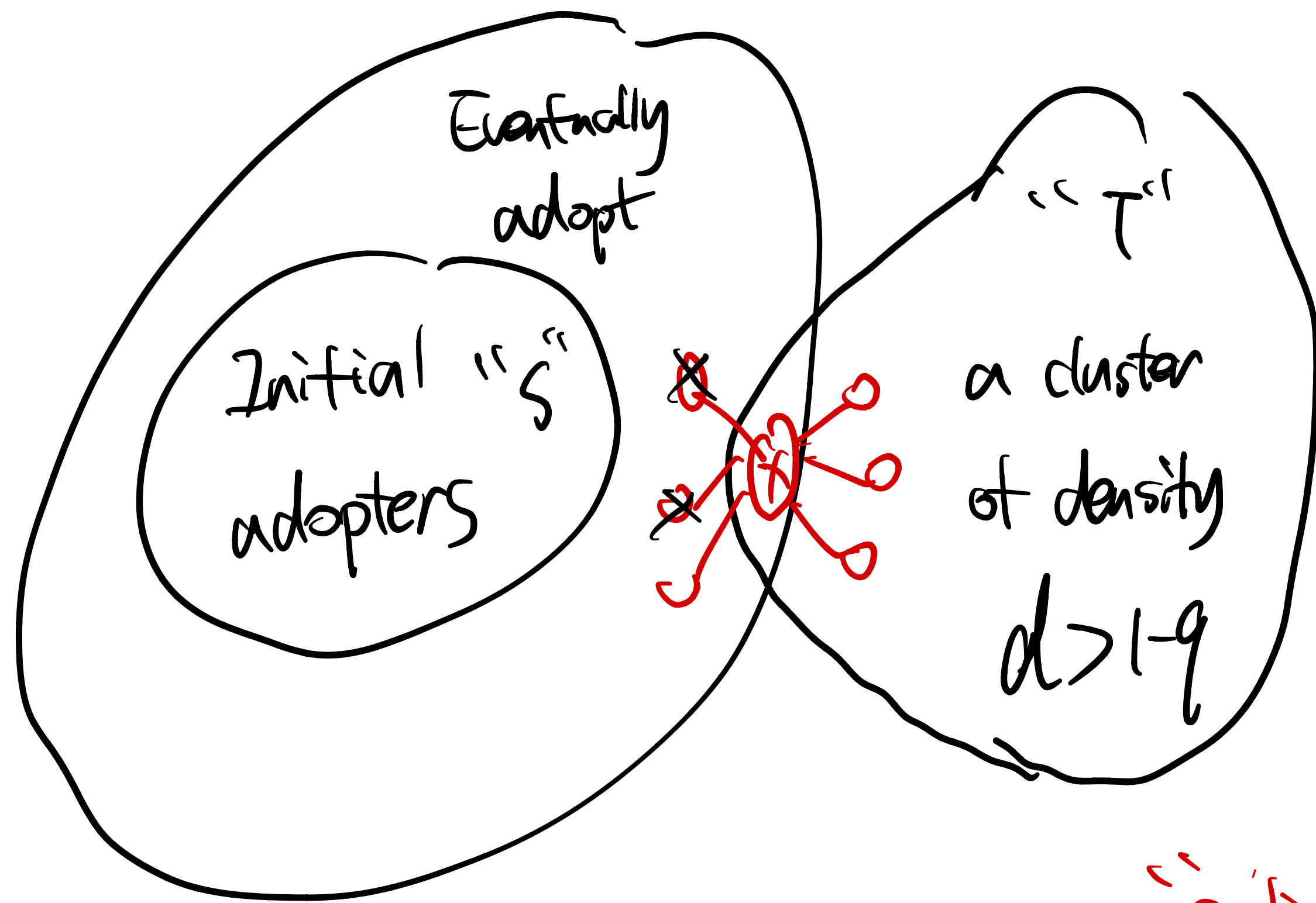


Why don't they "Drop the gun" (behavior A)

Cluster and cascades

(i) If the remaining network contains a cluster of density greater than $1-q$, then the set of initial adopters will not cause a complete cascade.





Claim: Nobody in T will eventually adopt

Prove by contradiction

Assume: if some people in T eventually adopt

Step 0: initial adopters. Nobody in T adopted

Step 1, 2, ..., $n-1$ Nobody in T adopted

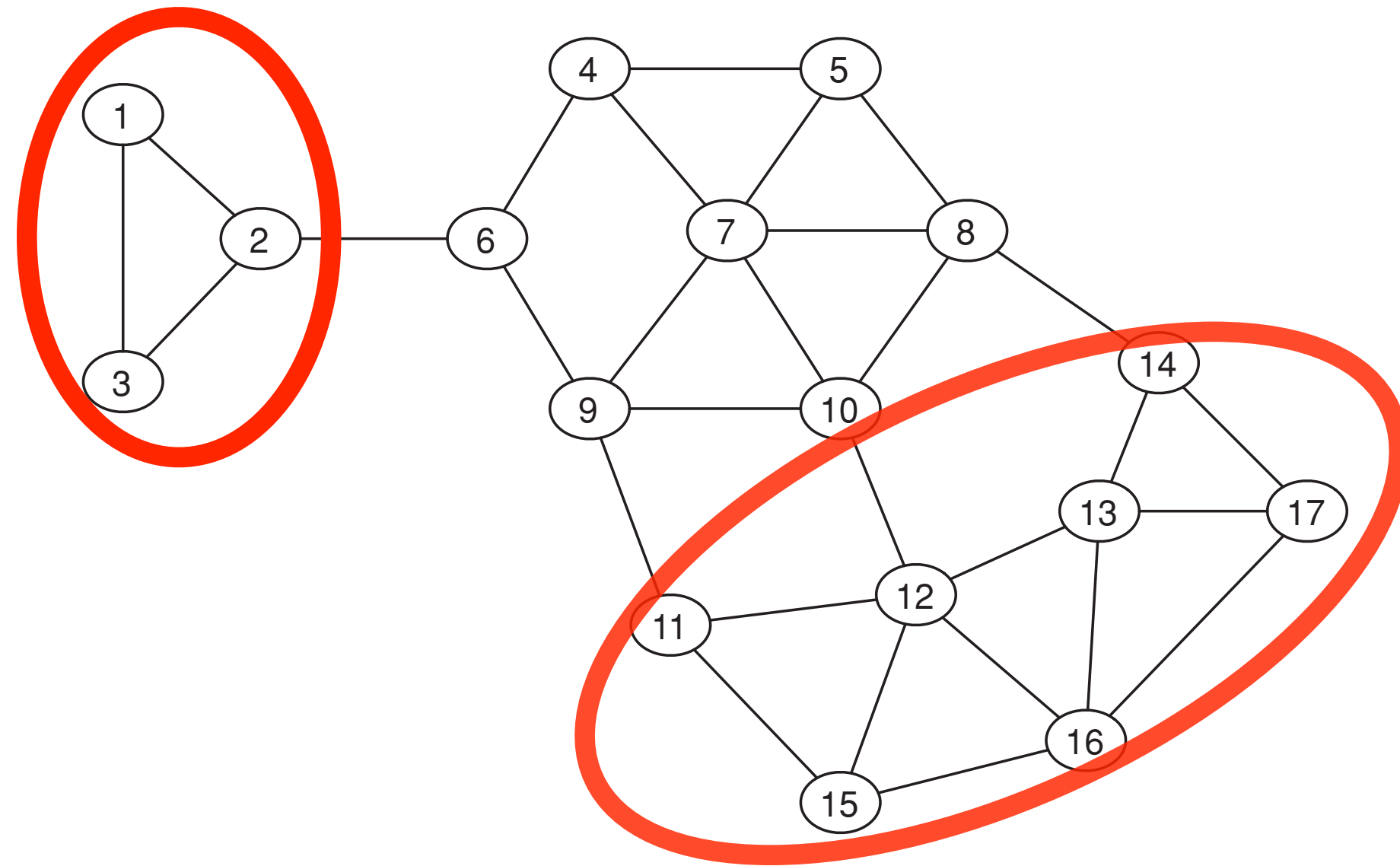
"earliest" Step n : somebody in T adopted
 $\leftarrow x$

(1) x has at least q frac. of friends adopting before step n . \rightarrow outside cluster T

$\Rightarrow x$ has at least q frac. of friends outside cluster T } But we know $d > 1-q$

(2) x has at least d frac of friend in cluster T

Cluster and cascades



Cluster with density $d > 1-q$ (w.o. seeds)

Complete cascade with threshold q

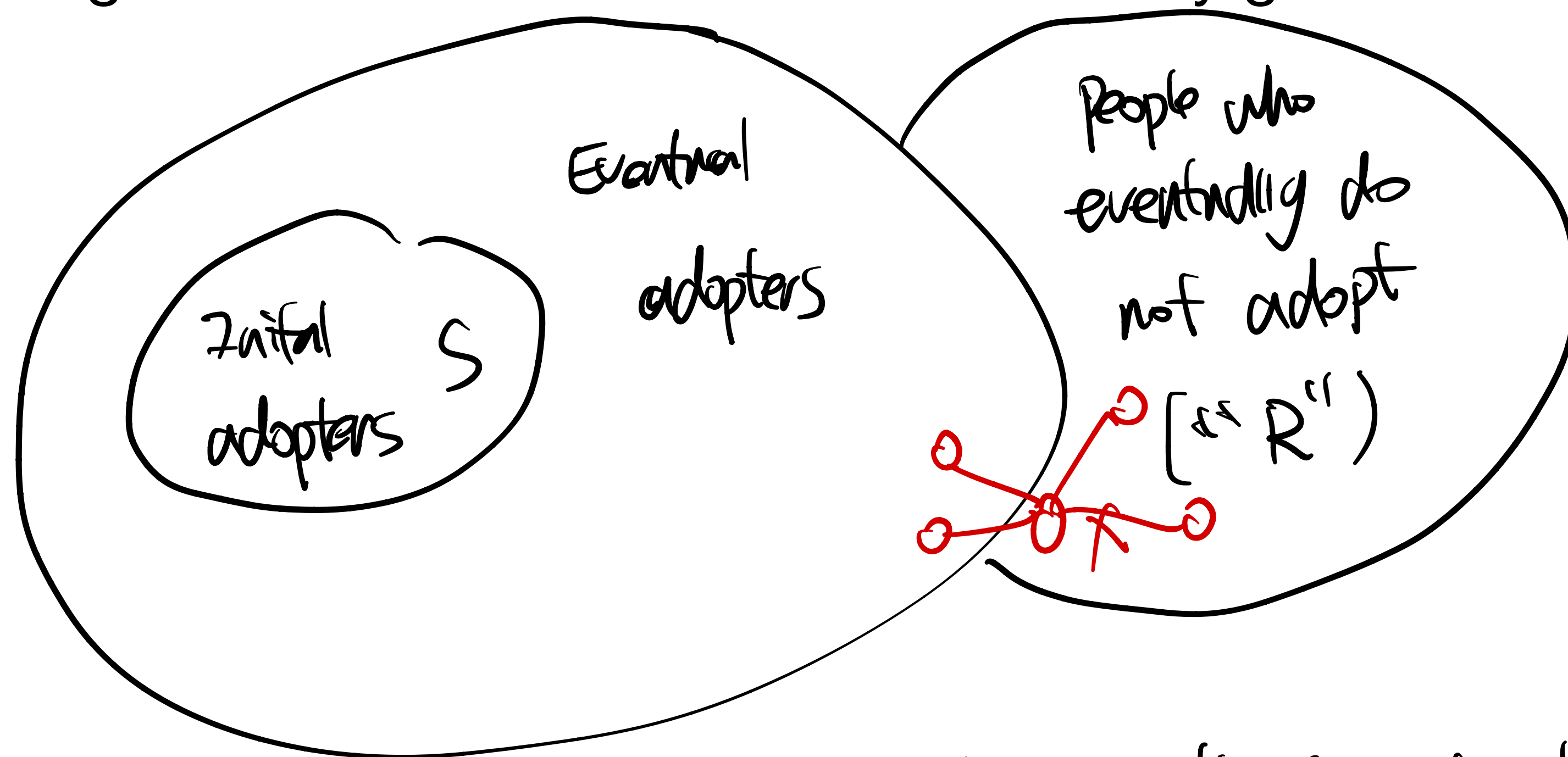
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(i) If the remaining network contains a cluster of density greater than $1-q$, then the set of initial adopters will not cause a complete cascade.

(ii) If a set of initial adopters does not cause a complete cascade with threshold q , the remaining network contains a cluster of density greater than $1-q$.

Cluster and cascades

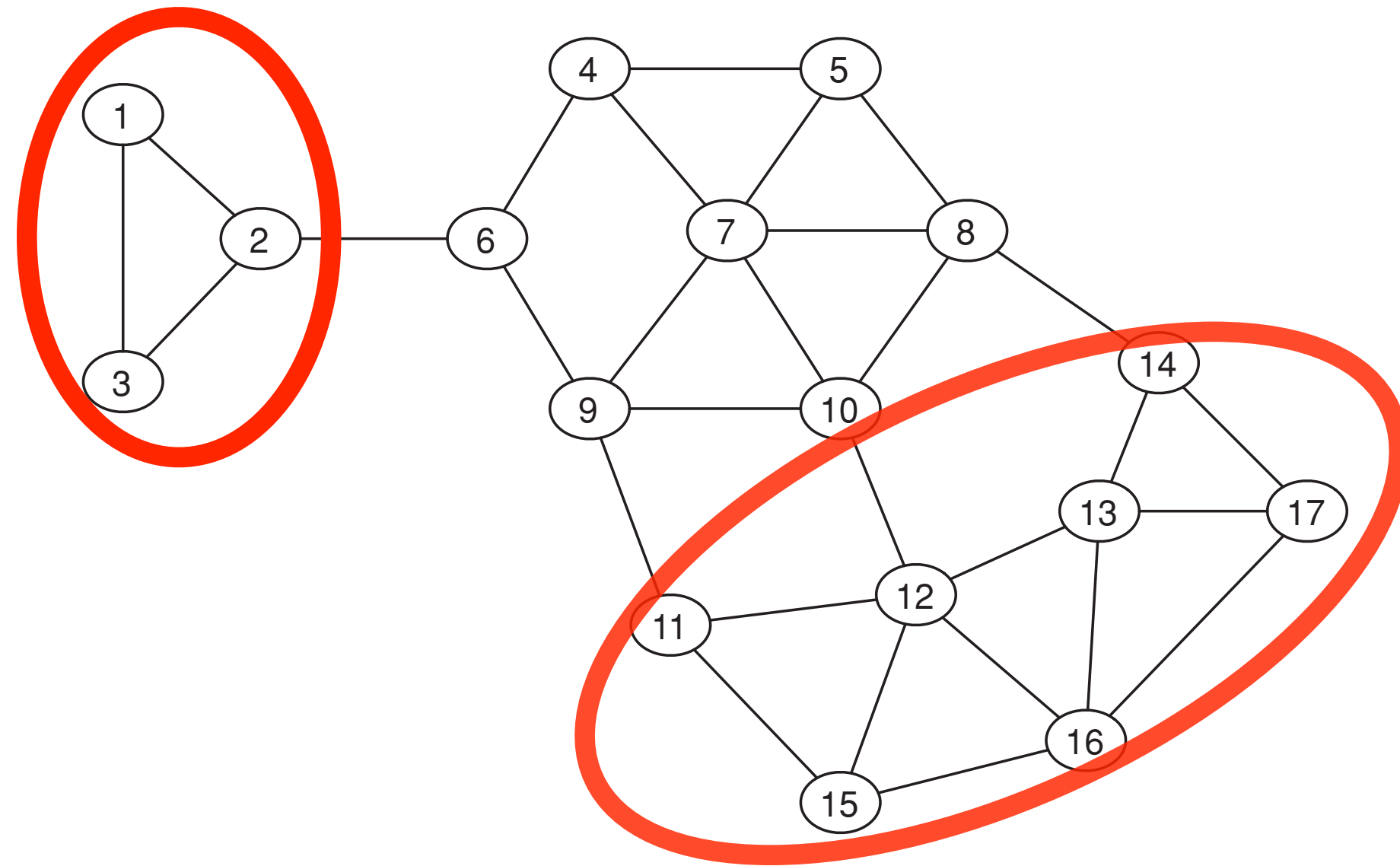
(ii) If a set of initial adopters does not cause a complete cascade with threshold q , the remaining network contains a cluster of density greater than $1-q$.



Claim: " R " is a cluster of density $> 1-q$
 \Leftrightarrow for any node $x \in R$, frac. of x 's friends in R is $> 1-q$

frac of x 's friends outside R is $< q$ (since otherwise x will also adopt $\Rightarrow x \notin R$)
 \Downarrow
inside R $> 1-q$

Cluster and cascades



Cluster with density $d > 1-q$ (w.o. seeds)

Complete cascade with threshold q

Consider a set of initial adopters of behavior A , with a threshold of q for nodes in the remaining network to adopt behavior A .

(i) If the remaining network contains a cluster of density greater than $1-q$, then the set of initial adopters will not cause a complete cascade.

(ii) If a set of initial adopters does not cause a complete cascade with threshold q , the remaining network contains a cluster of density greater than $1-q$.

Diffusion of innovation: Implications

$q = 34\%$
 $d = \frac{2}{3}$

- ① q : threshold Lower my $q \downarrow$
 - ② d : density of cluster lower $d \downarrow$
 - ③ Initial adopters.
- Introduce more links across cluster boundary
- Increase the set of "seeds" especially target at someone in the cluster

