# Introduction to Combinatorial Game Theory 

Tom Plick

Drexel MCS Society<br>April 10, 2008

A combinatorial game is a two-player game with the following properties:

- alternating play
- perfect information
- no element of chance
- guaranteed ending

A player left without a move loses the game.

## Impartial games

An impartial game is one in which both players have the same moves available to them in a given position.
(Most board games are partisan - e.g. in chess, I can only move my pieces, you can only move yours.)

## Impartial games

An impartial game is one in which both players have the same moves available to them in a given position.
(Most board games are partisan - e.g. in chess, I can only move my pieces, you can only move yours.)

So....a game is uniquely determined by the positions to which it allows us to move.

## The game of Nim

There are several heaps of sticks. A move consists of selecting a heap and removing one or more sticks from it. The winner is the player who takes the last stick.

| IIIII | IIIII | IIIII |
| :---: | :---: | :---: |
|  | IIII | IIIII |
| $(5)$ | $(9)$ | $(10)$ |

## The game of Nim

There are several heaps of sticks. A move consists of selecting a heap and removing one or more sticks from it. The winner is the player who takes the last stick.

| IIIII | IIIII | IIIII |
| :---: | :---: | :---: |
|  | IIII | IIIII |
| $(5)$ | $(9)$ | $(10)$ |

Note that each move affects exactly one heap.

Formally:
An impartial game $G$ consists of a set of impartial games, called the options of $G$. A move in $G$ consists of selecting one of its options.
(We will only consider finite games for now.)

Formally:
An impartial game $G$ consists of a set of impartial games, called the options of $G$. A move in $G$ consists of selecting one of its options.
(We will only consider finite games for now.)
Consider....a tree is a set of trees.


We use a tree as an way of representing the games abstractly. We start at the root, and we play by moving from the root to one of its children.

## Let's build some games

- $B_{0}$, the empty set:


## Let's build some games

- $B_{0}$, the empty set:
- $B_{1}$, the set containing the empty set:


## Let's build some games

- $B_{0}$, the empty set:
- $B_{1}$, the set containing the empty set:
- $B_{2}$, the set containing these two:



## Let's build some games

- $B_{0}$, the empty set:
- $B_{1}$, the set containing the empty set:
- $B_{2}$, the set containing these two:
- $B_{3}$, the set containing these three:



## Let's build some games

- $B_{0}$, the empty set:
- $B_{1}$, the set containing the empty set:
- $B_{2}$, the set containing these two:
- $B_{3}$, the set containing these three:


These are Nim-heaps: from $B_{k}$, one can move to $B_{0}, B_{1}, \ldots, B_{k-1}$. These trees correspond to Nim-heaps of size $0_{\mathrm{v}} 1,2,3$.

## Who wins?



Each of the games above is either a win or a loss:

## Who wins?



Each of the games above is either a win or a loss:
$G$ is a win iff some option of $G$ is a loss.
$G$ is a loss iff no option of $G$ is a loss (or equivalently, iff every option of $G$ is a win).

## Who wins?



Each of the games above is either a win or a loss:
$G$ is a win iff some option of $G$ is a loss.
$G$ is a loss iff no option of $G$ is a loss (or equivalently, iff every option of $G$ is a win).

You win by leaving your opponent a losing position.

## Addition. . .

We model addition after Nim:
In $G \& H$, the player to move makes a move in either $G$ or $H$, but not both.

Thus $G \& H=\{G \& x\}_{x \in H} \cup\{y \& H\}_{y \in G}$.

## Addition. . .

We model addition after Nim:
In $G \& H$, the player to move makes a move in either $G$ or $H$, but not both.

Thus $G \& H=\{G \& x\}_{x \in H} \cup\{y \& H\}_{y \in G}$.
A Nim game is the sum of its heaps.

## Addition. . .

We model addition after Nim:
In $G \& H$, the player to move makes a move in either $G$ or $H$, but not both.

Thus $G \& H=\{G \& x\}_{x \in H} \cup\{y \& H\}_{y \in G}$.
A Nim game is the sum of its heaps.
$B_{0}$ is an identity element:
$B_{0} \& B_{0}=B_{0}$,
and by induction:
$G \& B_{0}=\left\{x \& B_{0}\right\}_{x \in G}=\{x\}_{x \in G}=G$ for any $G$.
We will use $\mathbf{0}$ to denote $B_{0}$.

## Who wins. . . ?

(We start at the root in each tree, and at each turn, we move in one of the trees.)

- $B_{1} \& B_{1}$ ?



## Who wins. . . ?

(We start at the root in each tree, and at each turn, we move in one of the trees.)

- $B_{1} \& B_{1}$ ?
- $B_{2} \& B_{1}$ ?




## Who wins. . .?

(We start at the root in each tree, and at each turn, we move in one of the trees.)

- $B_{1} \& B_{1}$ ?

- $B_{2} \& B_{1}$ ?


In the top sum, the first player loses; in the bottom sum, the first player wins!

## Congruence

$B_{1}$ and $B_{2}$ are both wins, but they behave differently when added to $B_{1}$.

To classify games beyond "win" or "loss," we define congruence between games.

## Congruence

$B_{1}$ and $B_{2}$ are both wins, but they behave differently when added to $B_{1}$.

To classify games beyond "win" or "loss," we define congruence between games.

Two impartial games $G$ and $H$ are congruent iff for all games $x$, $G \& x$ and $H \& x$ have the same outcome.

Note that $G \cong G$ for all $G$.
But $G \cong H$ does not imply $G=H$. e.g. for all $x$,


## Properties of congruence

Congruence is reflexive, symmetric, and transitive.

## Properties of congruence

Congruence is reflexive, symmetric, and transitive.
Addition is commutative:
$G \& H=\{G \& x\}_{x \in H} \cup\{y \& H\}_{y \in G}$.
$H \& G=\{x \& G\}_{x \in H} \cup\{H \& y\}_{y \in G}$.
By induction, we assume that $G \& x=x \& G$ and $H \& y=y \& H$. Then the sets $G \& H$ and $H \& G$ are equal.

## Properties of congruence

Congruence is reflexive, symmetric, and transitive.
Addition is commutative:
$G \& H=\{G \& x\}_{x \in H} \cup\{y \& H\}_{y \in G}$.
$H \& G=\{x \& G\}_{x \in H} \cup\{H \& y\}_{y \in G}$.
By induction, we assume that $G \& x=x \& G$ and $H \& y=y \& H$. Then the sets $G \& H$ and $H \& G$ are equal.

By a similar argument, addition is also associative.

## Addition preserves congruence

Theorem. Suppose $G_{1} \cong G_{2}$. Then $G_{1} \& H \cong G_{2} \& H$.

## Addition preserves congruence

Theorem. Suppose $G_{1} \cong G_{2}$. Then $G_{1} \& H \cong G_{2} \& H$.
Proof. Given $x$, let $y=H \& x$. Then
$\left(G_{1} \& H\right) \& x \cong G_{1} \&(H \& x)=G_{1} \& y$, $\left(G_{2} \& H\right) \& x \cong G_{2} \&(H \& x)=G_{2} \& y$.

## Addition preserves congruence

Theorem. Suppose $G_{1} \cong G_{2}$. Then $G_{1} \& H \cong G_{2} \& H$.
Proof. Given $x$, let $y=H \& x$. Then
$\left(G_{1} \& H\right) \& x \cong G_{1} \&(H \& x)=G_{1} \& y$, $\left(G_{2} \& H\right) \& x \cong G_{2} \&(H \& x)=G_{2} \& y$.

Since $G_{1} \& y$ and $G_{2} \& y$ have the same outcome, $\left(G_{1} \& H\right) \& x$ and $\left(G_{2} \& H\right) \& x$ have the same outcome.
Thus $G_{1} \& H \cong G_{2} \& H$.

## Addition preserves congruence

Theorem. Suppose $G_{1} \cong G_{2}$. Then $G_{1} \& H \cong G_{2} \& H$.
Proof. Given $x$, let $y=H \& x$. Then
$\left(G_{1} \& H\right) \& x \cong G_{1} \&(H \& x)=G_{1} \& y$, $\left(G_{2} \& H\right) \& x \cong G_{2} \&(H \& x)=G_{2} \& y$.

Since $G_{1} \& y$ and $G_{2} \& y$ have the same outcome, $\left(G_{1} \& H\right) \& x$ and $\left(G_{2} \& H\right) \& x$ have the same outcome.
Thus $G_{1} \& H \cong G_{2} \& H$.
Corollary. If $G_{1} \cong G_{2}$ and $H_{1} \cong H_{2}$, then $G_{1} \& H_{1} \cong G_{2} \& H_{2}$.

Identity

Adding a loss $L$ to $G$ does not change the outcome of $G$ :
Every option of $L$ is a win.

$$
G \& L=\{g \& L\}_{g \in G} \cup\{G \& \ell\}_{\ell \in L}
$$

## Identity

Adding a loss $L$ to $G$ does not change the outcome of $G$ :
Every option of $L$ is a win.
$G \& L=\{g \& L\}_{g \in G} \cup\{G \& \ell\}_{\ell \in L}$.
If $G$ is a win, some $g$ is a loss, so $g \& L$ is a loss by induction, and
$G \& L$ is a win.
If $G$ is a loss, then every $g$ is a win, so that by induction, every $g \& L$ and every $G \& \ell$ is a win. Thus, $G \& L$ is a loss.

## Identity

Adding a loss $L$ to $G$ does not change the outcome of $G$ :
Every option of $L$ is a win.
$G \& L=\{g \& L\}_{g \in G} \cup\{G \& \ell\}_{\ell \in L}$.
If $G$ is a win, some $g$ is a loss, so $g \& L$ is a loss by induction, and $G \& L$ is a win.
If $G$ is a loss, then every $g$ is a win, so that by induction, every $g \& L$ and every $G \& \ell$ is a win. Thus, $G \& L$ is a loss.

Every loss is an identity element.
So all losses are congruent, and we obtain that

$$
G \cong \mathbf{0} \text { iff } G \text { is a loss. }
$$

## Negation

The negative of a number $x$ is the $y$ such that $x+y=0$. Does an impartial game $G$ have a negation?

## Negation

The negative of a number $x$ is the $y$ such that $x+y=0$. Does an impartial game $G$ have a negation?

Theorem. Every impartial game $G$ is its own negation; viz., $G \& G \cong \mathbf{0}$.

## Negation

The negative of a number $x$ is the $y$ such that $x+y=0$. Does an impartial game $G$ have a negation?

Theorem. Every impartial game $G$ is its own negation; viz., $G \& G \cong \mathbf{0}$.

Proof. If $G$ is a loss, it is apparent that $G \& G$ is a loss. Let us suppose then that $G$ is a win.

Write $G=\left\{g_{1}, g_{2}, g_{3}, \ldots, g_{n}\right\}$. By induction, we assume that the theorem holds for $g_{1}, g_{2}, g_{3}, \ldots, g_{n}$.

$$
\begin{aligned}
G \& G & =\left\{g_{1} \& G, g_{2} \& G, \ldots, g_{n} \& G\right\} \\
& =\left\{\left\{g_{1} \& g_{1}, \ldots\right\},\left\{g_{2} \& g_{2}, \ldots\right\}, \ldots,\left\{g_{n} \& g_{n}, \ldots\right\}\right\}
\end{aligned}
$$

$$
\begin{aligned}
G \& G & =\left\{g_{1} \& G, g_{2} \& G, \ldots, g_{n} \& G\right\} \\
& =\left\{\left\{g_{1} \& g_{1}, \ldots\right\},\left\{g_{2} \& g_{2}, \ldots\right\}, \ldots,\left\{g_{n} \& g_{n}, \ldots\right\}\right\}
\end{aligned}
$$

Each game of the form $\left\{g_{i} \& g_{i}, \ldots\right\}$ contains a loss, and thus is a win.

Consequently, each member of $G \& G$ is a win, which makes $G \& G$ a loss.

$$
\begin{aligned}
G \& G & =\left\{g_{1} \& G, g_{2} \& G, \ldots, g_{n} \& G\right\} \\
& =\left\{\left\{g_{1} \& g_{1}, \ldots\right\},\left\{g_{2} \& g_{2}, \ldots\right\}, \ldots,\left\{g_{n} \& g_{n}, \ldots\right\}\right\}
\end{aligned}
$$

Each game of the form $\left\{g_{i} \& g_{i}, \ldots\right\}$ contains a loss, and thus is a win.

Consequently, each member of $G \& G$ is a win, which makes $G \& G$ a loss.

Therefore $G \& G \cong \mathbf{0}$, q.e.d.

## Negation, again

Consider playing the game $G \& G$. Suppose your opponent moves in the left subgame. What move should you play now?


## Negation, again

Consider playing the game $G \& G$. Suppose your opponent moves in the left subgame. What move should you play now?

strategy-stealing

## Composition

We have seen that two congruent games behave the same in addition. We prove now that they behave the same way everywhere else, too:

## Composition

We have seen that two congruent games behave the same in addition. We prove now that they behave the same way everywhere else, too:

Theorem. If $G=\left\{g_{1}, g_{2}, \ldots, g_{n}\right\}$ and $H=\left\{h_{1}, h_{2}, \ldots, h_{n}\right\}$, with $g_{1} \cong h_{1}, g_{2} \cong h_{2}, \ldots, g_{n} \cong h_{n}$, then $G \cong H$. (Sets of congruent games are congruent.)

Proof.

$$
\begin{aligned}
G \& H=\{ & g_{1} \& H, g_{2} \& H, \ldots, g_{n} \& H \\
& \left.G \& h_{1}, G \& h_{2}, \ldots, G \& h_{n}\right\} \\
=\{ & \left\{g_{1} \& h_{1}, \ldots\right\},\left\{g_{2} \& h_{2}, \ldots\right\}, \ldots,\left\{g_{n} \& h_{n}, \ldots\right\} \\
& \left.\left\{g_{1} \& h_{1}, \ldots\right\},\left\{g_{2} \& h_{2}, \ldots\right\}, \ldots,\left\{g_{n} \& h_{n}, \ldots\right\}\right\} .
\end{aligned}
$$

Proof.

$$
\begin{aligned}
G \& H=\{ & g_{1} \& H, g_{2} \& H, \ldots, g_{n} \& H \\
& \left.G \& h_{1}, G \& h_{2}, \ldots, G \& h_{n}\right\} \\
=\{ & \left\{g_{1} \& h_{1}, \ldots\right\},\left\{g_{2} \& h_{2}, \ldots\right\}, \ldots,\left\{g_{n} \& h_{n}, \ldots\right\}, \\
& \left.\left\{g_{1} \& h_{1}, \ldots\right\},\left\{g_{2} \& h_{2}, \ldots\right\}, \ldots,\left\{g_{n} \& h_{n}, \ldots\right\}\right\} .
\end{aligned}
$$

Each game of the form $\left\{g_{i} \& h_{i}, \ldots\right\}$ contains a loss, and thus is a win.

Consequently, each option of $G \& H$ is a win, which makes $G \& H$ a loss.

Proof.

$$
\begin{aligned}
G \& H=\{ & g_{1} \& H, g_{2} \& H, \ldots, g_{n} \& H \\
& \left.G \& h_{1}, G \& h_{2}, \ldots, G \& h_{n}\right\} \\
=\{ & \left\{g_{1} \& h_{1}, \ldots\right\},\left\{g_{2} \& h_{2}, \ldots\right\}, \ldots,\left\{g_{n} \& h_{n}, \ldots\right\}, \\
& \left.\left\{g_{1} \& h_{1}, \ldots\right\},\left\{g_{2} \& h_{2}, \ldots\right\}, \ldots,\left\{g_{n} \& h_{n}, \ldots\right\}\right\} .
\end{aligned}
$$

Each game of the form $\left\{g_{i} \& h_{i}, \ldots\right\}$ contains a loss, and thus is a win.

Consequently, each option of $G \& H$ is a win, which makes $G \& H$ a loss.

Therefore $G \& H \cong \mathbf{0}$, and $G \cong H$, q.e.d.

## Addition of Nim-heaps (Bouton, 1902)

Theorem. When $c$ is a power of 2 and $0 \leq d<c$, it holds that $B_{c} \& B_{d} \cong B_{c+d}$. e.g. $B_{8} \& B_{3} \cong B_{11}$.

## Addition of Nim-heaps (Bouton, 1902)

Theorem. When $c$ is a power of 2 and $0 \leq d<c$, it holds that $B_{c} \& B_{d} \cong B_{c+d}$.
e.g. $B_{8} \& B_{3} \cong B_{11}$.

Combined with the fact that $B_{k} \& B_{k} \cong \mathbf{0}$, we can use this theorem to add any two Nim-heaps:
e.g. $B_{22} \& B_{5} \cong B_{16} \& B_{4} \& B_{2} \& B_{4} \& B_{1} \cong B_{16} \& B_{2} \& B_{1} \cong B_{19}$.

Binary addition without carries:

## Addition of Nim-heaps (Bouton, 1902)

Theorem. When $c$ is a power of 2 and $0 \leq d<c$, it holds that $B_{c} \& B_{d} \cong B_{c+d}$.
e.g. $B_{8} \& B_{3} \cong B_{11}$.

Combined with the fact that $B_{k} \& B_{k} \cong \mathbf{0}$, we can use this theorem to add any two Nim-heaps:
e.g. $B_{22} \& B_{5} \cong B_{16} \& B_{4} \& B_{2} \& B_{4} \& B_{1} \cong B_{16} \& B_{2} \& B_{1} \cong B_{19}$.

Binary addition without carries: bitwise exclusive-OR

$$
B_{c} \& B_{d}=B_{(c \text { xor } d)} .
$$

Example. Suppose the theorem holds for all of $B_{8} \& B_{<3}$ and $B_{<8} \& B_{3}$.

Note that $\{0 \ldots 7\}$ xor 3 is still $\{0 \ldots 7\}$.

Example. Suppose the theorem holds for all of $B_{8} \& B_{<3}$ and $B_{<8} \& B_{3}$.

Note that $\{0 \ldots 7\}$ xor 3 is still $\{0 \ldots 7\}$. So

$$
\begin{aligned}
B_{8} \& B_{3}= & \left\{B_{0} \& B_{3}, B_{1} \& B_{3}, B_{2} \& B_{3}, \ldots, B_{7} \& B_{3}\right\} \\
& \cup\left\{B_{8} \& B_{0}, B_{8} \& B_{1}, B_{8} \& B_{2}\right\} \\
\cong & \left\{B_{0}, B_{1}, \ldots, B_{7}\right\} \cup\left\{B_{8}, B_{9}, B_{10}\right\} \\
\cong & B_{11} .
\end{aligned}
$$

Example. Suppose the theorem holds for all of $B_{8} \& B_{<3}$ and $B_{<8} \& B_{3}$.

Note that $\{0 \ldots 7\}$ xor 3 is still $\{0 \ldots 7\}$. So

$$
\begin{aligned}
B_{8} \& B_{3}= & \left\{B_{0} \& B_{3}, B_{1} \& B_{3}, B_{2} \& B_{3}, \ldots, B_{7} \& B_{3}\right\} \\
& \cup\left\{B_{8} \& B_{0}, B_{8} \& B_{1}, B_{8} \& B_{2}\right\} \\
\cong & \left\{B_{0}, B_{1}, \ldots, B_{7}\right\} \cup\left\{B_{8}, B_{9}, B_{10}\right\} \\
\cong & B_{11} .
\end{aligned}
$$

We can replace $B_{8}$ with $B_{c}$ for any $c$ that is a power of 2 , and replace $B_{3}$ with $B_{d}$ for $d<c$.

## The Sprague-Grundy theorem (1930s)

Theorem. An impartial game $G=\left\{g_{1}, g_{2}, g_{3}, \ldots, g_{n}\right\}$ is congruent to the smallest Nim-heap that is not congruent to any member of $G$.
e.g. The game $\left\{B_{0}, B_{1}, B_{3}\right\} \cong B_{2}$, since $B_{0}$ and $B_{1}$ are represented in the members of $G$ but $B_{2}$ is not.

## The Sprague-Grundy theorem (1930s)

Theorem. An impartial game $G=\left\{g_{1}, g_{2}, g_{3}, \ldots, g_{n}\right\}$ is congruent to the smallest Nim-heap that is not congruent to any member of $G$.
e.g. The game $\left\{B_{0}, B_{1}, B_{3}\right\} \cong B_{2}$, since $B_{0}$ and $B_{1}$ are represented in the members of $G$ but $B_{2}$ is not.

Proof. By induction, we assume that the theorem holds true for $g_{1}, g_{2}, \ldots, g_{n}$.

Let $k$ be the smallest integer $\geq 0$ for which no element of $G$ is congruent to $B_{k}$. We know that $G$ contains elements congruent to each of $B_{0}, B_{1}, B_{2}, \ldots, B_{k-1}$.

$$
\begin{aligned}
G \& B_{k}=\{ & g_{1} \& B_{k}, g_{2} \& B_{k}, g_{3} \& B_{k}, \ldots, g_{n} \& B_{k} \\
& \left.G \& B_{0}, G \& B_{1}, G \& B_{2}, \ldots, G \& B_{k-1}\right\} .
\end{aligned}
$$

$G \& B_{0}$ is a win since one of its options is $\cong B_{0} \& B_{0}$.

$$
\begin{aligned}
G \& B_{k}=\{ & g_{1} \& B_{k}, g_{2} \& B_{k}, g_{3} \& B_{k}, \ldots, g_{n} \& B_{k} \\
& \left.G \& B_{0}, G \& B_{1}, G \& B_{2}, \ldots, G \& B_{k-1}\right\}
\end{aligned}
$$

$G \& B_{0}$ is a win since one of its options is $\cong B_{0} \& B_{0}$.
$G \& B_{1}$ is a win since one of its options is $\cong B_{1} \& B_{1}$, etc.
All the $g_{i} \& B_{k}$ are wins, because none of the $g_{i}$ is congruent to $B_{k} .\left(B_{i} \& B_{j} \not \equiv \mathbf{0}\right.$ for $\left.i \neq j\right)$

$$
\begin{aligned}
G \& B_{k}=\{ & g_{1} \& B_{k}, g_{2} \& B_{k}, g_{3} \& B_{k}, \ldots, g_{n} \& B_{k} \\
& \left.G \& B_{0}, G \& B_{1}, G \& B_{2}, \ldots, G \& B_{k-1}\right\} .
\end{aligned}
$$

$G \& B_{0}$ is a win since one of its options is $\cong B_{0} \& B_{0}$.
$G \& B_{1}$ is a win since one of its options is $\cong B_{1} \& B_{1}$, etc.
All the $g_{i} \& B_{k}$ are wins, because none of the $g_{i}$ is congruent to
$B_{k} .\left(B_{i} \& B_{j} \neq \mathbf{0}\right.$ for $\left.i \neq j\right)$
Every member of $G \& B_{k}$ is a win; thus, $G \& B_{k}$ is a loss and $\cong \mathbf{0}$, and we have $G \cong B_{k}$.

A game congruent to $B_{k}$ is said to have a Nim-value of $k$ and is denoted by $* k$.

## Putting it all together

For impartial games, we have shown

- that congruent games behave the same;
- how to add Nim-heaps; and
- that every game is congruent to some Nim-heap.

We now know how to deal with any impartial game.

## Putting it all together

For impartial games, we have shown

- that congruent games behave the same;
- how to add Nim-heaps; and
- that every game is congruent to some Nim-heap.

We now know how to deal with any impartial game.
Since congruent games are equivalent for our purposes, we will write $=$ in place of $\cong$ from now on.

## Evaluation

The S-G theorem gives us a way to evaluate an arbitrary impartial game: just start at the lower levels of the tree and label each node with its Nim-value, deriving the Nim-values of branch nodes from their children.


## Evaluation

The S-G theorem gives us a way to evaluate an arbitrary impartial game: just start at the lower levels of the tree and label each node with its Nim-value, deriving the Nim-values of branch nodes from their children.


We can prune any tree into a binomial tree with the same Nim-value.

## How to win at Nim

Losing positions have a Nim-value of 0; winning positions have a Nim-value $>0$.
Remember that to win the game, we want to leave the opponent with a losing position.

## How to win at Nim

Losing positions have a Nim-value of 0; winning positions have a Nim-value $>0$.
Remember that to win the game, we want to leave the opponent with a losing position.

So, try every move, and choose the one that leaves a position with Nim-value 0 :

| IIIII | IIIII | IIIII |
| :---: | :---: | :---: |
|  | IIII | IIIII |
| $(5)$ | $(9)$ | $(10)$ |

## How to win at Nim

Losing positions have a Nim-value of 0; winning positions have a Nim-value $>0$.
Remember that to win the game, we want to leave the opponent with a losing position.

So, try every move, and choose the one that leaves a position with Nim-value 0 :

| IIIII | IIIII | IIIII |
| :---: | :---: | :---: |
|  | IIII | IIIII |
| $(5)$ | $(9)$ | $(10)$ |

Take 2 from the pile of 5 . This move wins because 3 xor 9 xor $10=0$.

## Limited Nim

Play is the same as in Nim, except that we only allow the player to take 1,2 , or 3 sticks at a time.

| IIIII | IIIII | IIIII |
| :---: | :---: | :---: |
|  | IIII | IIIII |
| $(5)$ | $(9)$ | $(10)$ |

## Limited Nim

Play is the same as in Nim, except that we only allow the player to take 1,2 , or 3 sticks at a time.

| IIIII | IIIII | IIIII |
| :---: | :---: | :---: |
|  | IIII | IIIII |
| $(5)$ | $(9)$ | $(10)$ |

$$
\begin{array}{l|l}
L_{0}=\{ \}=* 0 & L_{4}=\left\{L_{1}, L_{2}, L_{3}\right\}=\{* 1, * 2, * 3\}=* 0 \\
L_{1}=\left\{L_{0}\right\}=\{* 0\}=* 1 & L_{5}=\left\{L_{2}, L_{3}, L_{4}\right\}=\{* 2, * 3, * 0\}=* 1 \\
L_{2}=\left\{L_{0}, L_{1}\right\}=\{* 0, * 1\}=* 2 & L_{6}=\left\{L_{3}, L_{4}, L_{5}\right\}=\{* 3, * 0, * 1\}=* 2 \\
L_{3}=\left\{L_{0}, L_{1}, L_{2}\right\}=\{* 0, * 1, * 2\}=* 3 & L_{7}=\left\{L_{4}, L_{5}, L_{6}\right\}=\{* 0, * 1, * 2\}=* 3
\end{array}
$$

etc.

$$
L_{k}=*(k \bmod 4)
$$

## Kayles

Bowling pins are set up in a row, with some gaps between them:


Fig. 26. The Kayles position $K_{4}+K_{1}+K_{2}+K_{5}$.

Two bowlers compete to knock down the last pin. Each throws the ball perfectly, and can, at will, knock down a pin of his choosing, or knock down two adjacent pins.

## Kayles

Bowling pins are set up in a row, with some gaps between them:


Fig. 26. The Kayles position $K_{4}+K_{1}+K_{2}+K_{5}$.

Two bowlers compete to knock down the last pin. Each throws the ball perfectly, and can, at will, knock down a pin of his choosing, or knock down two adjacent pins.

The sum of two Kayles games is another Kayles game, and each move affects only one of the clumps of pins. Therefore they behave as Nim-heaps:

## Values of Kayles games

$$
\begin{aligned}
K_{0} & =\{ \}=* 0 \\
K_{1} & =\left\{K_{0}\right\}=\{* 0\}=* 1 \\
K_{2} & =\left\{K_{0}, K_{1}\right\}=\{* 0, * 1\}=* 2 \\
K_{3} & =\left\{K_{1}, K_{2}, K_{1} \& K_{1}\right\}=\{* 1, * 2, * 0\}=* 3 \\
K_{4} & =\left\{K_{2}, K_{3}, K_{1} \& K_{2}, K_{1} \& K_{1}\right\}=\{* 2, * 3, * 3, * 0\}=* 1 \\
K_{5} & =\left\{K_{3}, K_{4}, K_{2} \& K_{2}, K_{1} \& K_{1}, K_{1} \& K_{3}, K_{2} \& K_{2}\right\} \\
& =\{* 3, * 1, * 2, * 0, * 2, * 0\}=* 4
\end{aligned}
$$

etc.

## Values of Kayles games

$$
\begin{aligned}
K_{0} & =\{ \}=* 0 \\
K_{1} & =\left\{K_{0}\right\}=\{* 0\}=* 1 \\
K_{2} & =\left\{K_{0}, K_{1}\right\}=\{* 0, * 1\}=* 2 \\
K_{3} & =\left\{K_{1}, K_{2}, K_{1} \& K_{1}\right\}=\{* 1, * 2, * 0\}=* 3 \\
K_{4} & =\left\{K_{2}, K_{3}, K_{1} \& K_{2}, K_{1} \& K_{1}\right\}=\{* 2, * 3, * 3, * 0\}=* 1 \\
K_{5} & =\left\{K_{3}, K_{4}, K_{2} \& K_{2}, K_{1} \& K_{1}, K_{1} \& K_{3}, K_{2} \& K_{2}\right\} \\
& =\{* 3, * 1, * 2, * 0, * 2, * 0\}=* 4
\end{aligned}
$$

etc.

Starting from $K_{72}$, the values settle into a repeating pattern with period 12:

$$
* 4, * 1, * 2, * 8, * 1, * 4, * 7, * 2, * 1, * 8, * 2, * 7, \ldots
$$

## Extensions. . .

- misère play: the last player to move loses (e.g. misère Nim)
- partisan games - the two players have different options
- scoring - e.g. Go, Dots-and-Boxes


## Partisan games (Berlekamp, Conway, and Guy, 1982)

What if we allow the two players to have different moves?
Let us call the two players Left and Right. A partisan game $G$ consists of a pair of sets of games, the left set and the right set.


## Partisan games (Berlekamp, Conway, and Guy, 1982)

What if we allow the two players to have different moves?
Let us call the two players Left and Right. A partisan game $G$ consists of a pair of sets of games, the left set and the right set.


We can turn every impartial game into a partisan game.

## Addition, negation

$$
x+y=\left\{x^{L}+y, x+y^{L} \mid x^{R}+y, x+y^{R}\right\} .
$$

(We can also multiply them...)

## Addition, negation

$x+y=\left\{x^{L}+y, x+y^{L} \mid x^{R}+y, x+y^{R}\right\}$.
(We can also multiply them...)
The negation of $\{L \mid R\}$ is $\{-R \mid-L\}$; the negations are applied recursively.


## Addition, negation

$x+y=\left\{x^{L}+y, x+y^{L} \mid x^{R}+y, x+y^{R}\right\}$.
(We can also multiply them...)
The negation of $\{L \mid R\}$ is $\{-R \mid-L\}$; the negations are applied recursively.


## Comparison

A game $G$ can be positive, negative, zero, or fuzzy:

- $G>0$ iff $G$ is a win for Left.


## Comparison

A game $G$ can be positive, negative, zero, or fuzzy:

- $G>0$ iff $G$ is a win for Left.
- $G<0$ iff $G$ is a win for Right.


## Comparison

A game $G$ can be positive, negative, zero, or fuzzy:

- $G>0$ iff $G$ is a win for Left.
- $G<0$ iff $G$ is a win for Right.
- $G=0$ iff $G$ is a loss for the player to move.


## Comparison

A game $G$ can be positive, negative, zero, or fuzzy:

- $G>0$ iff $G$ is a win for Left.
- $G<0$ iff $G$ is a win for Right.
- $G=0$ iff $G$ is a loss for the player to move.
- $G \| 0$ iff G is a win for the player to move.


## Comparison

A game $G$ can be positive, negative, zero, or fuzzy:

- $G>0$ iff $G$ is a win for Left.
- $G<0$ iff $G$ is a win for Right.
- $G=0$ iff $G$ is a loss for the player to move.
- $G \| 0$ iff $G$ is a win for the player to move.

To show $G=H$, we can show $G-H$ is a loss for the player to move.

To show $G>H$, we can show $G-H$ is a win for Left. etc.

## Comparison

A game $G$ can be positive, negative, zero, or fuzzy:

- $G>0$ iff $G$ is a win for Left.
- $G<0$ iff $G$ is a win for Right.
- $G=0$ iff $G$ is a loss for the player to move.
- $G \| 0$ iff G is a win for the player to move.

To show $G=H$, we can show $G-H$ is a loss for the player to move.

To show $G>H$, we can show $G-H$ is a win for Left. etc.

$$
\begin{aligned}
& \text { Formally, } \\
& x \geq y \text { iff no } x^{R} \leq y \text { and } x \leq \text { no } y^{L}
\end{aligned}
$$

## Numbers (Conway, 1976)

The surreal numbers are those games

- formed from surreal numbers
- where no left option $\geq$ any right option.

For sets of numbers $L$ and $R$, the number $\{L \mid R\}$ is the "simplest" number greater than $L$ and less than $R$.

## Numbers (Conway, 1976)

The surreal numbers are those games

- formed from surreal numbers
- where no left option $\geq$ any right option.

For sets of numbers $L$ and $R$, the number $\{L \mid R\}$ is the "simplest" number greater than $L$ and less than $R$.

Neither player ever wants to move in a number unless it is the only move left.

## The integers

Let $C_{n}$ be a left-leaning chain with $n$ links. Then $C_{n}$ behaves like the integer $n$. (Right-leaning is $-n$ )

## The integers

Let $C_{n}$ be a left-leaning chain with $n$ links. Then $C_{n}$ behaves like the integer $n$. (Right-leaning is $-n$ )


## The integers

Let $C_{n}$ be a left-leaning chain with $n$ links. Then $C_{n}$ behaves like the integer $n$. (Right-leaning is $-n$ )


## Fractions

$$
\{0 \mid 1\}=\frac{1}{2}:
$$



## Fractions

$$
\{0 \mid 1\}=\frac{1}{2}:
$$


$x \quad+$

$X$
$1=0$

- The integers
- The dyadic rationals: $\frac{j}{2^{k}}$ for integers $j, k$
- The integers
- The dyadic rationals: $\frac{j}{2^{k}}$ for integers $j, k$
- The integers
- The dyadic rationals: $\frac{j}{2^{k}}$ for integers $j, k$

- The integers
- The dyadic rationals: $\frac{j}{2^{k}}$ for integers $j, k$

| 0 |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | -1 |  |  | 1 |  |
| -2 |  | $-\frac{1}{2}$ | $\frac{1}{2}$ | 2 |  |

- The integers
- The dyadic rationals: $\frac{j}{2^{k}}$ for integers $j, k$

| 0 |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | -1 |  | 1 |  |  |  |  |
| -2 |  | $-\frac{1}{2}$ |  | $\frac{1}{2}$ |  | 2 |  |
| -3 | $-1 \frac{1}{2}$ | $-\frac{3}{4}$ | $-\frac{1}{4}$ | $\frac{1}{4}$ | $\frac{3}{4}$ | $1 \frac{1}{2}$ | 3 |

- The integers
- The dyadic rationals: $\frac{j}{2^{k}}$ for integers $j, k$

- The other real numbers (by Dedekind cuts)
- The integers
- The dyadic rationals: $\frac{j}{2^{k}}$ for integers $j, k$

| 0 |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | -1 |  | 1 |  |  |  |  |
| -2 |  | $-\frac{1}{2}$ |  | $\frac{1}{2}$ |  | 2 |  |
| -3 | $-1 \frac{1}{2}$ | $-\frac{3}{4}$ | $-\frac{1}{4}$ | $\frac{1}{4}$ | $\frac{3}{4}$ | $1 \frac{1}{2}$ | 3 |

- The other real numbers (by Dedekind cuts)
- Infinite ordinals: $\omega, \omega+1, \frac{\omega}{2}, 2 \omega, 3 \omega, \omega^{2}, \omega^{\omega}, \ldots$
- The integers
- The dyadic rationals: $\frac{j}{2^{k}}$ for integers $j, k$

| 0 |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | -1 |  |  | 1 |  |  |  |
| -2 |  | $-\frac{1}{2}$ |  | $\frac{1}{2}$ |  | 2 |  |
|         <br> -3 $-1 \frac{1}{2}$ $-\frac{3}{4}$ $-\frac{1}{4}$ $\frac{1}{4}$ $\frac{3}{4}$ $1 \frac{1}{2}$ 3 |  |  |  |  |  |  |  |

- The other real numbers (by Dedekind cuts)
- Infinite ordinals: $\omega, \omega+1, \frac{\omega}{2}, 2 \omega, 3 \omega, \omega^{2}, \omega^{\omega}, \ldots$
- Infinitesimals: $\frac{1}{\omega}, \ldots$


## Infinity plus one!

$$
\begin{aligned}
& \omega=\{0,1,2, \ldots \mid\} \\
& \text { We can show that }\{\omega \mid\}=\omega+1 \text { : }
\end{aligned}
$$

## Infinity plus one!

$\omega=\{0,1,2, \ldots \mid\}$.
We can show that $\{\omega \mid\}=\omega+1$ :

$$
\omega+1=\left\{\omega^{L}+1, \omega+1^{L} \mid \omega^{R}+1, \omega+1^{R}\right\}
$$

## Infinity plus one!

$\omega=\{0,1,2, \ldots \mid\}$.
We can show that $\{\omega \mid\}=\omega+1$ :

$$
\begin{aligned}
\omega+1 & =\left\{\omega^{L}+1, \omega+1^{L} \mid \omega^{R}+1, \omega+1^{R}\right\} \\
& =\{0,1,2, \ldots
\end{aligned}
$$

## Infinity plus one!

$\omega=\{0,1,2, \ldots \mid\}$.
We can show that $\{\omega \mid\}=\omega+1$ :

$$
\begin{aligned}
\omega+1 & =\left\{\omega^{L}+1, \omega+1^{L} \mid \omega^{R}+1, \omega+1^{R}\right\} \\
& =\{0,1,2, \ldots, \omega \mid
\end{aligned}
$$

## Infinity plus one!

$\omega=\{0,1,2, \ldots \mid\}$.
We can show that $\{\omega \mid\}=\omega+1$ :

$$
\begin{aligned}
\omega+1 & =\left\{\omega^{L}+1, \omega+1^{L} \mid \omega^{R}+1, \omega+1^{R}\right\} \\
& =\{0,1,2, \ldots, \omega \mid\}
\end{aligned}
$$

## Infinity plus one!

$\omega=\{0,1,2, \ldots \mid\}$.
We can show that $\{\omega \mid\}=\omega+1$ :

$$
\begin{aligned}
\omega+1 & =\left\{\omega^{L}+1, \omega+1^{L} \mid \omega^{R}+1, \omega+1^{R}\right\} \\
& =\{0,1,2, \ldots, \omega \mid\} \\
& =\{\omega \mid\}
\end{aligned}
$$

( 1 is preferable to 0,2 to 1 , etc. And $\omega$ is preferable to any integer)

We have shown how games add. Games can also be split into sums. . .
(see e.g. Spight pg. 8; Berlekamp and Kim pg. 2, 3, 5)

## Suggested reading

Claus Tøndering, Surreal Numbers - An Introduction:
http://www.tondering.dk/claus/surreal.html
Aaron Siegel, Misère Games and Misère Quotients:
http://arxiv.org/abs/math.CO/0612616
Games of No Chance, 1996:
http://www.msri.org/publications/books/Book29/contents.html

- Fraenkel, Scenic Trails Ascending from Sea-Level Nim to Alpine Chess
- West, Championship-Level Play of Domineering
- Elkies, On Numbers and Endgames: Combinatorial Game Theory in Chess Endgames
- Berlekamp and Kim, Where Is the "Thousand-Dollar Ko"?

More Games of No Chance, 2002:
http://www.msri.org/publications/books/Book42/contents.html

- Elkies, Higher Nimbers in Pawn Endgames on Large Chessboards
- Spight, Go Thermography: The 4/21/98 Jiang-Rui Endgame
- Berlekamp and Scott, Forcing Your Opponent to Stay in Control of a Loony Dots-and-Boxes Endgame
- Moore and Eppstein, One-Dimensional Peg Solitaire, and Duotaire


## General references

- John H. Conway, On Numbers and Games. 1976, 2nd ed 2000.
- Berlekamp, Conway, and Guy, Winning Ways for Your Mathematical Plays. 1982, 2nd ed 2001-2004.
- Elwyn Berlekamp and David Wolfe, Mathematical Go: Chilling Gets the Last Point. 1994.
- Combinatorial Game Suite (software): http://www.cgsuite.org/

The material on impartial games comes from Chapters 6 and 16 of Conway; the material on partisan games comes mostly from Chapters 7 and 8 of the same.

