

# Dynamics of Clustering in Networks with Repulsive Interaction

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Network of  $N$  *identical* one-dimensional elements.

$$\frac{d\varphi_i}{dt} = f(\varphi_i) + \kappa \sum_j A_{ij} g(\varphi_i, \varphi_j)$$

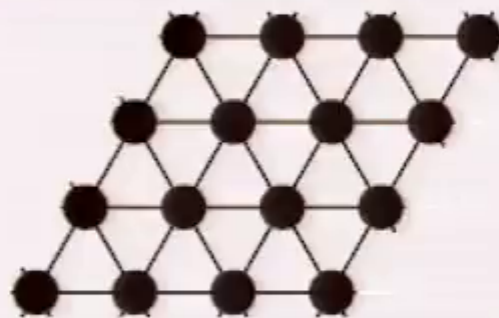
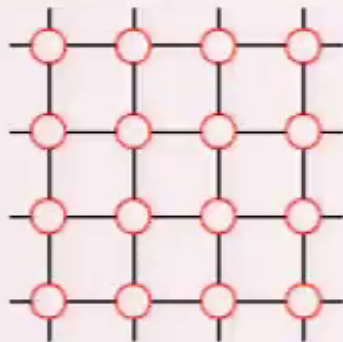
with adjacency matrix  $A_{ij}$ .

- ▷ Global coupling: synchronization,  
in case of coupling through the first Fourier harmonics:

**Strogatz-Watanabe** phenomenon

(existence of  $N-3$  conserved quantities).

- ▷ Local coupling: lattices



- ▷ Clustering, splay states ...



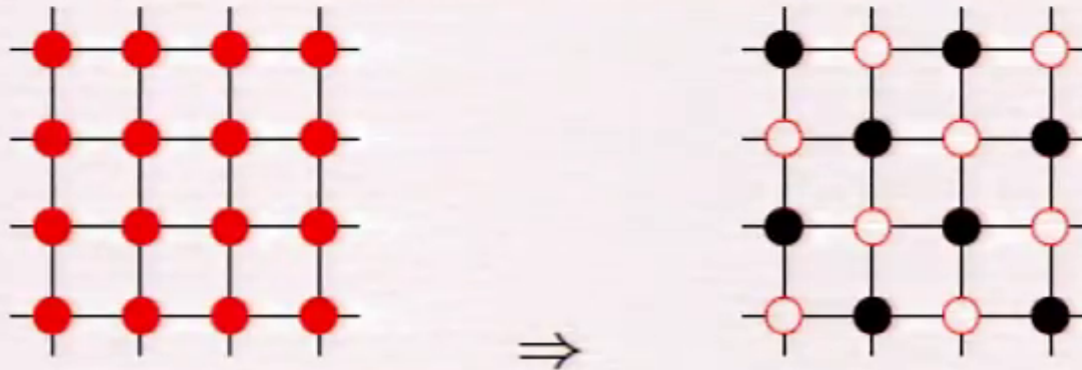
- ▷ Working elements: coupled “active rotators”  
(Kuramoto & Shinomoto, 1979):

$$\frac{d\varphi_i}{dt} = \omega - \sin \varphi_i + \kappa \sum_j^N A_{ij} \sin(\varphi_j - \varphi_i)$$

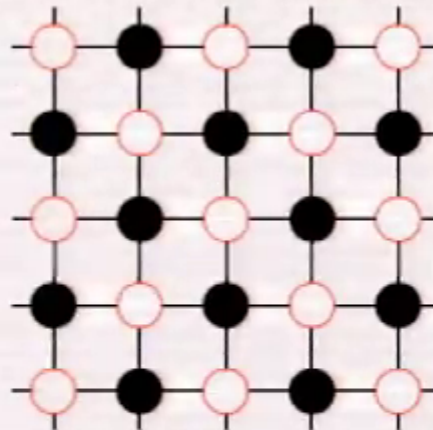
- ▷ Every unit is connected to  $M$  other elements.  
(*network is a regular graph with degree  $M$* ).
- ▷ Gradient dynamics: no small-scale oscillations  
(full-scale rotations along at least one coordinate)  
⇒ no Hopf bifurcations.
- ▷ Consider “excitable case”:  $\omega < 1$ .  
For all positive  $\kappa > 0$ , the synchronous steady state  $S_0$ :  
 $\phi_i = \arcsin(\omega) \quad \forall i$ , is stable.



- ▷ Negative coupling:  $\kappa < 0$ : neighbors in counterphase are favored
- ▷ e.g. checkerboard pattern on a square lattice with periodic boundary conditions and even sizes



- ▷ But not if at least one of the sizes is odd!



- ▷ For a triangular motif (e.g. of a hexagonal lattice) at least one link is always frustrated!





- ▷ Negative coupling:  $\kappa < 0$ .
- ▷ Steady state  $S_0$  is stable for:

$$\kappa > \kappa_c = -\frac{\sqrt{1 - \omega^2}}{M - \lambda_{\min}},$$

where  $\lambda_{\min}$  is the minimal eigenvalue of the adjacency matrix  $A_{ij}$ .



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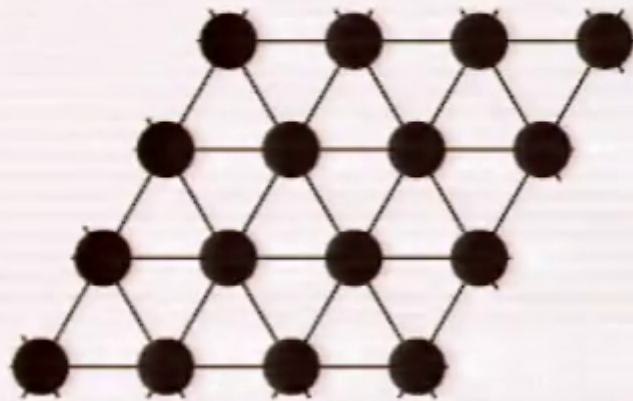
- ▷ Empirically:  $\lambda_{\min}$  is degenerate (sometimes with rather high multiplicity) for all checked regular graphs.
- ▷ Example: hexagonal lattice of  $L_1$  rows and  $L_2$  columns with periodic boundary conditions:

For  $L_1 \neq L_2$ : multiplicity equals 2.

For  $L_1 = L_2 = 3k$ : multiplicity equals 2.

For  $L_1 = L_2 \neq 3k$ : multiplicity equals 6, except

for  $L_1 = L_2 = 4$ : multiplicity equals 9.



Shrikhande graph (1959).

Discrete symmetries: translations, rotations, reflections.

$$\lambda_{\min} = -2.$$

9-dimensional central manifold at  $\kappa_c$ .

*What happens at  $\kappa_c$ ?*

( saddle-node, pitchfork, transcritical, ... )



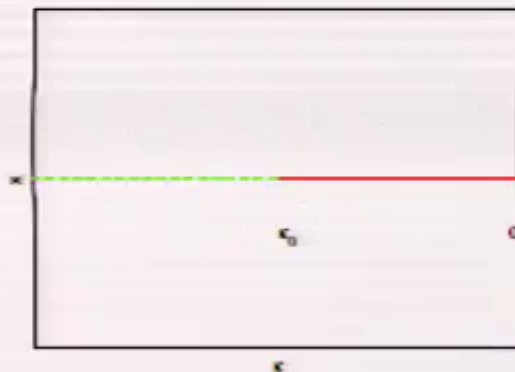
- ▷ Working elements:  $N$  globally coupled active rotators

$$\frac{d\varphi_i}{dt} = \omega - \sin \varphi_i + \kappa \sum_j^N \sin(\varphi_j - \varphi_i)$$

- ▷ Synchronous equilibrium  $\varphi_i = \arcsin \omega$ ,  $i = 1, \dots, N$  is stable for

$$\kappa > \kappa_0 = -\frac{\sqrt{1 - \omega^2}}{N}$$

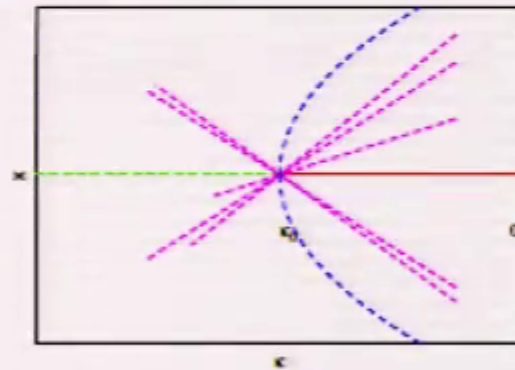
- ▷ the critical eigenvalue has multiplicity  $N - 1$ .







## $N$ globally coupled active rotators



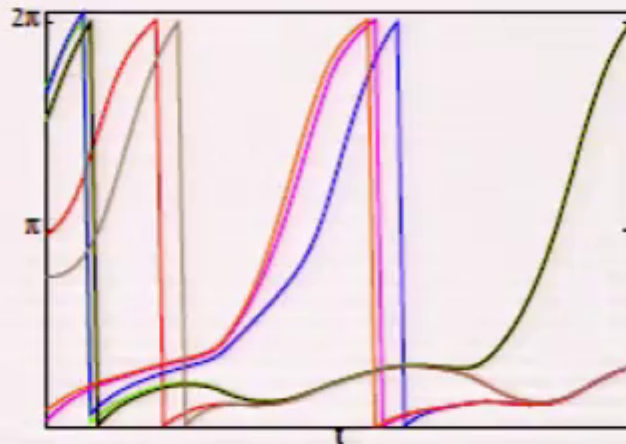
- ▷ For **odd**  $N$ :  $2^{N-1} - 1$  transcritical branches;
- ▷ For **even**  $N$ :  $2^{N-1} + N! / \left(2 \left(\frac{N}{2}!\right)^2\right) - 1$  branches,

whereof  $N! / \left(\left(\frac{N}{2}!\right)^2\right)$  form subcritical pitchforks.

- ▷ All saddles with  $\dim(W_s) > \dim(W_u)$  lie on transcritical branches;  
All saddles with  $\dim(W_s) = \dim(W_u)$  lie on pitchforks.
- ▷ For  $\kappa < k_0$ : **no stable equilibria.**



For sufficiently negative values of  $\kappa$ , numerical integration shows, that initially distinct and broadly scattered phase values tend to formation of several oscillating groups, inside which the values (nearly) coincide.



henceforth I refer to such groups as **clusters**  
(dynamical clusters, state clusters...)

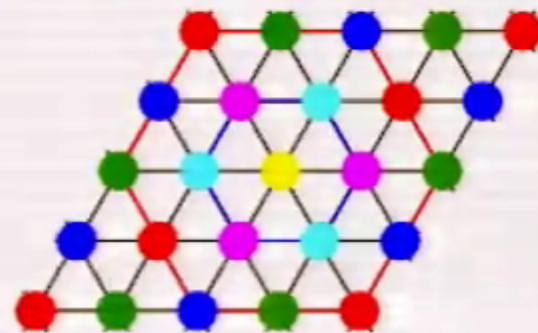
Members of the same cluster are not necessarily neighbors on the lattice.



Example: fix  $\omega = 0.7 \rightarrow \kappa_c = -0.089267 \dots$

Take  $\kappa = -1/3$ .

- ▷ From  $10^5$  initial conditions in the hypercube  $[0 : 2\pi]^{16}$ , 34.87% converge to the limit cycle: the pattern with 6 clusters



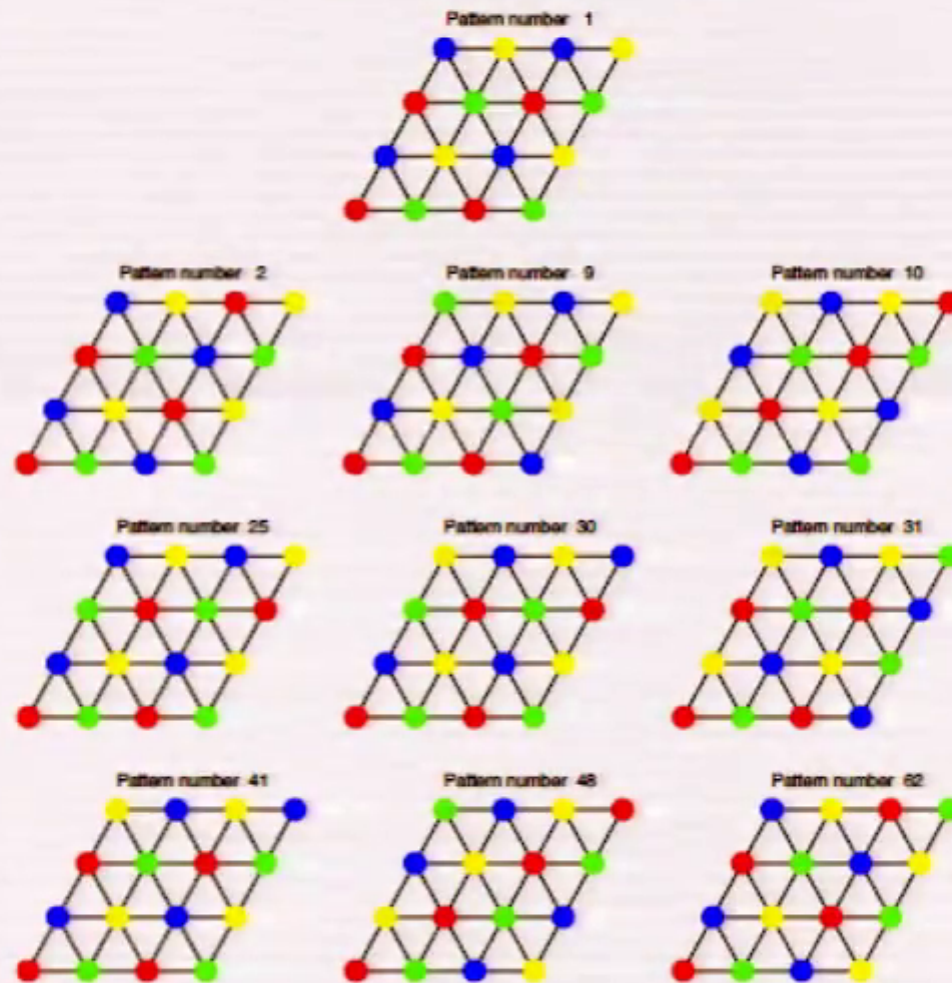
- and its symmetric images (altogether 192).
- ▷ 2.17% converge to the limit cycle without clustering: pattern of 16 non-coinciding rotators and its symmetric images.
- ▷ 0.3% converge to quasiperiodic oscillations without clustering (smooth curves on the Poincaré hyperplane).
- ▷ The rest (63%) converges to periodic oscillations in one of the spatial patterns with 4 clusters.





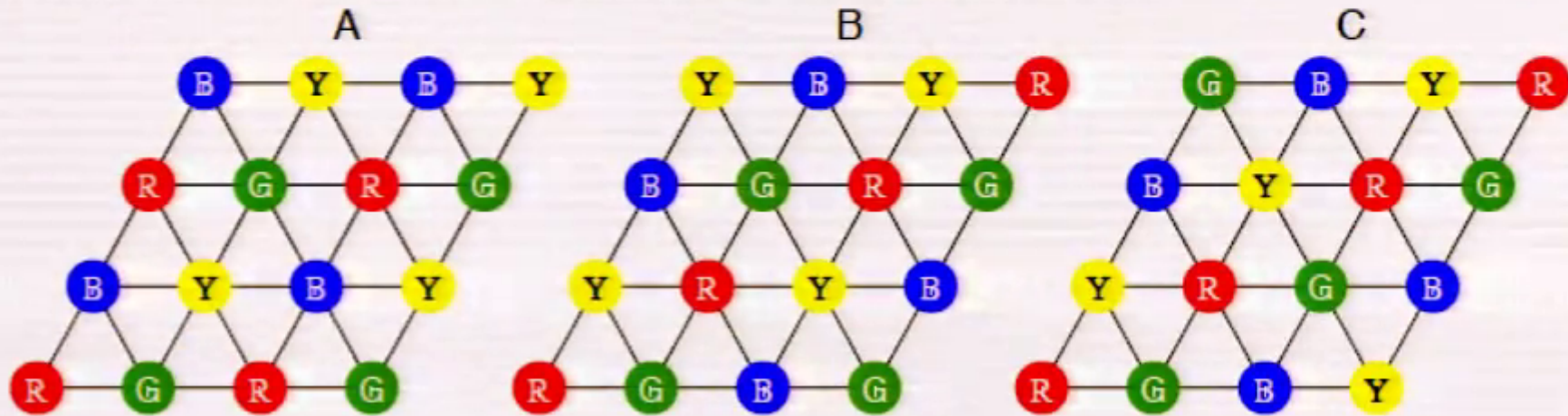
- ▷ ...The rest (63%) converges to periodic oscillations in one of the spatial patterns with 4 clusters.
- ▷ There seems to be no distinct value of period: within precision  $10^{-4}$ , over  $4 \times 10^4$  different values are resolved.
- ▷ Spatial arrangement in these clustering patterns:







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- ▷ In each configuration, every element is connected to two rotators from every other cluster.
- ▷  $\Rightarrow$  Every cluster is connected to every other cluster with the same coupling strength.
- ▷ This is spontaneous onset of global coupling: units are coupled locally, but clusters are coupled globally.



- ▷ Introducing collective variables, we arrive at a set of 4 globally coupled identical oscillators.
- ▷  $\Rightarrow$  Strogatz-Watanabe phenomenon,  $4-3=1$  conserved quantity





- ▷ Introducing collective variables, we arrive at a set of 4 globally coupled identical oscillators.
- ▷ ⇒ Strogatz-Watanabe phenomenon,  $4-3=1$  conserved quantity
- ▷ ⇒ 1-parameter continuous family of periodic solutions

▷ Integral:

$$I = \frac{\sin \frac{\phi_1 - \phi_2}{2} \sin \frac{\phi_3 - \phi_4}{2}}{\sin \frac{\phi_1 - \phi_3}{2} \sin \frac{\phi_2 - \phi_4}{2}}$$

- ▷ The same reduced system of the 4th order (with rescaled coupling) stands behind different configurations of clusters.
- ▷ The very same periodic solution of reduced system can be arranged on the lattice in different spatial ways, and have different stability with respect to the cluster-splitting perturbations.  
(Lou Pecora, yesterday: “*desynchronizing perturbations*”)





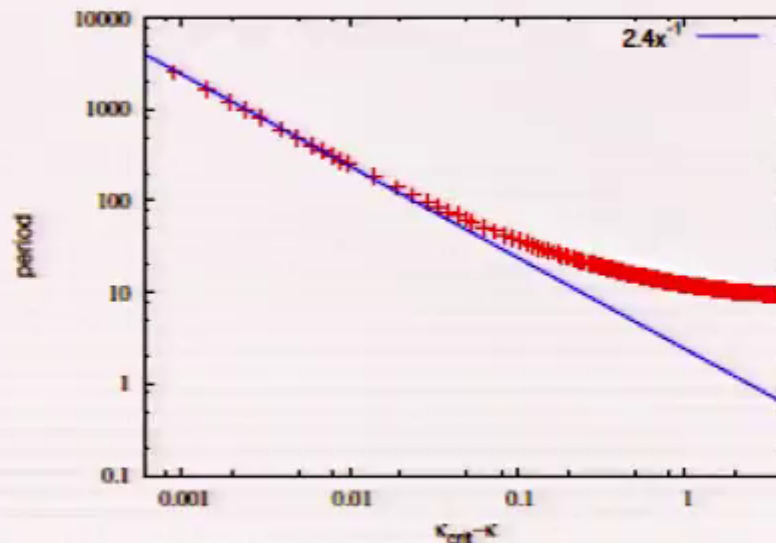
- ▷ The family of periodic solutions is born at  $\kappa_c$  in a highly degenerate global bifurcation.
- ▷ Recall case of global coupling:

at  $\kappa_c$  the symmetric equilibrium collides with **10** saddles in the invariant subspace of ... for **every** 4-cluster pattern with **all** its translations, rotations and reflections.



- ▷ The family of periodic solutions is born at  $\kappa_c$  in a highly degenerate global (**transcritical heteroclinic**) bifurcation.
- ▷ Near  $\kappa_c$  the whole newborn continuum of periodic solutions is unstable (with respect to splitting of clusters), but further decrease of  $\kappa$  leads to stabilization of its segments.
- ▷ Asymptotics of (*range of*) periods near  $\kappa_c$ :

$$T \sim \frac{1}{\kappa_c - \kappa}$$





Definitions of Peter Ashwin:

The oscillators are indistinguishable if they are identical and interchangeable in the sense that they have the same number and strength of inputs.

Oscillators  $i$  and  $j$  on a trajectory are frequency synchronized if

$$\Omega_{ij} := \lim_{T \rightarrow \infty} \frac{1}{T} [\theta_i(T) - \theta_j(T)] = 0$$

and the trajectory is frequency synchronized if  $\Omega_{ij} = 0$  for all  $i \neq j$ .

**A** is a *chimera state* if it is a compact recurrent invariant set such that trajectories within **A** are not frequency synchronized.

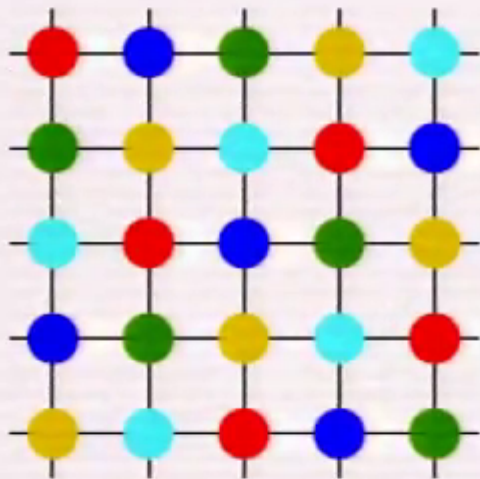


- ▷ Steady checkerboard pattern is not the only attractor of the square lattice at negative values of  $\kappa$ .
- ▷ For sufficiently strong repelling interaction, oscillatory patterns with **global coupling between clusters** get stabilized:



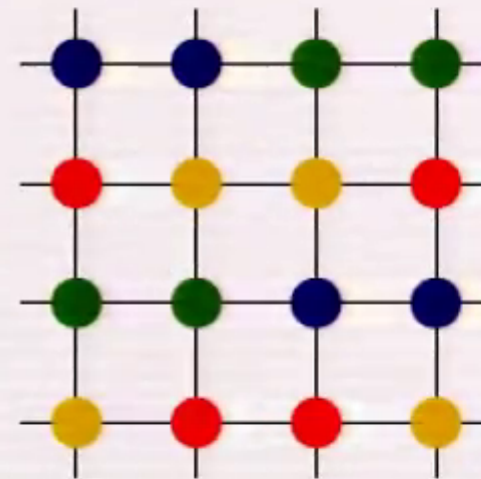


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5 clusters

2 integrals



4 clusters

1 integral

note a neighbor from the **same** cluster!



- ▷ Similar effect takes place on a ring with  $N$  rotators, where each unit repulsively interacts with  $M$  neighbors.



5 clusters

2-parameter continuous family of periodic solutions



- ▷ For the effect to take place:
- ▷ Number of clusters  $K$  should be a divisor of  $N$
- ▷ Every element interacts with equal number of elements from every other cluster (except the cluster to which it belongs itself).  
The number  $n$  of connections between the element and other elements of the *same* cluster can be anything from 0 to  $M + 1 - K$ .
- ▷ Hence,  $K = 1 + \text{div}(M - n)$  (1 + any of the integer divisors of  $M - n$ ).  
Integrals, continuous families of solutions etc. arise at  $K > 3$ .
- ▷ For a general hexagonal coupling ( $M = 6$ ) this refers to:  
 $K = 7$  at  $n = 0$ ,                       $K = 6$  at  $n = 1$ ,  
 $K = 5$  at  $n = 2$ ,                       $K = 4$  at  $n = 0$  and  $n = 3$ .
- ▷ For the square coupling ( $M = 4$ ) there are just two possibilities:  
 $K = 5$  at  $n = 0$ , and  $K = 4$  at  $n = 1$ .





## Summarizing:

- ▷ In a network of repulsively coupled **identical** units on a **regular** graph with **properly** related degree and the number of nodes,
- ▷ the elements can spontaneously group into **clusters** of equal size,
- ▷ so that every cluster interacts with **equal** intensity with every other cluster.
- ▷ If, additionally, the coupling is restricted to the **1st Fourier harmonics**, conserved quantities, and, as a consequence, continuous families of solutions can be encountered.