

# The Penney's Game with Group Action

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## General question

A random string is generated by attaching either H or T to the end of the string until the substring \_\_\_ appears. What is the expected length of the final string?

- In other words, calculate the **expected wait time**.

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- How many outputs of length  $\ell$  do not contain a word except at the end?
- What if we stop when we see any word from a set  $S$ ? (e.g.  $S = \{HHHH, THHH\}$ , leading to the concept of the **Penney's game**)

# Basic terminology

We designate an **alphabet**  $\mathcal{A}$  with  $q$  letters.

## Example

When flipping a coin,  $q = 2$  and  $\mathcal{A} = \{H, T\}$ , the *coin alphabet*.

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When flipping a coin,  $q = 2$  and  $\mathcal{A} = \{H, T\}$ , the *coin alphabet*.

A **word**  $w$  *avoids*  $v$  if it does not contain any substring equal to  $v$ . We are interested in:

- words which avoid  $w$ , except for a single  $w$  at the end; and
- words which avoid a word  $w$ .

# Word correlation

The **autocorrelation** of a word  $w = w_1 w_2 \dots w_\ell$  of length  $\ell$  is a vector

$$C(w, w) = (C_0, C_1, \dots, C_{\ell-1})$$

of 0's and 1's, such that  $C_k = 1$  iff  $w$  has period  $k$ , i.e.  $w_i = w_{i+k}$ .

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HTHTH

HTHTH  $\rightarrow 1$

HTHT H  $\rightarrow 0$

HTH TH  $\rightarrow 1$

HT HTH  $\rightarrow 0$

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## Word correlation (pt. 2)

Similarly, we can define the **correlation**  $C(w, v)$  between two words  $w$  and  $v$ , even between words of different length.



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### Example

Under the coin alphabet, the correlation  $C(\text{HTHTTH}, \text{HTTHT})$  is equal to  $(0, 0, 1, 0, 0, 1)$ .

<u>HTHTTH</u>	
HTTHT	→ 0
HTTHT	→ 0
HTTH T	→ 1
HTT HT	→ 0
HT THT	→ 0
H TTHT	→ 1

## Expected wait times

Say  $C(w, w) = (C_0, C_1, \dots, C_{\ell-1})$ . The **Conway leading number**  $wLw$  of a word  $w$  of length  $\ell$  is

$$C_0q^{\ell-1} + C_1q^{\ell-2} + \dots + C_{\ell-1}.$$

(Think base- $q$ .)

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On average, it takes  $2(2^{4-0} + 2^{4-2} + 2^{4-4}) = 42$  letters to generate the string HTHTH.

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**Example**

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**Example (Rubinstein-Salzedo)**

On average, a monkey will take  $26(26^{10} + 26^3 + 1) = 26^{11} + 26^4 + 26$  letters to type ABRACADABRA.

# The Penney's game

If the avoiding set  $S$  has two words  $\{w_A, w_B\}$ , then we can turn this into a game (the **Penney's game**, a la Walter Penney): if Alice and Bob pick  $w_A$  and  $w_B$ , which word will appear first?

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## Theorem (Conway)

*The odds that Alice wins are exactly*

$$p_A : p_B = (w_B L w_B - w_B L w_A) : (w_A L w_A - w_A L w_B).$$



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## Example

If Alice picks HHTT and Bob picks THTT, then Alice's chance of winning is  $\frac{9}{14}$ . Alice's expected wait time is 20, but Bob's is 18.

# Best beater

## Theorem (Guibas & Odlyzko)

*If Alice picks her word  $w_A = w(1)w(2)\dots w(\ell)$  first, then Bob has the best odds of winning when he chooses  $w_B = w^*w(1)w(2)\dots w(\ell - 1)$  for some  $w^*$ . This is a winning strategy.*

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## Example

If Alice chooses HHHH and Bob chooses THHH, then the probability Bob's word appears first is  $\frac{15}{16}$ .

## Best beater (pt. 2)

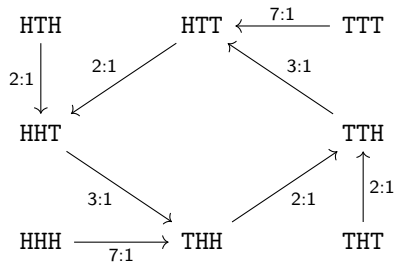


Figure: Directed graph of best beaters for  $(q, \ell) = (2, 3)$ .

# Generating function system

For a word  $w$ , define

- the **correlation polynomial**

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We then define the generating functions

$$G(z) = \sum_{n=0}^{\infty} A_w(n)z^n, \quad G_w(z) = \sum_{n=0}^{\infty} T_w(n)z^n.$$

# Extended results

## Theorem (Guibas & Odlyzko, 1978)

For a **reduced** set  $S = \{w_1, w_2, \dots, w_k\}$ , the generating functions  $G(z)$ ,  $G_{w_1}(z)$ ,  $G_{w_2}(z)$ ,  $\dots$ ,  $G_{w_k}(z)$  satisfy the following system of linear equations:

$$(1 - qz)G(z) + G_{w_1}(z) + G_{w_2}(z) + \dots + G_{w_k}(z) = 1$$

$$G(z) - z^{-\ell_1} C_{w_1, w_1}(z) G_{w_1}(z) - \dots - z^{-\ell_k} C_{w_k, w_1}(z) G_{w_k}(z) = 0$$

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We generalize to a group action  $\varphi : G \times \mathcal{A} \rightarrow \mathcal{A}$ , thus sending words to words. A word  $w$  resides in an orbit  $\mathcal{O}(w)$  under the action; a **pattern** is a representative (typically earliest lex. and *in lowercase*) from  $\mathcal{O}(w)$ . Alice and Bob pick patterns instead of words.

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We can also define pattern correlation polynomials, and generating functions  $G(z)$  with avoiders of  $p$ , and  $G_p(z)$  for first-timers of  $p$ .

# How the Penney flips

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- The pattern Conway leading number and correlation polynomial

$$p\mathcal{L}p' = C_0q^{\ell-1} + C_1q^{\ell-2} + \cdots + C_{\ell-1};$$
$$C_{p,p'}(z) = C_0 + C_1z + \cdots + C_{\ell-1}z^{\ell-1}.$$

## How the Penney flips (pt. 2)

### Theorem

For a **reduced** set  $S = \{p_1, p_2, \dots, p_k\}$  whose orbit sizes are  $r_1, r_2, \dots, r_k$ , the generating functions  $G(z), G_{p_1}(z), G_{p_2}(z), \dots, G_{p_k}(z)$  satisfy the following system of linear equations:

$$(1 - qz)G(z) + G_{p_1}(z) + G_{p_2}(z) + \dots + G_{p_k}(z) = 1$$

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*Suppose Alice picks the pattern  $p_A$  and Bob picks the pattern  $p_B$ . The odds that Alice wins are exactly*

$$\frac{1}{r_B}(p_B \mathcal{L} p_B - p_B \mathcal{L} p_A) : \frac{1}{r_A}(p_A \mathcal{L} p_A - p_A \mathcal{L} p_B).$$

*(Here  $r_A$  and  $r_B$  are orbit sizes.)*

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### Theorem

*For lengths  $\ell < q - \sqrt{q}$  and under the symmetric action, Alice has a winning strategy by choosing a pattern with  $\ell$  distinct letters  $a_1 a_2 \dots a_\ell$ .*

# How the Penney flips (pt. 4)

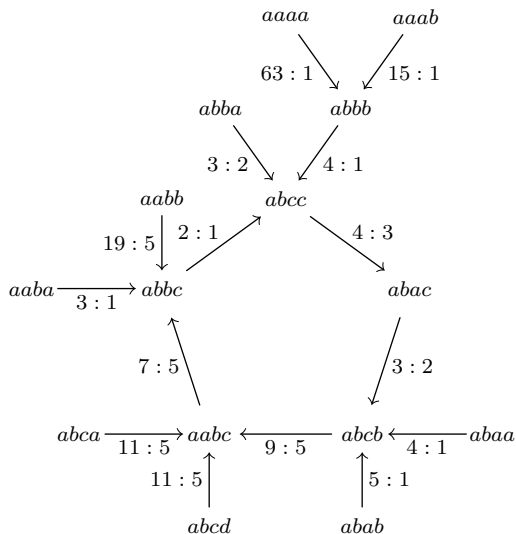






Figure: Directed graph of Bob's best choices for  $(q, \ell) = (4, 4)$ .

# Acknowledgements

- My mentor, Dr. Tanya Khovanova of MIT
- The PRIMES Program, especially Dr. Gerovitch & Dr. Etingof
- Peers at MIT-PRIMES and the attendees of MathROCs
- My parents :)

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