# Password hacking, the de Bruijn way. 

Dan Fretwell

## Outline of talk

(2) de Bruijn sequences
(3) Constructing de Bruijn sequences
4. Magic...explained

## Magic...

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See...magic...

## Proper magic...

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Volunteer 1, take the cards and cut the deck as many times as you want. Take the top card and pass the deck to Volunteer 2.

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Volunteer 1, take the cards and cut the deck as many times as you want. Take the top card and pass the deck to Volunteer 2.

Volunteer $n \geq 2$, take top card from deck and pass to volunteer $n+1$ until volunteer 5 has a card.

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- Who didn't cheat on last years exams?
- Who eats pickles on burgers?

For each of the following questions put your hand up if you satisfy the criterion:

- Who has a red card?
- Who has a surname beginning with a letter in the first half of the alphabet? (A-M)
- Who didn't cheat on last years exams?
- Who eats pickles on burgers?
- Who is here only because they wanted to listen to Nick's talk?

How was* I able to guess all five cards?
(* replace with wasn't if necessary.)

How was* I able to guess all five cards?
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We'll find out in this talk.

## Outline of talk

## (2) de Bruijn sequences

(3) Constructing de Bruijn sequences

4 Magic...explained

## Question

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If $|X|$ or $n$ is large then we really don't have time for that.

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Hmmm...we would need a string of symbols that contains every $\mathbf{v} \in X^{n}$ as a consecutive substring at least once.

Obviously we could just concatenate all possibilities and enter that, but this is equivalent to the previous attack. Can we do better?

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A de Bruijn sequence of order $n$ for $X$ is a sequence of elements of $X$ such that every $\mathbf{v} \in X^{n}$ is a consecutive substring exactly once (allowing cycling).

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We can make some small examples easily:
If $X=\{0,1\}$ then the following are de Bruijn sequences of order $n=1,2,3,4$ :

0011
00010111

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A de Bruijn sequence of order $n$ for $X$, if it exists, has length $|X|^{n}$.

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We have proved the following:
A de Bruijn sequence of order $n$ for $X$, if it exists, has length $|X|^{n}$.

Note that this is much smaller than $n|X|^{n}$, the size of the string needed to break the password the old fashioned way!

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## 2) de Bruijn sequences

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The following is non-trivial!

## Theorem

If $X$ is a finite set and $n \geq 1$ then there exists a de Bruijn sequence of order $n$ for $X$.

In fact, if $k=|X|$ then there are $\frac{(k!)^{k^{(n-1)}}}{k^{n}}$ of them.

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## Question

How do we make one?

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In the case where $X=\mathbb{Z} / p \mathbb{Z}$ we can construct de Bruijn sequences recursively.

Let $f(t)=t^{n}+A_{n-1} t^{n-1}+\ldots+A_{1} t+A_{0} \in(\mathbb{Z} / p \mathbb{Z})[t]$ be irreducible. Then the recursion:

$$
x_{m+n} \equiv A_{n-1} x_{m+n-1}+\ldots+A_{1} x_{m+1}+A_{0} x_{m} \bmod p
$$

gives a de Bruijn sequence of order $n$ for any non-zero initial vector $\mathbf{v}=\left(x_{0}, x_{1}, \ldots, x_{n-1}\right) \in(\mathbb{Z} / p \mathbb{Z})^{n}$.

## Example

If $p=2$ then $t^{3}+t+1$ is an irreducible polynomial of degree 3 over $\mathbb{Z} / 2 \mathbb{Z}$.

Starting with seed 001 we get the sequence:
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## Confession 1

The deck contained only 32 cards, the ones with numerical value up to 8.

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## Confession 1

The deck contained only 32 cards, the ones with numerical value up to 8 .

## Confession 2

The deck was rigged!

We can encode the cards in our deck as binary strings of length 5 , two bits for the suit and three for the number:

Clubs $\rightarrow 00 \quad$ Spades $\rightarrow 01$
Diamonds $\rightarrow 10$ Hearts $\rightarrow 11$

$$
\begin{array}{ll}
A \rightarrow 001 & 5 \rightarrow 101 \\
2 \rightarrow 010 & 6 \rightarrow 110 \\
3 \rightarrow 011 & 7 \rightarrow 111 \\
4 \rightarrow 100 & 8 \rightarrow 000
\end{array}
$$

For example:

$$
5 \mathrm{H} \rightarrow 11101 \quad \mathrm{AC} \quad 00001 \quad 8 \mathrm{~S} \rightarrow 01000
$$

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Cutting the deck corresponds to cycling the sequence...which doesn't change the de Bruijn property.

Note that the 1's in the sequence translate into red cards. So knowing who has a red card gives a binary sequence of length 5 corresponding to what the first card drawn was!

## How did I know the other four cards?

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The de Bruijn sequence $\left(x_{n}\right)$ in the previous slide is generated by the recursion $x_{n+5} \equiv x_{n}+x_{n+2}$ mod 2 (with $\mathbf{v}=00001$ ).

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So once I know what the first card drawn was, I can generate the binary sequences corresponding to the next four cards! For example:

01011

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010110 \rightarrow 010110
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Thanks for listening

