

The Majority Game on Regular and Random Networks  
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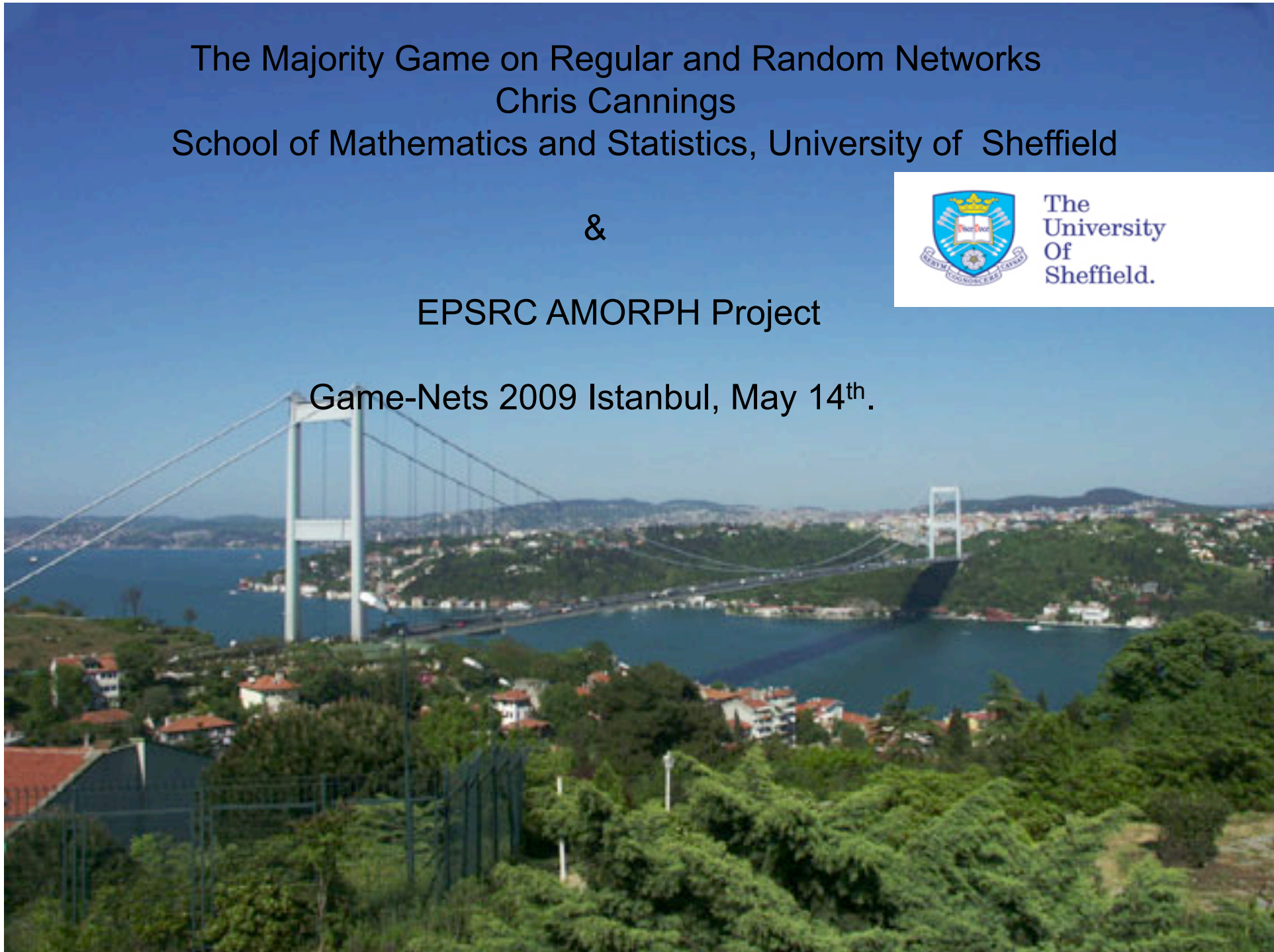
&

EPSRC AMORPH Project

Game-Nets 2009 Istanbul, May 14<sup>th</sup>.



The  
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Of  
Sheffield.



# Games on Networks

- $G=(V,E)$ ,  $V$ =vertex set,  $E$ =edge set.
- State of vertex ,  $\{0,1\}$  only here.
- At time  $t$  some subset of vertices  $S_t$  update their states. A vertex,  $i$  say, in  $S_t$  looks at a subset of its neighbours, and reset its own state according to the observation, and to some rule (function).

# Synchronous Games

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We consider only synchronous games.  
Thus each vertex plays against **all** of  
its neighbours at each time  $t=0,1,2,3,\dots$

# Mixed Majority/Minority Games

- The thrust of this presentation is the examination of games where individuals, located at the vertices of a graph, are either **consistently conformist** (they copy their neighbours), or are **consistently non-conformist** (they play the opposite of their neighbours).
- The **conformists** are **Majority Players**, the **non-conformists** are **Minority Players**

# Majority Player

- A **majority player** M, is an individual who, resets (for time t+1) to state **1(0)** if it observes a **majority** of its neighbours, at time t, as being in state **1(0)**.
- This is a “**conformist**” strategy.
- If payoff for i versus j is  $a_{i,j}$  and plays against each of the neighbours viewed, this is the **myopic best response** strategy.

$$A = (a_{i,j}) = \begin{pmatrix} 1 & 0 \\ 0 & 1 \end{pmatrix}$$

# A Minority Player

- A **minority player**  $m$ , is an individual who, resets (for time  $t+1$ ) to state **1(0)** if it observes a **minority** of its neighbours, at time  $t$  in state **1(0)**.
- This is a “non-**conformist**” strategy.
- If payoff for  $i$  versus  $j$  is  $a_{i,j}$  and 
$$A = (a_{i,j}) = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}$$
 plays against each of the neighbours viewed, this is the **myopic best response** strategy.

# “El Farol” Bar Problem

- The minority player was introduced by Anderson in the “El Farol” Bar scenario.
- There are two bars. An individual checks which bar others were at one evening , and goes to the other bar the next evening; to avoid the crowds. This has applications also in “trading”, where being a buyer in a market with an excess of sellers may be advantageous or choosing a route to drive to work on the basis of yesterday’s traffic.

# Majority Players

- Individuals seeking a lively night-club may adopt the opposite strategy to the above and go where others went the previous evening.
- Ants following trails will choose to follow those trails which have been most reinforced by other ants. Individuals may choose a restaurant which seems to have more customers (the food must be good!).



# Threshold Games

- In a threshold game each vertex  $v$  has a threshold  $b_v$  and plays 1 at time  $t+1$  iff number of neighbours with 1 at time  $t$  exceeds  $b_v$ .
- On any graph this always leads to **fixed points or to 2-cycles**. Goles (1987), Berninghaus and Schwable (1996).
- Majority Game is a threshold game, as is minority game (with a simple swop of labels).

# The Majority Game

- Everyone is a majority player.
- This should lead to a consensus in the population. Everyone should play 0 or everyone should play 1.
- We shall see that this need not be the outcome on graphs; indeed may be only exceptionally.

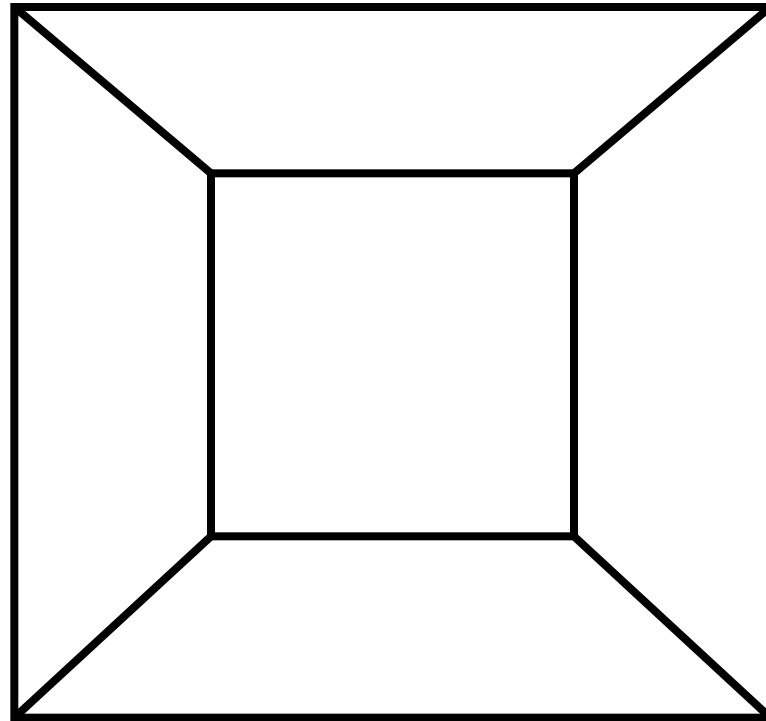
# Majority Game

- Often games will be played in relatively small groups (families, clubs, market).
- Suppose that the set of individuals **repeatedly play games** of this type and that in each such game the **initial state is chosen randomly** and then the group plays a series of trials of reasonable length (so the limit is reached and used for some number of trials; relevant for payoffs).

# Regular Graphs

- In an attempt to understand the behaviour of such games (and generalisations) in relation to graph parameters we consider various special regular graphs.
- Consider cubic (trivalent graphs). Every vertex has three neighbours. This avoids “draws” (i.e. neighbourhoods with equal numbers of 0’s and 1’s).

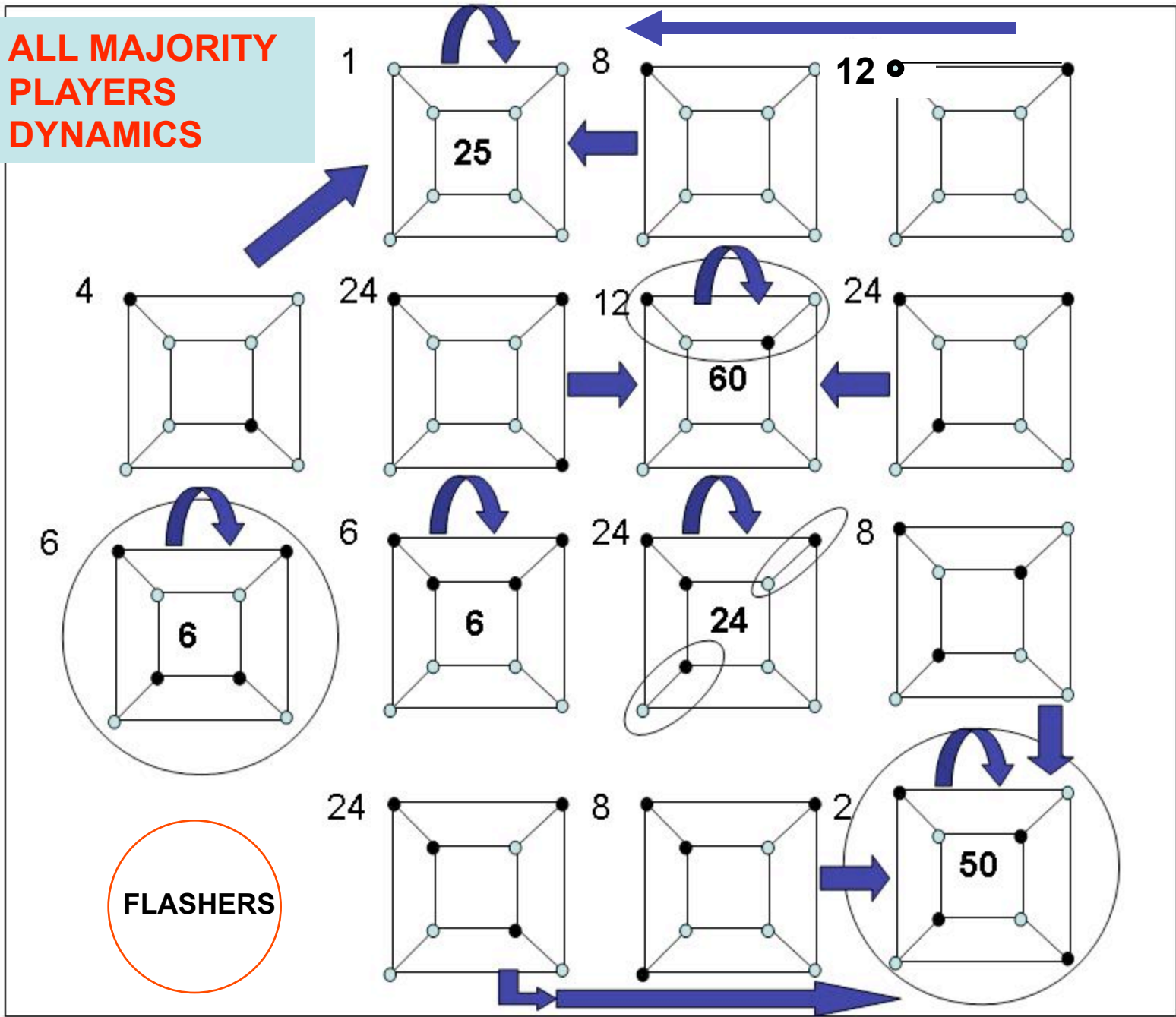
# Example. 3-cube



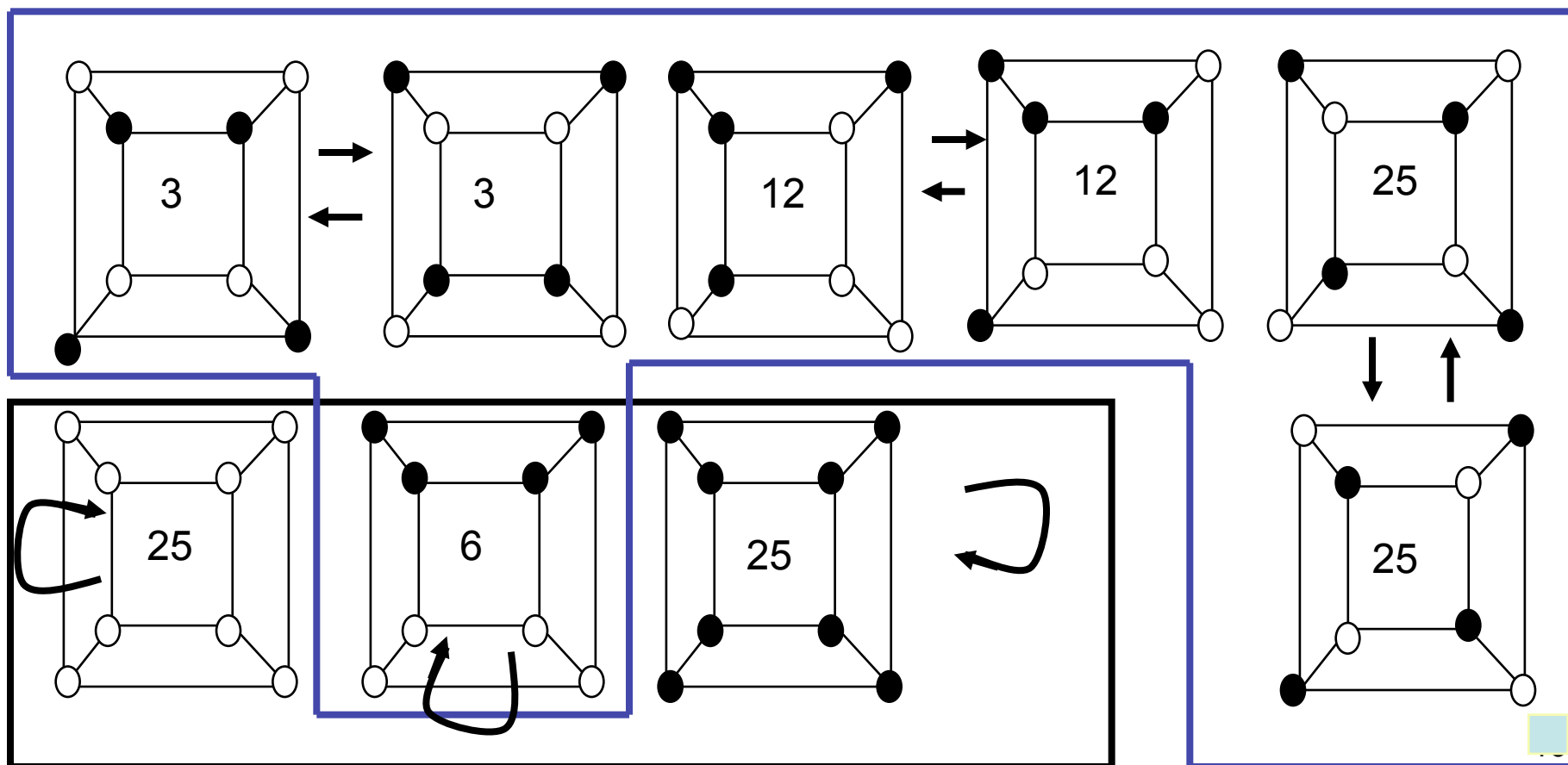
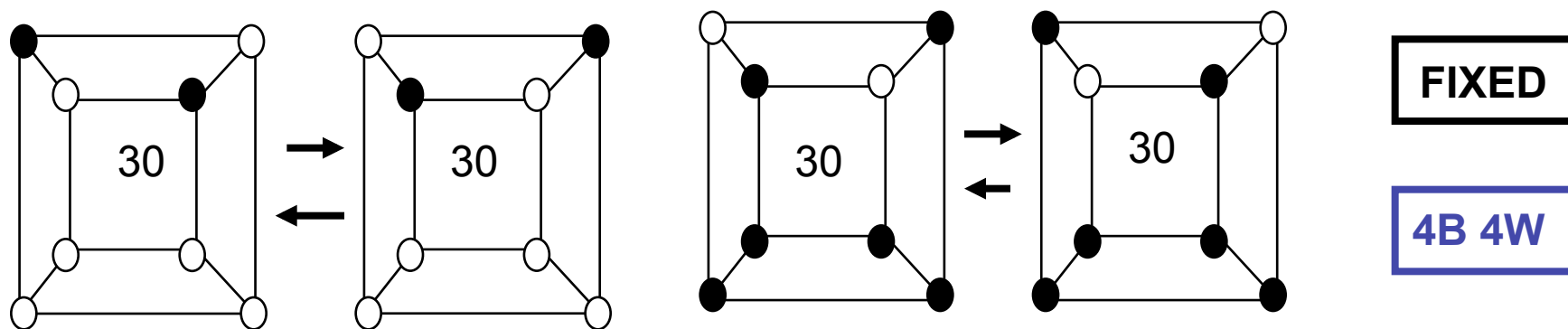
# Majority Game

- There are 256 possible states (the 0's and 1's) here and 22 permutationally distinct configurations (of 0's and 1's on a cube).
- We consider the outcomes when the initial state is assigned with equal probability ( $1/256$ ).

**ALL MAJORITY  
PLAYERS  
DYNAMICS**



# LIMIT CYCLES FOR MAJORITY GAME.





# Limit Cycles for Majority Game on 3-cube

- There are 3 fixed points and 5 2-cycles.
- Convergence is in 1 step.
- Probability of consensus  $50/256$ .

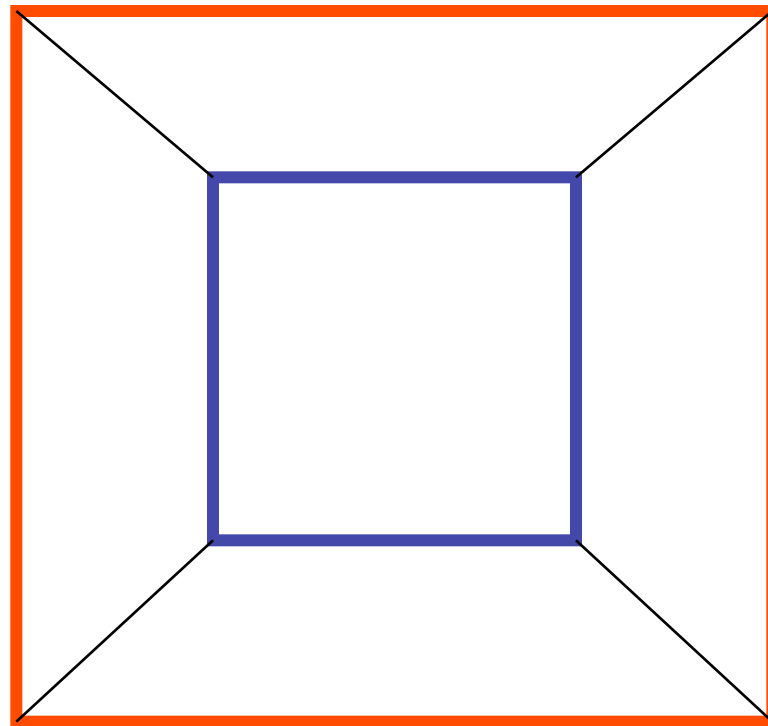
# Fixed Points of the Majority Game on Cubic Graphs.

- Suppose we have a state where every vertex is fixed (0 or 1) through time.
- A vertex (playing wlog 0) must have at least two 0-neighbours. Each of these must have at least two 0-neighbours i.e. one additional to our original one, and so on.
- Thus every 0-vertex must be in a circuit of 0-vertices. Similarly for 1-vertices.

# Cycle-Partitions of Cubic Graphs

- For a graph  $G=\{V,E\}$  a cycle partition is  $\{G_1, G_2, \dots, G_k\}$  being  $k$  graphs induced by  $G$  on the elements of a partition of  $V=\{V_1, V_2, \dots, V_k\}$ ; such that every vertex of  $G_i$  belongs to a cycle in  $G_i$ .
- Given a cycle-partition then we can assign 0's and 1's to the elements  $G_i$  to give a fixed point of the majority game.

# Cycle-Partitions of the Cube



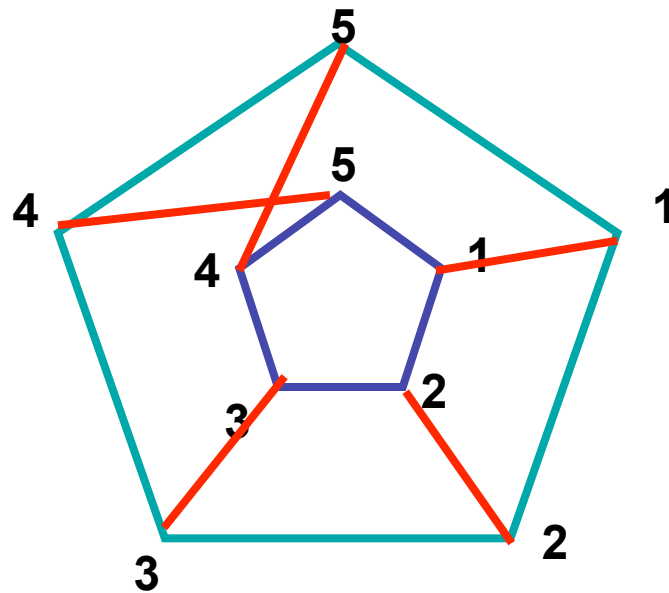
Pairs of  
Opposite faces.  
Thus 3 distinct  
cycle-partitions,  
8 distinct fixed  
points.

# Other Cubic Graphs

- Our examples are for  $n=4, 6, 8$  and  $10$ .
- There are  $1, 2, 5, 19, 85, \dots$  connected cubic graphs with (resp)  $4, 6, 8, 10, 12$  vertices.
- A random cubic graph will generically have little, or no, symmetry. Here I choose some which have more symmetries, the order of the automorphism group of the graph..

# A class of “cylindrical” cubic graphs

- Take two polygons of size  $n$  (here  $n=5$ ).

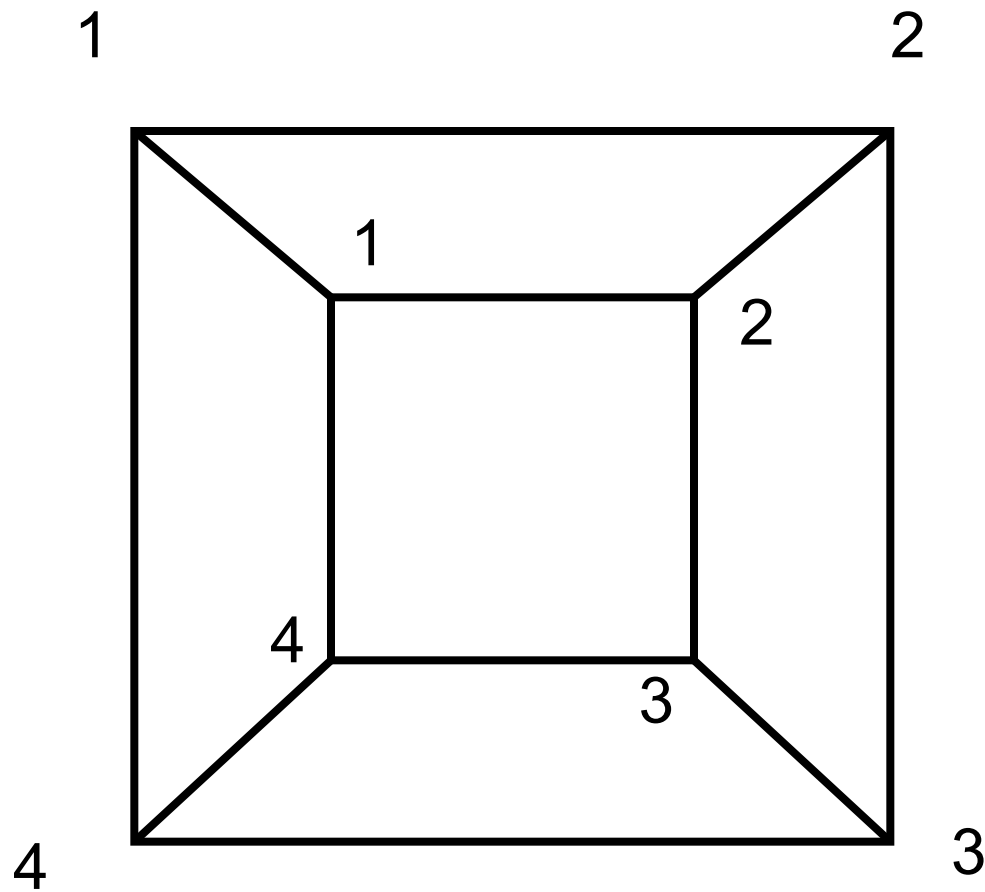


Take a permutation  $P=\{p_1, p_2, \dots, p_n\}$ , and join each  $i$  on one polygon to  $p_i$  on the other.

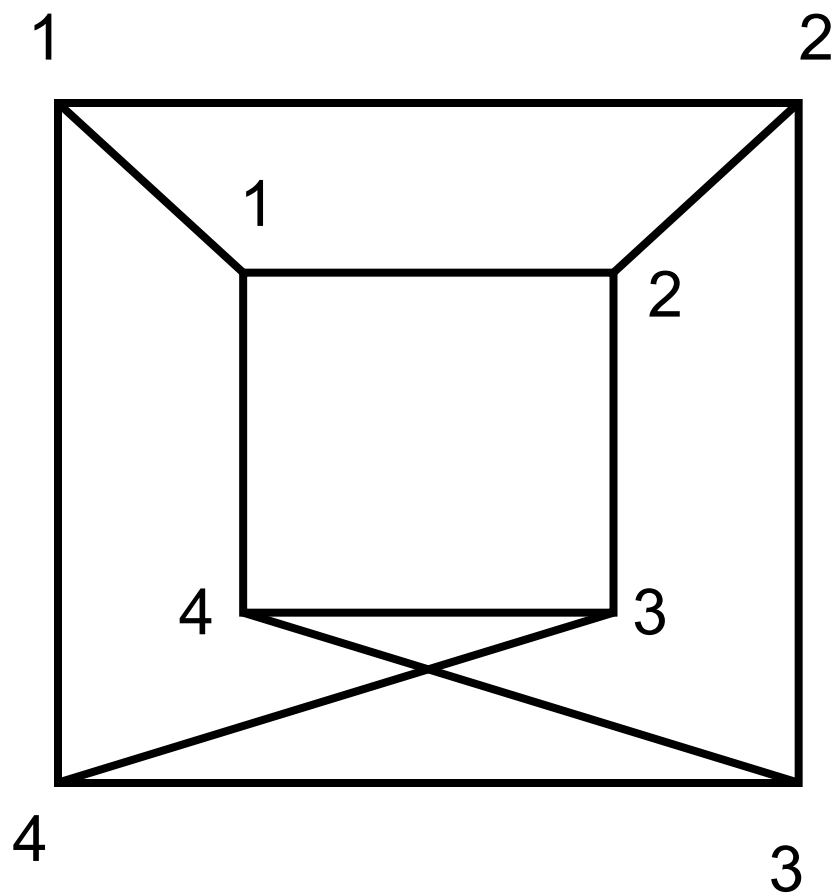
Example (shown)  
 $\text{perm}=(1, 2, 3, 5, 4)$

Denote such a graph  **$n$ -CYL- $P$**

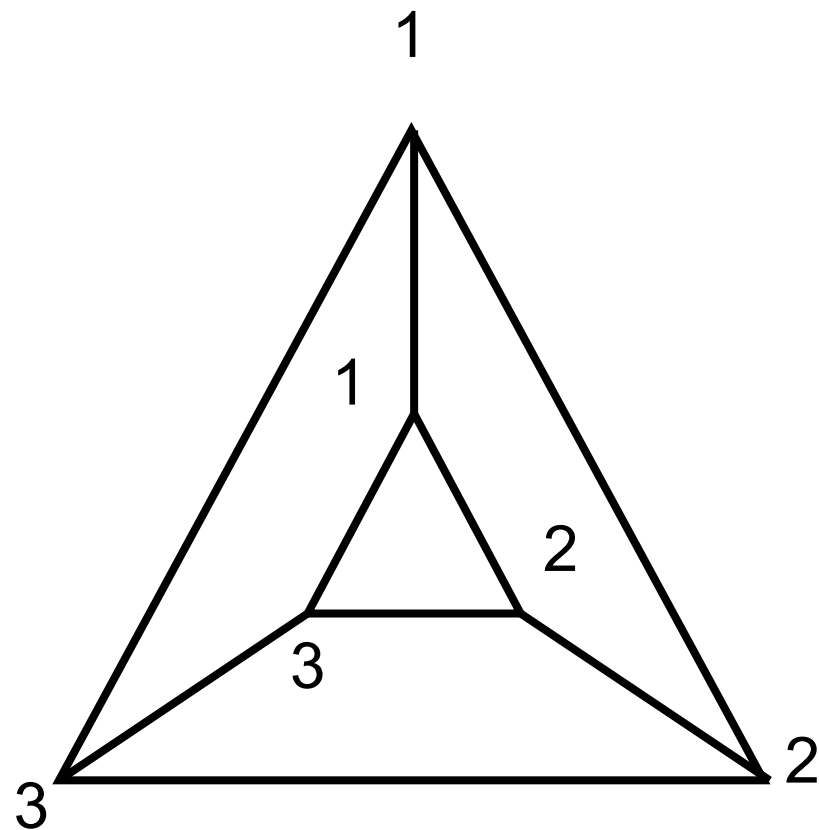
# Example. 4-CYL- $\{1234\}$



**4-CYL-{1243}**



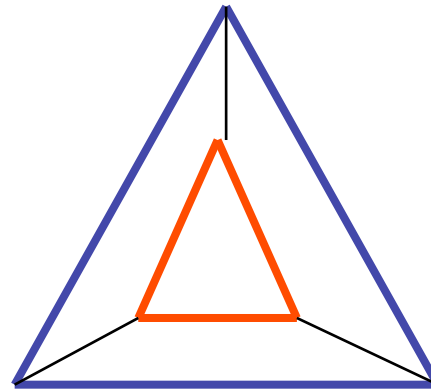
**3-CYL-{123}**





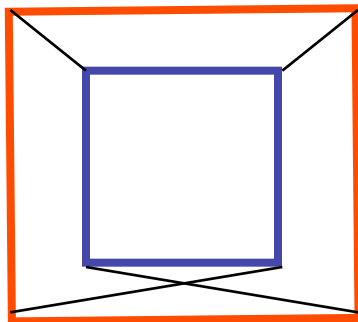
# Cycle Partitions

**3-CYL{123}**

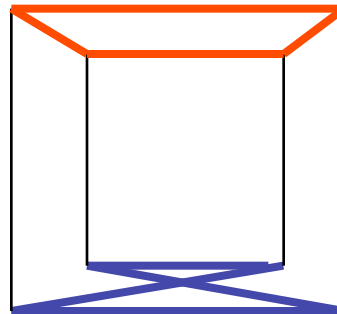


1 cycle-partition  
so 4 fixed points

**4-CYL{1243}**

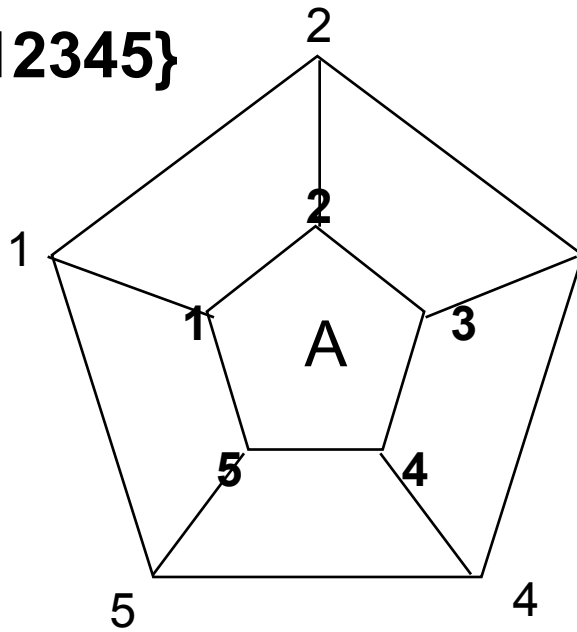


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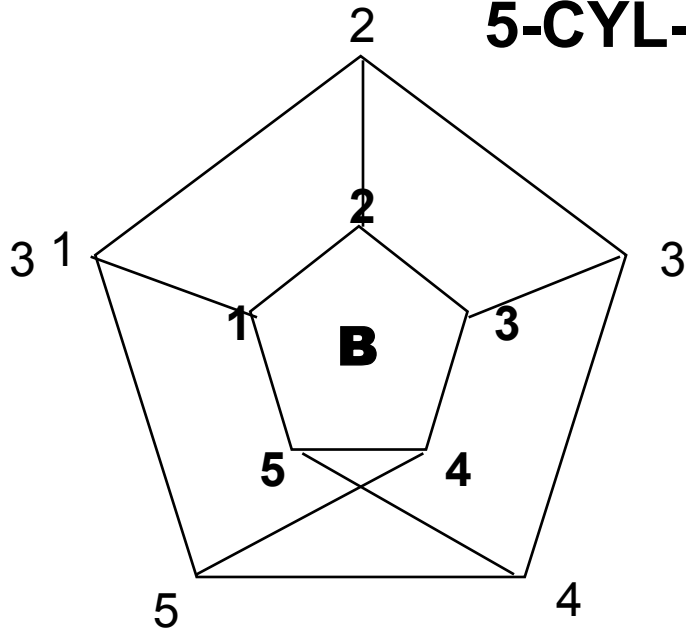


2 cycle-partitions  
so 6 fixed points

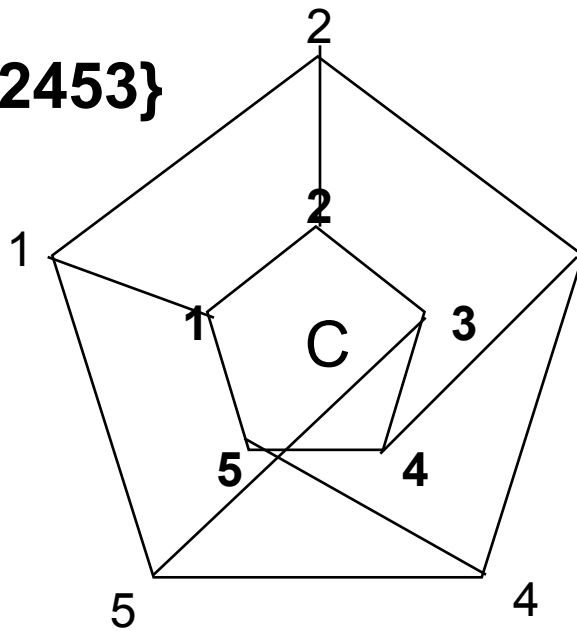
**5-CYL-{12345}**



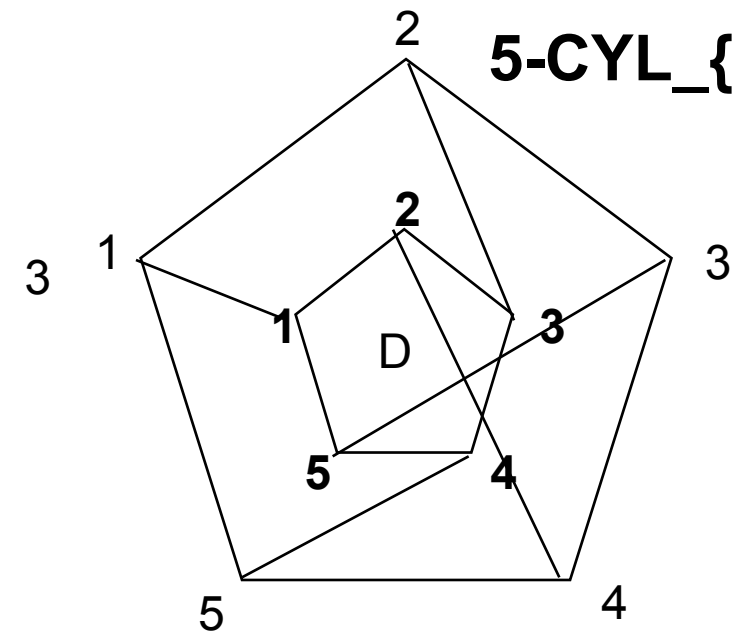
**5-CYL-{12354}**



**5-CYL-{12453}**

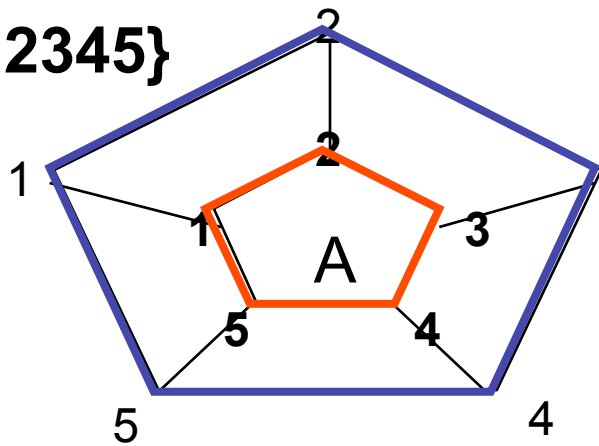


**5-CYL\_{13524}**

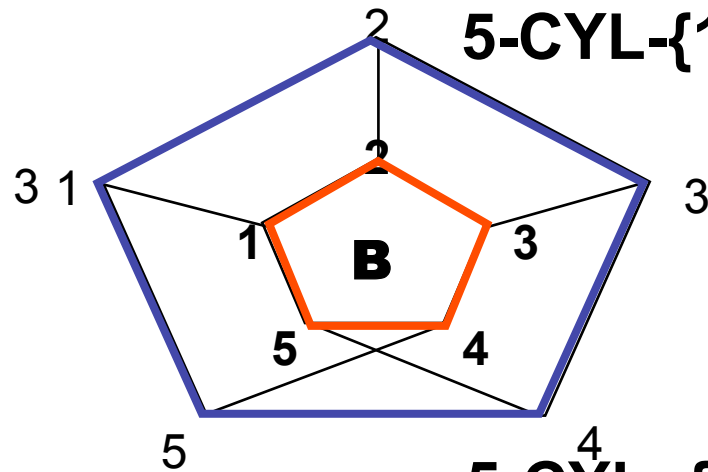


# 5/5 Cycle Partitions

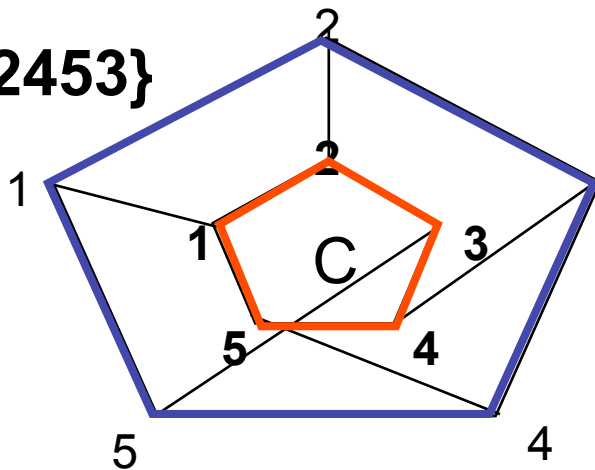
**5-CYL- $\{12345\}$**



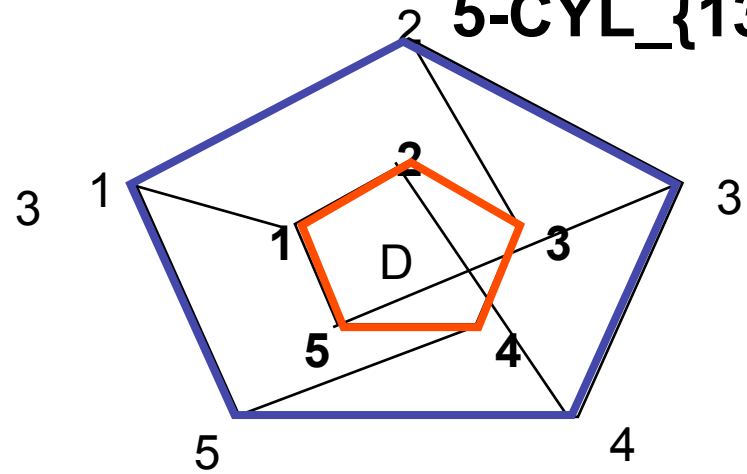
**5-CYL- $\{12354\}$**



**5-CYL- $\{12453\}$**

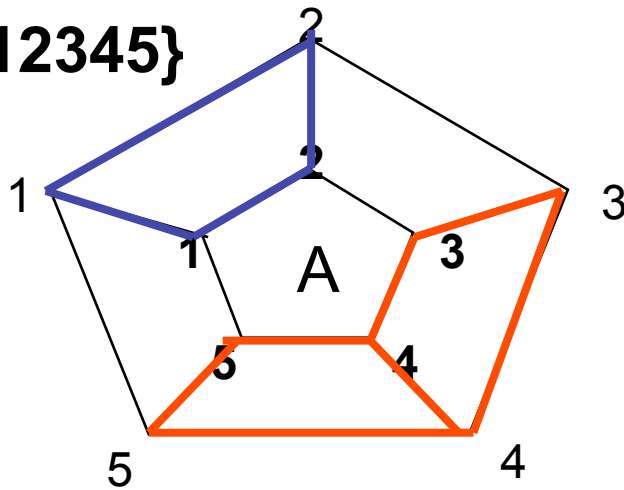


**5-CYL- $\{13524\}$**

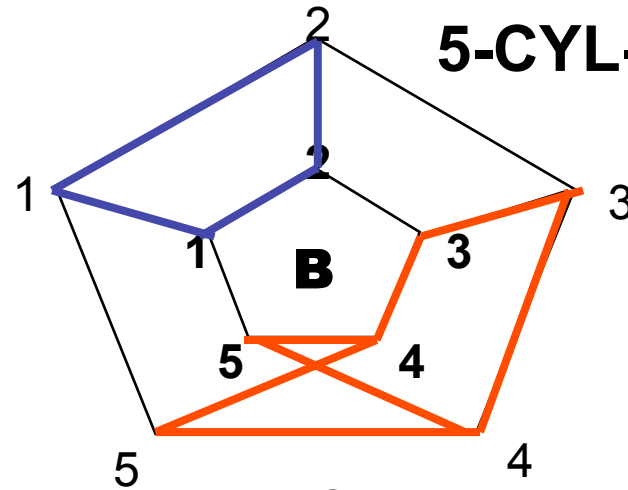


# 4/6 Cycle Partitions

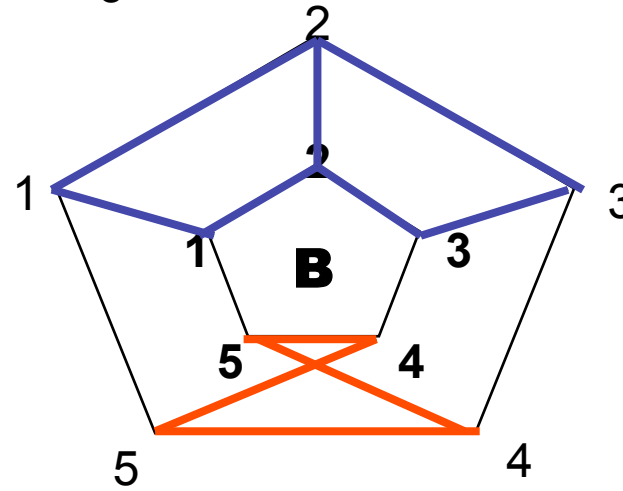
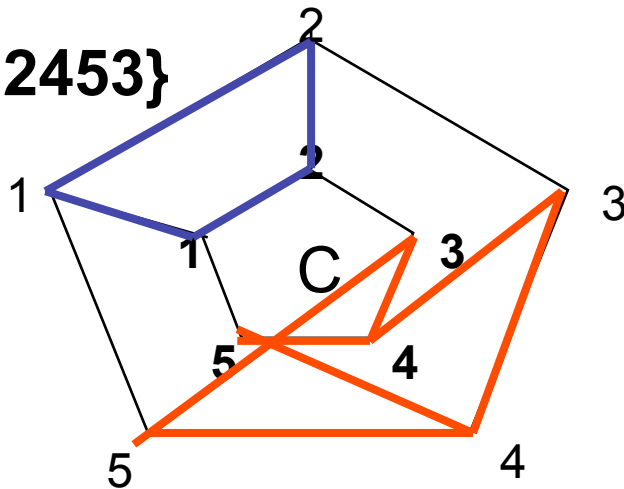
5-CYL-{12345}



5-CYL-{12354}



5-CYL-{12453}



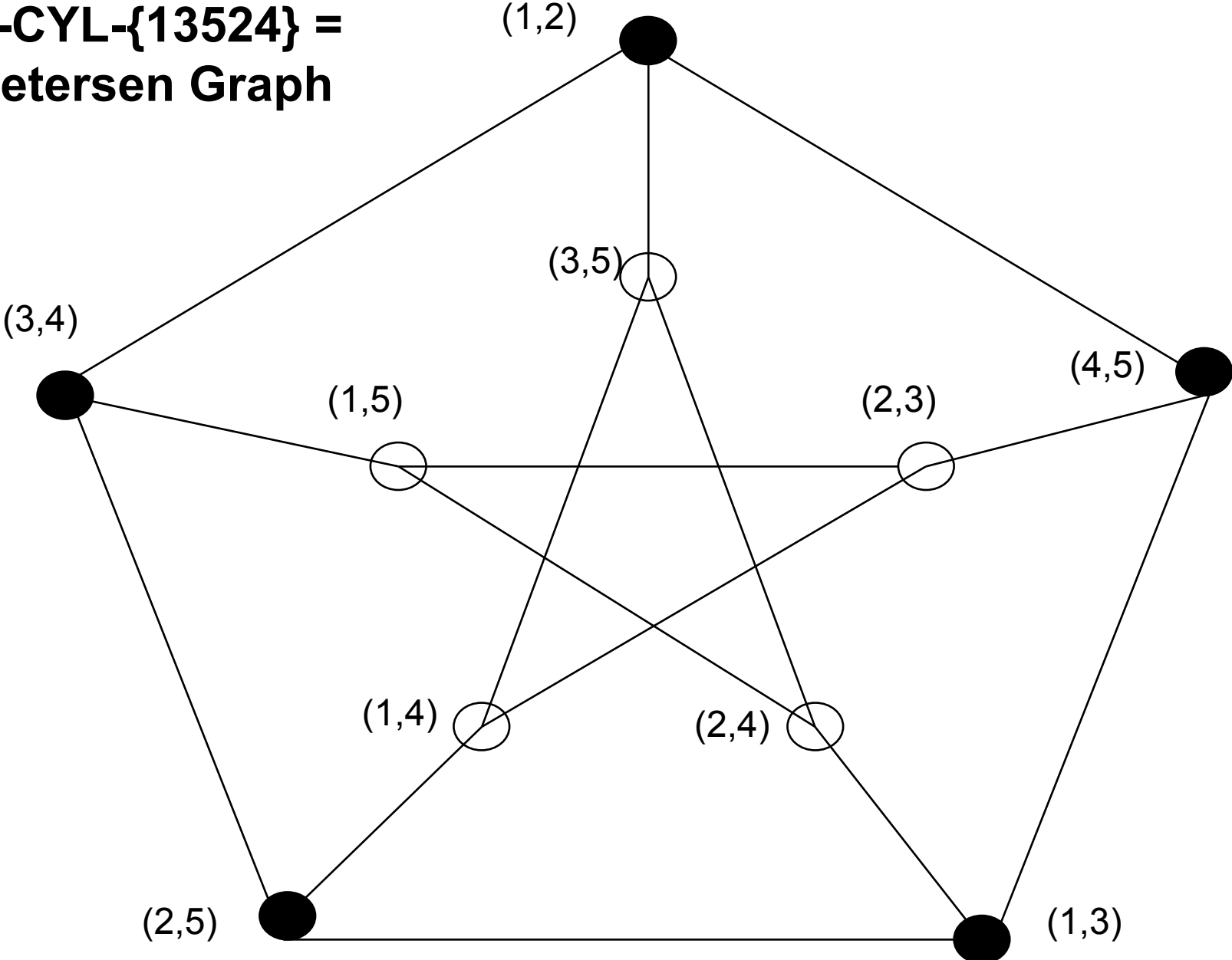
# Fixed Points of the Minority Game on Cubic Graphs.

- Suppose we have a state where every vertex is fixed (0 or 1) through time.
- A vertex (playing wlog 0) must have at least two 1-neighbours. Each of these must have at least two 0-neighbours i.e. one additional to our original one, and so on.
- Thus every vertex must be in an alternating circuit of 0 and 1 vertices.

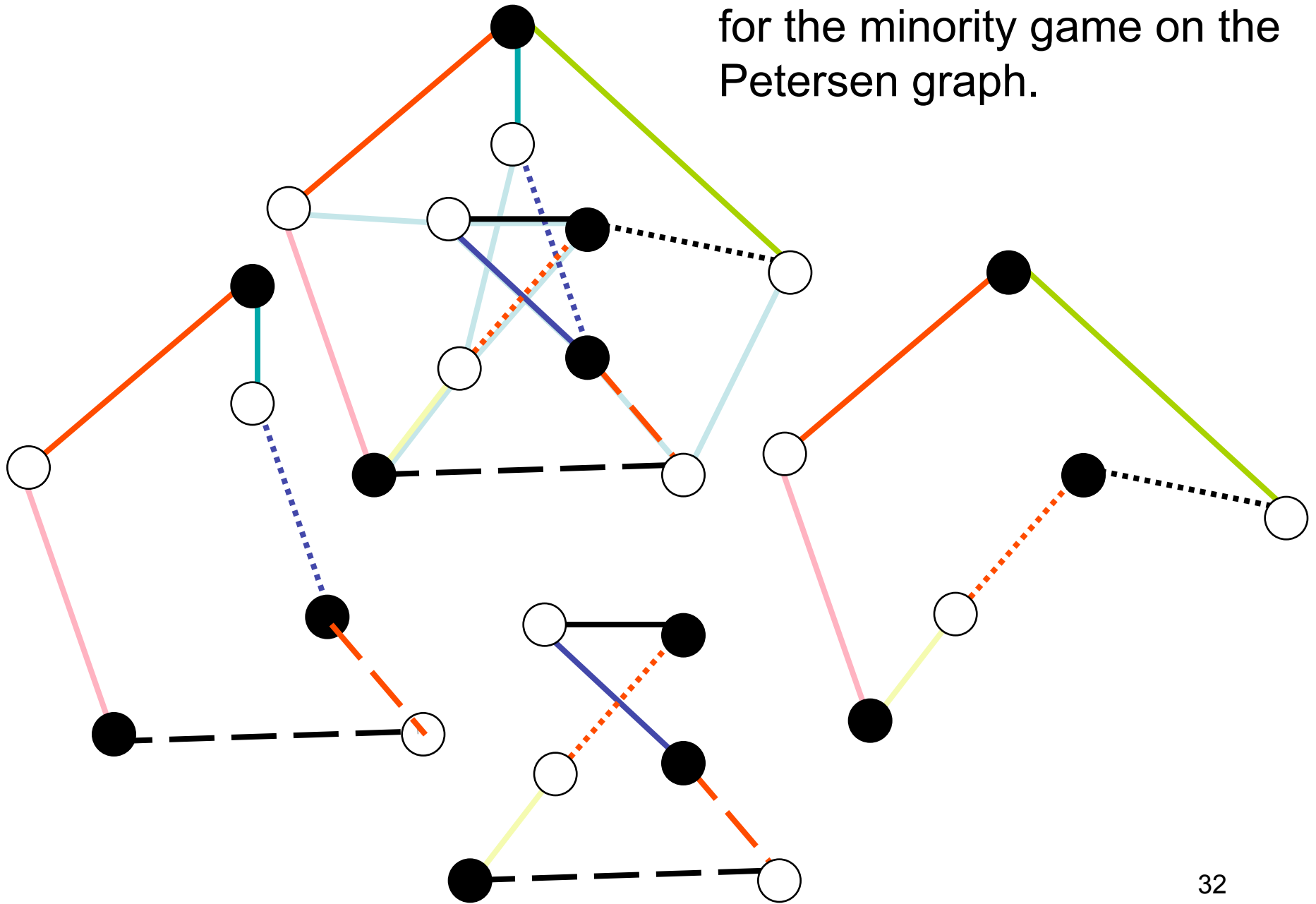
# Fixed Points of the Minority Game on Cubic Graphs.

- Much more difficult to find appropriate sets of cycle (which must be of even length), because they are not necessarily disjoint.
- Just give an example; for Petersen graph.

**5-CYL- $\{13524\}$  =  
Petersen Graph**



“Unique” form of fixed point  
for the minority game on the  
Petersen graph.





# Mixed Populations

- We now suppose that there is a mixture of  $M$  majority and  $m$  minority players in the network. Each player consistently employs a majority or a minority strategy.
- Players only observe 0/1 status of neighbours, not maj/min status.
- We shall again suppose that they are repeatedly challenged by randomly assigned initial states.

# Notation

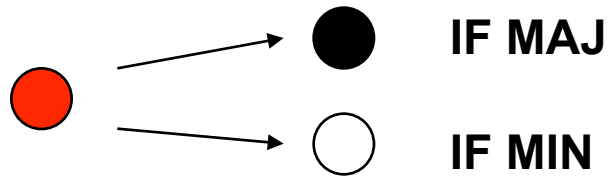
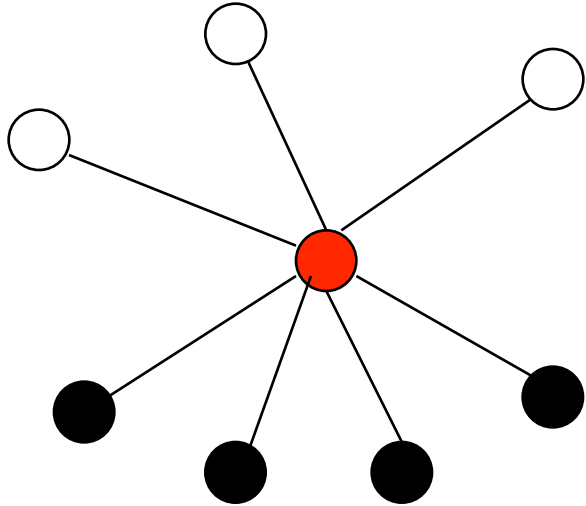
- We differentiate between the **player vector**  $\mathbf{z}$  specifying which of majority player (indicated by 1) and minority player (by 0) each vertex (fixed in each game), and
- The **state vector**  $\mathbf{x}$  specifying which of the possible plays (0 or 1) each vertex is using (changing through time).

$$F(\mathbf{x}) = \mathbf{1} - F(\mathbf{1} - \mathbf{x})$$

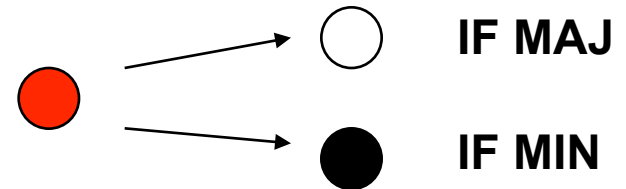
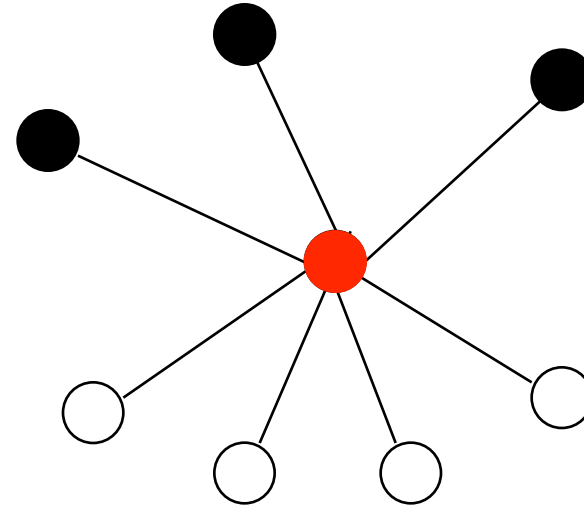
- We denote by  $F(\mathbf{z}, \mathbf{x}_t) = \mathbf{x}_{t+1}$  the successor to state vector  $\mathbf{x}_t$  when the player vector is  $\mathbf{z}$ . For ease we shall usually just use  $F(\mathbf{x}_t)$
- Now we consider the class of games on networks where  $F(\mathbf{x}) = \mathbf{1} - F(\mathbf{1} - \mathbf{x})$  which includes all cases where each individual plays as a majority, or as a minority, player (though not only these).

$$F(X) = 1 - F(1 - X)$$

**x**



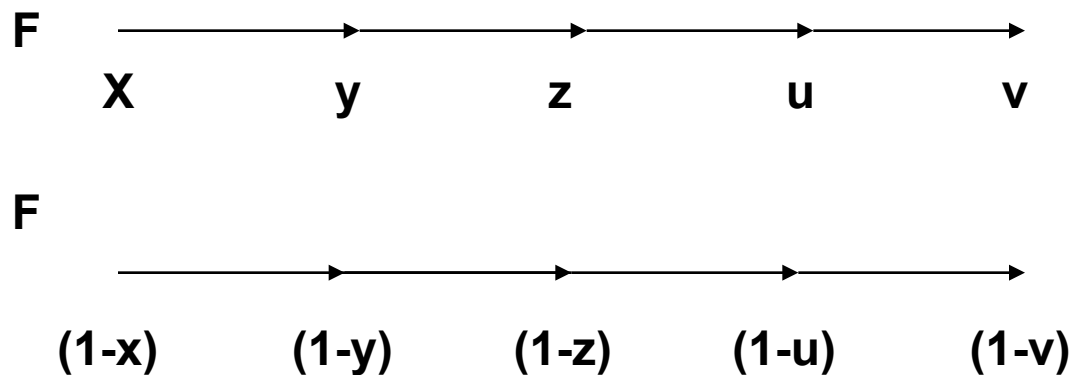
**1-x**



$$F_r(\mathbf{x}) = 1 - F_r(1 - \mathbf{x})$$

- We write  $F_r(\mathbf{x})$  for the  $r$ th iterate of  $F$  on  $\mathbf{x}$ .
- Straightforwardly (by induction) we obtain

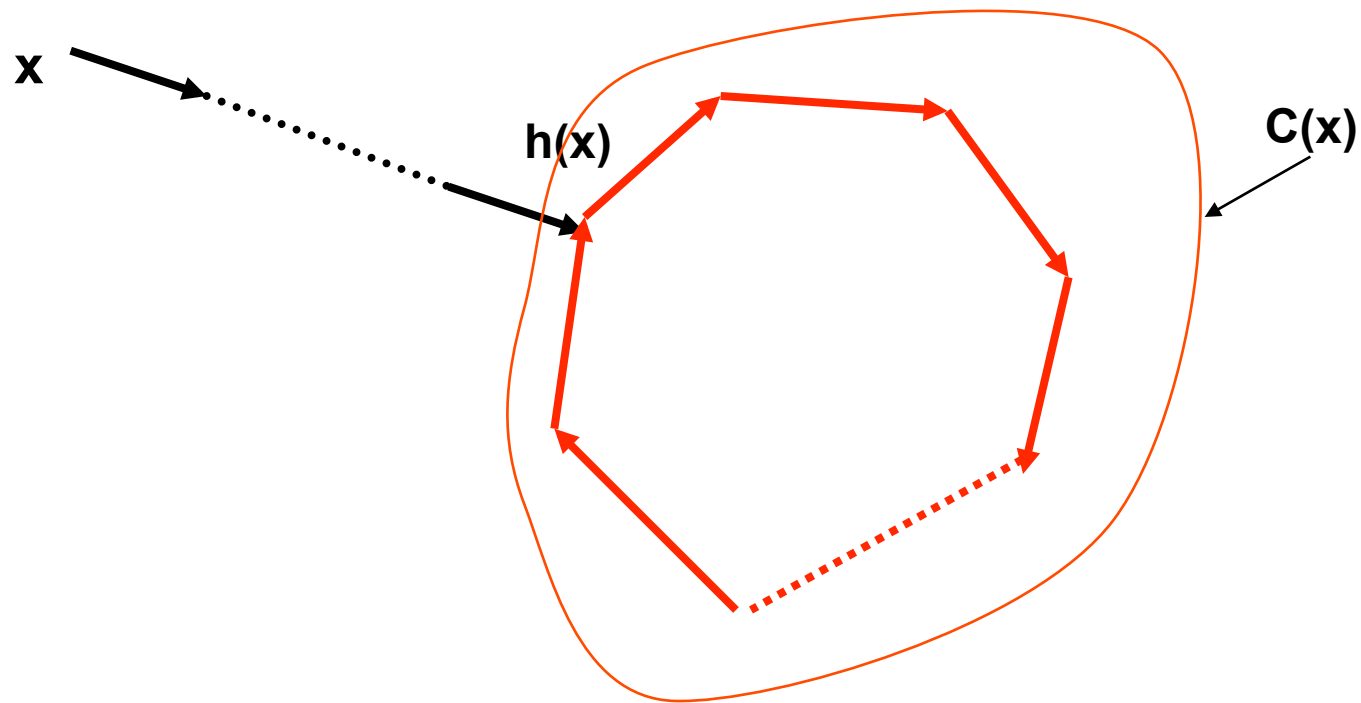
$$F_r(\mathbf{x}) = 1 - F_r(1 - \mathbf{x})$$



# Trajectories/Limits for $F$

- All trajectories reach limit cycles (since finite networks only here). For any state  $\mathbf{x}$  denote  $C(\mathbf{x})$  the set of states in the limit cycle reached from  $\mathbf{x}$ , and let  $h(\mathbf{x})$  be the first element of the sequence  $\{F_r(\mathbf{x})\}$  which belongs to  $C(\mathbf{x})$ .

# Trajectories/Limits for $F$

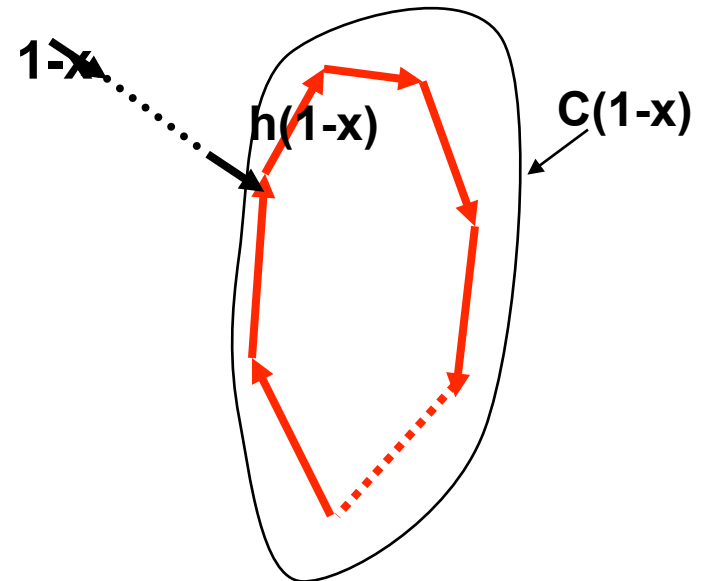
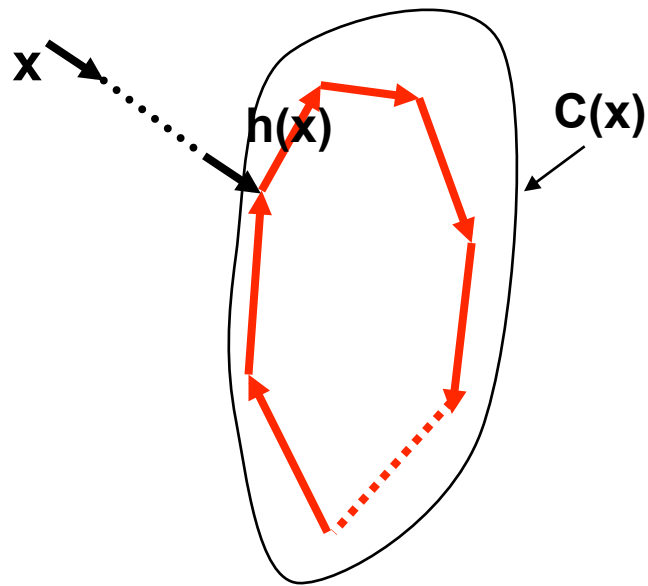


# Trajectories/Limits for F

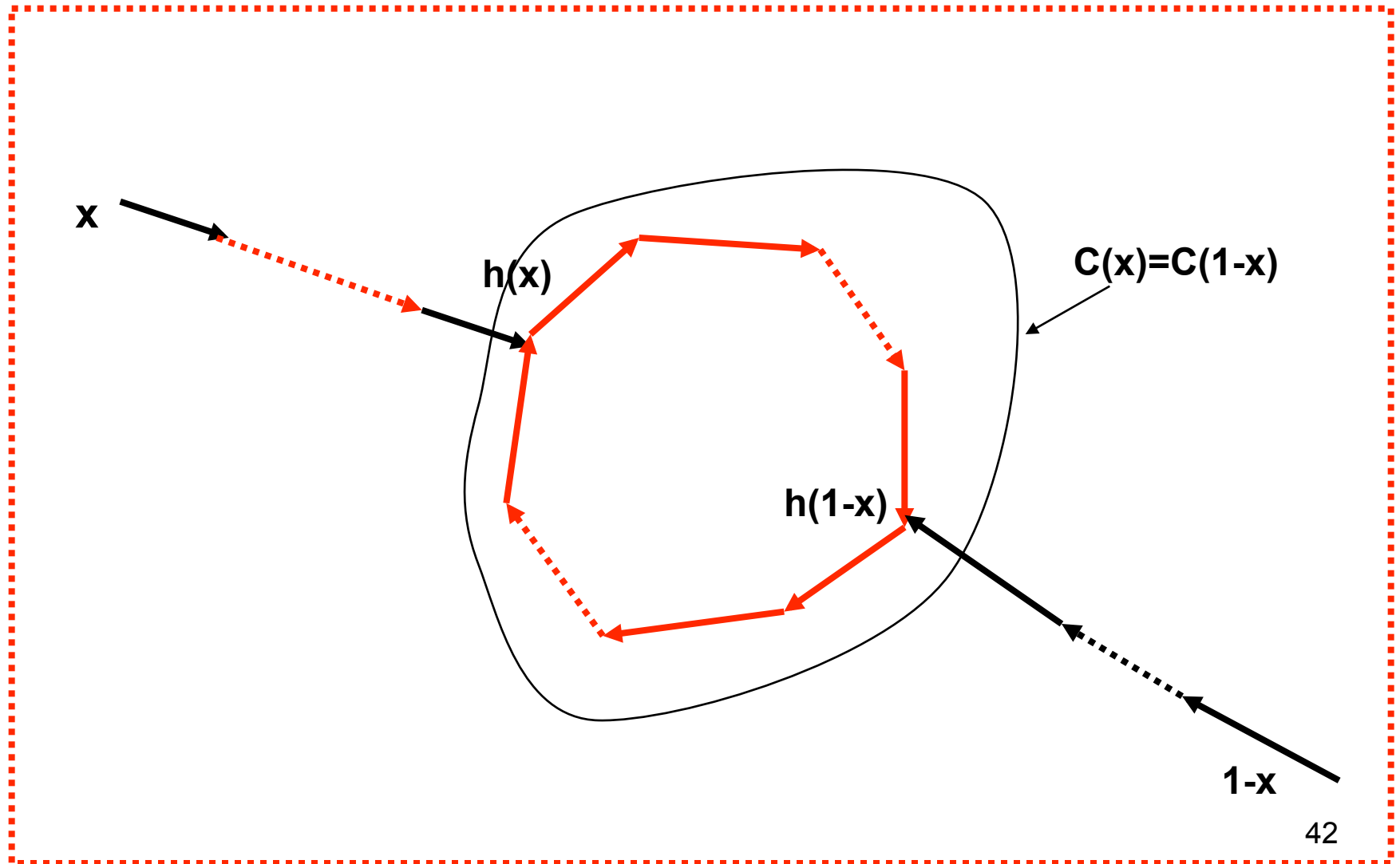
- Clearly  $h(1-x)=1-h(x)$
- Suppose  $y=h(1-x) \in C(x)$  then for some  $s$   $F_s(y)=h(x)=1-y$ , and thus  $F_s(1-y)=h(1-x)=y$  and so the cycle length is  $2s$  (i.e. even).
- If  $x$  and  $1-x$  lead to distinct cycles then these will be of the same length, which may be odd or even.



# Trajectories/Limits for $C(x) \neq C(1-x)$



# Trajs/Limits for $C(x)=C(1-x)$



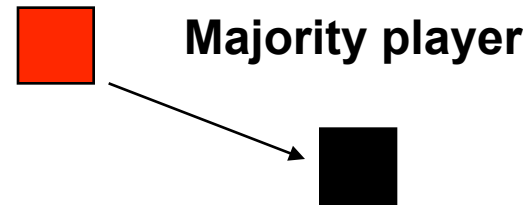
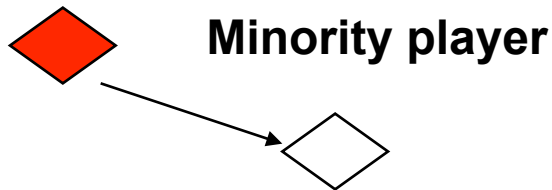
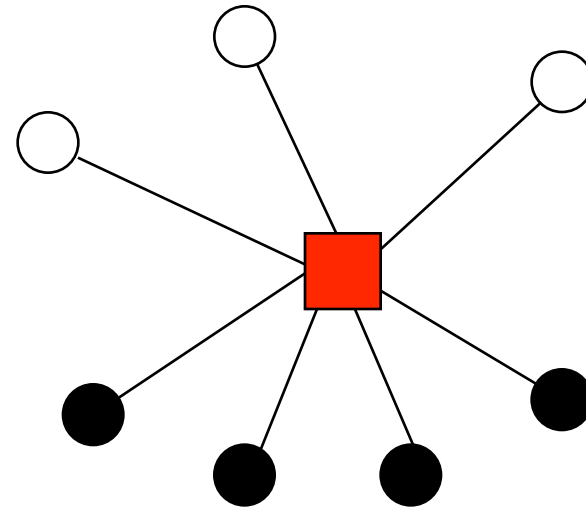
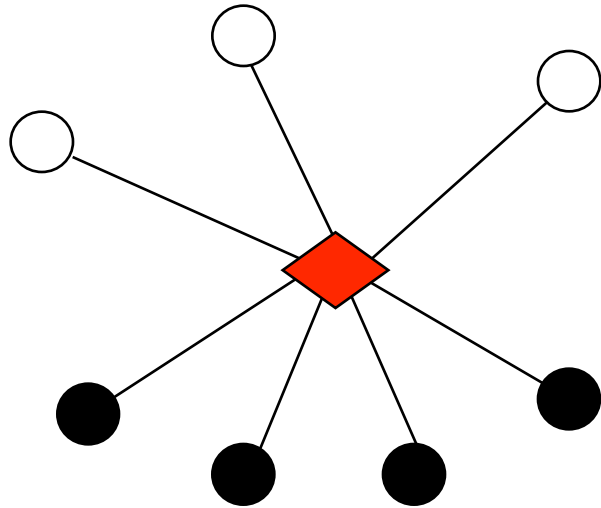
# Balance

- Every vertex in  $C(x) \cup C(1-x)$  will have states 0 and 1 with equal frequencies.

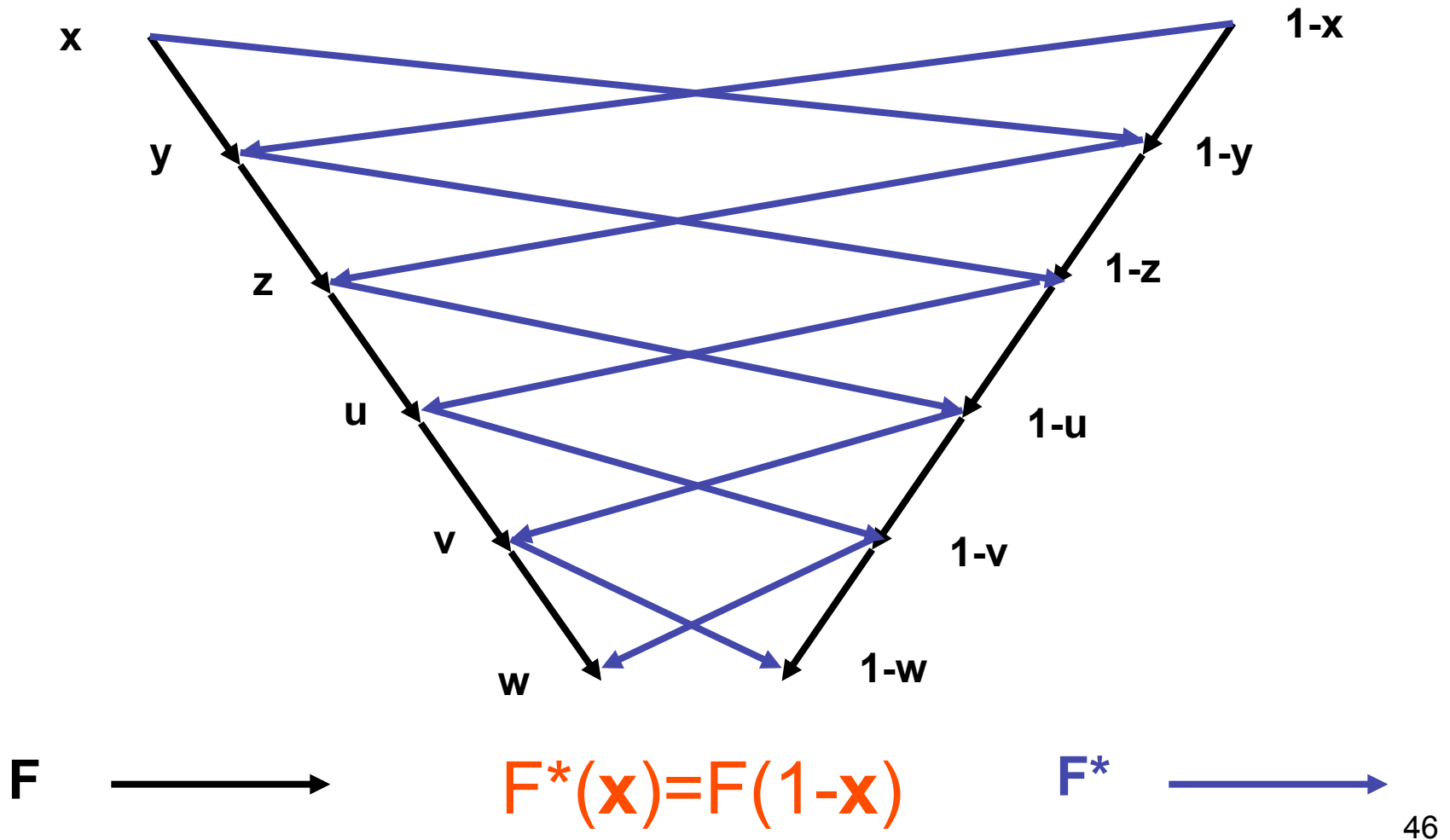
# Reversible Games

- Suppose now that we consider a **reversal** of the assignment of **majority and minority** players to the vertices, so consider  $F(\mathbf{1}-\mathbf{z}, \mathbf{x})$  which when  $\mathbf{z}$  is clear we write as  $F^*(\mathbf{x})$ .
- We term such a game reversible (it is more general than those we consider here) if  $F^*(\mathbf{x}) = \mathbf{1} - F(\mathbf{x}) = F(\mathbf{1} - \mathbf{x})$ .

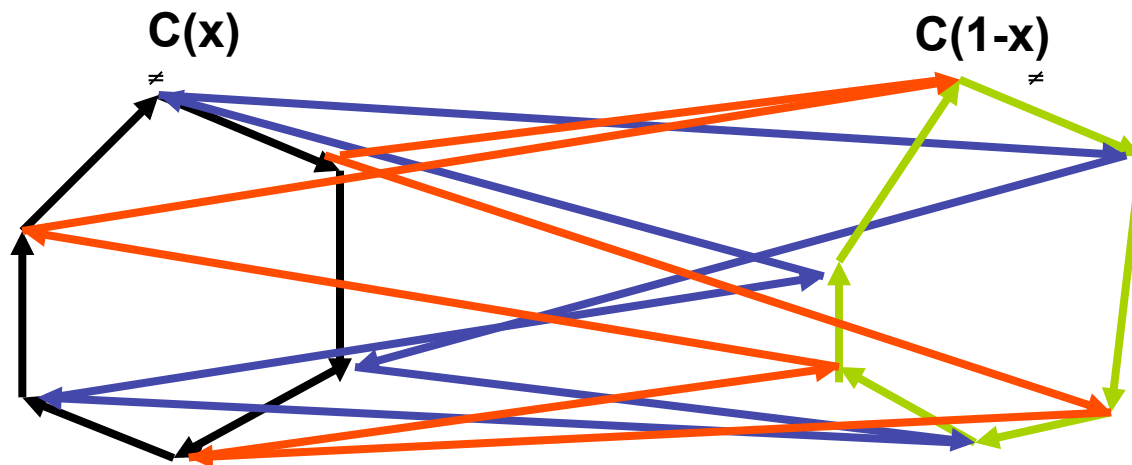
$$F^*(\mathbf{x}) = 1 - F(\mathbf{x}) = F(1 - \mathbf{x})$$



# Dynamics of Reversible Games



F:  $C(x) \neq C(1-x)$ ,  $m(\text{even})$ -cycles

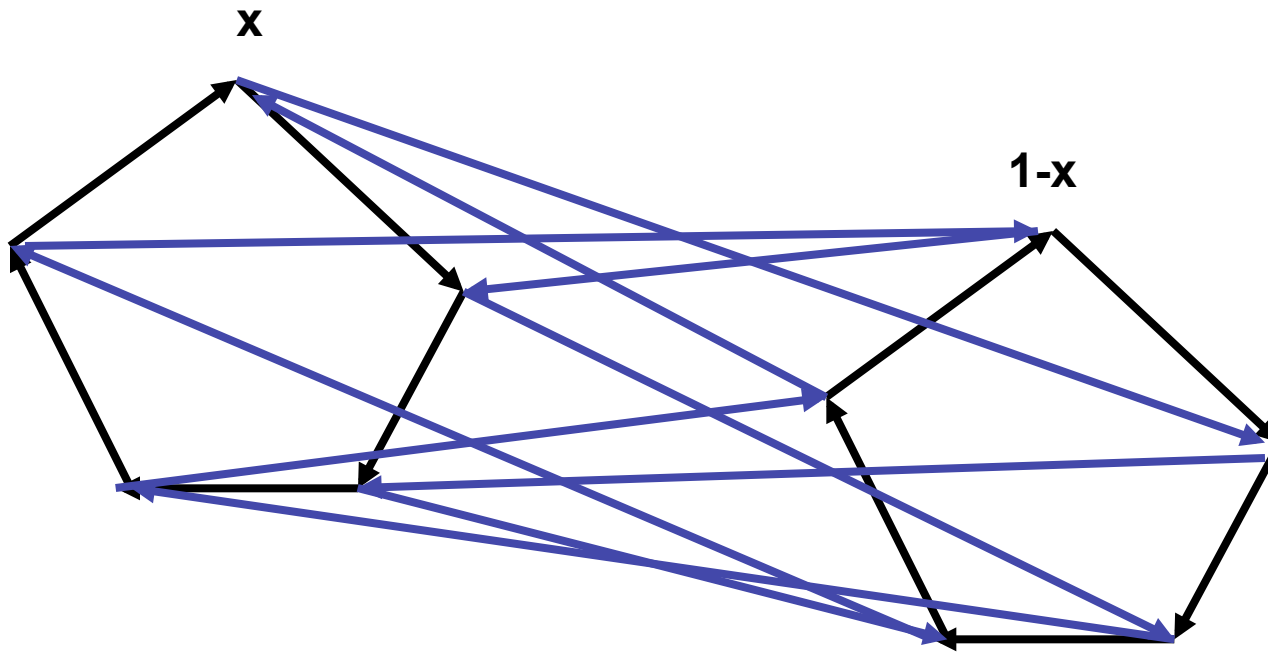


Two  $m$ -cycles arise for  $F^*$ ,

$C^*(x) \neq C^*(1-x)$



**F:  $C(x) \neq C(1-x)$ ,  $m(\text{odd})$ -cycles**



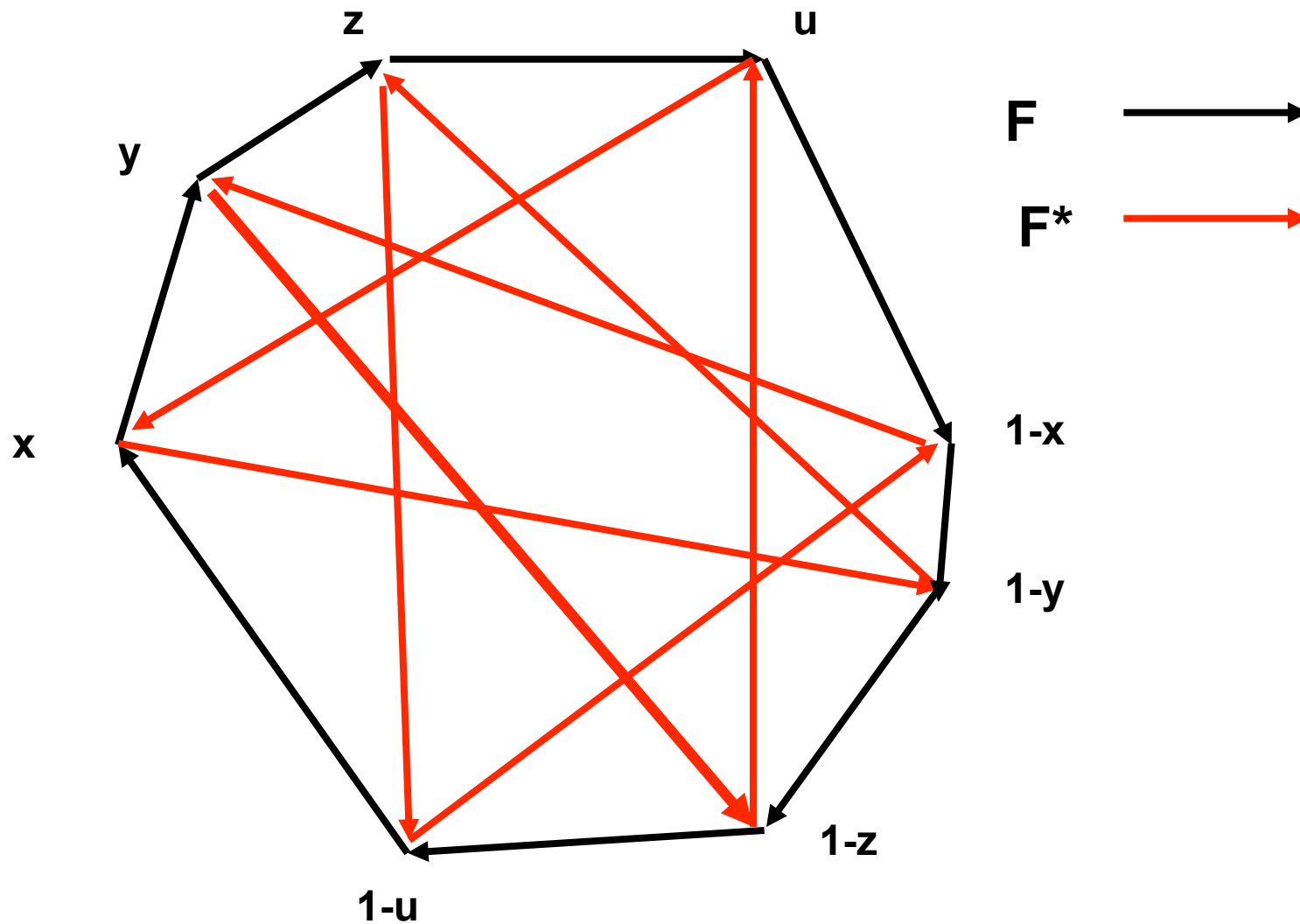
**One  $2m$ -cycle arises for  $F^*$ ,  $C^*(x)=C^*(1-x)$**

**F**  $\longrightarrow$

**F\***  $\longrightarrow$



F:  $C(x)=C(1-x)$ ,  $2m(m \text{ even})$ -cycle

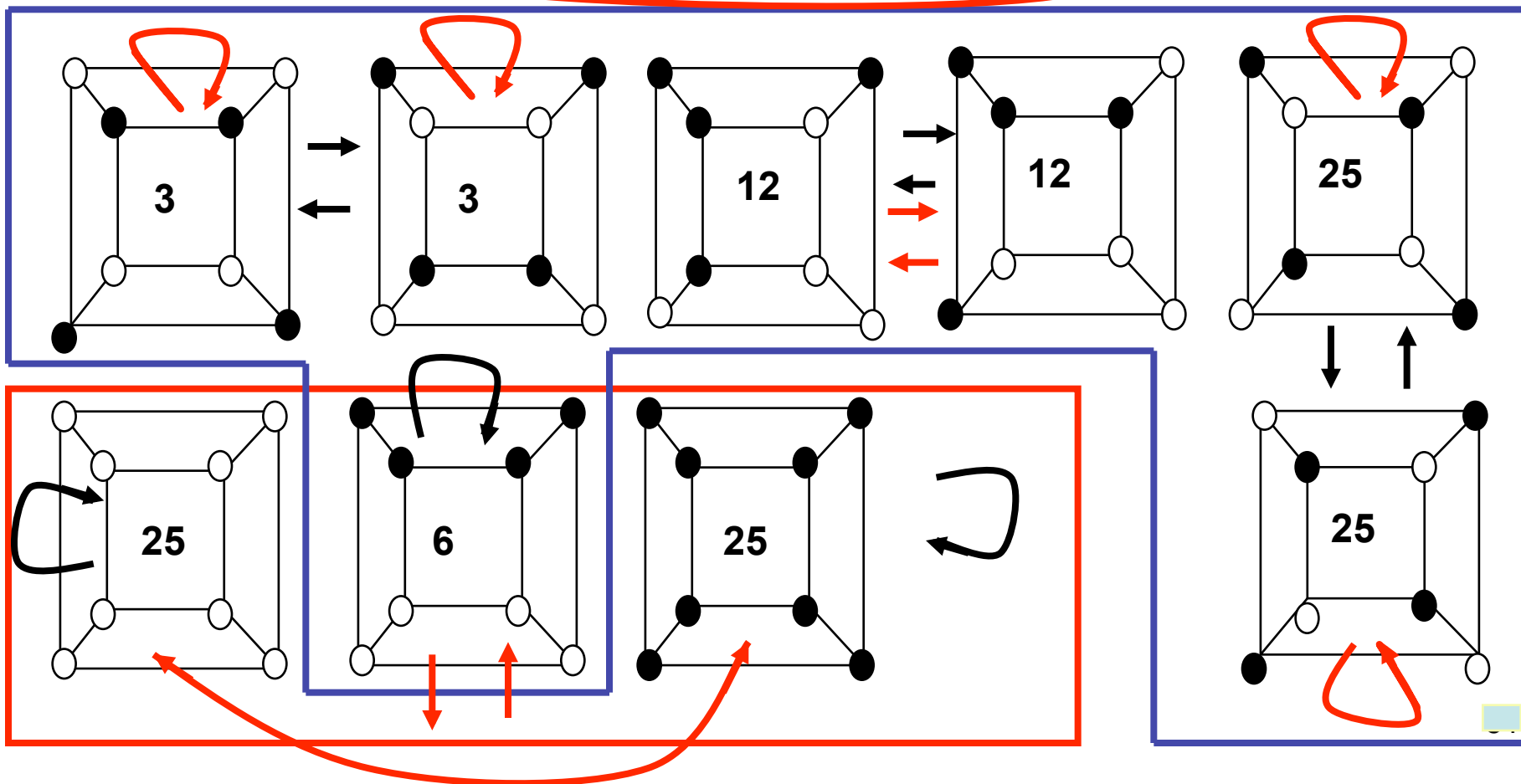
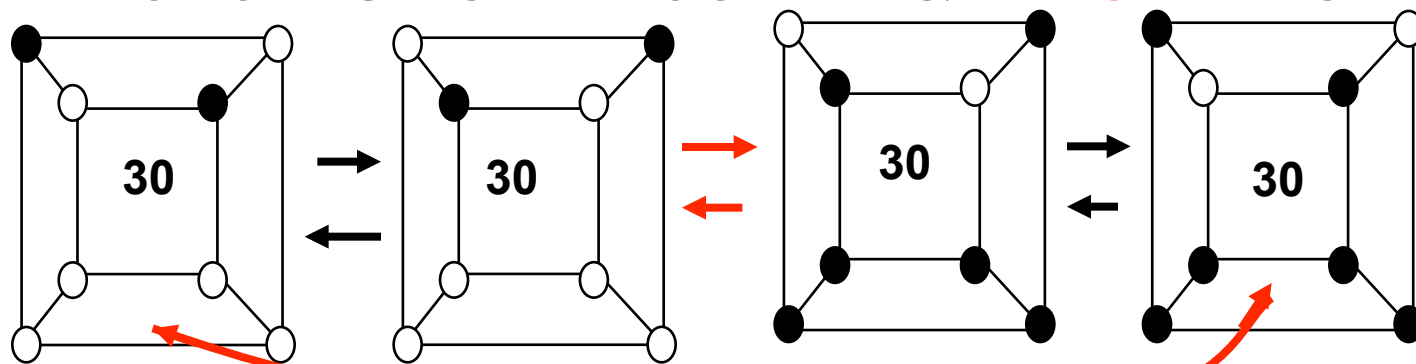


One  $2m$ -cycle arises for  $F^*$ ,  $C^*(x)=C^*(1-x)$

$$U_x\{C(x)\}=U_x\{C^*(x)\}$$

- We have demonstrated that the set of states which belong to a limit cycle for  $F$  precisely match those of  $F^*$  which belong to a limit cycle.
- The basins of attraction of  $C(x) \cup C(1-x)$  and of  $C^*(x) \cup C^*(1-x)$  are identical.

# LIMIT CYCLES FOR MAJORITY & MINORITY GAME



# Mixed Populations (Recap)

- There is a mixture of **M majority** and **m minority** vertices in the network. Each vertex **consistently** employs a majority or a minority strategy.
- Players only observe 0/1 status of neighbours, not maj/min status.
- They are repeatedly challenged by randomly assigned initial states.

# Basins of Attraction and Limit Cycles Lengths for 3-cube.

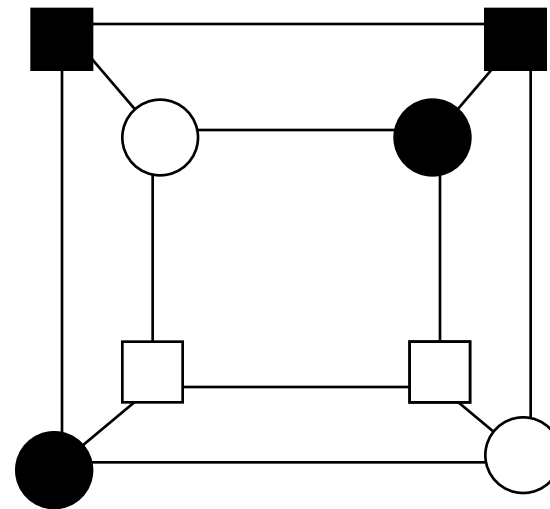
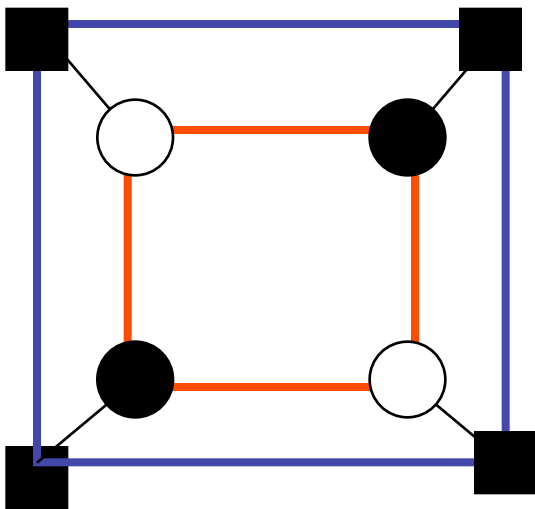
TABLE 1. Number of cycles of various lengths according to number of majority players in mixed game on 3-cube

		Cycle Length				
		1	2	4	8	Totals
M	0	56	200	0	0	256
A	1	1,024	1,024	0	0	2048
J	2	2,048	2,048	3,072	0	7,168
	3	3,072	3,072	8,192	0	14,436
I	4	144	816	10,816	6,144	17,920
N	5	3,072	3,072	8,192	0	14,436
D	6	2,048	2,048	3,072	0	7,168
'	7	1,024	1,024	0	0	2048
S	8	56	200	0	0	256
Totals		12,544	13,504	33,334	6,144	65,536

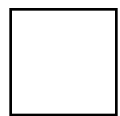
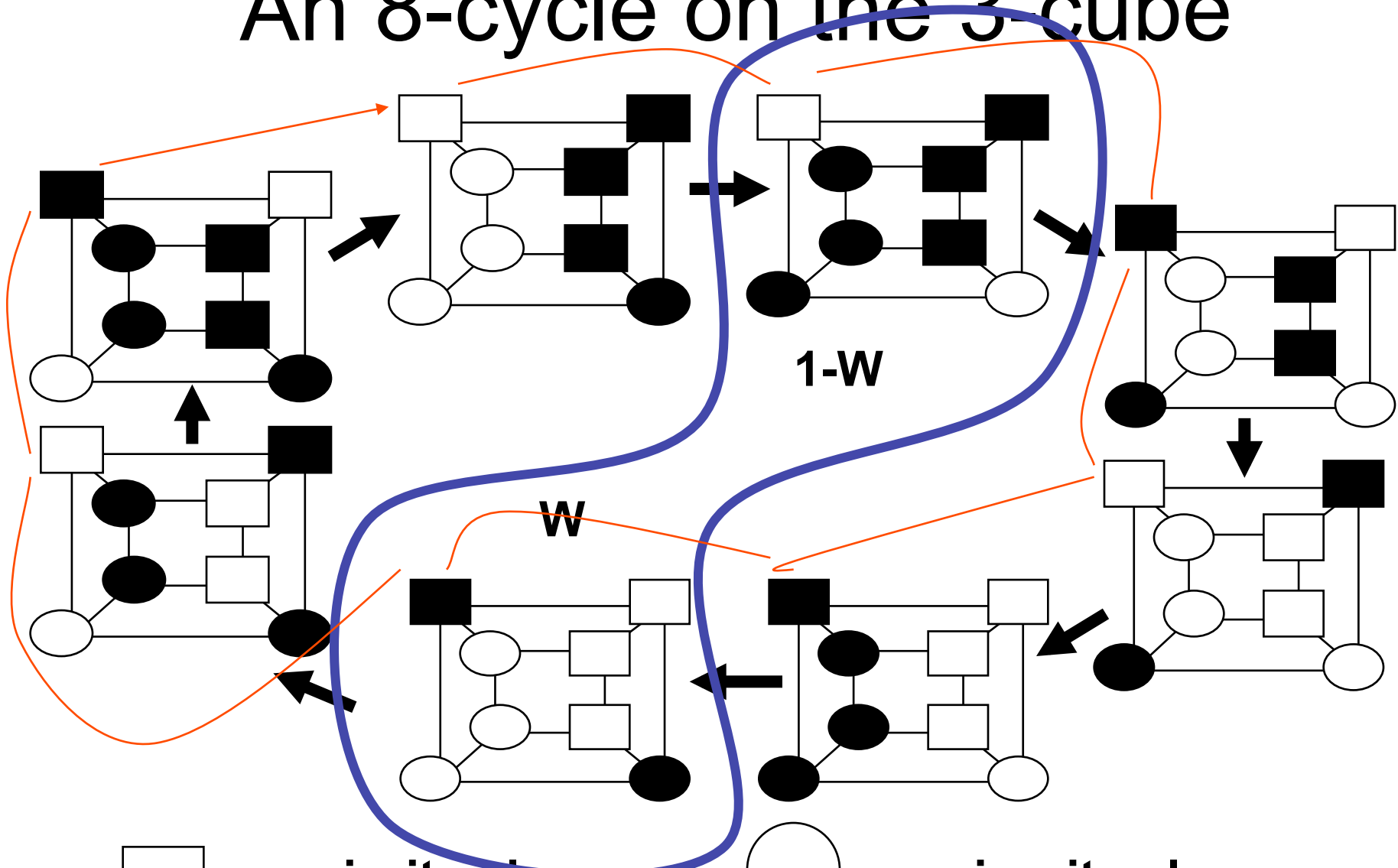
# Mixed Game on 3-cube

- Symmetric. e.g.  $M=5, m=3$  and  $M=3, m=5$  give similar distributions.
- Longer cycles when closer match of  $M$  and  $m$ .
- Not restricted to 1-cycle and 2-cycles.
- Cycle lengths are powers of two.

# Two Fixed Points for 4 Maj/4 Min on 3-cube.

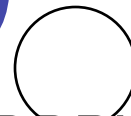


# An 8-cycle on the 3-cube



= majority player

BWWBWBBW or BBBBWWWW



= minority player



# Programme

- For a graph with  $n$  vertices there are  $2^n$  state vectors and  $2^n$  strategy vectors.
- We can thus explore the dynamics exhaustively for  $n$  small.
- It would be preferable to generate the permutationally distinct state/strategy configurations via Pólya's theorem. There are 1996 configurations on the three cube vis-à-vis  $2^{16}=65,536$ .

TABLE 1. Number of cycles of various lengths according to number of majority players in mixed game on Petersen graph

		Cycle Length				
		1	2	3	4	5
M	0	100	924	0	0	0
A	1	1,560	7,880	0	800	0
J	2	420	20,100	0	19,080	0
	3	3840	26,240	0	55,360	0
I	4	3820	7,260	28,080	135,560	0
N	5	2,400	7968	32,880	72,960	960
D	6	3,680	7,400	720	135,560	0
'	7	17,720	12,360	2640	55,360	0
S	8	20,100	420	0	19,080	0
	9	6,200	3,240	0	800	0
	10	464	560	0	0	0
	$\Sigma$	60,304	94,352	64,320	494,560	960

# Flow for Majority Game on the Petersen Graph.

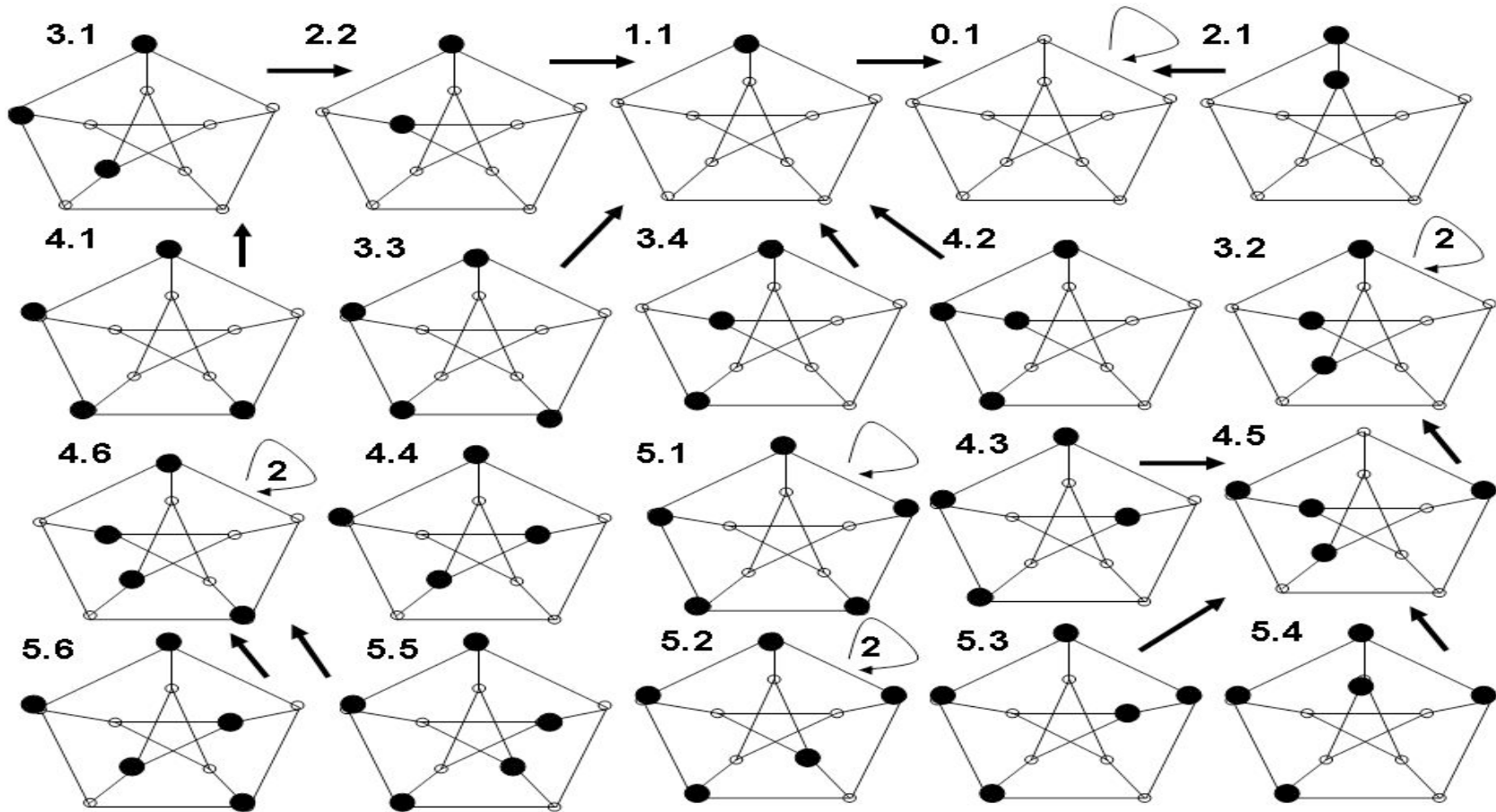


TABLE 2. Number of cycles of various lengths according to number of majority players in mixed game on Petersen graph

				Cycle	Length		
		6	8	10	16	32	Total
M	0	0	0	0	0	0	1,024
A	1	0	0	0	0	0	10,240
J	2	6,480	0	0	0	0	46,080
	3	6,720	30,720	0	0	0	122,880
I	4	36,720	2,160	0	1,440	0	215,040
N	5	85,680	19,680	960	0	34,560	258,048
D	6	64,080	2,160	0	1,440	0	215,040
'	7	4,080	30,720	0	0	0	122,880
S	8	6,480	0	0	0	0	46,080
	9	0	0	0	0	0	10,240
	10	0	0	0	0	0	1,024
	$\Sigma$	210,240	85,440	960	2,880	34,560	$2^{20}$

# General Features for Reversible Games

- $n \text{ div } 4$  then symmetric over  $M/m$  (follows from earlier discussion)
- Longest cycles for  $M=m$
- More fixed points for  $M>m$
- More 2-cycles for  $m>M$

# Dynamics on the Graphs

- Can we detect features of the graphs which tell us what limits to expect?
- Apart from  $3\text{-CYL}\{123\}$  there are no triangles so the usual clustering measures will be 0.
- We might expect the diameter, the number of symmetries, average distance to have influence.

# Dynamics on the Graphs

TABLE 1

Linked Polygon	I	II	III	IV	V	VI	VII
MD	1	3/2	11/8	17/10	87/50	81/50	3/2
OAG	12	48	16	20	4	4	120
NC	6	4	7	16	21	15	10
LC	8	8	16	28	38	24	32
NOC	1	0	1	4	6	4	2
LOC	3	0	3	9	19	9	5

Properties of the Linked Polygonal Graphs for Triangles, Rectangles and Pentagons. Key. I={1,2,3}, II={1,2,3,4}, III={1,2,4,3}, IV={1,2,3,4,5}, V={1,2,3,5,4}, VI={1,2,4,5,3}, VII={1,3,5,2,4}, MD=Mean Distance between Nodes, OAG=Order of Automorphism Group, NC=Number of Cycle Lengths, LC=Longest Cycle Length, NOC=Number of Odd ( $\geq 3$ ) Cycle Lengths, LOC=Longest Odd Cycle Length

# Payoff Matrix

- A **Majority** player receives 1 for each neighbour whose state matches his own, 0 for any that contrast.
- A **Minority** player receives 1 for each neighbour whose state contrasts with his own, 0 for any that match.



# Payoffs

- Suppose that the **players are fixed** but their **position in the graph** and **state in the various contests** it will engage in are **randomly assigned** (equal probs etc).
- We can then ask what payoffs will vertices receive. In fact we ask what payoffs will majority/minority vertices receive. Normalised so that random plays would average 1.

# Reversible Games

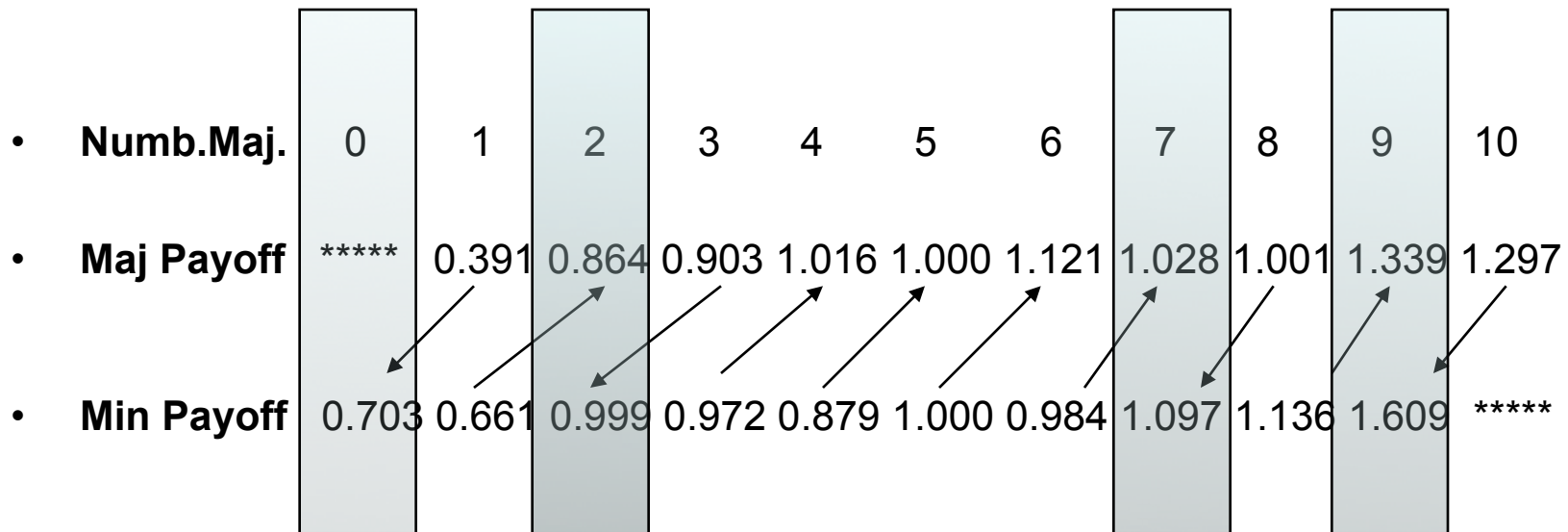
- Define  $P_F(k)$ =average (over all starting states) payoff per player when there are  $k$  majority players.
- $P_F(k)+P_{F^*}(k)=P_F(n-k)+P_{F^*}(n-k)=\text{constant}$ .
- $P_{F,M}(k)$ =average payoff to majority players when  $k$  majority players, similarly  $P_{F,m}(k)$ .
- $P_{F,M}(k)+P_{F,m}(n-k)=\text{constant}$ .

# Payoff for the 3-cube

- For the three cube  $P_{FM}(k)=1.5$  i.e. just what a random player receives.
- In fact for any bipartite graph this is true.

# Payoff to maj/min v number maj.

- Petersen = 5-cylinder{13524}



**Nash Equilibria for number of Maj/Min Players**  
**NB. Payoffs scaled so random play gives 1.000**  
**Rather than 1.500.**

# Nash Equilibria

Maj's- >	0	1	2	3	4	5	6	7	8	9	10
123											
1243											
12345											
12354											
12453											
13524											
PT											
L10											

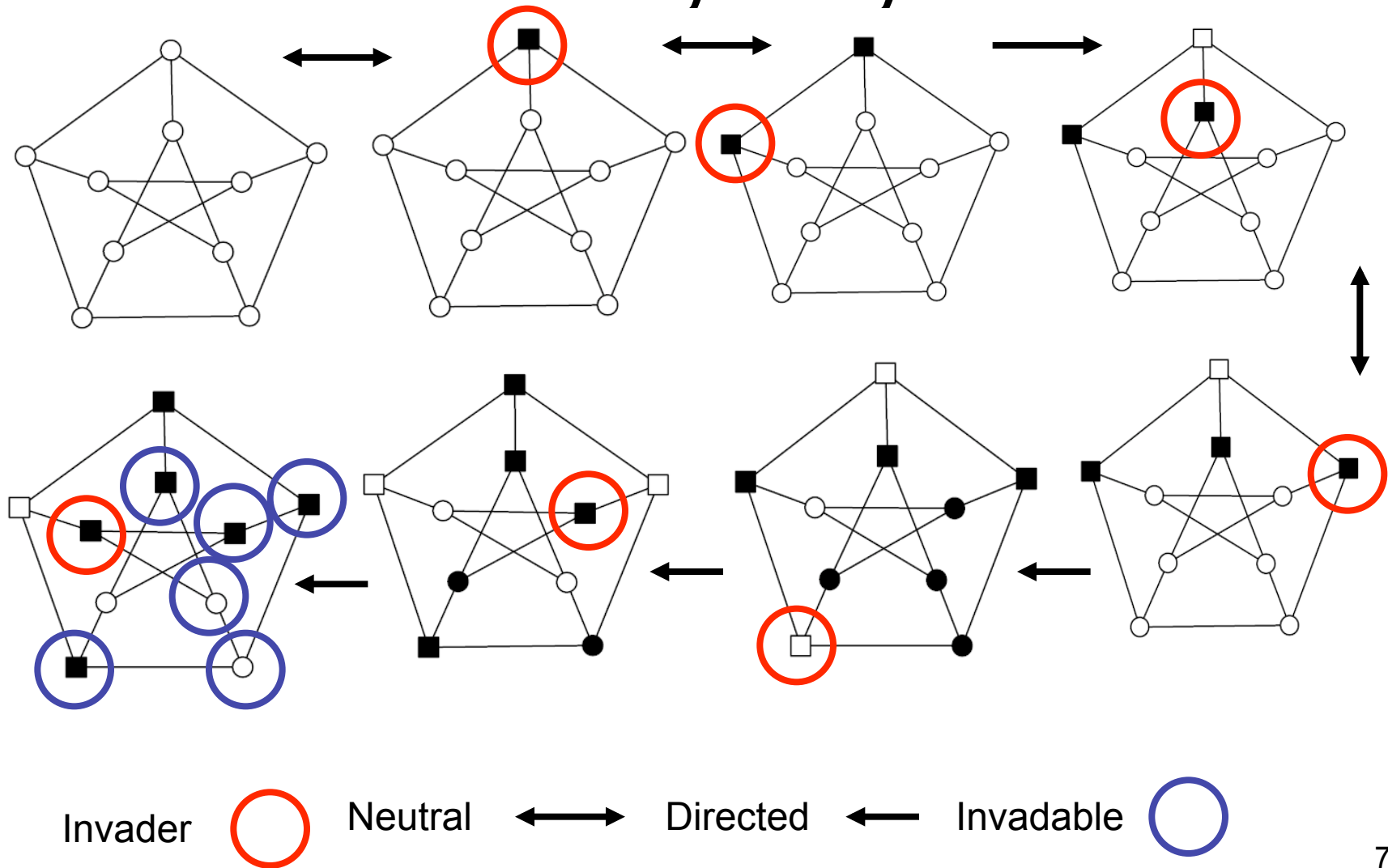
# Nash Equilibria

- All-Maj never strict Nash equilibrium.
- All-Min is strict Nash equilibrium.

# Fixed Vertex Position

- If the players have fixed positions then the above analysis is not appropriate. Nonetheless some similar results must apply. The following is a simple illustration of the possible behaviour.

# Invasion of All Majority Players by Minority Players





# Conclusions

- Long cycles may result (longest so far 58)
- Balance of Maj and Min leads to longer cycles, and smaller basin of attractions for fixed points.
- Difficult to link properties of the graph and the dynamics.
- Dynamics of the full game, i.e. where Maj and Min are also changeable is complex.

# Future Work

- Cycle partitions.
- More states.
- Higher degrees.
- Larger networks.
- Evolving networks.
- Less myopia.

***Thank you for your  
attention!***