#### The Small World Problem: An Algorithmic Perspective

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### Local Vertex Information

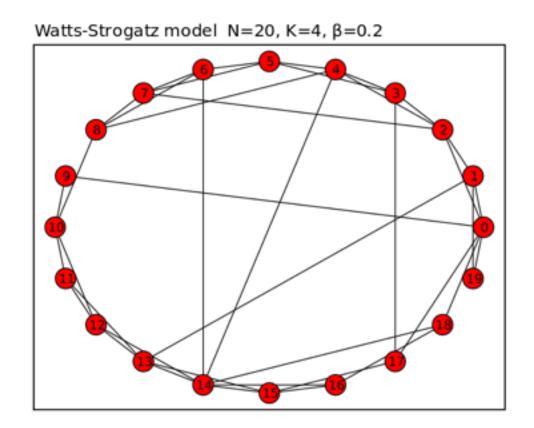
#### (i) the set of local contacts among all nodes (i.e. the underlying grid structure)

(ii) the location, on the lattice, of the target (*t*)

## **De-centralized Algorithm**

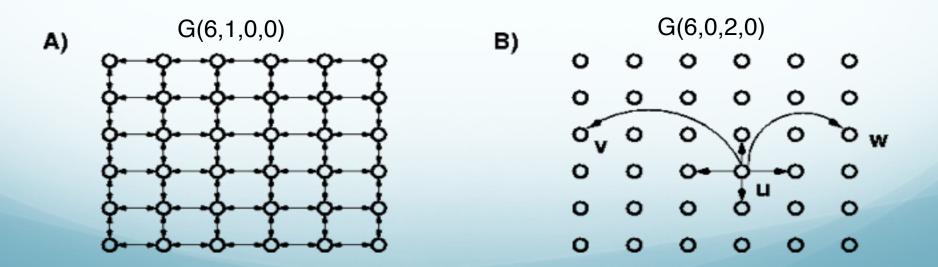
• A: in each step, the current message-holder (u) chooses a contact that is as close to the target (t) as possible, in the sense of lattice distance.

## Watts & Strogatz Model



# **Kleinberg Model**

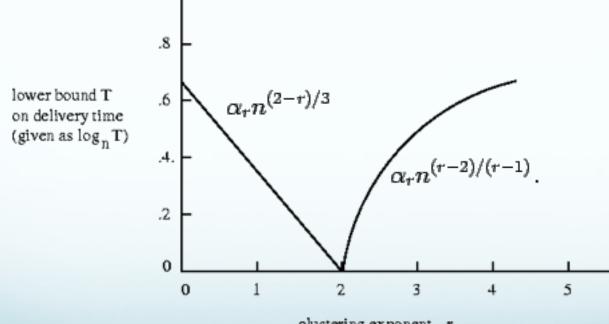
- G(n,p,q,r)
- Distance between verticeies:  $d((i, j), (k, \ell)) = |k i| + |\ell j|$ .
- Probability of long links:  $[d(u,v)]^{-r}$ .
- Normalizing Factor:  $\sum_{v} [d(u,v)]^{-r}$
- Inverse r-th power distribution



# Kleinburg's Theorems

- **Theorem 1** There is a constant  $\mathcal{P}$  depending on *p* and *q*, but independent of *n*, so that when r = 0, the expected delivery time of any decentralized algorithm is at least (Hence exponential in the the expected minimum path length.)
- **Theorem 2** There is a decentralized algorithm aAd a constant , independent of *n*, so that when r = 2 and p = q = 1, the expected delivery time of is at most  $\alpha_2(\log n)^2$
- **Theorem 3** (a) Let  $0 \le r < 2$  here is a constant , depending on p, q, r, but independent of n, so that the expected delivery time of any decentralized algorithm is at least  $\alpha_r n^{(2-r)/3}$ .
- (b) Let r > 2. There is a constant , depending on p, q, r, but independent of n, so that the expected delivery time of any decentralized algorithm is at least  $\alpha_r n^{(r-2)/(r-1)}$ .

r = 2 is the only value for which there is a decentralized algorithm capable of producing chains whose length is a polynomial in (log n)



clustering exponent r

## **K-Dimensions**

- r=k
- k-th inverse distribution for (log n) in polynomial time