

Constructing and computing equilibria for two-player games

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Nash equilibria of bimatrix games

$$A = \begin{array}{|c|c|} \hline 0 & 6 \\ \hline 2 & 5 \\ \hline 3 & 3 \\ \hline \end{array}$$

$$B = \begin{array}{|c|c|} \hline 2 & 1 \\ \hline 1 & 3 \\ \hline 4 & 3 \\ \hline \end{array}$$

Nash equilibrium =

pair of strategies x , y with

x best response to y and

y best response to x .

Mixed equilibria

$$A = \begin{bmatrix} 0 & 6 \\ 2 & 5 \\ 3 & 3 \end{bmatrix}$$

$$B = \begin{bmatrix} 2 & 1 \\ 1 & 3 \\ 4 & 3 \end{bmatrix}$$

$$x = \begin{bmatrix} 2/3 \\ 1/3 \\ 0 \end{bmatrix}$$

$$x^T B = \begin{bmatrix} 5/3 & 5/3 \end{bmatrix}$$

$$A y = \begin{bmatrix} 4 \\ 4 \\ 3 \end{bmatrix}$$

$$y^T = \begin{bmatrix} 1/3 & 2/3 \end{bmatrix}$$

only **pure best responses** can have probability > 0

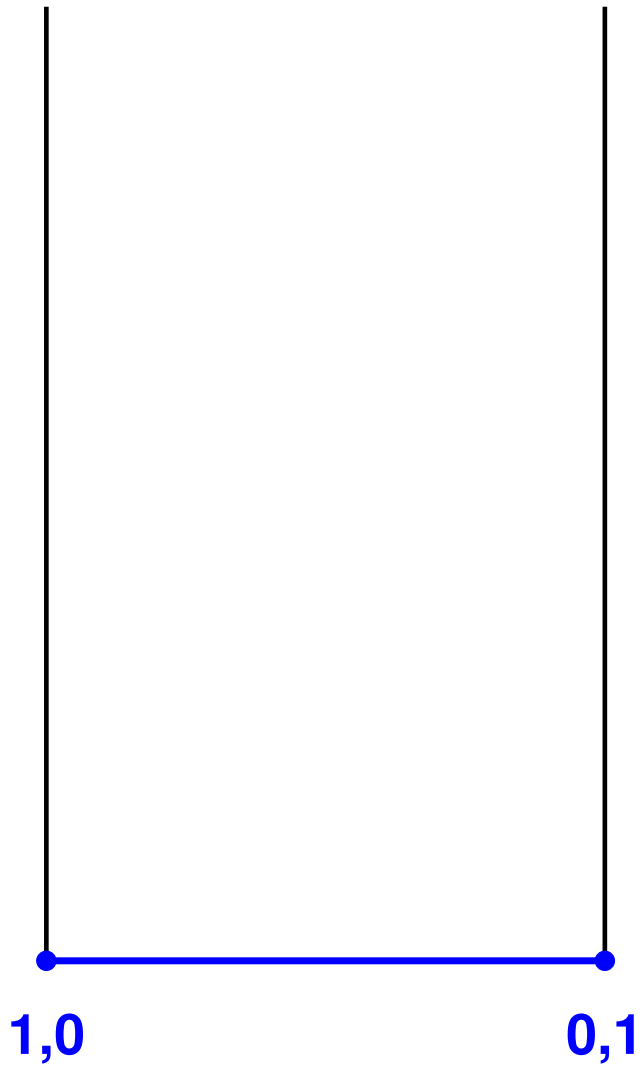
Best responses to mixed strategy of player 2

	4	5	
1	0	6	= A
2	2	5	
3	3	3	

payoffs to
player I



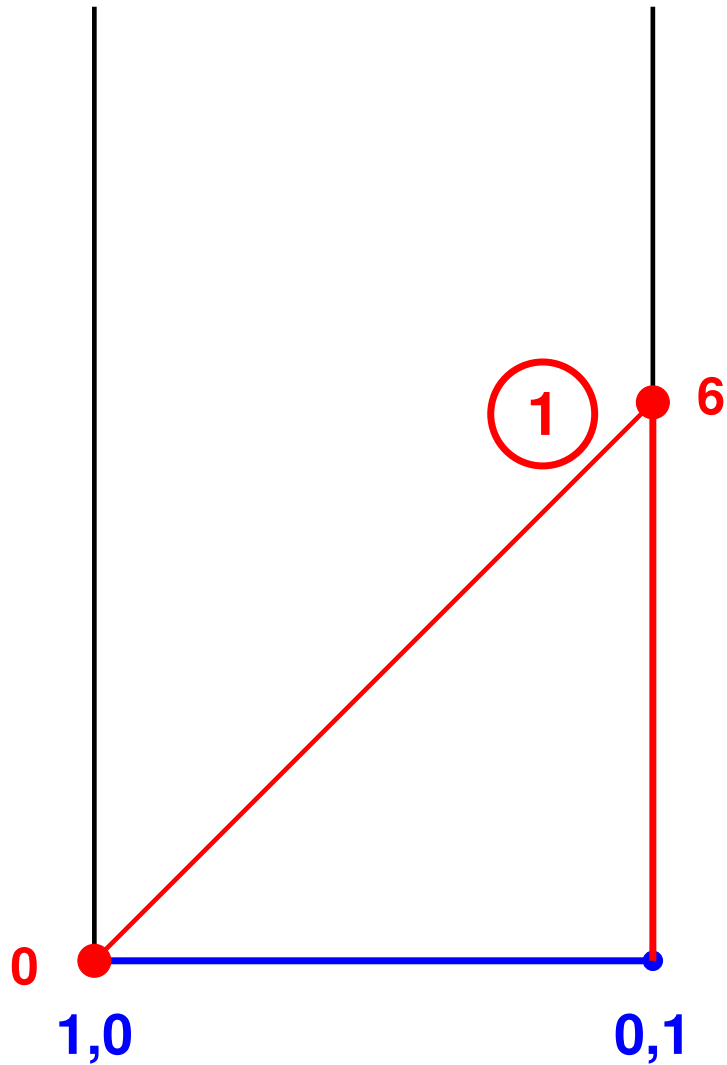
Best responses to mixed strategy of player 2



	4	5	
1	0	6	= A
2	2	5	
3	3	3	

payoffs to
player 1

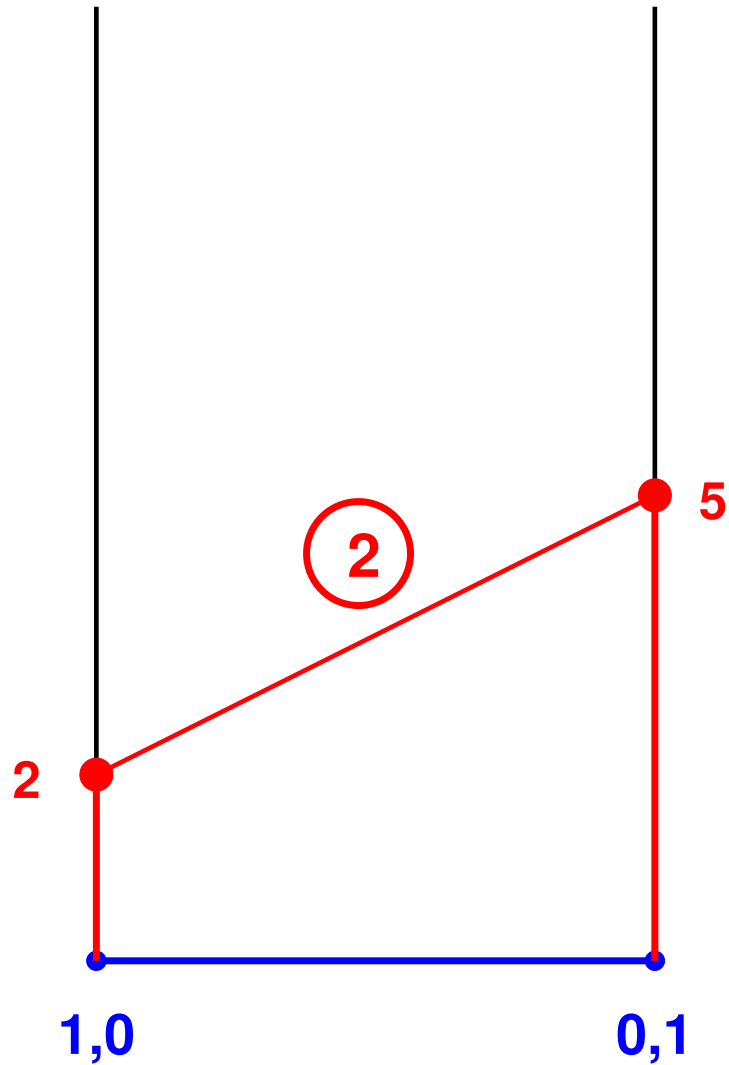
Best responses to mixed strategy of player 2



	4	5	
1	0	6	
2	2	5	= A
3	3	3	

payoffs to
player 1

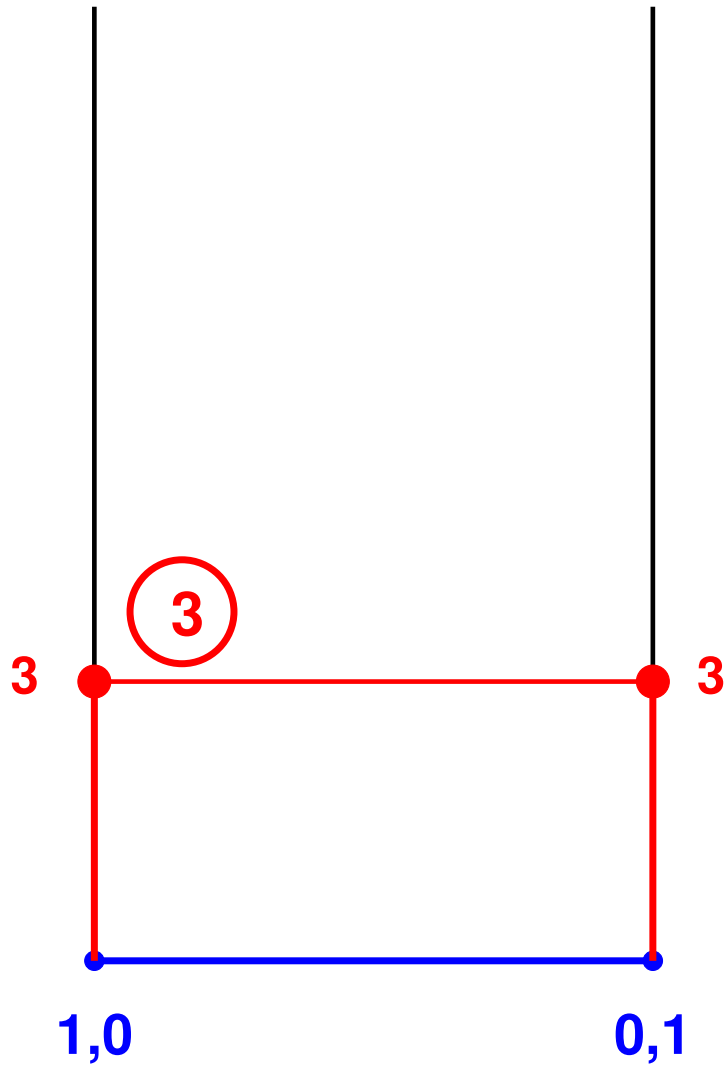
Best responses to mixed strategy of player 2



	4	5	
1	0	6	
2	2	5	= A
3	3	3	

payoffs to
player I

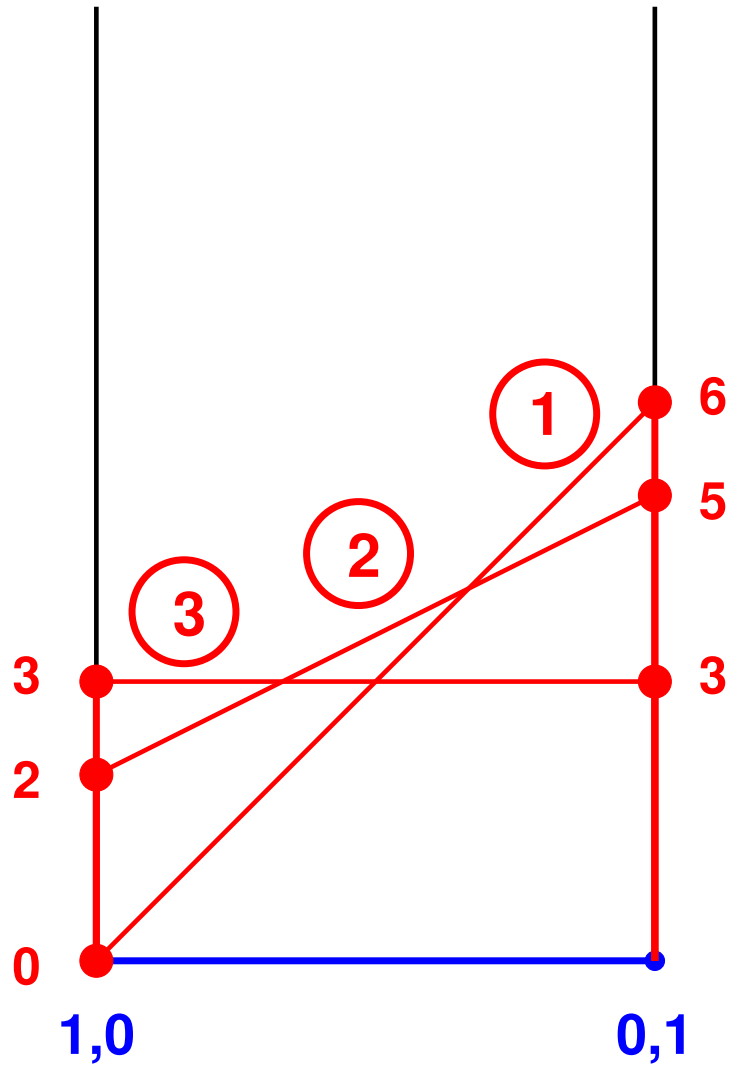
Best responses to mixed strategy of player 2



	4	5	
1	0	6	
2	2	5	= A
3	3	3	

payoffs to
player I

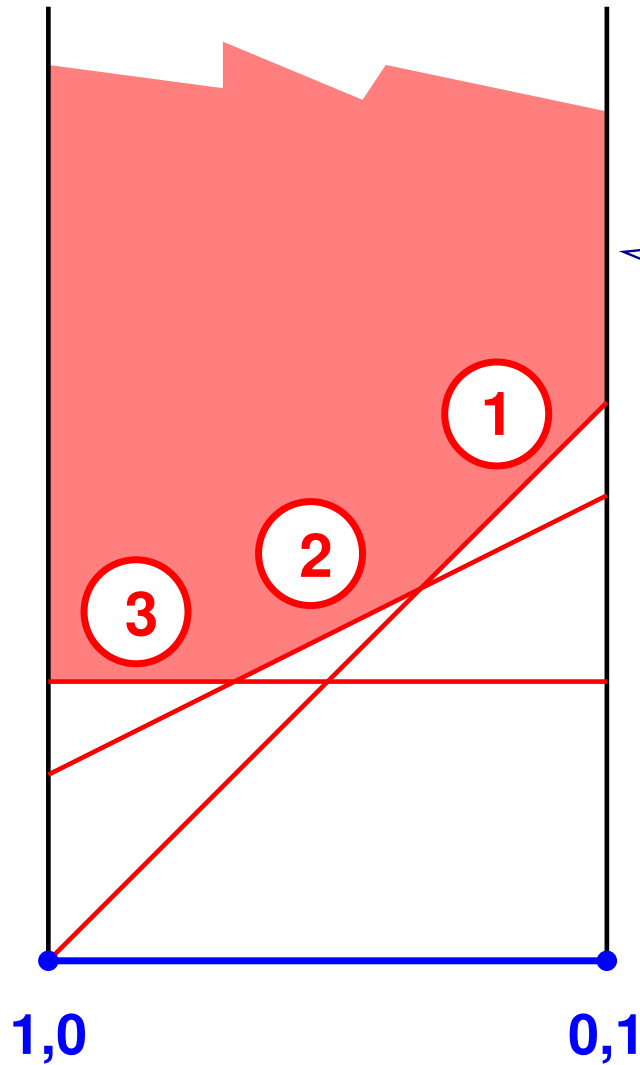
Best responses to mixed strategy of player 2



	4	5	
1	0	6	= A
2	2	5	
3	3	3	

payoffs to
player I

Best responses to mixed strategy of player 2

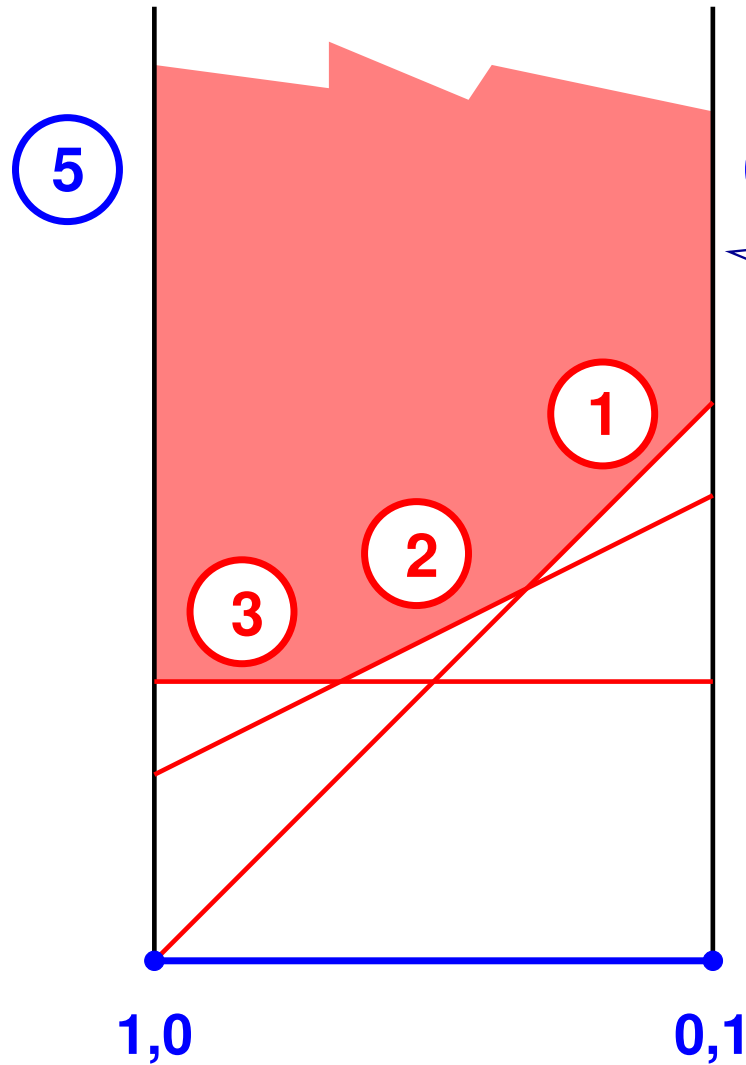


	(4)	(5)	
(1)	0	6	= A
(2)	2	5	
(3)	3	3	

payoffs to
player I

best response polyhedron

Best responses to mixed strategy of player 2

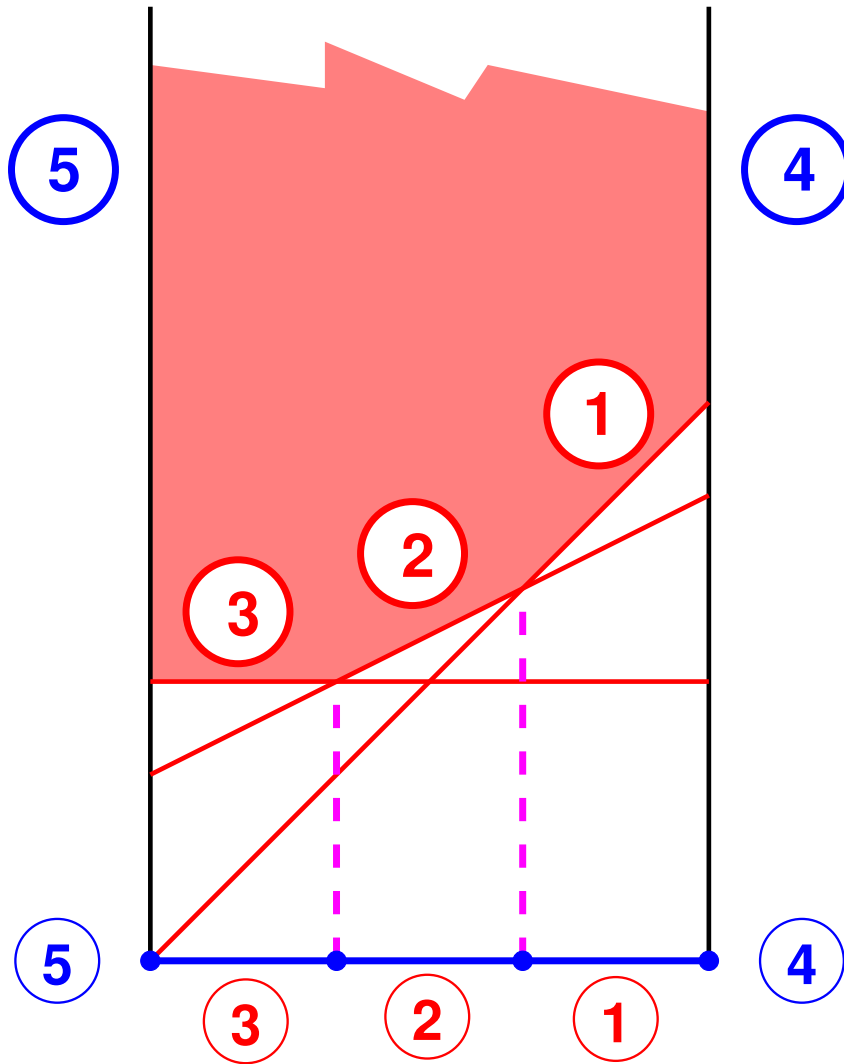


	(4)	(5)	
(1)	0	6	= A
(2)	2	5	
(3)	3	3	

payoffs to player I

best response polyhedron with facet labels

Best responses to mixed strategy of player 2



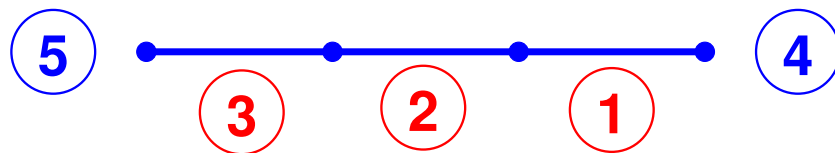
	(4)	(5)	
(1)	0	6	= A
(2)	2	5	
(3)	3	3	

payoffs to
player 1

Best responses to mixed strategy of player 2

	4	5	
1	0	6	= A
2	2	5	
3	3	3	

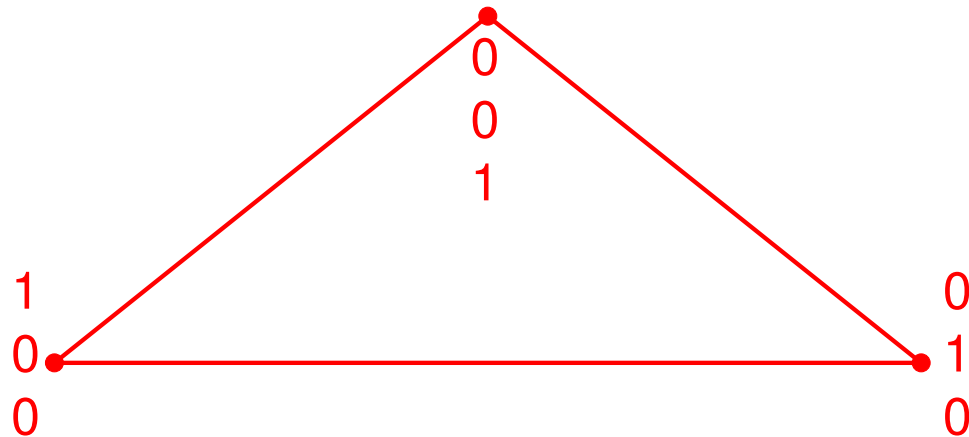
payoffs to
player I



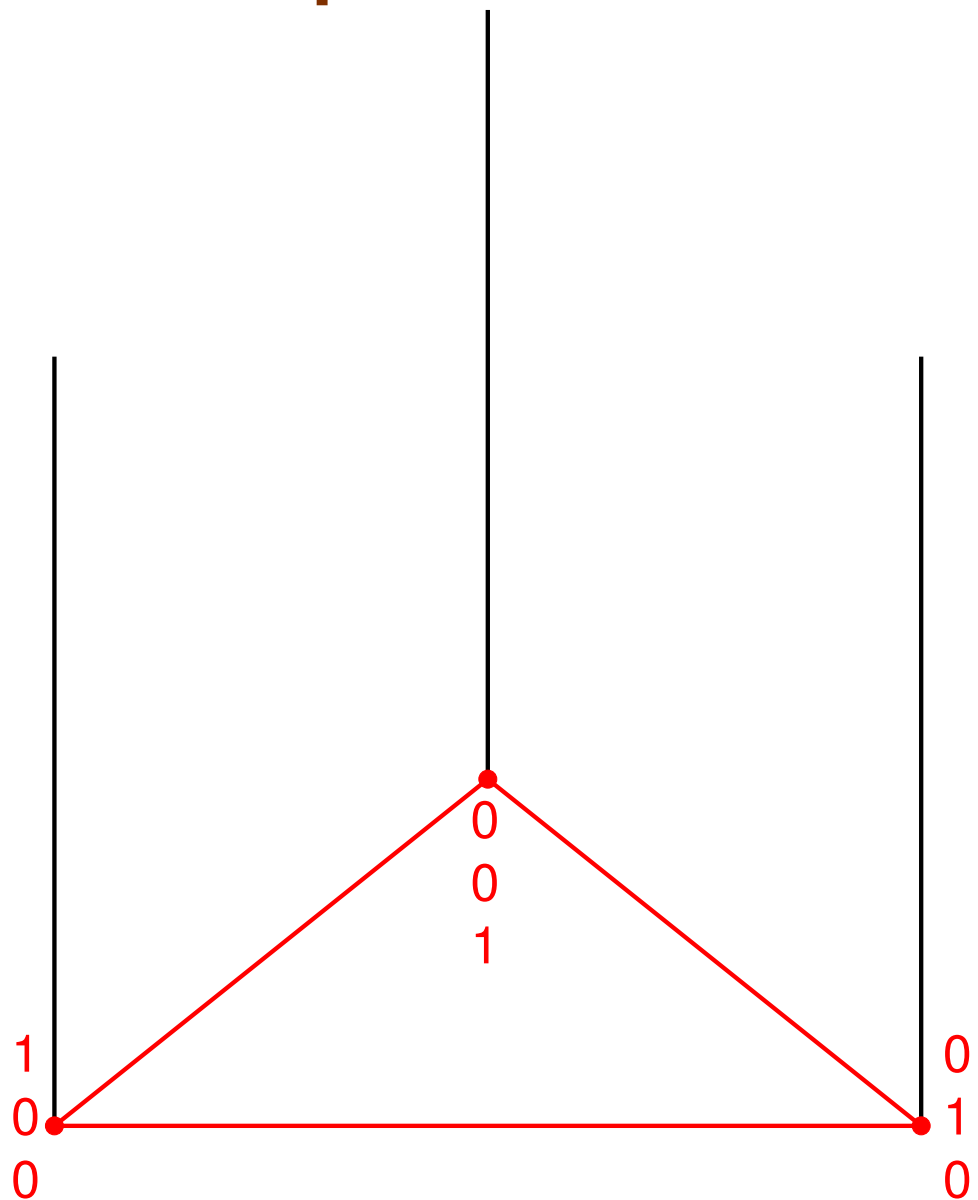
Best responses to mixed strategy of player 1

	4	5	
1	2	1	= B
2	1	3	
3	4	3	

payoffs to
player II



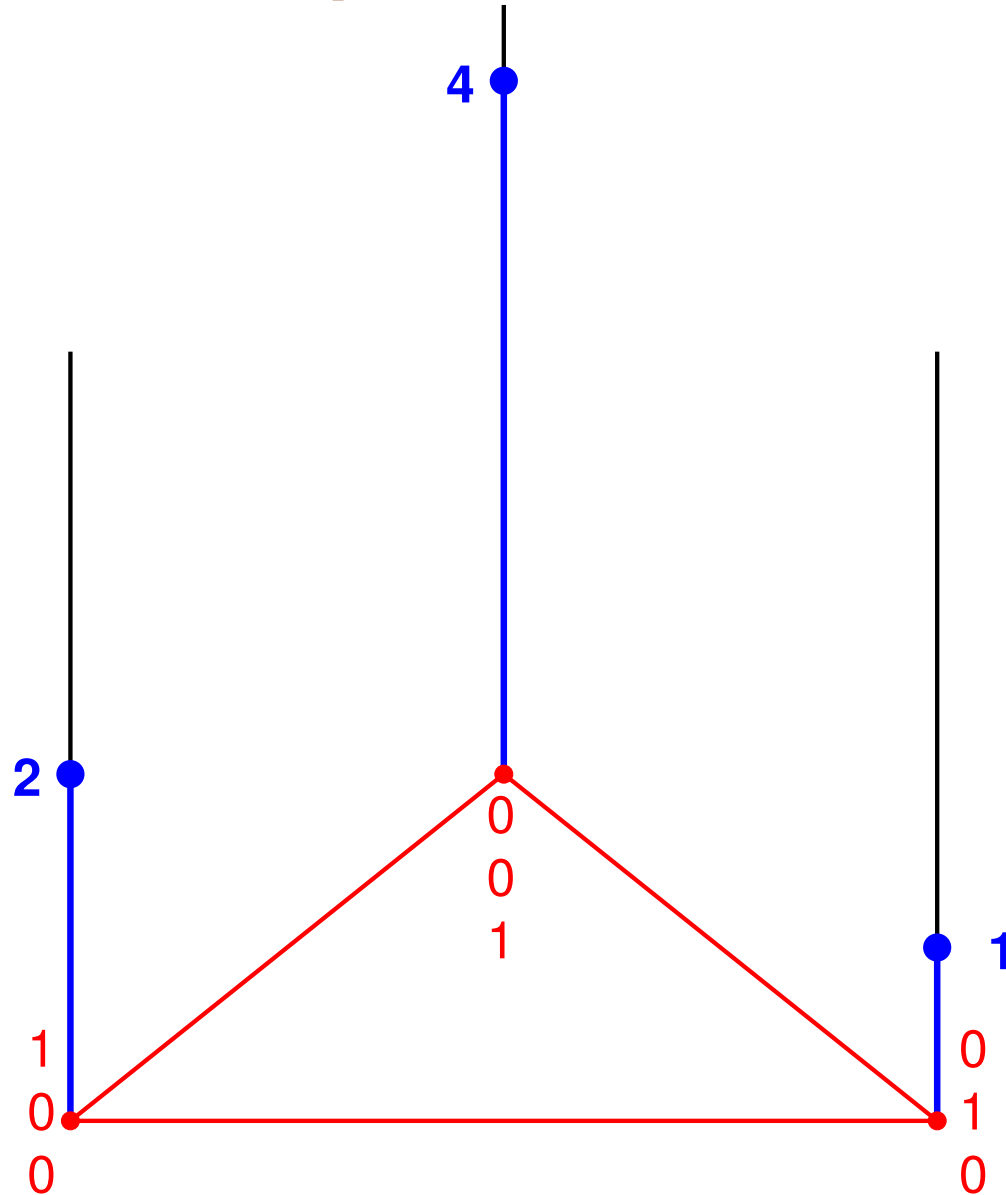
Best responses to mixed strategy of player 1



	(4)	(5)	
(1)	2	1	
(2)	1	3	= B
(3)	4	3	

payoffs to
player II

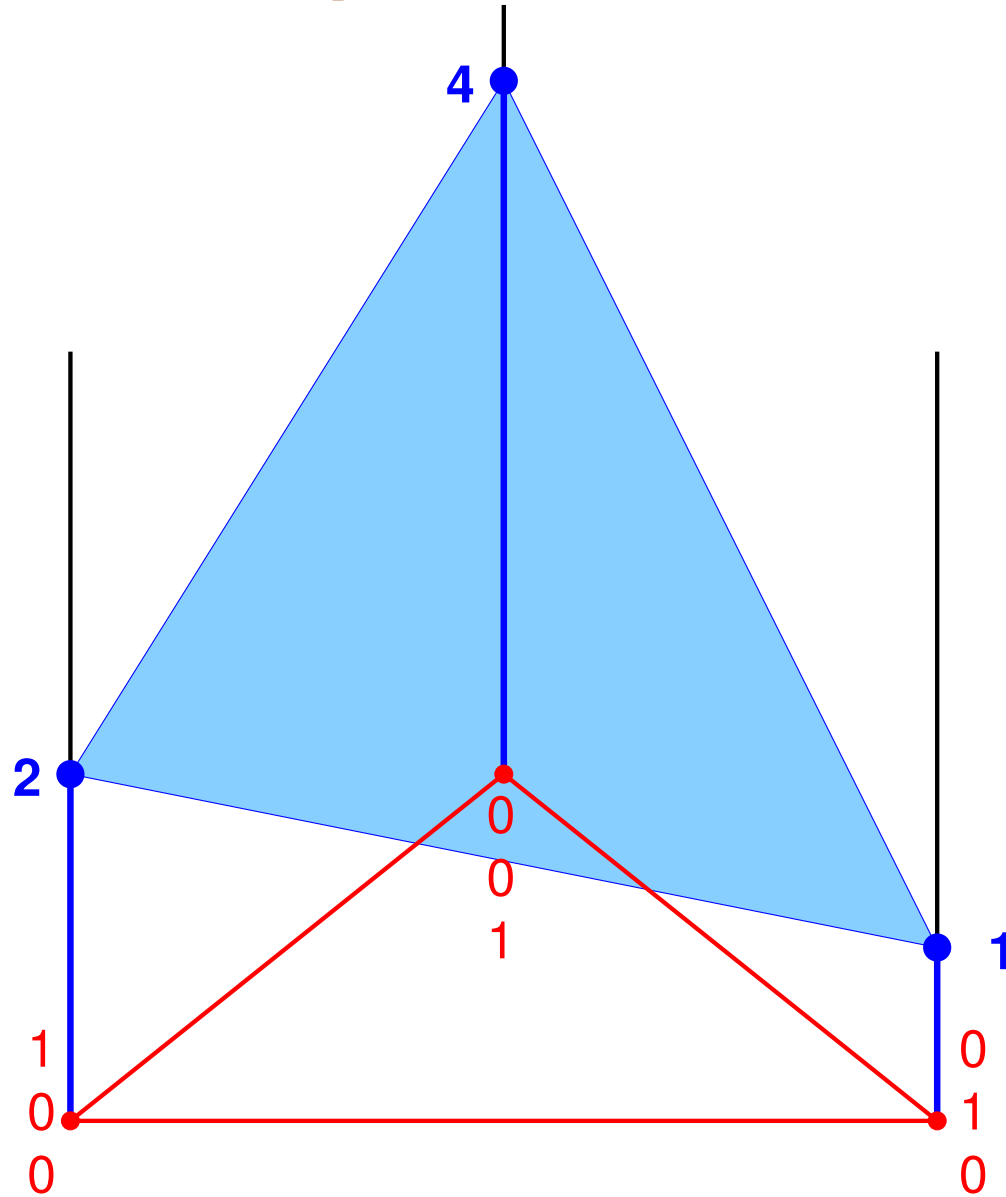
Best responses to mixed strategy of player 1



	4	5	
1	2	1	= B
2	1	3	
3	4	3	

payoffs to
player II

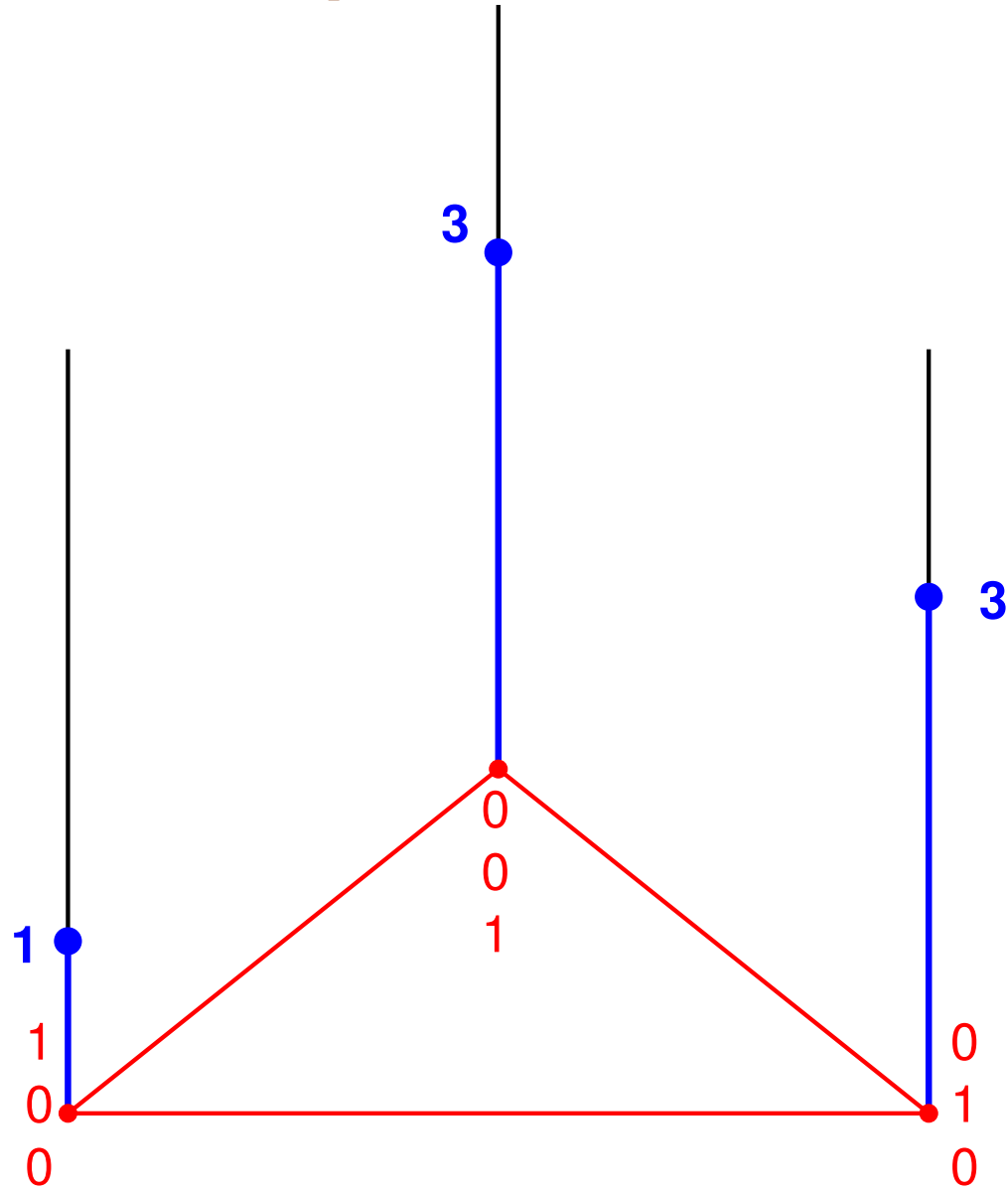
Best responses to mixed strategy of player 1



	4	5	
1	2	1	= B
2	1	3	
3	4	3	

payoffs to
player II

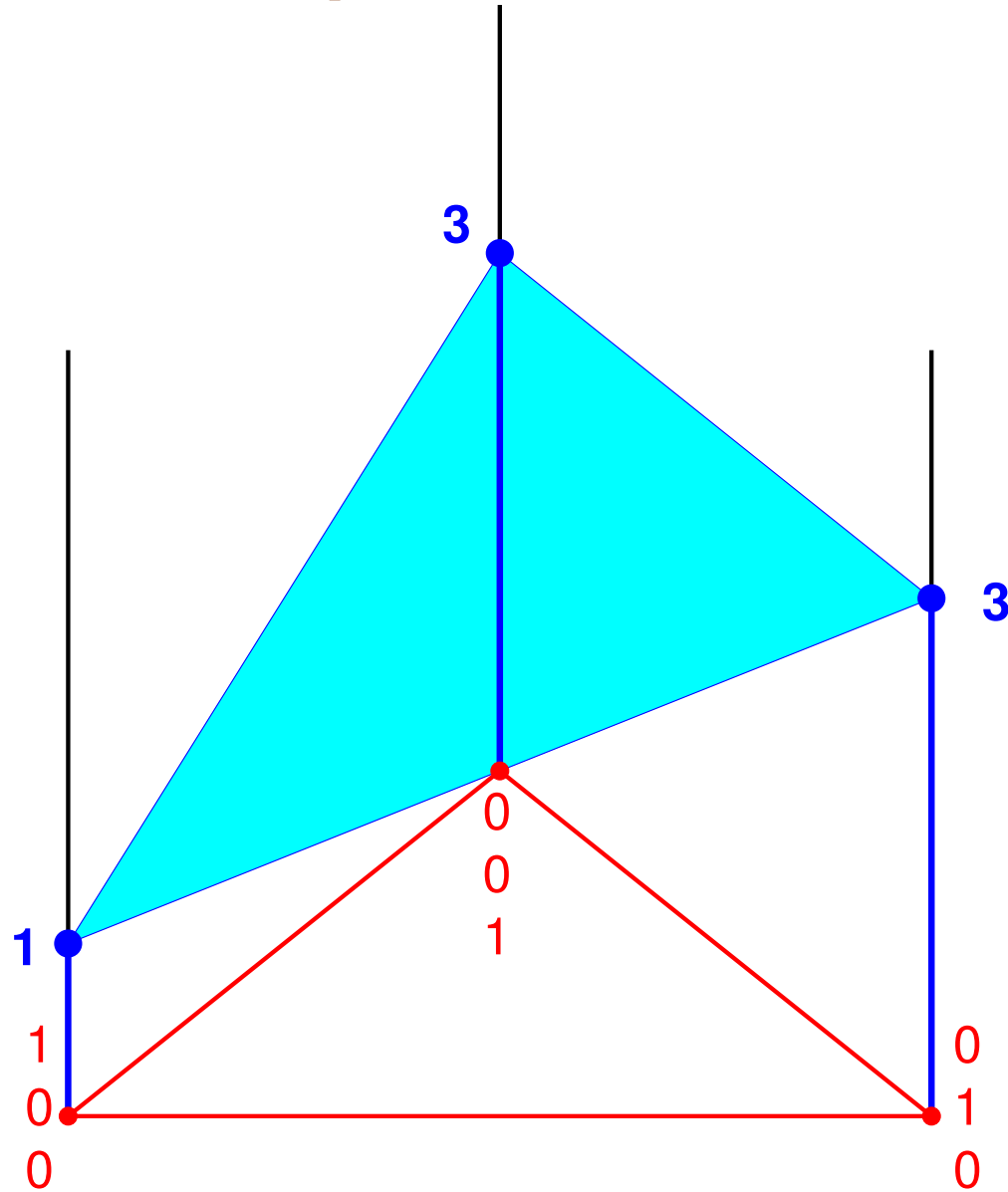
Best responses to mixed strategy of player 1



	4	5	
1	2	1	= B
2	1	3	
3	4	3	

payoffs to
player II

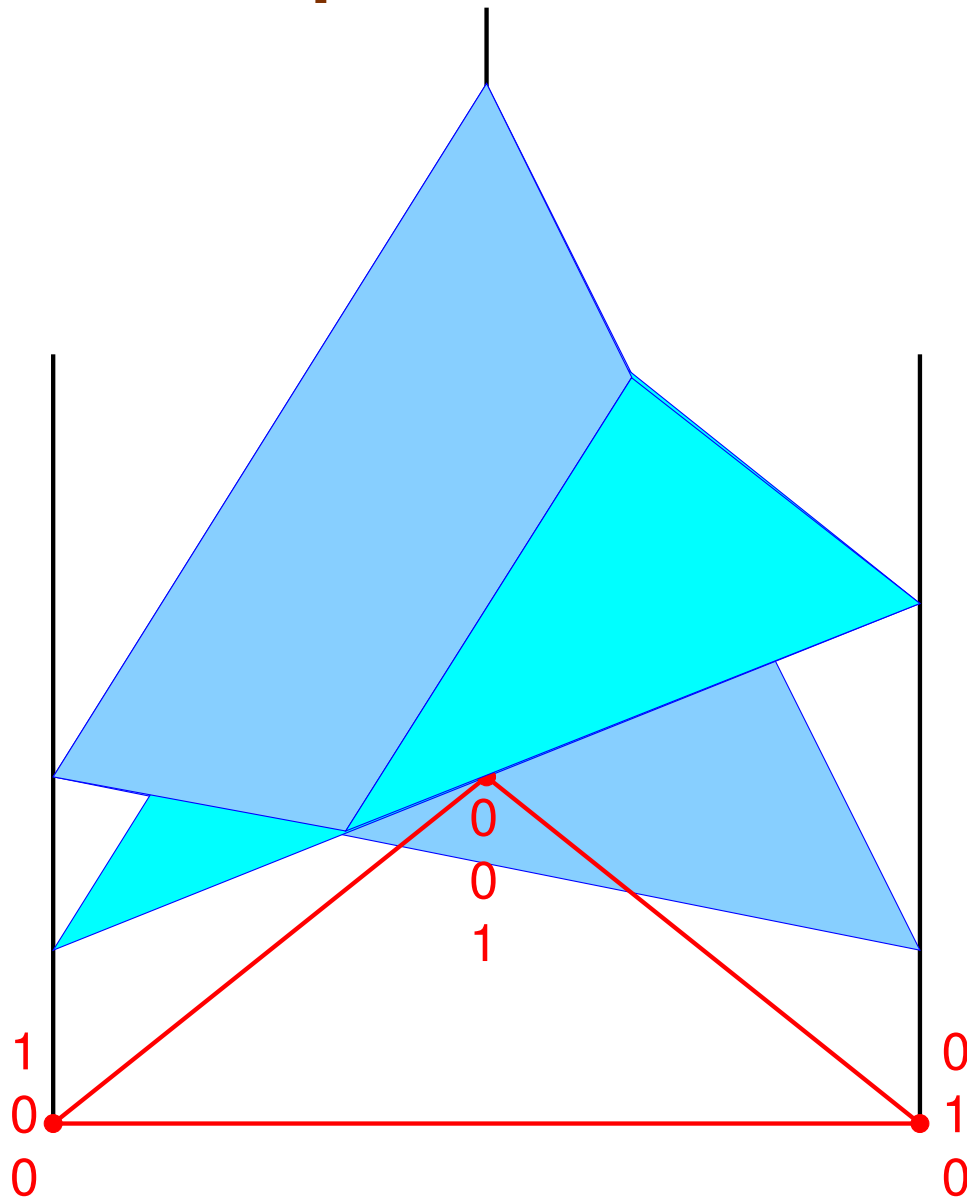
Best responses to mixed strategy of player 1



	4	5	
1	2	1	= B
2	1	3	
3	4	3	

payoffs to
player II

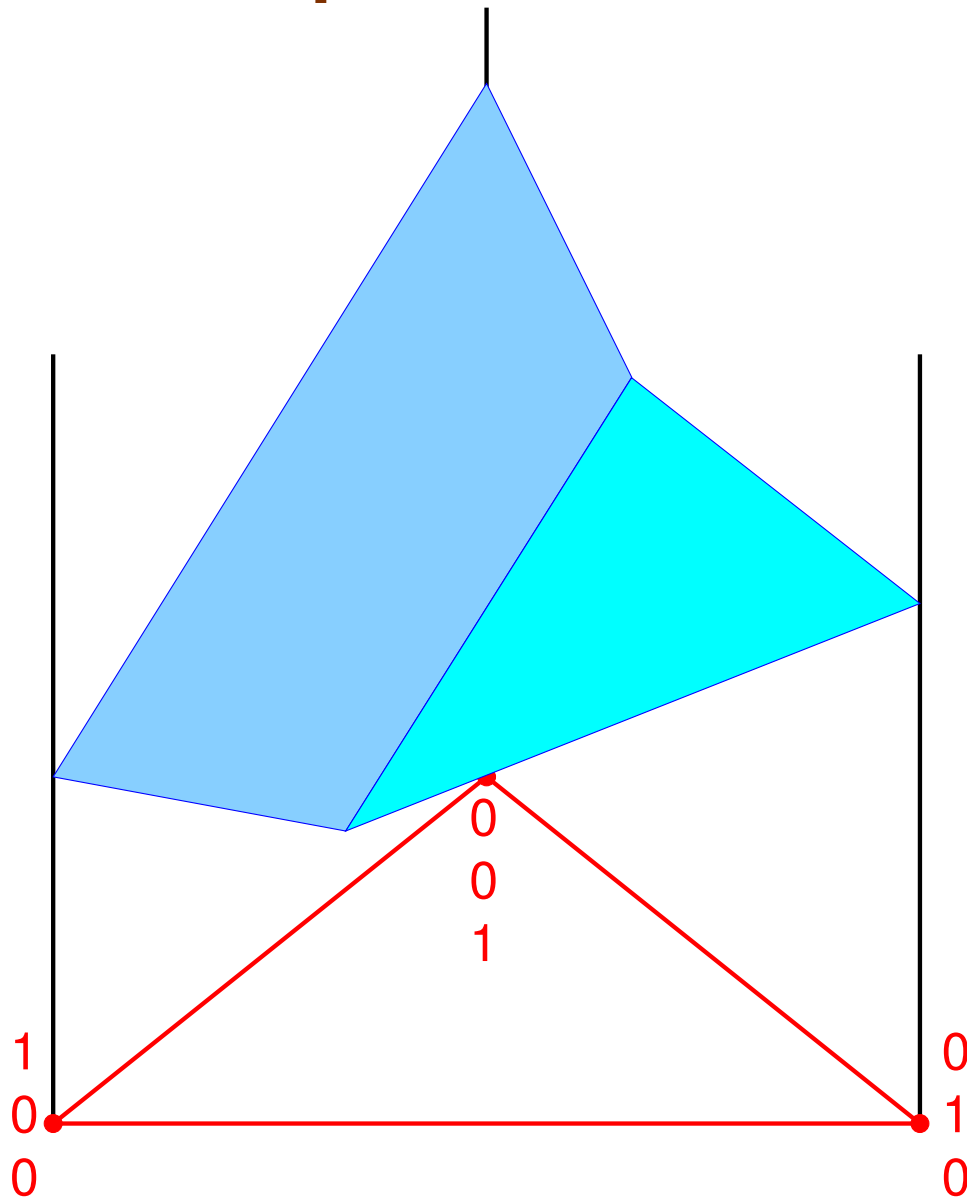
Best responses to mixed strategy of player 1



	4	5	
1	2	1	= B
2	1	3	
3	4	3	

payoffs to
player II

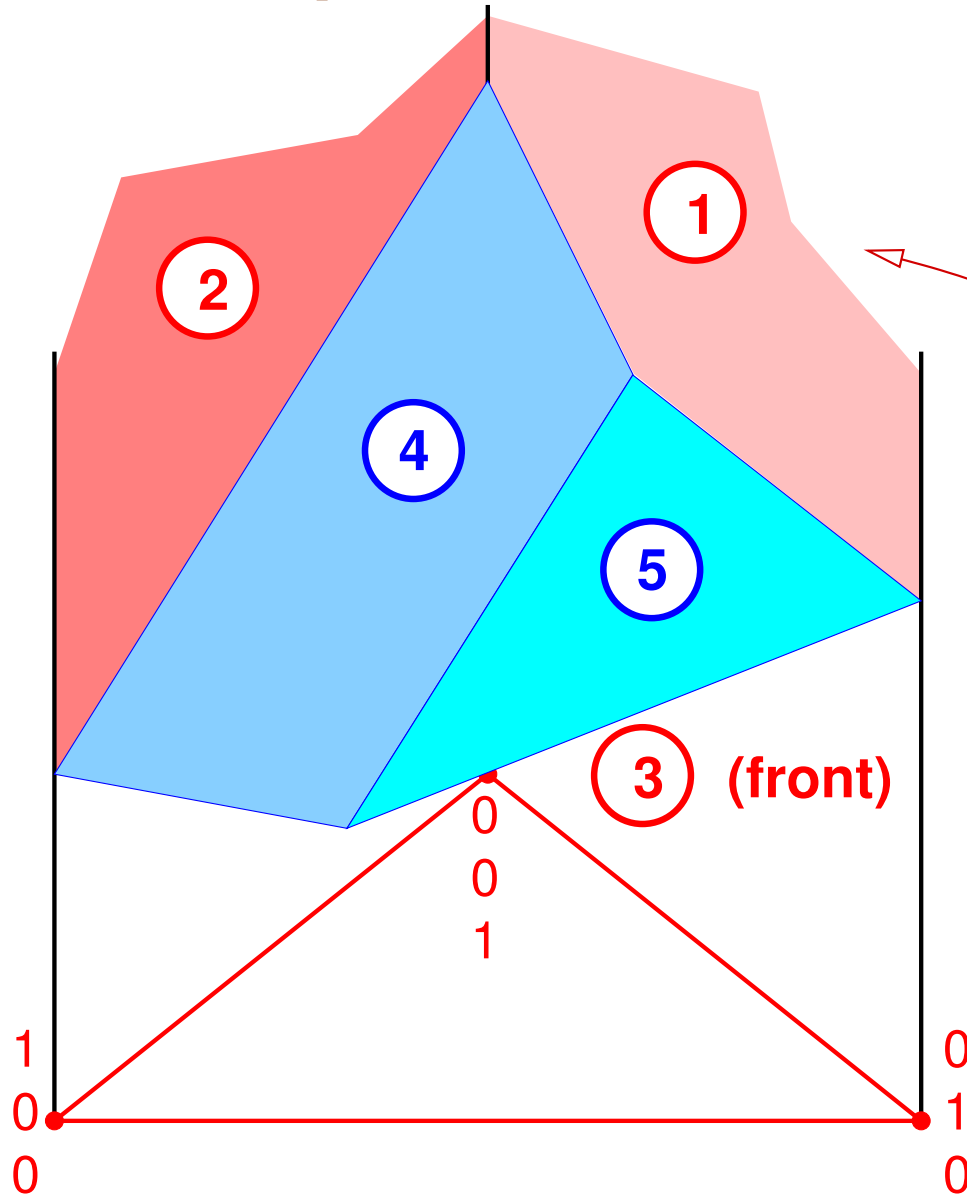
Best responses to mixed strategy of player 1



	4	5	
1	2	1	= B
2	1	3	
3	4	3	

payoffs to
player II

Best responses to mixed strategy of player 1



	4	5	
1	2	1	= B
2	1	3	
3	4	3	

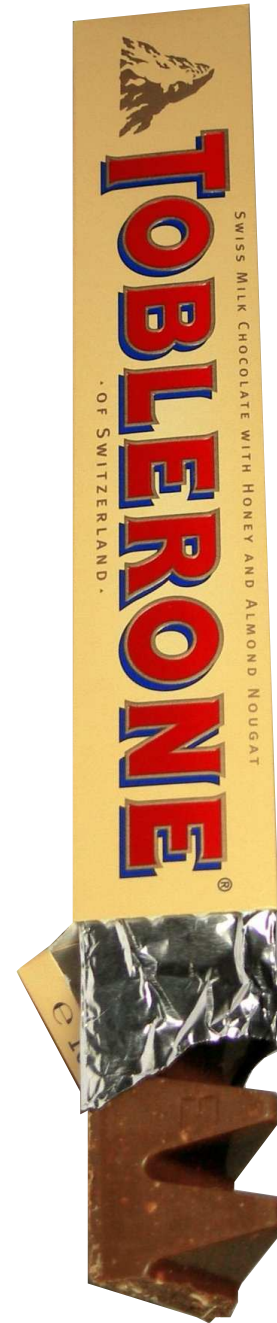
payoffs to player II

best response polyhedron with facet labels

Alternative view



Chop off Toblerone prism



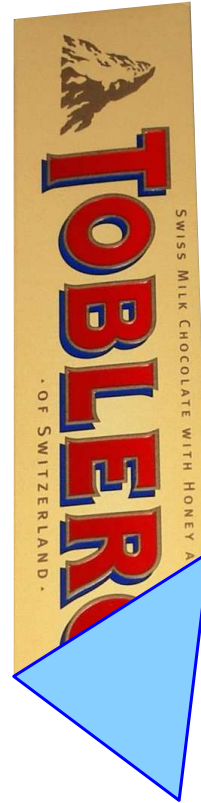
Chop off Toblerone prism



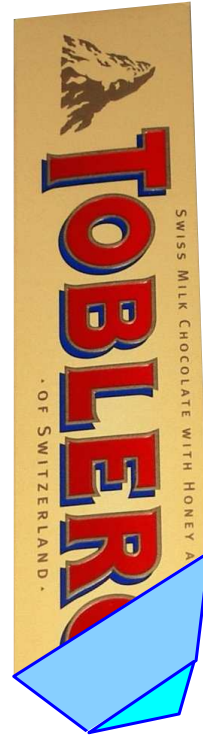
Chop off Toblerone prism



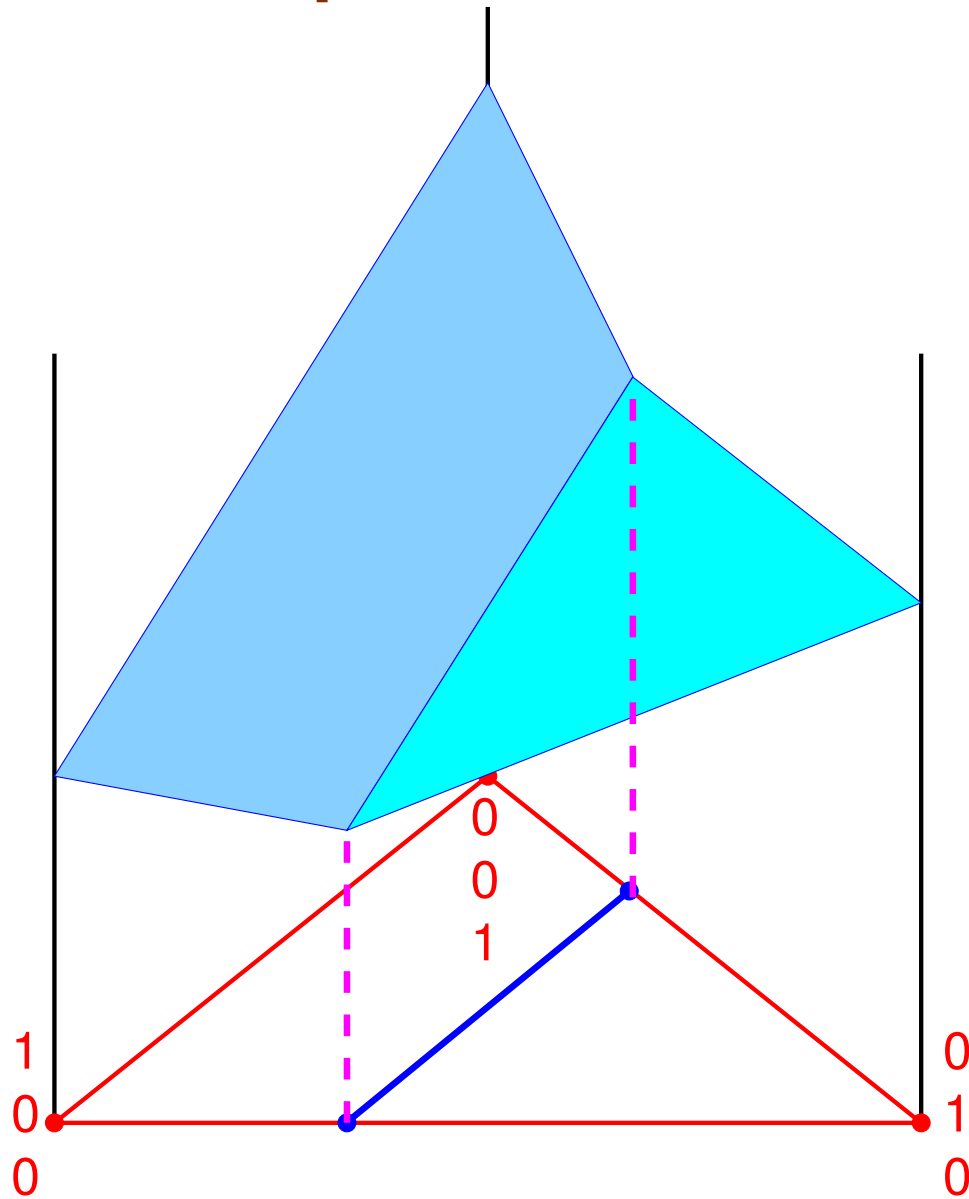
Chop off Toblerone prism



Chop off Toblerone prism



Best responses to mixed strategy of player 1



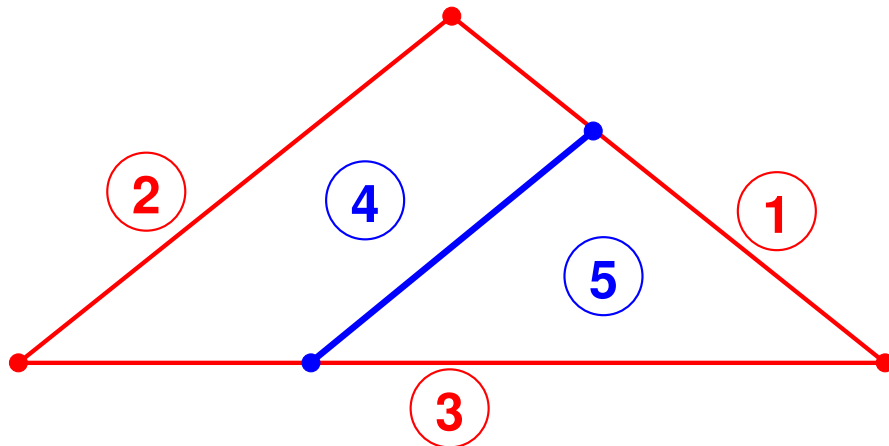
	4	5	
1	2	1	= B
2	1	3	
3	4	3	

payoffs to
player II

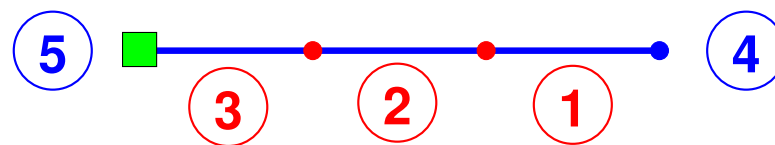
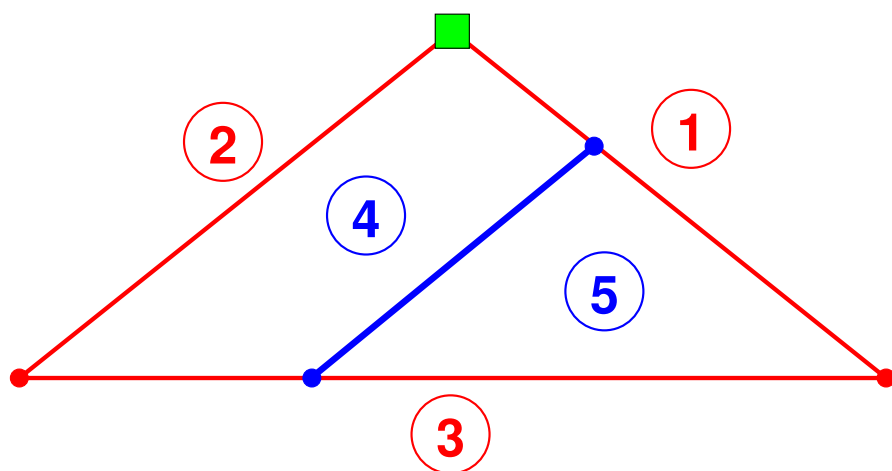
Best responses to mixed strategy of player 1

	4	5	
1	2	1	= B
2	1	3	
3	4	3	

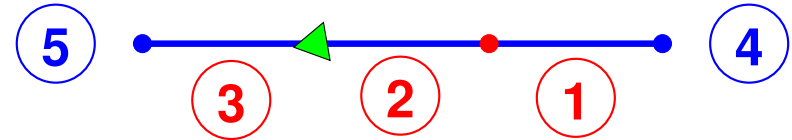
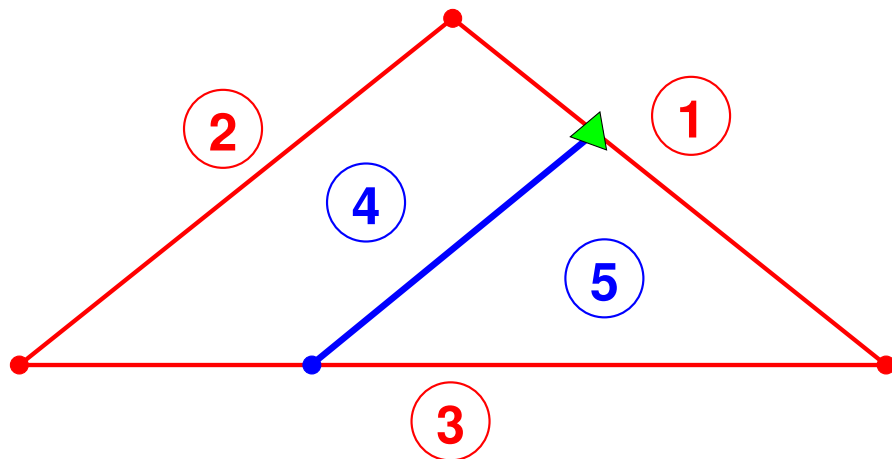
payoffs to
player II



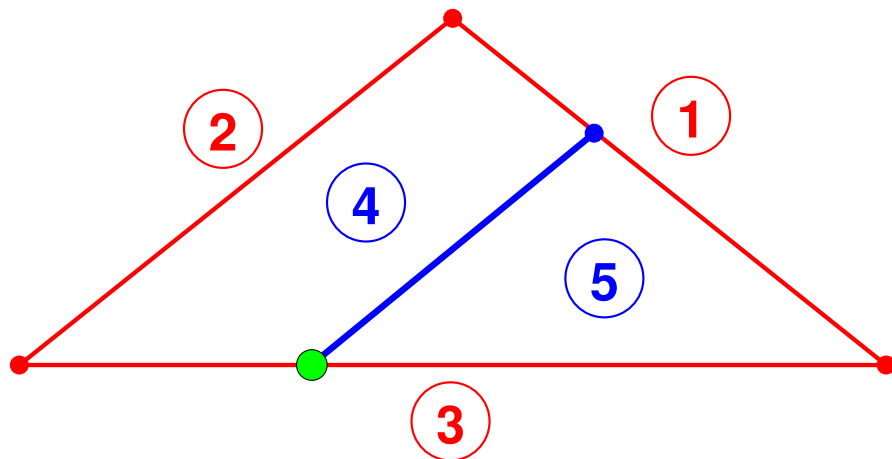
Equilibrium = completely labeled strategy pair



Equilibrium = completely labeled strategy pair



Equilibrium = completely labeled strategy pair



Constructing games using geometry

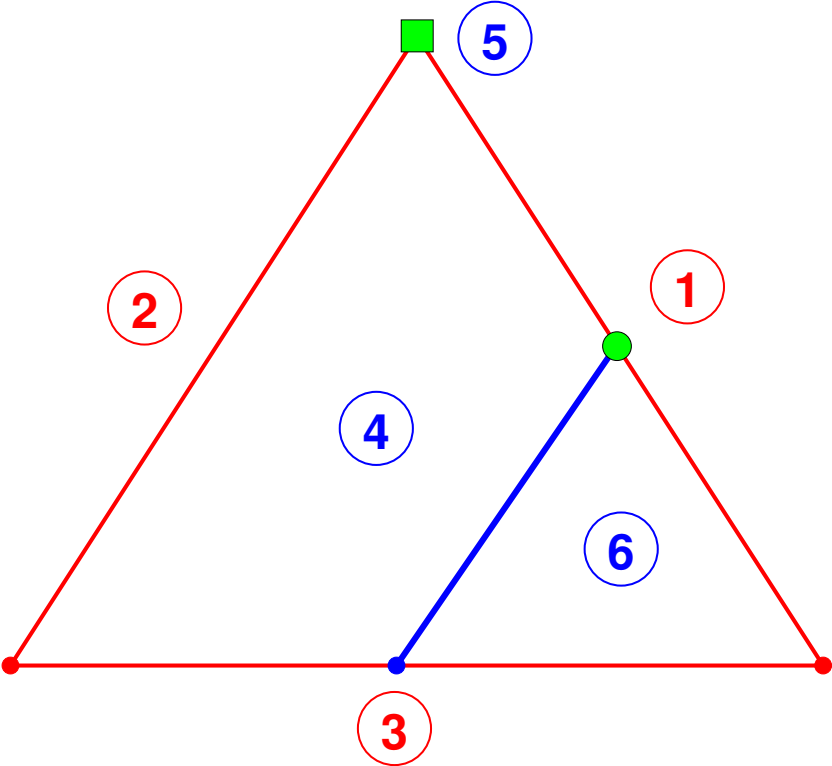
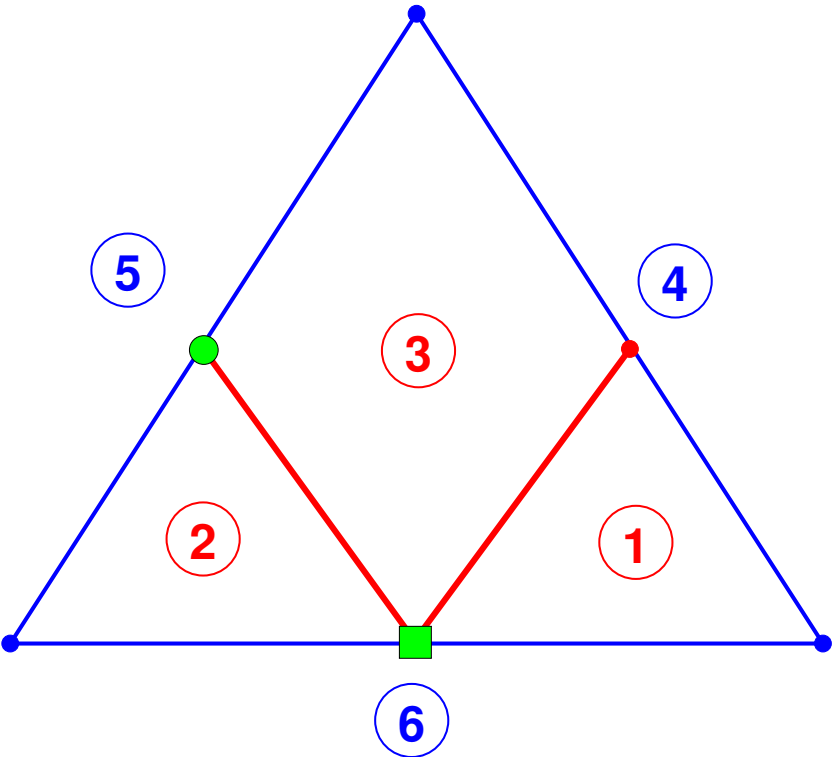
low dimension: 2, 3, (4) pure strategies:

subdivide mixed strategy simplex into response regions, label suitably

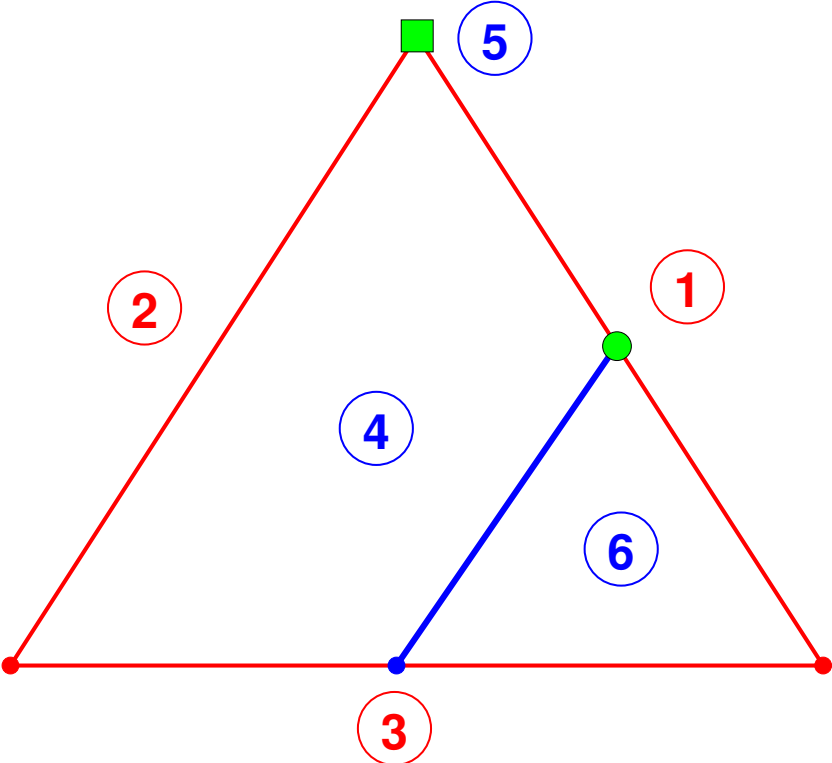
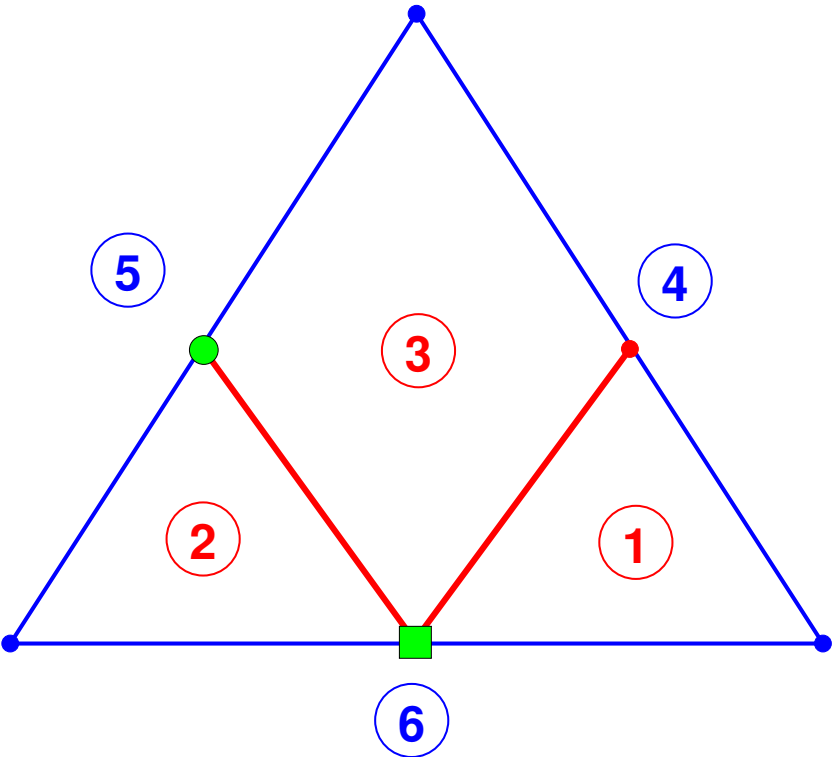
high dimension:

use polytopes with **known combinatorial structure**
e.g. for constructing games with many equilibria,
or long Lemke-Howson computations
[Savani & von Stengel, *FOCS 2004*,
Econometrica 2006]

Construct isolated non-quasi-strict equilibrium



Construct isolated non-quasi-strict equilibrium



$$A = \begin{matrix} \begin{matrix} 0 & 2 & 0 \\ 2 & 0 & 0 \\ 1 & 1 & 1 \end{matrix} & \begin{matrix} \textcircled{1} \\ \textcircled{2} \\ \textcircled{3} \end{matrix} \end{matrix}$$

$$B = \begin{matrix} \begin{matrix} \textcircled{4} & \textcircled{5} & \textcircled{6} \\ 1 & 0 & 0 \\ 1 & 0 & 2 \\ 1 & 1 & 0 \end{matrix} \end{matrix}$$

Best response polyhedron H_2 for player 2

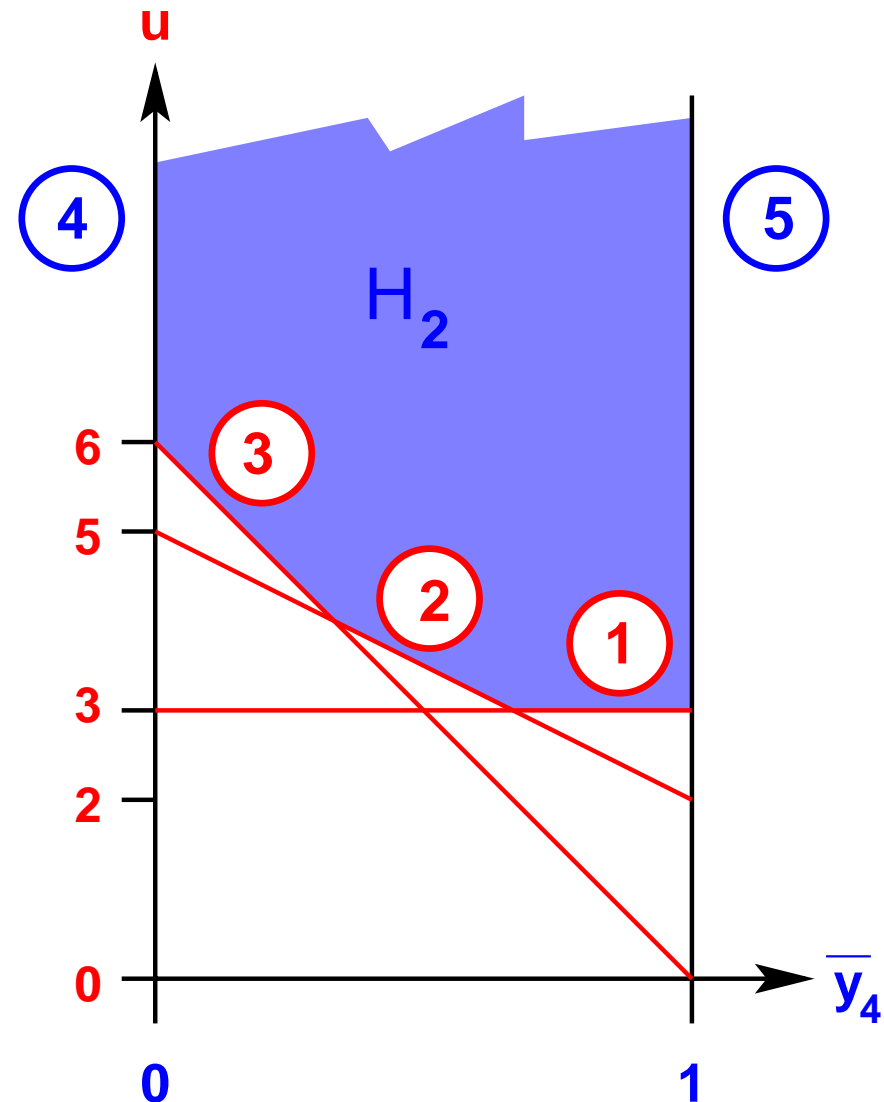
$$\begin{array}{c} \bar{y}_4 \quad \bar{y}_5 \\ \textcircled{1} \quad 3 \quad 3 \\ \textcircled{2} \quad 2 \quad 5 \\ \textcircled{3} \quad 0 \quad 6 \end{array} = A$$

$$H_2 = \{ (\bar{y}_4, \bar{y}_5, u) \mid$$

$$\begin{array}{l} \textcircled{1} : 3\bar{y}_4 + 3\bar{y}_5 \leq u \\ \textcircled{2} : 2\bar{y}_4 + 5\bar{y}_5 \leq u \\ \textcircled{3} : \quad \quad 6\bar{y}_5 \leq u \end{array}$$

$$\bar{y}_4 + \bar{y}_5 = 1$$

$$\begin{array}{l} \textcircled{4} : \bar{y}_4 \geq 0 \\ \textcircled{5} : \bar{y}_5 \geq 0 \end{array} \}$$



Best response polytope Q for player 2

$$\begin{array}{c} \textcircled{1} \\ \textcircled{2} \\ \textcircled{3} \end{array} \begin{array}{cc} y_4 & y_5 \\ \hline 3 & 3 \\ 2 & 5 \\ 0 & 6 \end{array} = A$$

$$Q = \{ y \mid Ay \leq 1, y \geq 0 \}$$

$$Q = \{ (y_4, y_5) \mid$$

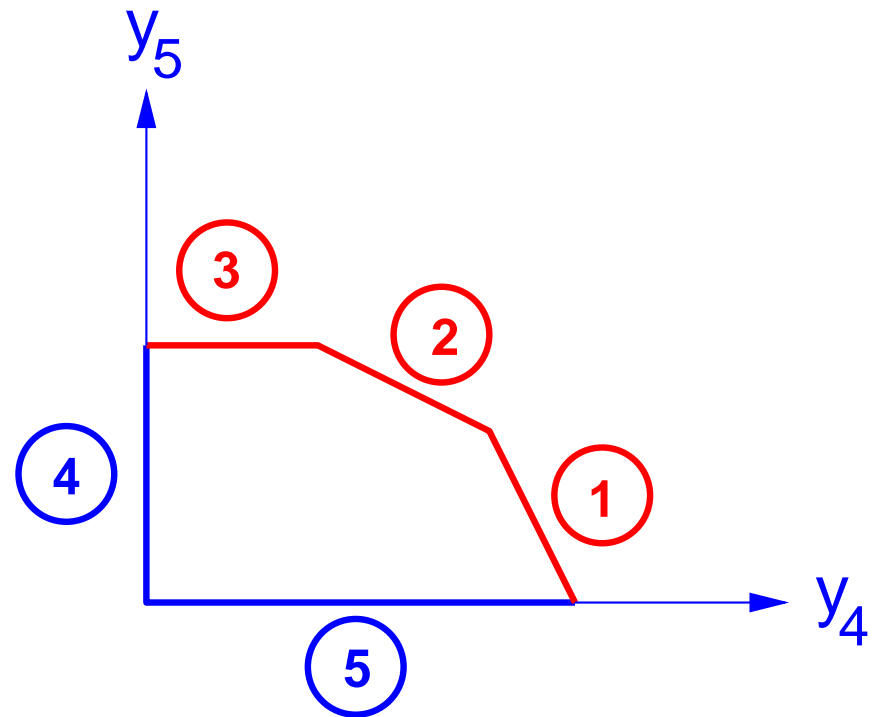
$$\textcircled{1} : 3y_4 + 3y_5 \leq 1$$

$$\textcircled{2} : 2y_4 + 5y_5 \leq 1$$

$$\textcircled{3} : 6y_5 \leq 1$$

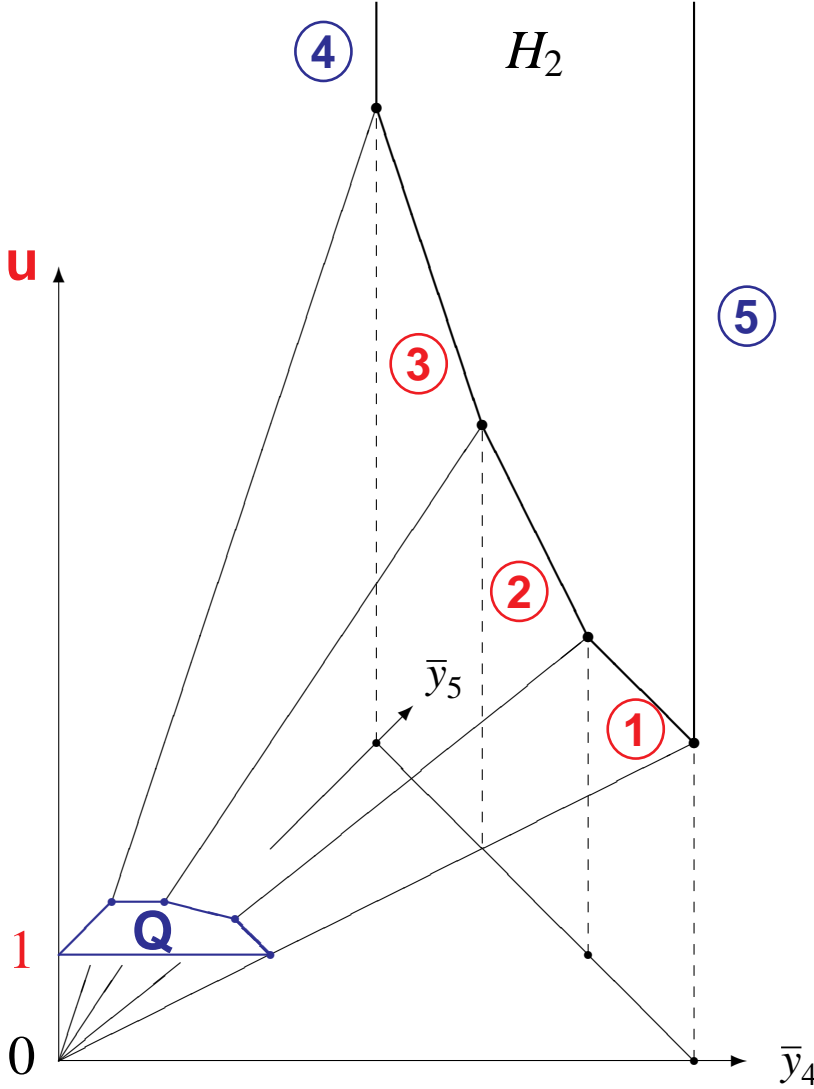
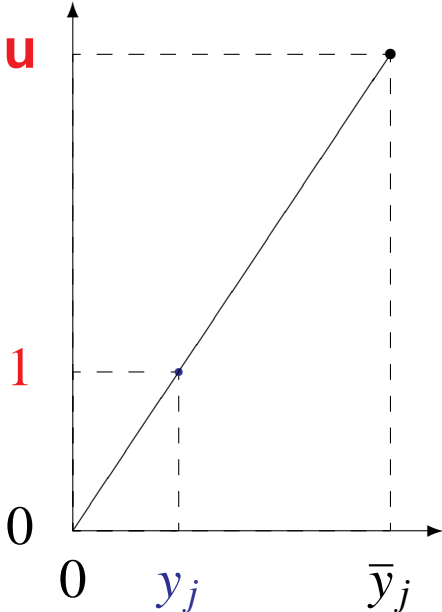
$$\textcircled{4} : y_4 \geq 0$$

$$\textcircled{5} : y_5 \geq 0 \}$$



Projective transformation

H_2, Q same face incidences



Best response polytope Q for player 2

$$\begin{array}{c} \textcircled{1} \\ \textcircled{2} \\ \textcircled{3} \end{array} \begin{array}{cc} y_4 & y_5 \\ \hline 3 & 3 \\ 2 & 5 \\ 0 & 6 \end{array} = A$$

$$Q = \{ y \mid Ay \leq 1, y \geq 0 \}$$

$$Q = \{ (y_4, y_5) \mid$$

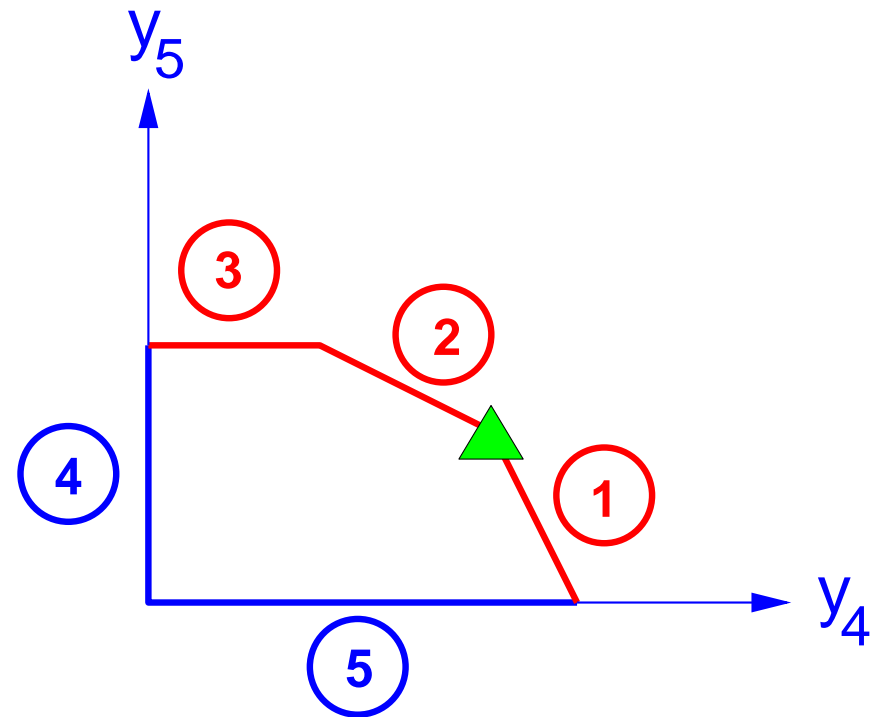
$$\textcircled{1} : 3y_4 + 3y_5 \leq 1$$

$$\textcircled{2} : 2y_4 + 5y_5 \leq 1$$

$$\textcircled{3} : 6y_5 \leq 1$$

$$\textcircled{4} : y_4 \geq 0$$

$$\textcircled{5} : y_5 \geq 0 \}$$

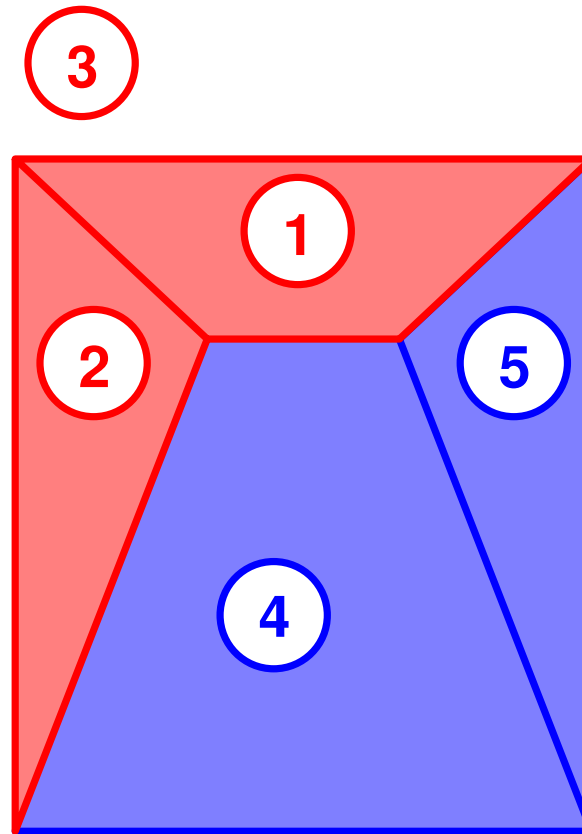
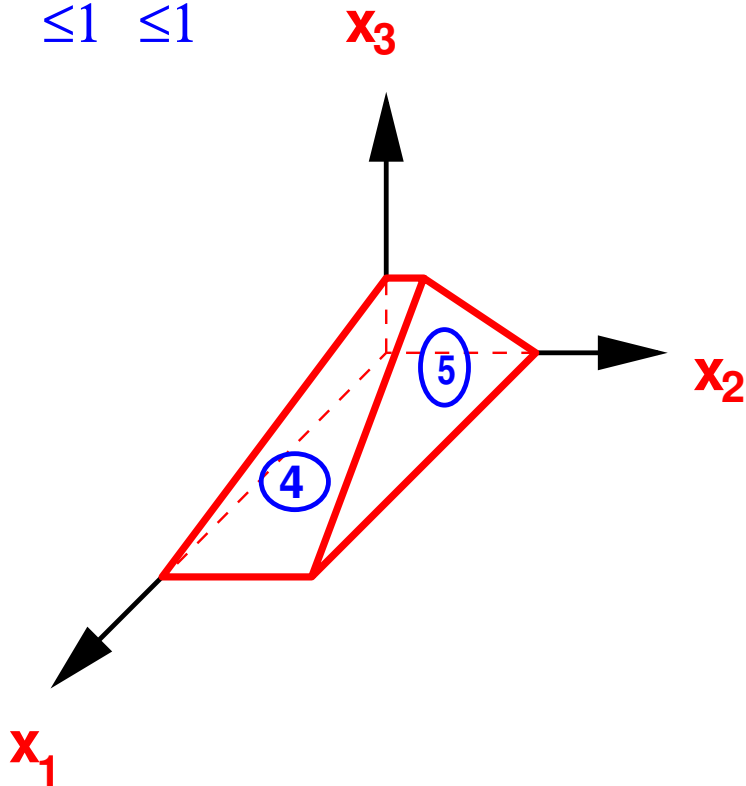


Best response polytope P for player 1

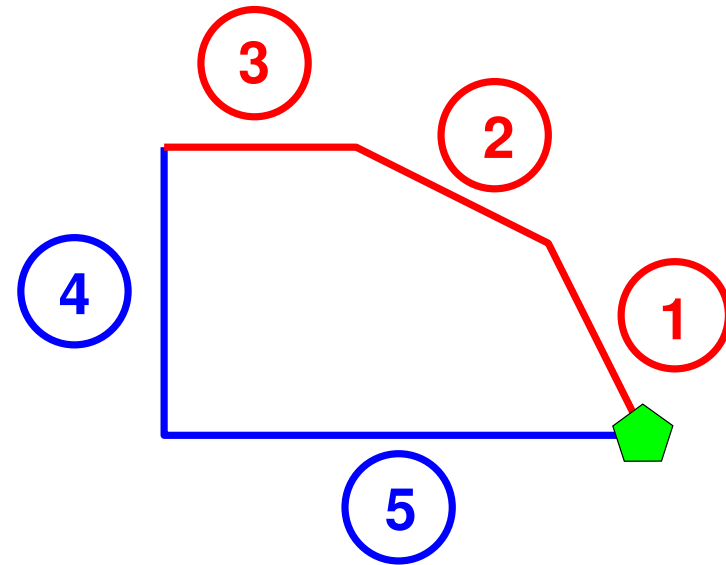
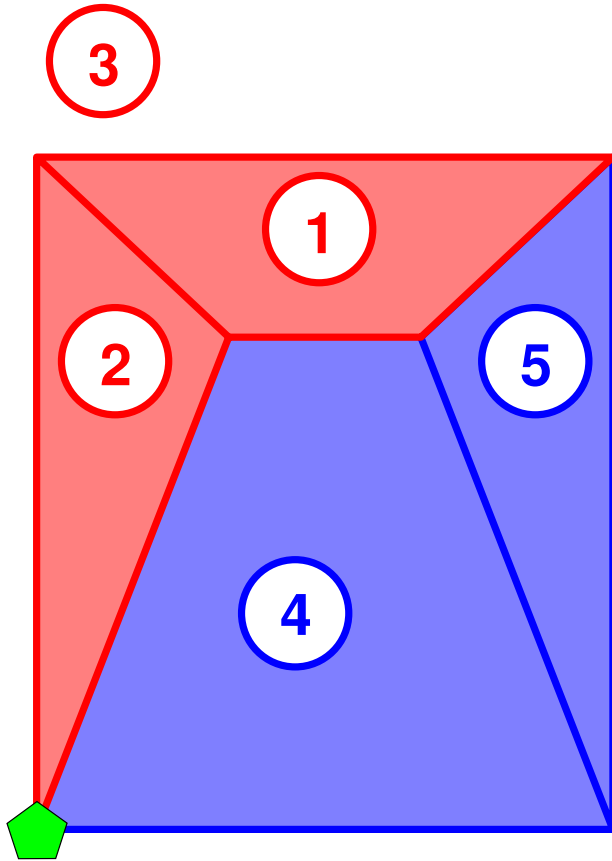
$$\begin{array}{l} x_1 \\ x_2 \\ x_3 \end{array} \begin{array}{|c|c|} \hline 1 & 0 \\ \hline 0 & 2 \\ \hline 4 & 3 \\ \hline \end{array} = B$$

$\leq 1 \leq 1$

$$P = \{ x \mid x \geq 0, x^T B \leq 1 \}$$

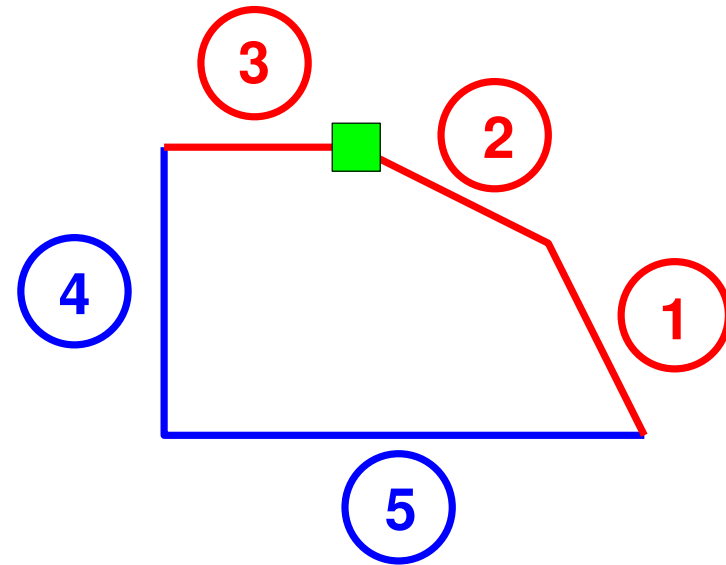
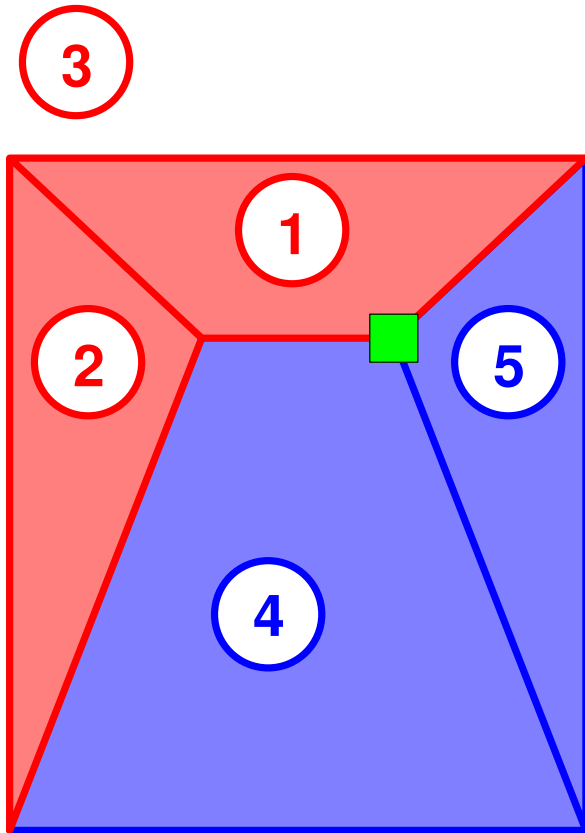


Equilibrium = completely labeled pair



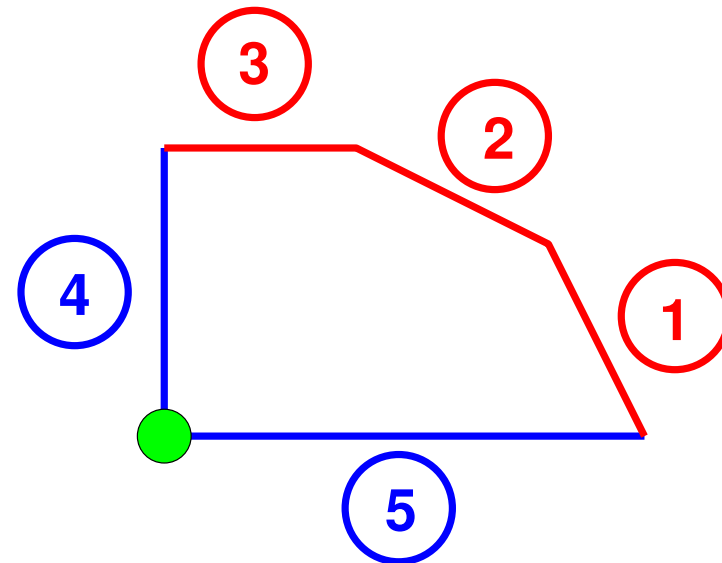
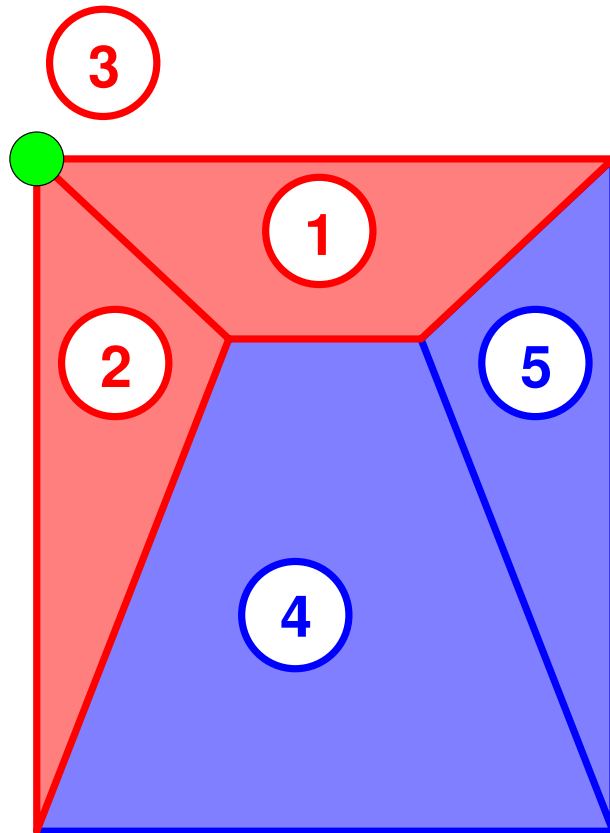
pure equilibrium

Equilibrium = completely labeled pair

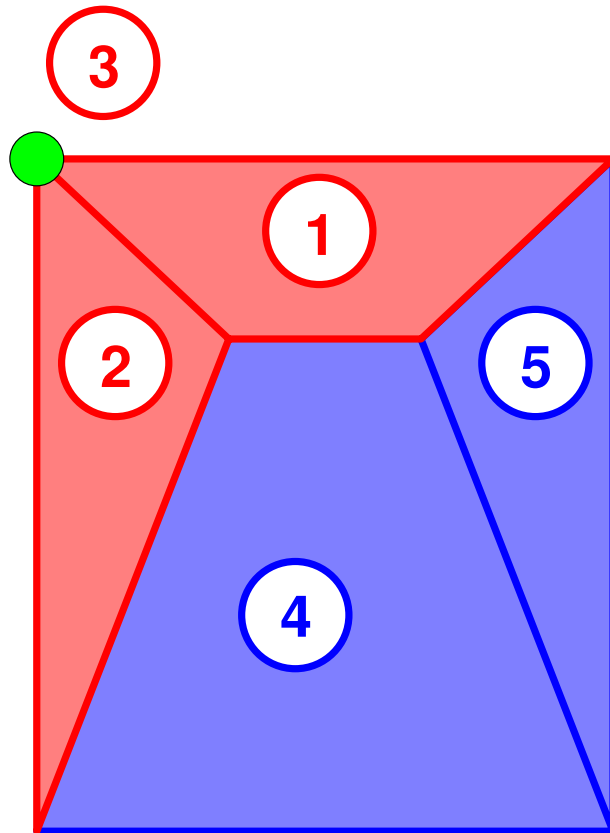


mixed equilibrium

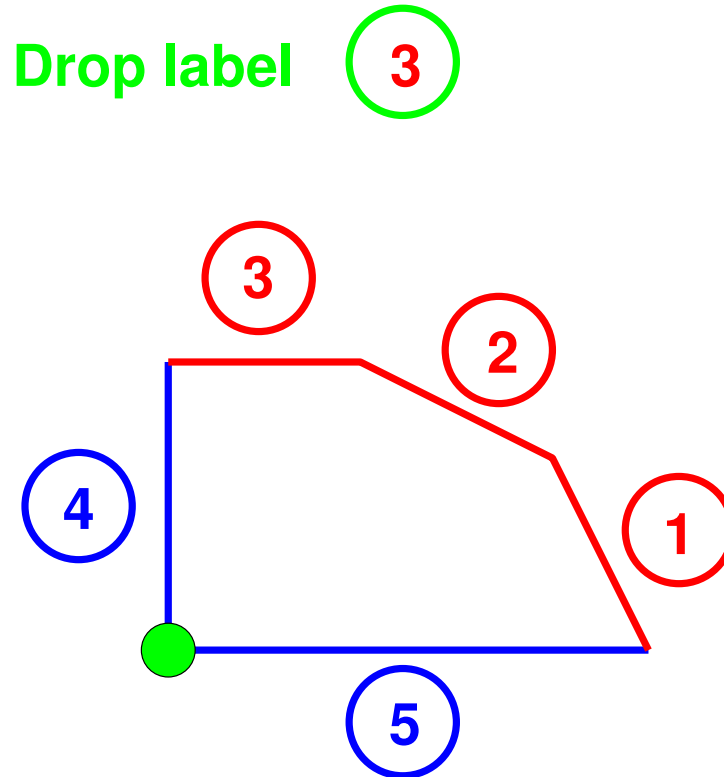
The Lemke–Howson algorithm



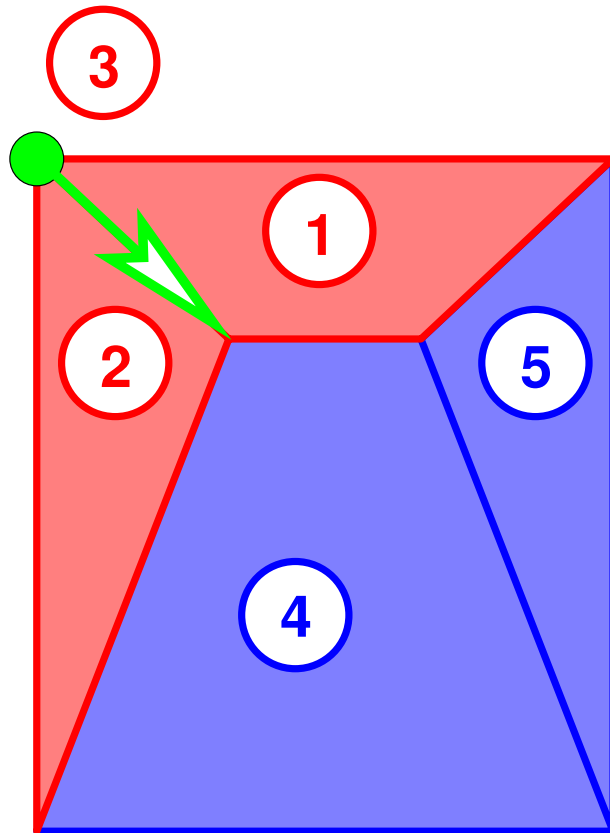
The Lemke–Howson algorithm



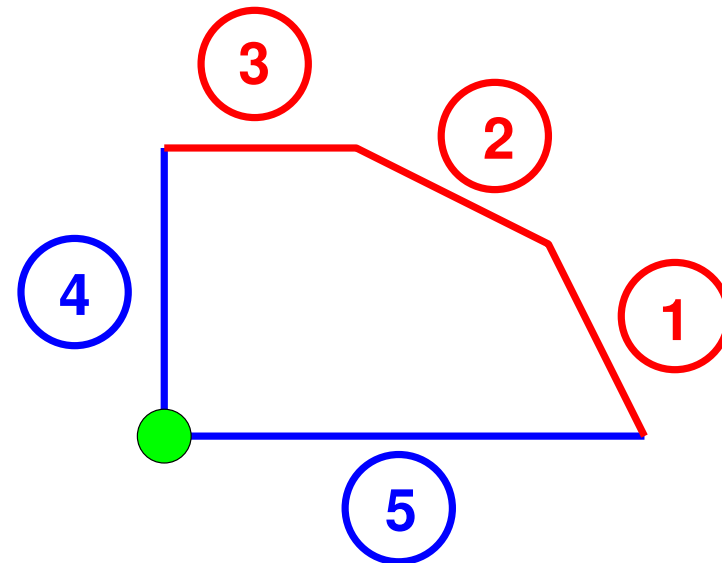
Drop label



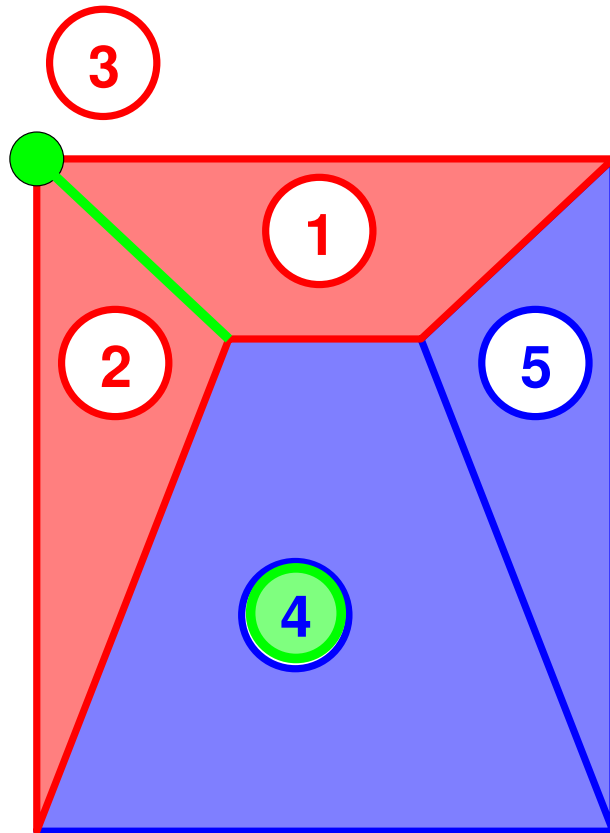
The Lemke–Howson algorithm



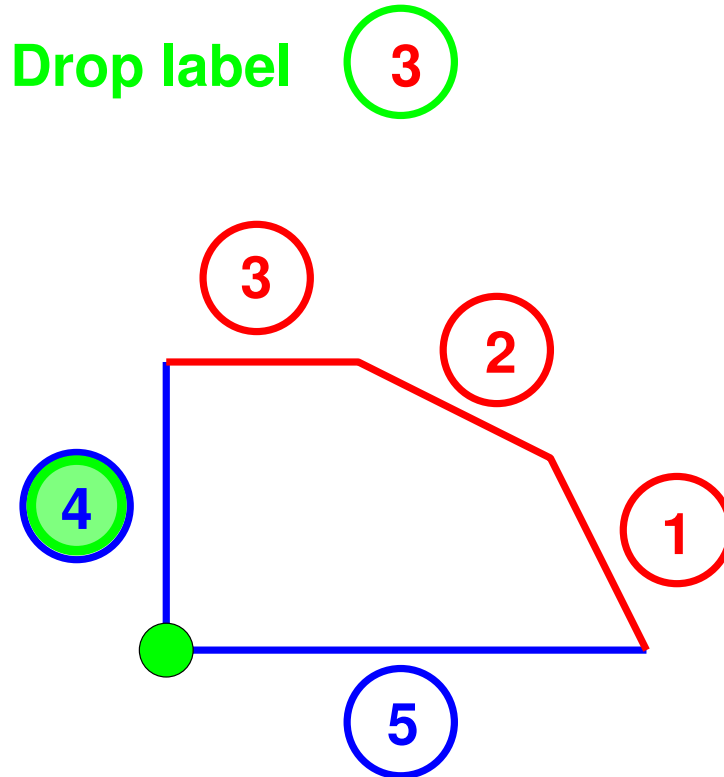
Drop label



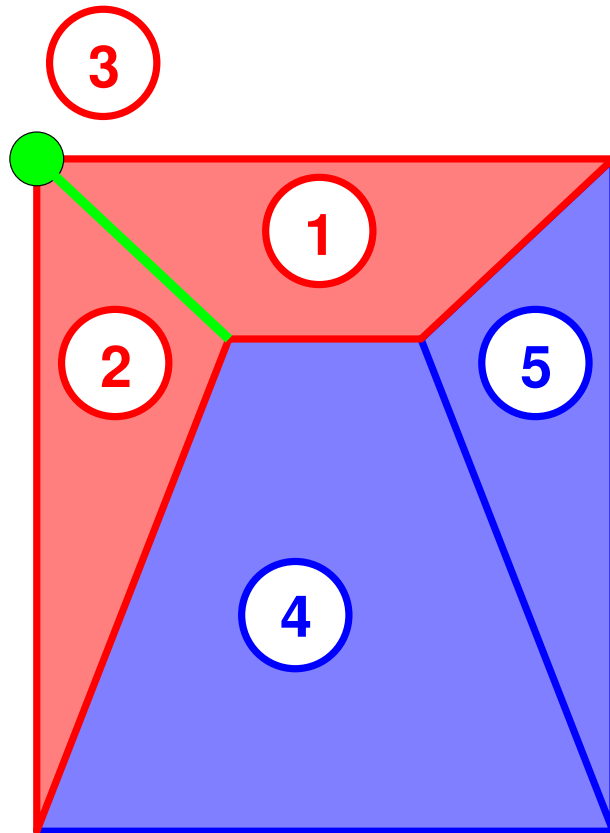
The Lemke–Howson algorithm



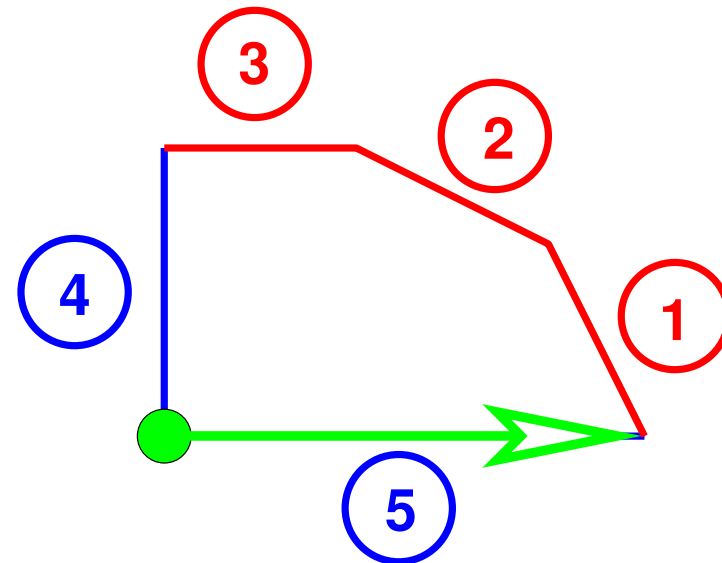
Drop label



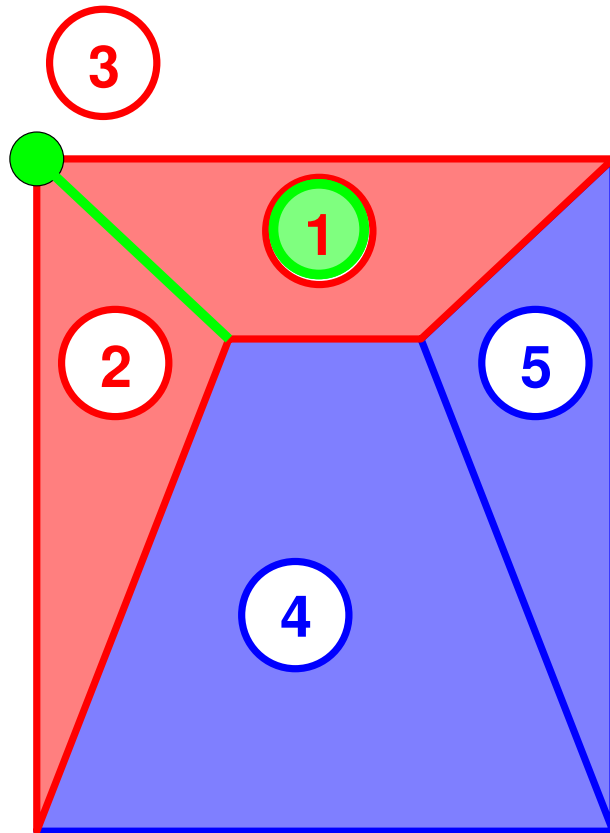
The Lemke–Howson algorithm



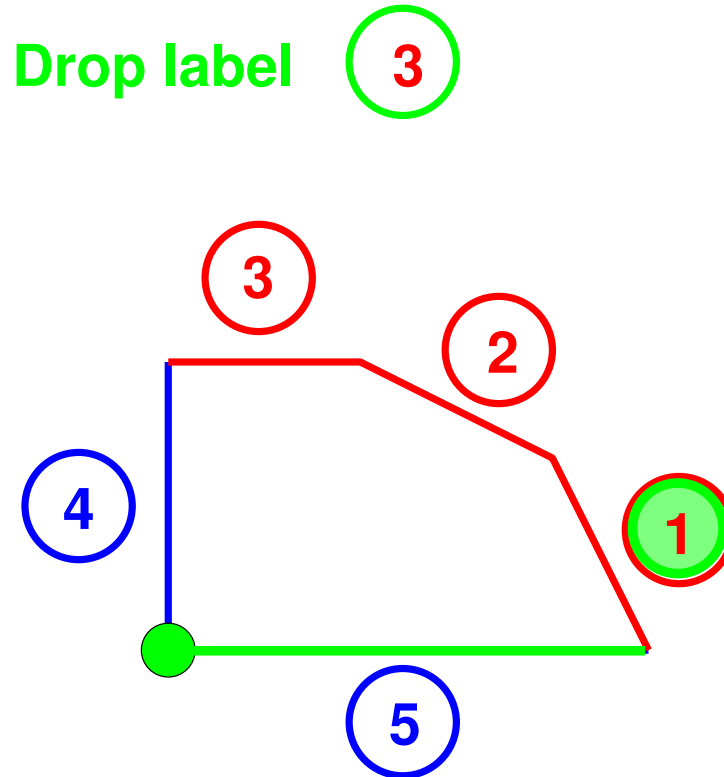
Drop label



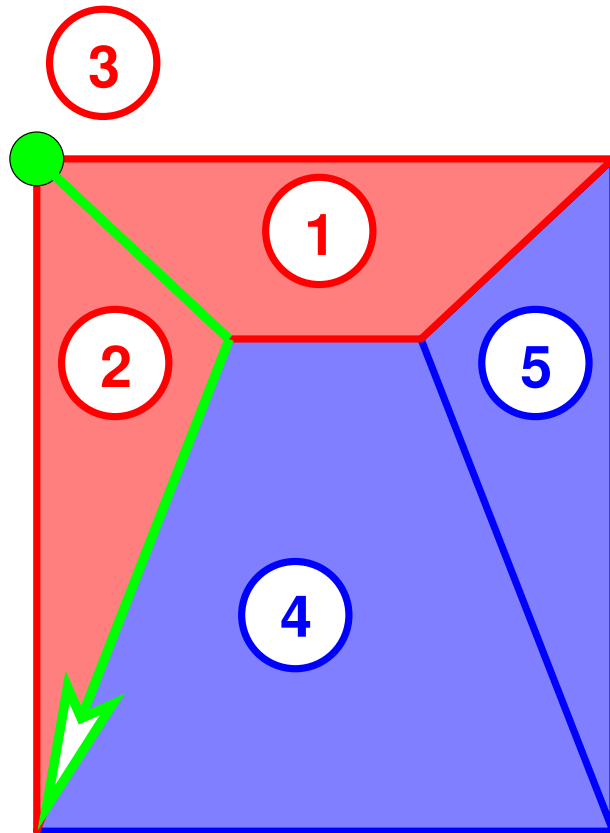
The Lemke–Howson algorithm



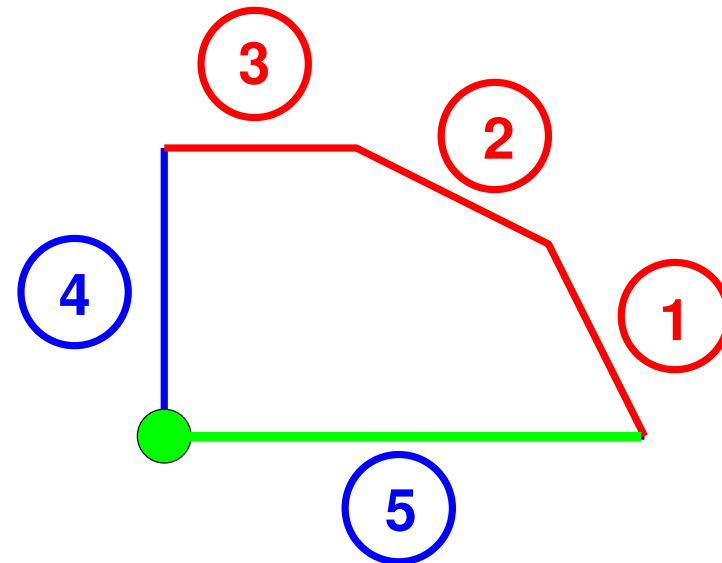
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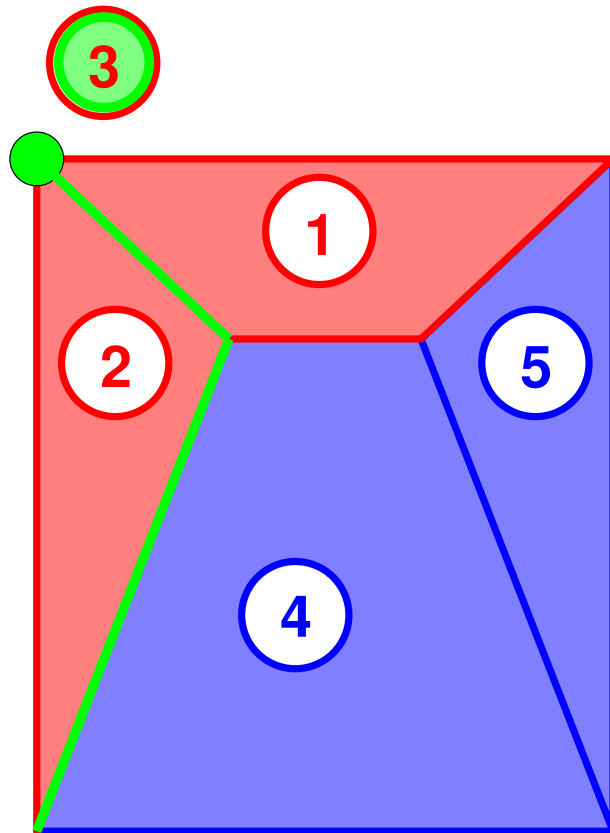
The Lemke–Howson algorithm



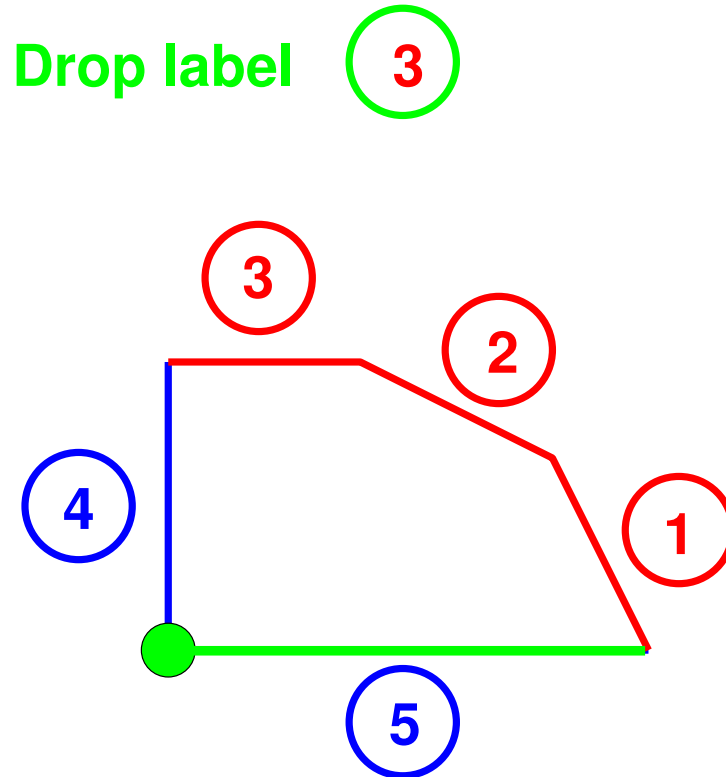
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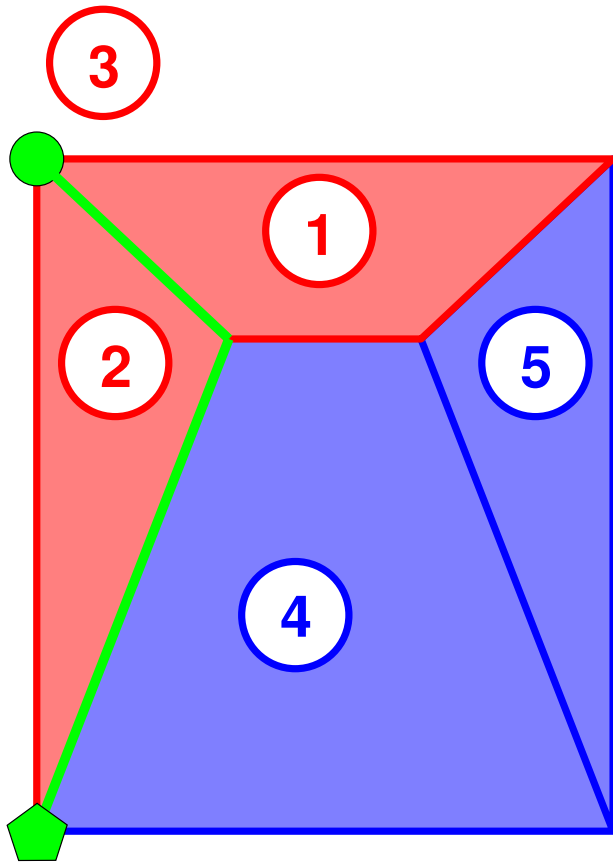
The Lemke–Howson algorithm



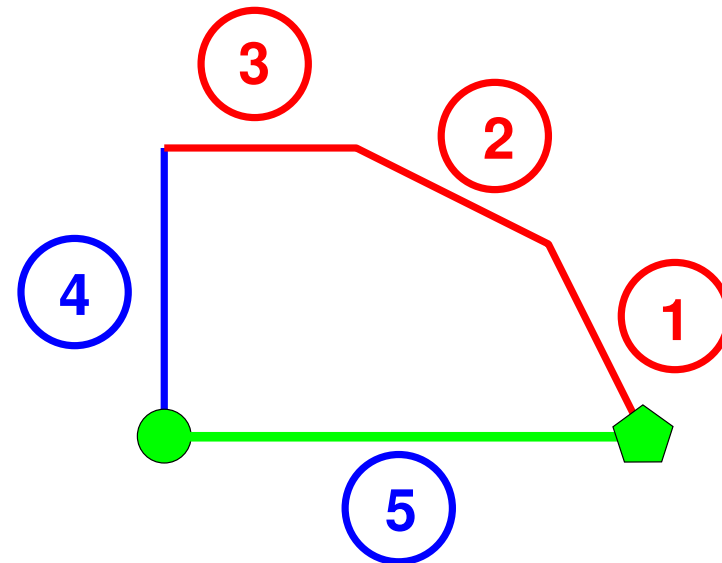
Drop label



The Lemke–Howson algorithm



Drop label



Why Lemke-Howson works

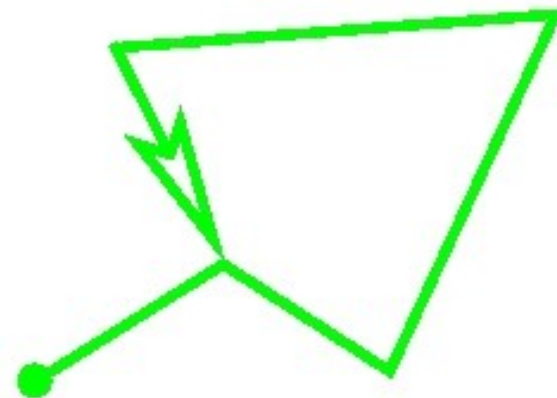
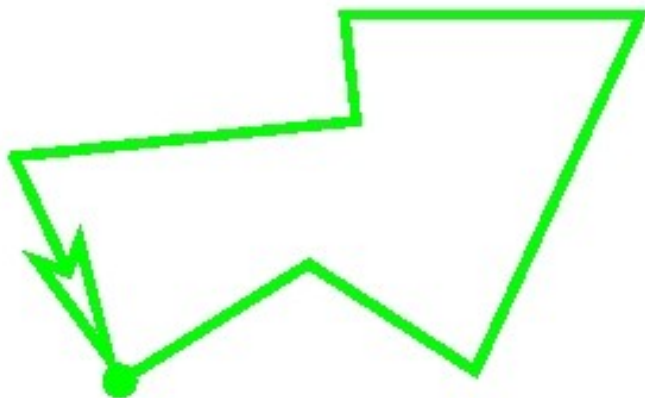
LH finds at least one Nash equilibrium because

- **finitely many** "vertices"

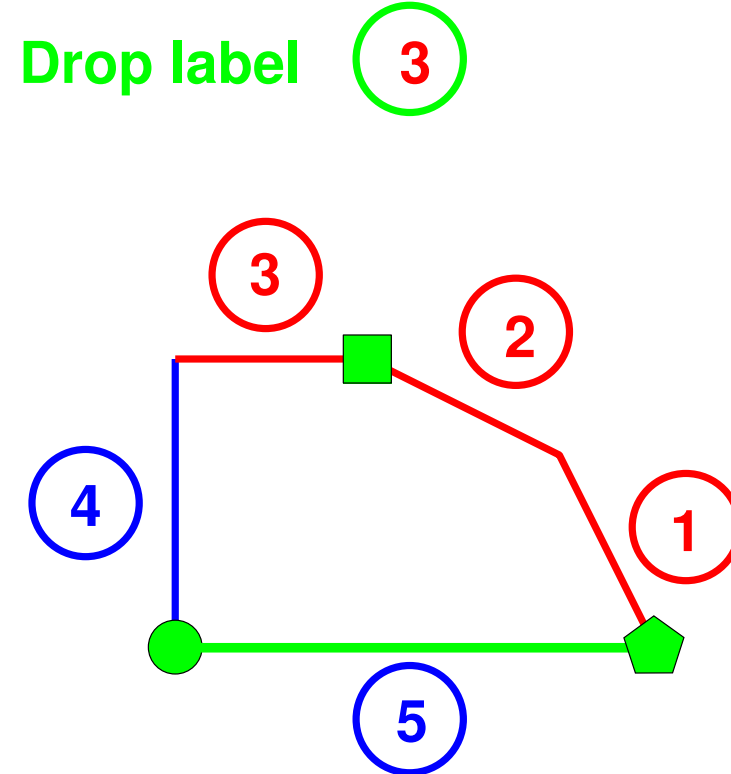
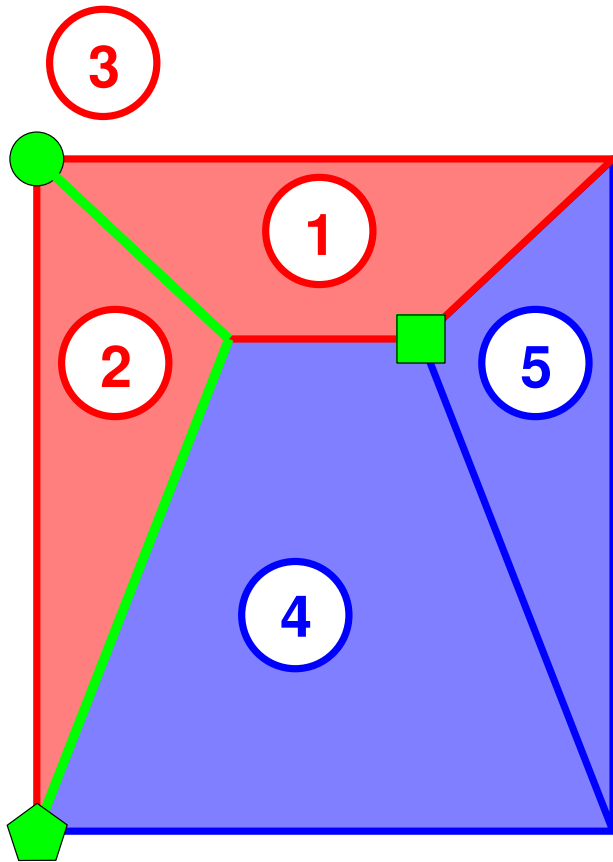
for nondegenerate (generic) games:

- **unique** starting edge given missing label
- **unique** continuation

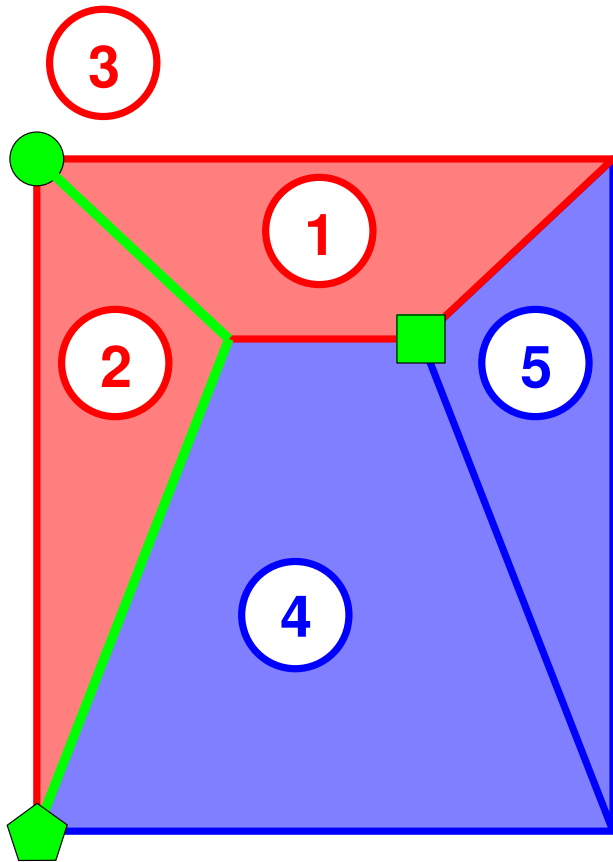
⇒ precludes "coming back" like here:



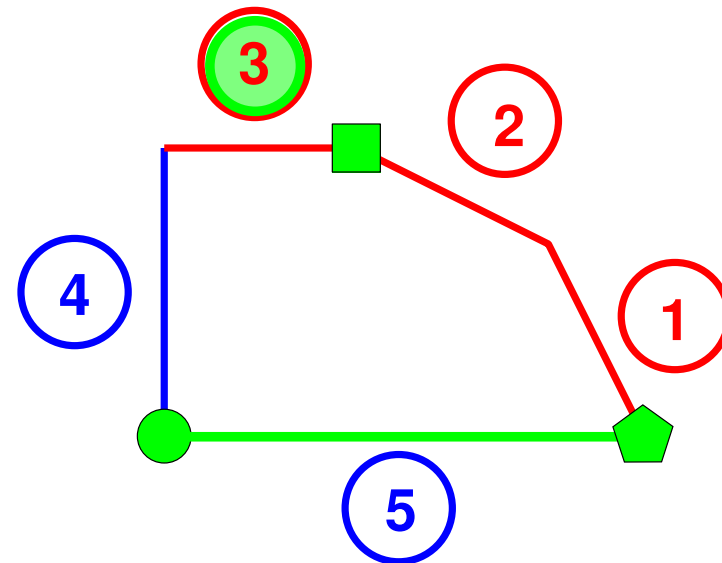
The Lemke–Howson algorithm



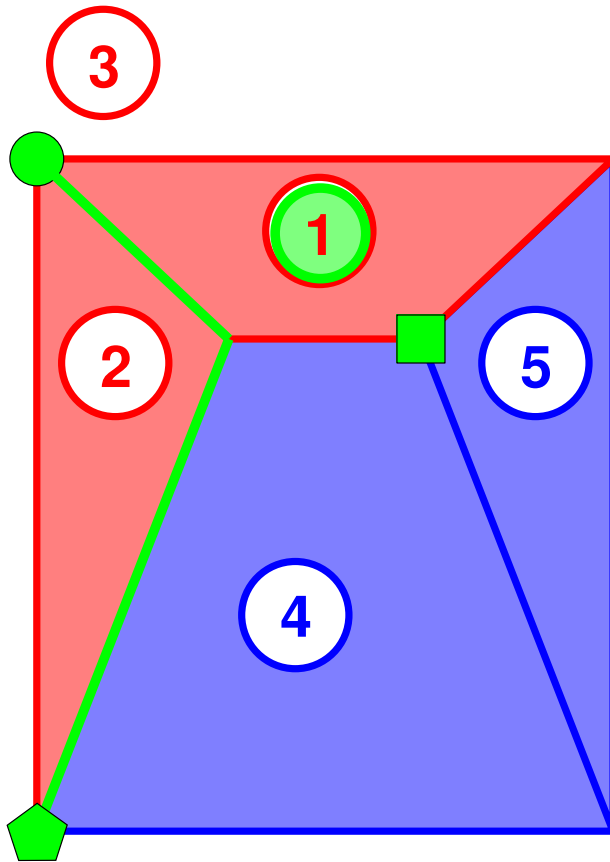
The Lemke–Howson algorithm



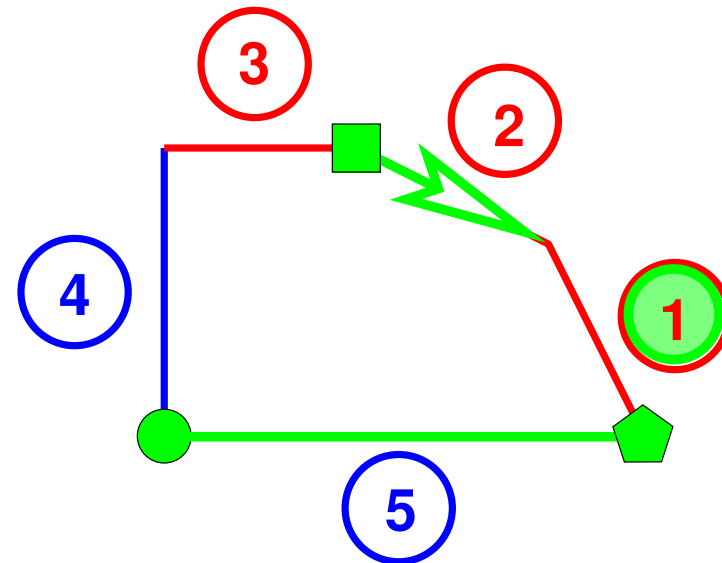
Drop label **3** from ■



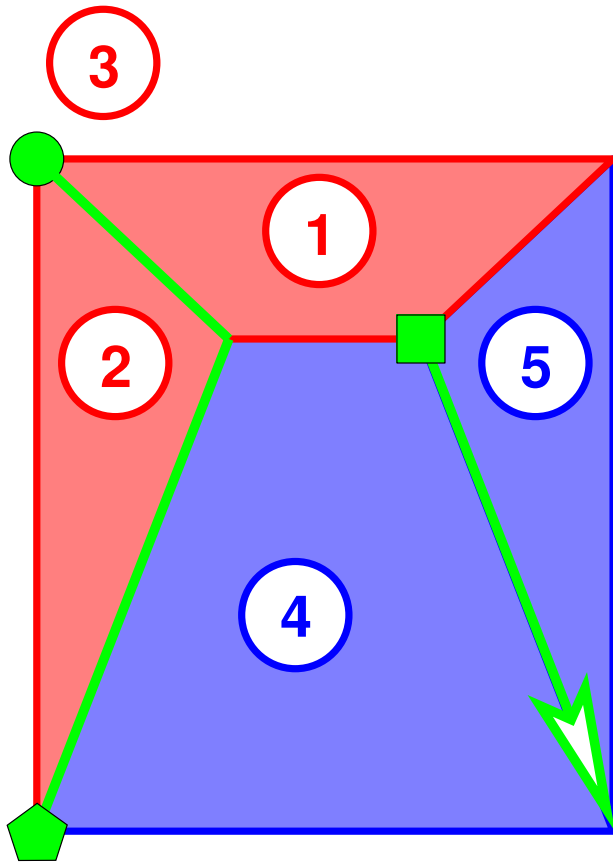
The Lemke–Howson algorithm



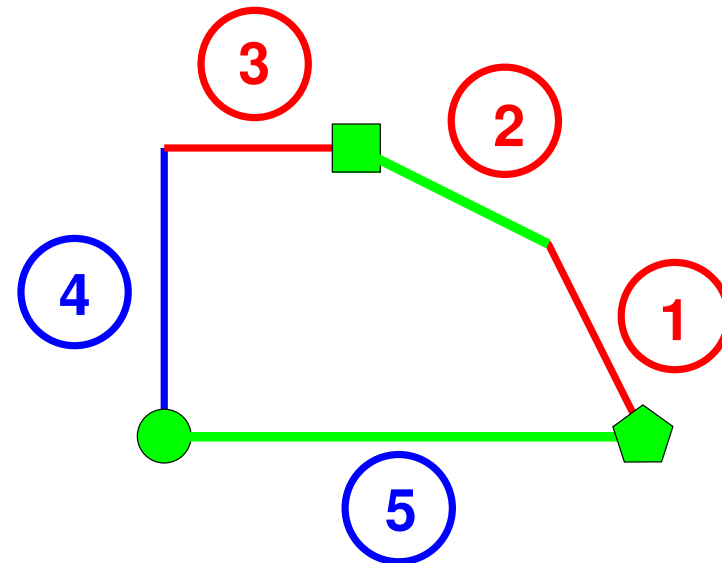
Drop label **3** from ■



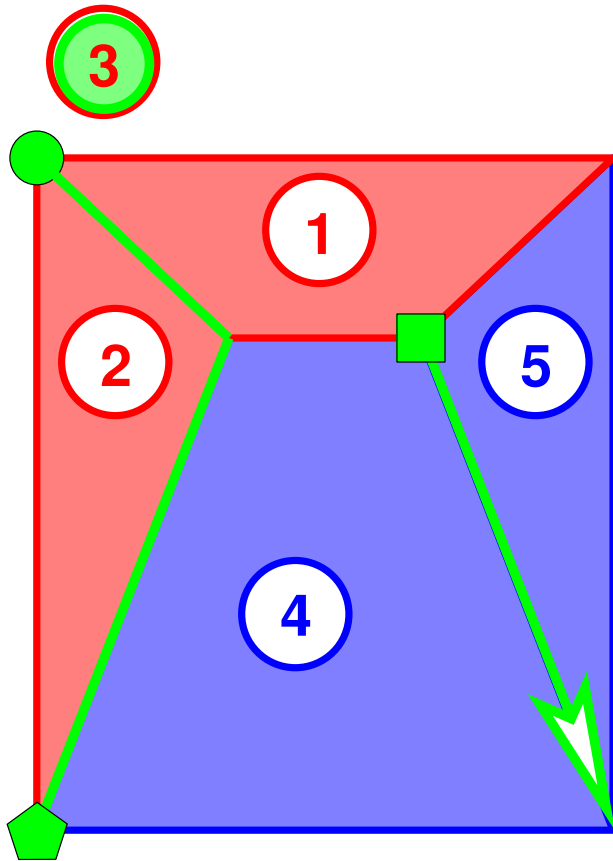
The Lemke–Howson algorithm



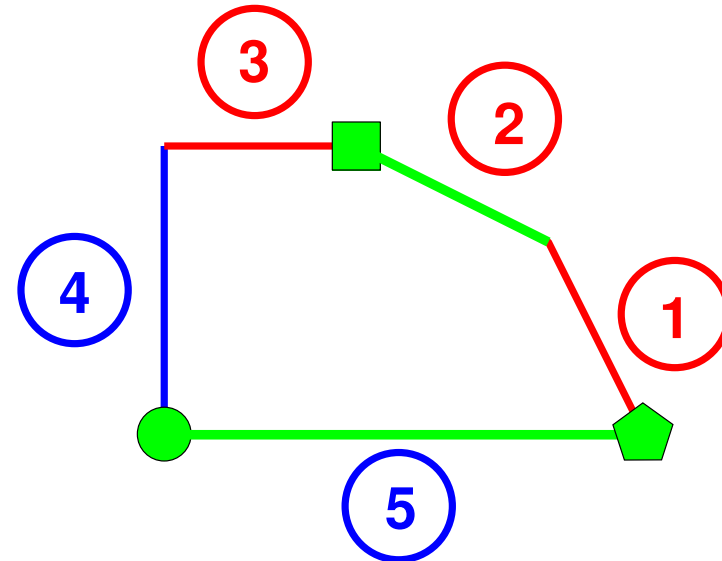
Drop label **3** from ■



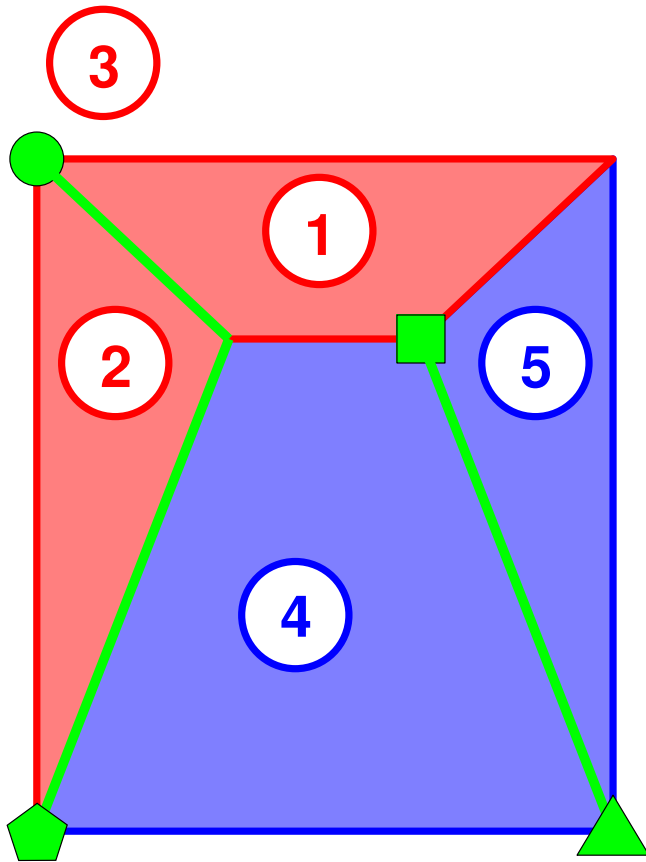
The Lemke–Howson algorithm



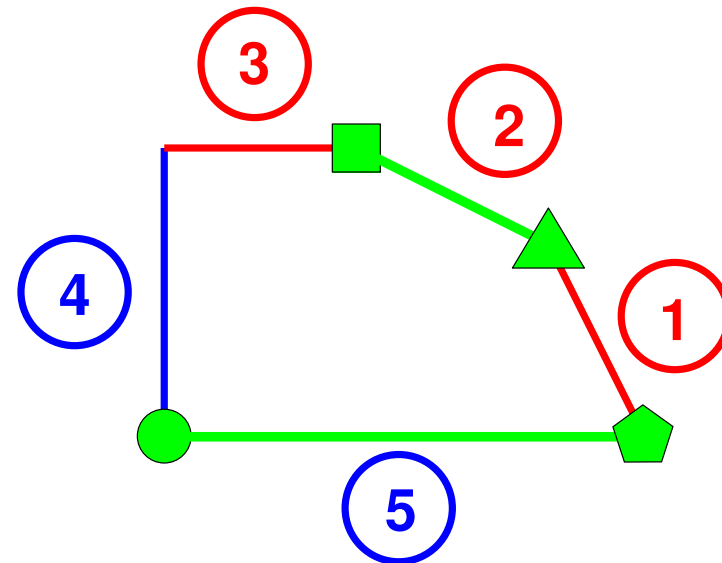
Drop label **3** from 



The Lemke–Howson algorithm



Drop label **3** from ■



Complexity of Lemke-Howson

- finds at least one Nash equilibrium,
pivots like Simplex algorithm for linear programming
- Simplex may be **exponential** [Klee-Minty cubes]
- exponentially many steps of Lemke-Howson
for **any** dropped label?
- **Yes!** This is our result.

Our result

There are $d \times d$ games with exactly one Nash equilibrium, for which the Lemke-Howson algorithm takes $\geq \phi^{3d/4}$ many steps for **any dropped label** (with **Golden Ratio** $\phi = (\sqrt{5} + 1) / 2 = 1.618\dots$)

We will show this extending

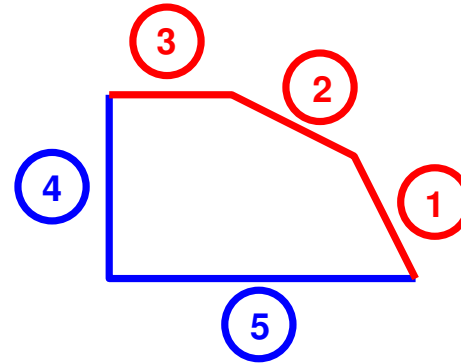
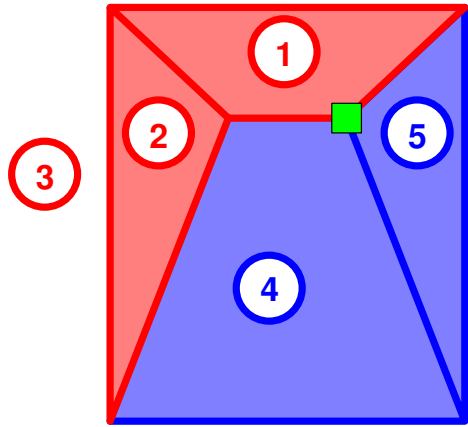
[Morris 1994] - exponentially long Lemke paths
(finds symmetric equilibria of symmetric games)

[von Stengel 1999] - games with many equilibria

using **dual cyclic polytopes**

Vertices as bit patterns

P



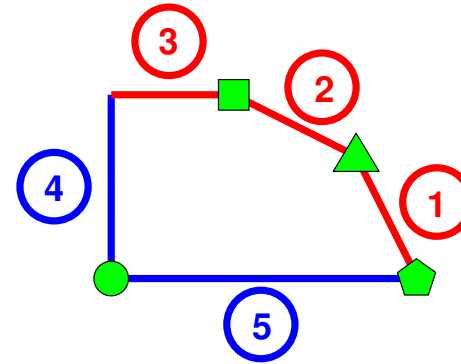
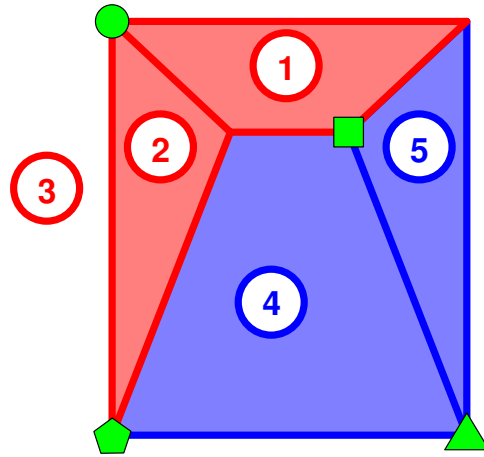
Q

	1	2	3	4	5
	1	1	1	0	0
	1	1	0	1	0
	1	0	1	0	1
■	1	0	0	1	1
	0	0	1	1	1
	0	1	1	1	0

	1	2	3	4	5
	0	0	0	1	1
	0	0	1	1	0
	0	1	1	0	0
	1	1	0	0	0
	1	0	0	0	1

Vertices as bit patterns

P



Q

	1	2	3	4	5		1	2	3	4	5
●	1	1	1	0	0		0	0	0	1	1
	1	1	0	1	0		0	0	1	1	0
	1	0	1	0	1		0	1	1	0	0
■	1	0	0	1	1		1	1	0	0	0
▲	0	0	1	1	1		1	0	0	0	1
⬠	0	1	1	1	0						

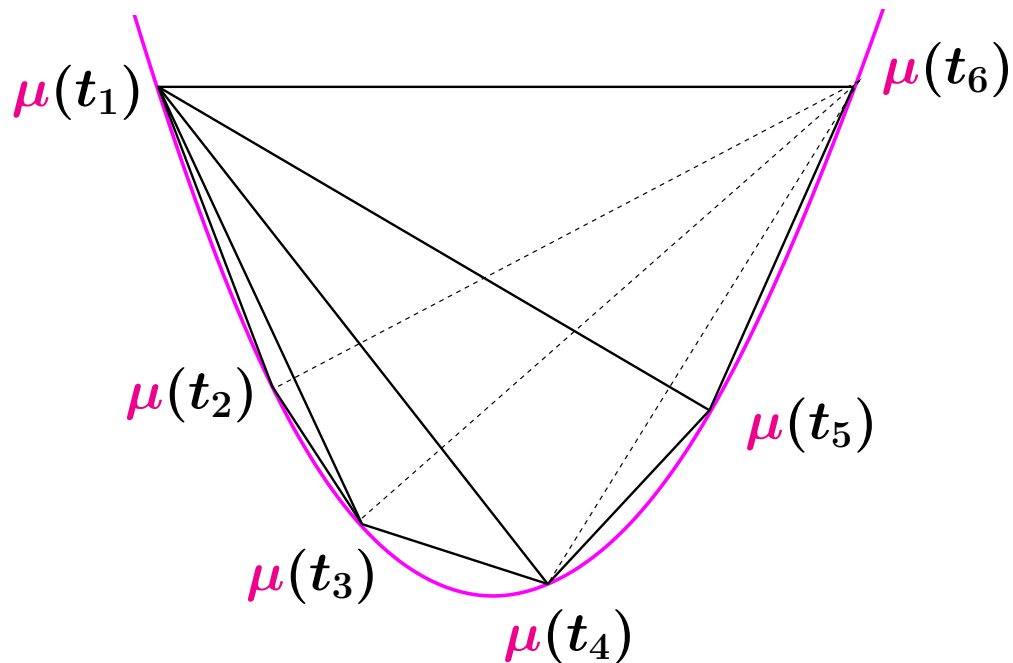
Cyclic polytopes

moment curve in \mathbb{R}^d

$$\mu : \mathbb{R} \rightarrow \mathbb{R}^d \quad t \mapsto \mu(t) = (t, t^2, \dots, t^d)^\top.$$

cyclic polytope in dim d with N vertices: $t_1 < t_2 < \dots < t_N$

$$C_d(N) := \text{conv}\{\mu(t_1), \dots, \mu(t_N)\}$$

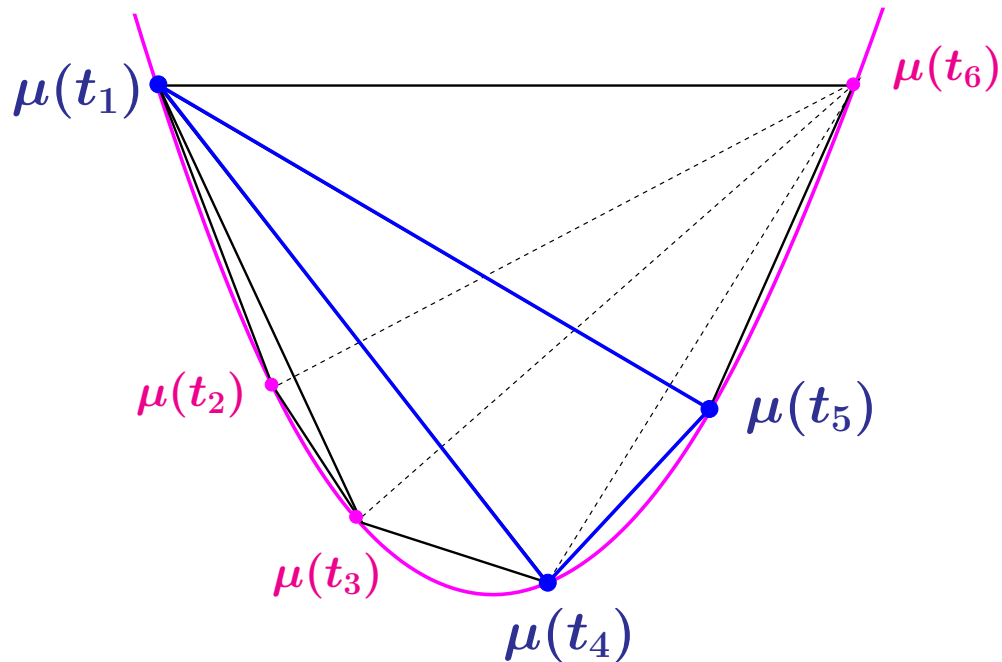


Facets of $C_d(N)$

Any d of the vertices $\mu(t_1), \dots, \mu(t_N)$ define hyperplane F in \mathbf{R}^d .

F facet \iff all **other** vertices are on one side of F

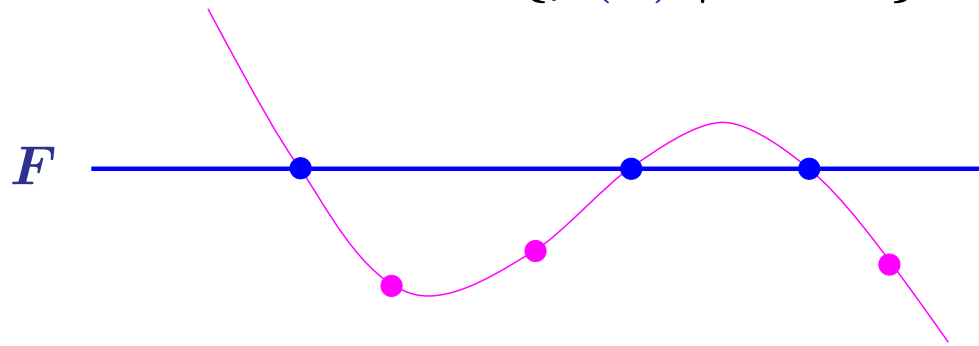
Example: $C_3(6)$, vertices **100110**



Gale's Evenness condition

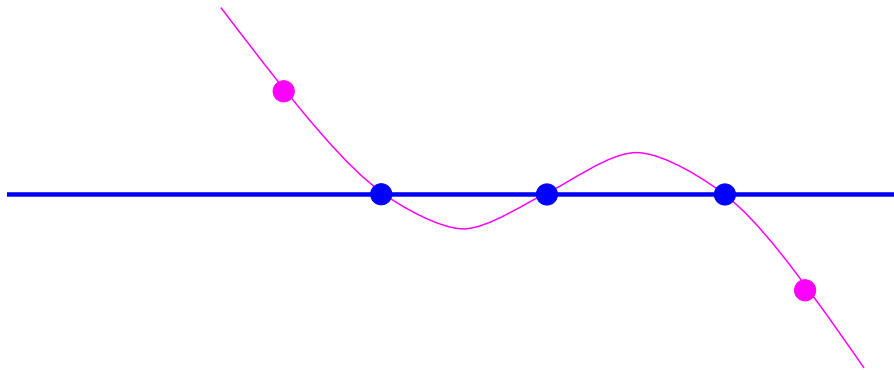
bitstring $s = s_1 s_2 \dots s_N$, $s_i \in \{0, 1\}$ e.g. **100110**

defines facet $F = \text{conv}\{\mu(t_i) \mid s_i = 1\}$ of $C_d(N)$



\iff s has only even-length substrings **0110**, **011110**, **01111110**,

forbidden: substrings **010**, **01110**, ... of odd length.

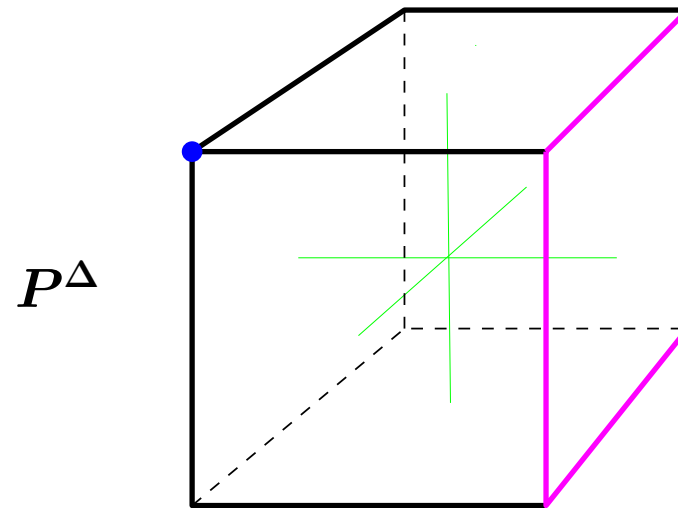
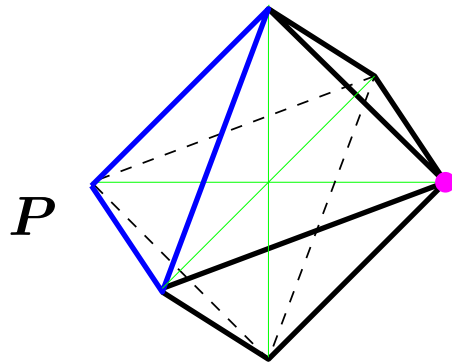


Polar polytopes

$$P = \text{conv}\{c_1, \dots, c_N\}, \quad 0 \in \text{int}(P) \quad \text{vertices } c_i$$

polar polytope

$$P^\Delta = \{z \mid c_1^\top z \leq 1, \dots, c_N^\top z \leq 1\} \quad \text{facets } \{z \in P^\Delta \mid c_i^\top z = 1\}$$



Dual cyclic polytopes

- vertices = strings of **N** bits with **d** bits "1",
- **no odd** substrings 010, 01110, 0111110, . . .
[Gale evenness]

Example: **d=4**, N=6 **d=2**, N=6 (**4** × **2** game)

111100	000011
111001	000110
110110	001100
110011	011000
101101	110000
100111	100001
011110	
011011	
001111	

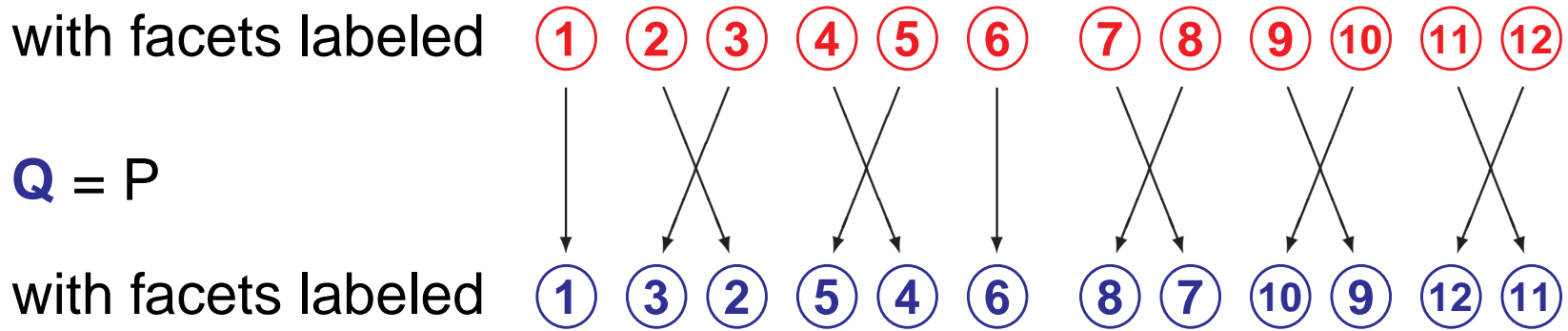
Vertices of $C_d(2d)^\Delta$ and complementarity

vertex no.	defining facets	labels (example)
1	00001111	
2	00011011	
3	00011110	
4	00110011	
5	00110110	
6	00111100	
7	01100011	
8	01100110	② ③ ⑥ ⑦
9	01101100	
10	01111000	
11	10000111	
12	10001101	
13	10011001	① ④ ⑤ ⑧
14	10110001	
15	11000011	
16	11000110	
17	11001100	
18	11011000	
19	11100001	
20	11110000	

$C_4(8)^\Delta$

Permuted labels

P = dual cyclic polytope in dimension **d** with **2d** facets



only **one** non-artificial equilibrium:

0 0 0 0 0 1 1 1 1 1 1

1 1 1 1 1 0 0 0 0 0 0

Lemke–Howson will take long to find it!

Lemke-Howson on dual cyclic polytopes

P								Q								
①	②	③	④	⑤	⑥	⑦	⑧	①	③	②	④	⑥	⑤	⑧	⑦	
1	1	1	1	0	0	0	0	0	0	0	0	0	1	1	1	1

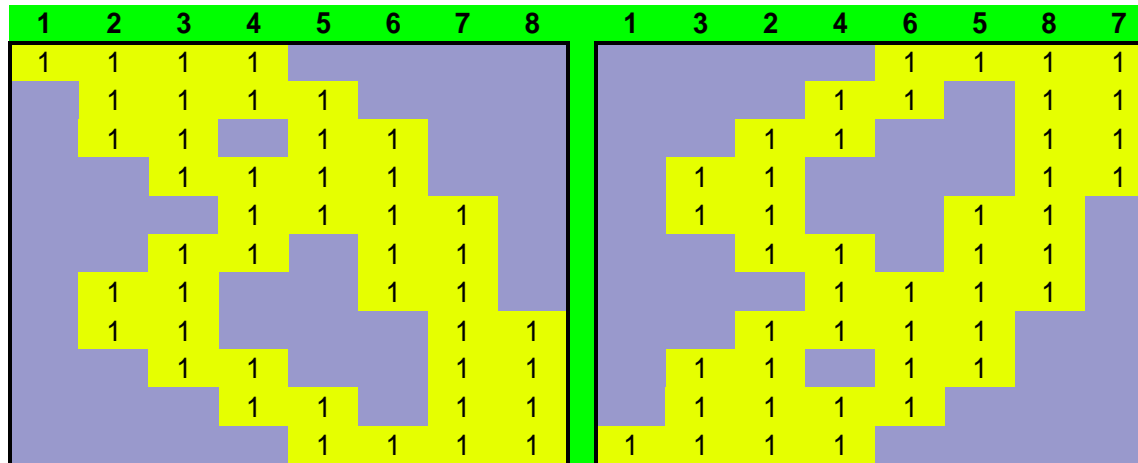
Lemke-Howson on dual cyclic polytopes

P								Q							
①	②	③	④	⑤	⑥	⑦	⑧	①	③	②	④	⑥	⑤	⑧	⑦
1	1	1	1	0	0	0	0	0	0	0	0	1	1	1	1
0	1	1	1	1	0	0	0	0	0	0	1	1	0	1	1

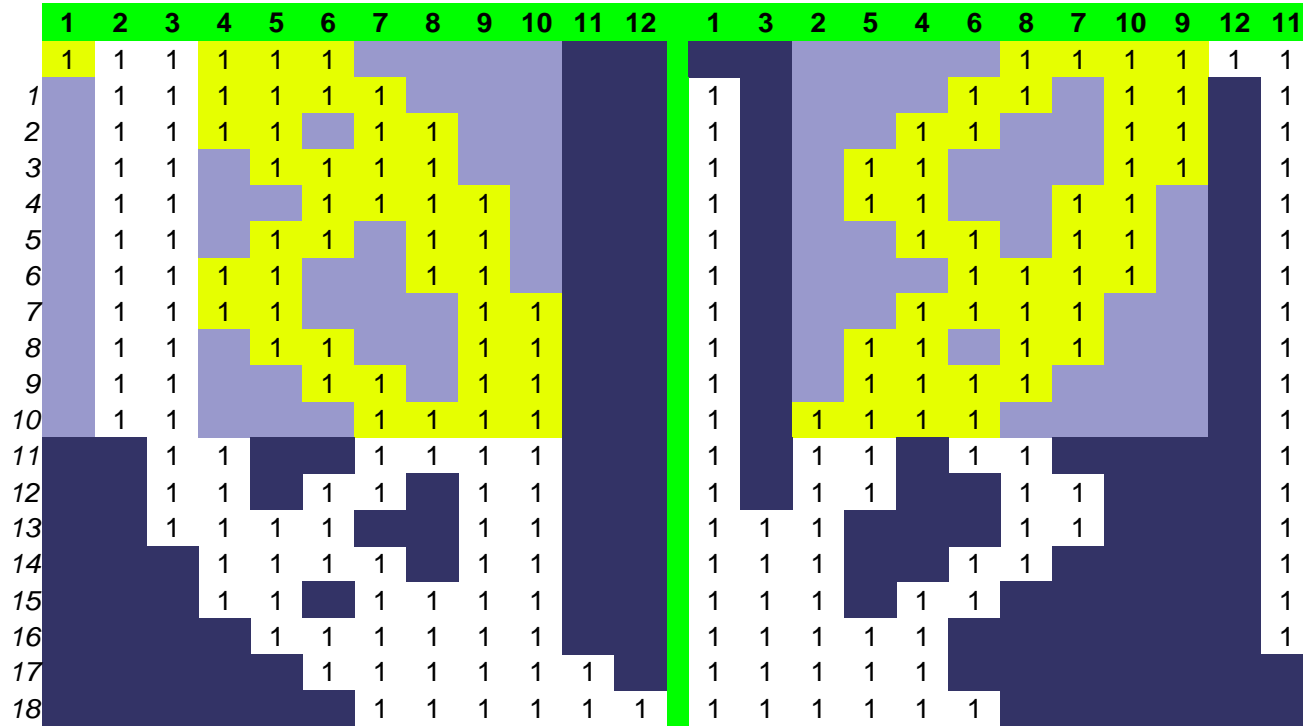
Lemke-Howson on dual cyclic polytopes

P								Q							
①	②	③	④	⑤	⑥	⑦	⑧	①	③	②	④	⑥	⑤	⑧	⑦
1	1	1	1	0	0	0	0	0	0	0	0	1	1	1	1
0	1	1	1	1	0	0	0	0	0	0	1	1	0	1	1
0	1	1	0	1	1	0	0	0	0	1	1	0	0	1	1
0	0	1	1	1	1	0	0	0	1	1	0	0	0	1	1
0	0	0	1	1	1	1	0	0	1	1	0	0	1	1	0
0	0	1	1	0	1	1	0	0	0	1	1	0	1	1	0
0	1	1	0	0	1	1	0	0	0	0	1	1	1	1	0
0	1	1	0	0	0	1	1	0	0	1	1	1	1	0	0
0	0	1	1	0	0	1	1	0	1	1	0	1	1	0	0
0	0	0	1	1	0	1	1	0	1	1	1	1	0	0	0
0	0	0	0	1	1	1	1	1	1	1	1	0	0	0	0

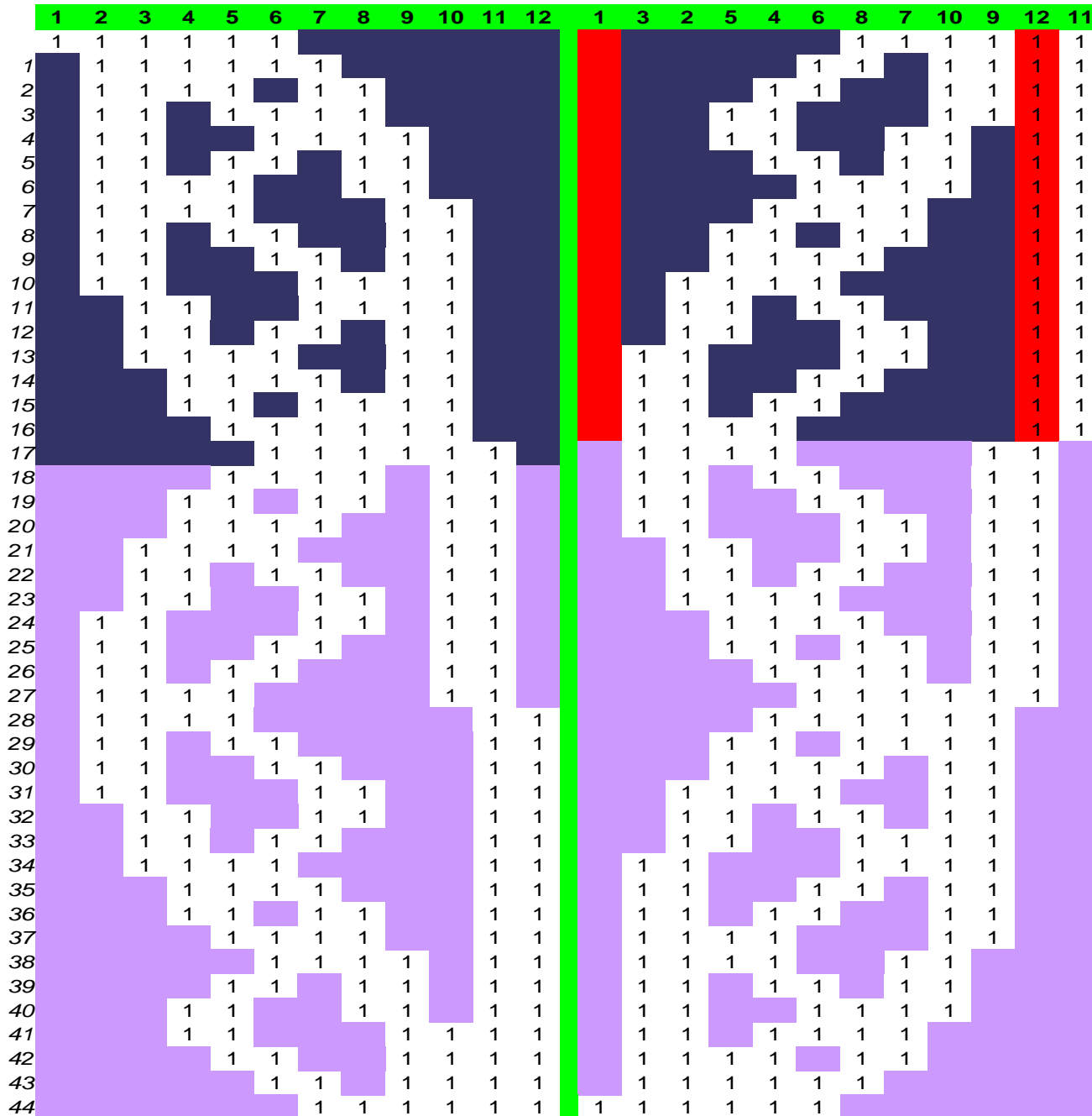
$A(4) = \text{path for } d=4, \text{ label } 1$



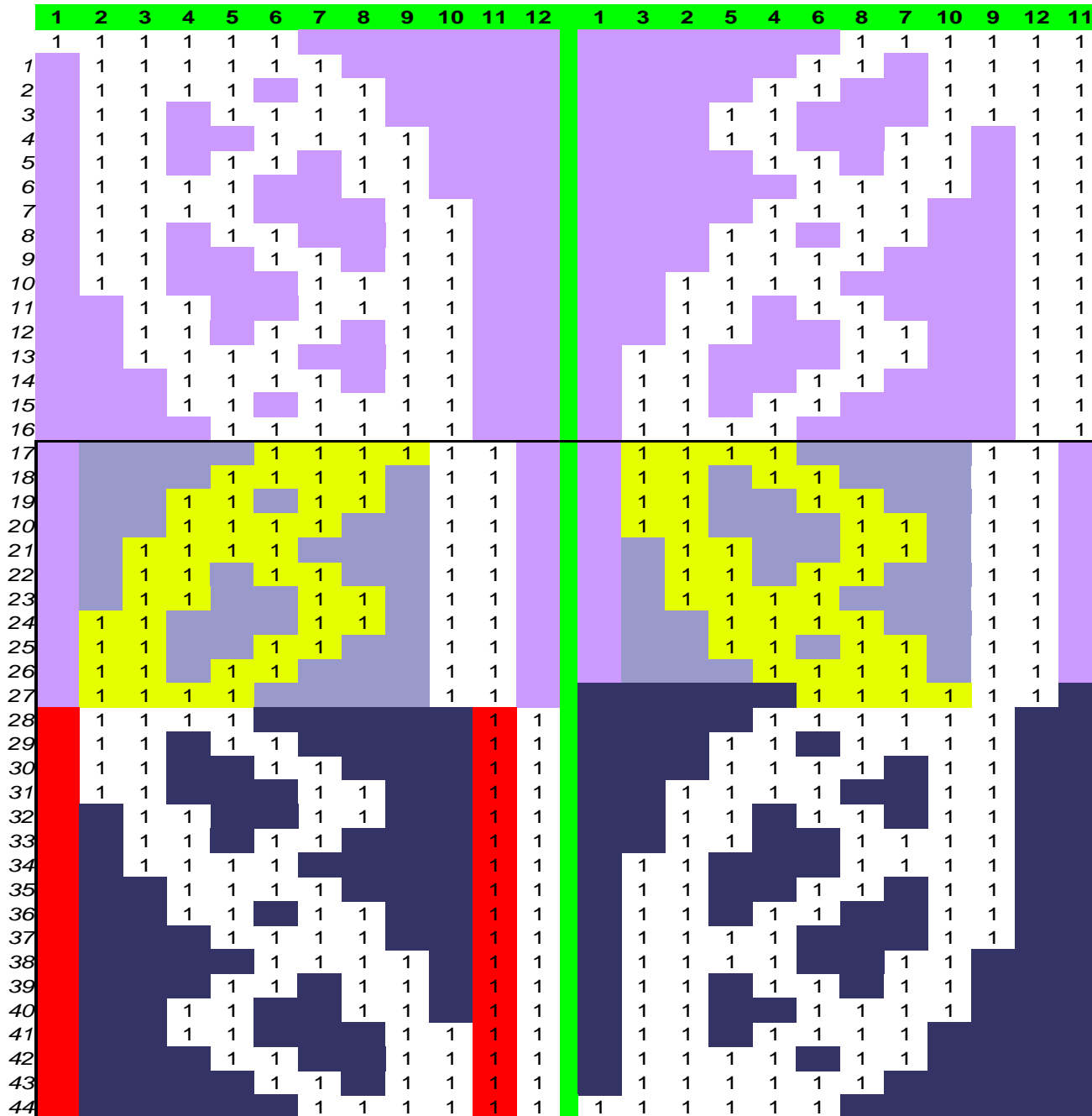
A(4) is prefix of B(6)



B(6) is prefix of A(6)



Suffix of $A(6) = C(6) = A(4)+B(6)$



Recurrences for longest paths

$A(d)$ = LH path dropping label 1 in dim d

$B(d)$ = LH path dropping label $2d$ in dim d

$C(d)$ = suffix of $A(d)$

lengths of

$B(2)$ $C(2)$ $A(2)$ $B(4)$ $C(4)$ $A(4)$ $B(6)$ $C(6)$ $A(6)$. . .

are the **Fibonacci** numbers

2 3 5 8 13 21 34 55 89 . . .

Exponential path lengths

longest paths: drop label 1 or 2d, paths A(d), B(d)

path length $\Omega(\phi^{3d/2})$

with Golden Ratio $\phi = (\sqrt{5} + 1) / 2 = 1.618\dots$

shortest paths: drop label 3d/2, path $B(d/2)+B(d/2+2)$

path length $\Omega(\phi^{3d/4}) = \Omega(1.434\dots^d)$

Summary and extensions

- NE of a bimatrix game = combinatorial **polytope** problem
- **label** dual cyclic polytopes,
equilibrium at end of **exponentially long** paths
- **but**: fully mixed equilibrium easily **guessed**
by support enumeration algorithms
- can extend to **d** × **2d** games with **hard-to-guess**
support (exponentially many guesses on average)
and exponentially long paths

The 1984 song „The longest time**“ by **Billy Joel** was given the following „computer science“ version by **Daniel Barrett**, who wrote it as a graduate student at Johns Hopkins University, „on May 1, 1988, during a difficult Algorithms II final exam“, and subsequently recorded it.**

**Woh oh-oh-oh find the longest path
Woh oh-oh find the longest path.**

**If you say P is NP tonight
there would still be
papers left to write
I have a weakness
I'm addicted to completeness
and I keep searching
for the longest path.**

**The algorithm I would like to see
is of polynomial degree
but it's elusive
nobody has found conclusive
evidence that we can find
the longest path.**

**I have been
hard working for so long
I swear it's right
and he marks it wrong
somehow I feel
sorry when it's done
GPA 2.1
is more than I hope for**

**Garey, Johnson,
Karp and other men (and women, too)
try to make it order $N \log N$
am I a mad fool
if I spend my life in grad school
forever following the longest path**

**Woh oh-oh-oh find the longest path
Woh oh-oh find the longest path
Woh oh-oh find the longest path.**