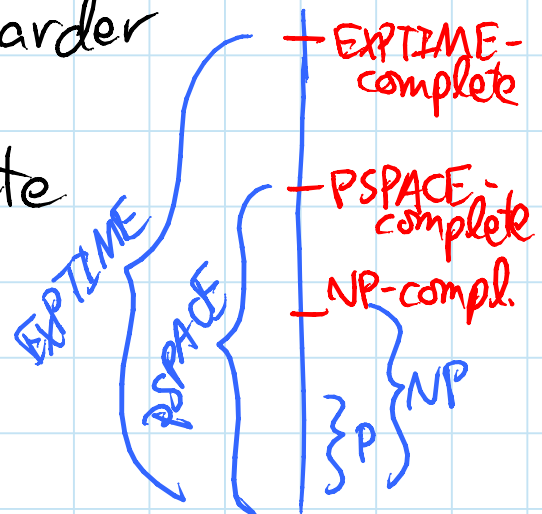


# Playing Games with Algorithms:

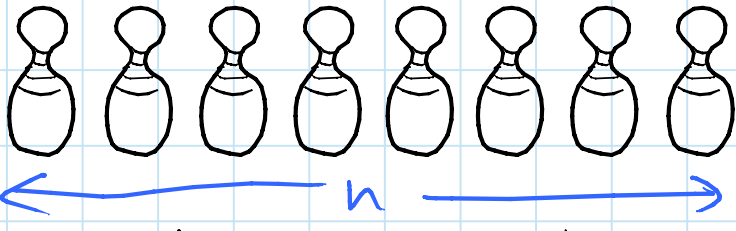
[http://erikdemaine.org/papers/AlgGameTheory\\_GONC3/](http://erikdemaine.org/papers/AlgGameTheory_GONC3/)

- most games are hard to play well:
- Chess is EXPTIME-complete:
  - $n \times n$  board, arbitrary position
  - need exponential ( $c^n$ ) time to find a winning move (if there is one)
  - also: as hard as all games (problems) that need exponential time
- Checkers is EXPTIME-complete
  - $\Rightarrow$  Chess & Checkers are the "same" computationally: solving one solves other (PSPACE-complete if draw after poly. moves)
- Shogi (Japanese Chess) is EXPTIME-complete
- Japanese Go is EXPTIME-complete
  - U.S. Go might be harder
- Othello is PSPACE-complete
  - conjecture requires exponential time, but not sure (implied by  $P \neq NP$ )



- can solve some games fast:  
in "polynomial time"  $\sim n^c$  (mostly 1D)

TODAY: 1D impartial games via Dynamic Programming

Kayles:  [Dudeney 1908]

- move = hit one or two adjacent pins
- last player to move wins (normal play)

Let's play!

First-player win: SYMMETRY STRATEGY

- move to split into two equal halves  
(1 pin if odd, 2 if even)
- whatever opponent does, do same  
in other half

$(K_n + K_n = 0 \dots \text{just like Nim})$

But what if we played the sum of  
2 Kayles games?  
or Kayles + Nim?

$\hookrightarrow$  can make  
a move in  
either game  
 $\sim$  still last player  
to move wins

Impartial game, so Sprague-Grundy Theory  
says Kayles  $\equiv$  Nim somehow

$$\text{followers}(K_n) = \{K_i + K_{n-i-1} \mid i=0, 1, \dots, n-1\} \\ \cup \{K_i + K_{n-i-2} \mid i=0, 1, \dots, n-2\}$$

→ one pin  
→ two pins

Sprague-Grundy value / number ↓

$$\Rightarrow g(K_n) = \text{mex}(g(\text{followers}(K_n))) \\ = \text{mex} \left\{ g(K_i + K_{n-i-1}) \mid i=0, 1, \dots, n-1 \right\} \\ \cup \left\{ g(K_i + K_{n-i-2}) \mid i=0, 1, \dots, n-2 \right\}$$

→ nim sum / binary XOR

$$- g(X+Y) = g(x) \oplus g(y)$$

$$\Rightarrow g(K_n) = \text{mex} \left\{ g(K_i) \oplus g(K_{n-i-1}) \mid i=0, 1, \dots, n-1 \right\} \\ \cup \left\{ g(K_i) \oplus g(K_{n-i-2}) \mid i=0, 1, \dots, n-2 \right\}$$

RECURRENCE - write what you want  
in terms of smaller things

How do we compute it?

$$g(K_0) = 0$$

$$g(K_1) = \text{mex} \{ g(K_0) \oplus g(K_0) \}$$

$$0 \oplus 0 = 0$$

$$= 1$$

(BASE CASE)

$$\begin{aligned}
 g(K_2) &= \text{mex} \{ \underset{0}{g(K_0)} \oplus \underset{1}{g(K_1)}, \\
 &\quad \underset{0}{g(K_0)} \oplus \underset{0}{g(K_0)} \} \\
 &= 2
 \end{aligned}$$

So e.g.  $K_2 + *2 = 0 \Rightarrow 2^{\text{nd}}$  player win

$$\begin{aligned}
 g(K_3) &= \text{mex} \{ \underset{0}{g(K_0)} \oplus \underset{2}{g(K_2)}, \\
 &\quad \underset{0}{g(K_0)} \oplus \underset{1}{g(K_1)}, \\
 &\quad \underset{1}{g(K_1)} \oplus \underset{1}{g(K_1)} \} \\
 &= 3
 \end{aligned}$$

$$\begin{aligned}
 g(K_4) &= \text{mex} \{ \underset{0}{g(K_0)} \oplus \underset{3}{g(K_3)}, \\
 &\quad \underset{0}{g(K_0)} \oplus \underset{2}{g(K_2)}, \\
 &\quad \underset{1}{g(K_1)} \oplus \underset{2}{g(K_2)}, \\
 &\quad \underset{1}{g(K_1)} \oplus \underset{1}{g(K_1)} \} \\
 &= 1
 \end{aligned}$$

In general: if we compute  $g(K_0), g(K_1), g(K_2), \dots$  in order, then we always use values that we've already computed (because smaller)

- in Python, can do this with for loop:

```
k = {}
for n in range(0, 1000):
    k[n] = mex ([k[i] ^ k[n-i-1] for i in range(n)] +
                [k[i] ^ k[n-i-2] for i in range(n-1)])
    print n, "-", k[n]

def mex(nimbers):
    nimbers = set(nimbers)
    n = 0
    while n in nimbers:
        n = n + 1
    return n
```

960 - 4	972 - 4	984 - 4
961 - 1	973 - 1	985 - 1
962 - 2	974 - 2	986 - 2
963 - 8	975 - 8	987 - 8
964 - 1	976 - 1	988 - 1
965 - 4	977 - 4	989 - 4
966 - 7	978 - 7	990 - 7
967 - 2	979 - 2	991 - 2
968 - 1	980 - 1	992 - 1
969 - 8	981 - 8	993 - 8
970 - 2	982 - 2	994 - 2
971 - 7	983 - 7	995 - 7

periodic mod 12!  
(starting at 72)  
(Guy & Smith 1972)

DYNAMIC PROGRAMMING

How fast? to compute  $g(K_n)$ :

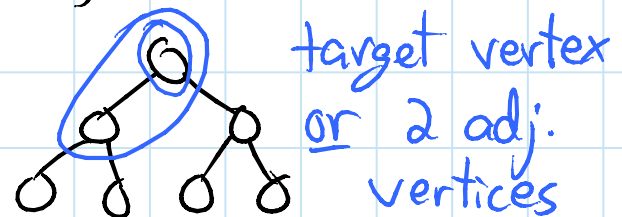
- look up  $\approx 4n$  previous numbers
- compute  $\approx 2n$  nimsums (XOR)
- compute one mex on  $\approx 2n$  numbers
- call all this  $O(n)$  work "order  $n$ "

- need to do this for  $n = 0, 1, \dots, m$   
 $\Rightarrow \sum_{n=0}^m O(n) = O\left(\sum_{n=0}^m n\right) = O\left(\frac{m(m+1)}{2}\right) = \underline{\underline{O(m^2)}}$

POLYNOMIAL TIME - GOOD

Variations: dynamic programming also works for:

- Kayles on a cycle  
(1 move reduces to regular Kayles  
 $\Rightarrow$  2<sup>nd</sup> player win)
- Kayles on a tree:



- Kayles with various ball sizes:  
hit 1 or 2 or 3 pins  
(still 1<sup>st</sup> player win)

↓  
also green  
Hackenbush  
trees

Cram: impartial Domineering

- board =  $m \times n$  rectangle possibly with holes
- move = place a domino (make  $1 \times 2$  hole)

Symmetry strategies:

[Gardner 1986]

- even  $\times$  even: reflect in both axes  
 $\Rightarrow$  2<sup>nd</sup> player win
- even  $\times$  odd: play center 2  $\square$ s  
then reflect in both axes  
 $\Rightarrow$  1<sup>st</sup> player win
- odd  $\times$  odd: **OPEN** who wins?

Linear Cram =  $1 \times n$  cram

- easy with dynamic programming
- also periodic [Guy & Smith 1956]

- $1 \times 3$  blocks still easy with DP
- **OPEN**: periodic?

Horizontal Cram:  $\square \square$  only

$\Rightarrow$  sum of linear crams!

$2 \times n$  Cram: Nimbers

**OPEN**

$3 \times n$  Cram: winner

**OPEN**

Let's play!

(dynamic programming doesn't work)