# Genome 540 Discussion 

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## Outline

- Related topics
- Information content
- Compression
- Burrows-Wheeler transform
- Homework \#1 questions


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- Related topics
- Information content
- Compression
- Burrows-Wheeler transform


## Information Content



In [61]: print_contents(file_1)
DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG DOG

In [62]: print_contents(file_2)

Lassie is a fictional character created by Eric Knight
She is a female Rough Collie dog, and is featured in a short story that was later expanded to a full-length novel called Lassie Come-Home.
file size compressed
dog1.txt 73254
dog2.txt 199
173


## Information Theory

sending information over a noisy channel



Harry Nyquist

## Information Theory

# Certain Topics in Telegraph Transmission Theory 

H. NYQUIST, MEMBER, A. I. E. E.

Classic Paper


## Communication in the Presence of Noise* CLAUDE E. SHANNON $\dagger$, member, ire

Summary-A method is developed for representing any communication system geometrically. Messages and the corresponding signals are points in two "function spaces," and the modulation process is a mapping of one space into the other. Using this repreentation, a numberion hreshold effect Formulas are found for the maximum rate of transmission of binary digits over a system when the signal is perturbed by various types of noise. Some of the properties of "ideal" systems which transmit at this maximum rate are discussed. The equivalent number of binary digits per second for certain information sources is calculated.

* Decimal classification: 621.38. Original manuscript received by
he Institute, July 23, 1940. Presented, 1948 IRE National ConvenNew York, N. Y., November 12, 1947 .
$\dagger$ Bell Telephone Laboratories, Murray Hill, N. J.


## I. Introduction

AGENERAL COMMUNICATIONS system is shown schematically in Fig. 1. It consists essentially of five elements.

1. An information source. The source selects one message from a set of possible messages to be transmitted to the receiving terminal. The message may be of various types; for example, a sequence of letters or numbers, as in telegraphy or teletype, or a continuous function of time $f(t)$, as in radio or telephony.
2. The transmitter. This operates on the message in some way and produces a signal suitable for transmis sion to the receiving point over the channel. In teleph-


Claude Shannon

## Data compression

- Compression - pressing something into a smaller space, increasing its density
- Data compression - storing information (or a close approximation) with a higher information density, occupying less space
- Compression algorithms
- Lossy vs. lossless
- Tradeoffs, best algorithm depends on situation
- Applications to big data: images, audio, videos, machine learning, genetics


## Data compression - repetition

- Degree of compression depends on the raw data and algorithm used
- In general, repetitive data is more compressible

| raw: | AAAAAAAAAAAAAAAAAAAAAAAAAAAAAA | raw: | AAAAACCCCCCGGGGGTTTTTAAAAAAAAA |
| :---: | :---: | :---: | :---: |
| compressed: | 30A | compressed: | 5A6C5G5T9A |
| raw: | ACGTGCTAGTACGTCTATGT | ACAGT |  |
| comp | essed: 1A1C1G1T1G1C1T1A1G1T | G1T1C1T1A1T1 | G1C1A1G1T1A1C1A1G1T |

## Burrows-wheeler transform

- Results in same-character runs (repetitive)
- Reversible (useful in lossless compression)
- Efficient suffix-array based implementation

| Transformation |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
| 1. Input | 2. All rotations | 3. Sort into lexical order | 4. Take the last column | 5. Output |
| ^BANANA | ^BANANA\| |^BANANA <br> A\|^BANAN <br> NA\|^BANA <br> ANA\|^BAN <br> NANA\|^BA <br> ANANA\|^B <br> BANANA\|^ | ANANA\|^B ANA|^BAN A|^BANAN BANANA|^ NANA|^BA NA|^BANA ^BANANA| |^BANANA | ANANA\|^B ANA|^BAN Al^BANAN BANANA|^ NANA|^BA NA|^BANA ^bananal |^BANANA | BNN^AA ${ }^{\text {A }}$ |

## Applications

- Sequence alignment
- BWA = Burrows-Wheeler Alignment tool
- Bowtie uses Burrows-Wheeler indexing
- Compression of genomic databases
- Sequence prediction
- Image compression


## Outline

- Homework \#1 questions


## HW1 input FASTA files

- Assume each file has exactly one header line
- The header line begins with ">"
- Non-alphabetic characters
- Exclude the header line
- Exclude white space (e.g. spaces)
- Include only digits from seq position numbers
- Convert nucleotide sequences to upper case


## IUPAC Nucleotide ambiguity code

| IUPAC Code | Meaning | Complement |
| :---: | :---: | :---: |
| $\mathbf{A}$ | A | T |
| $\mathbf{C}$ | C | G |
| $\mathbf{G}$ | G | C |
| $\mathbf{T} / \mathbf{U}$ | T | A |
| $\mathbf{M}$ | A or C | K |
| $\mathbf{R}$ | A or G | Y |
| $\mathbf{W}$ | A or T | W |
| $\mathbf{S}$ | C or G | S |
| $\mathbf{Y}$ | C or T | R |
| $\mathbf{K}$ | G or T | M |
| $\mathbf{V}$ | A or C or G | B |
| $\mathbf{H}$ | A or C or T | D |
| $\mathbf{D}$ | A or G or T | H |
| $\mathbf{B}$ | C or G or T | V |
| $\mathbf{N}$ | G or A or T or C | N |

- Useful in general
- Suffix array approach
- Exact matches only
- In HW1
- Shouldn't come up


## Structs \& pointers

- For HW1 can use integers or explicit pointers
- Struct members can be values or pointers

```
typedef struct
{
        int iLen;
    char *poName;
Info;
```

The above structure "Info" contains two members, integer variable (iLen) and a pointer to the character (pcName).

- More info and examples
https://aticleworld.com/pointers-as-member-of-structure-in-c/


## "Number of match strings"

HW1 Example Template

The longest match length: 122
Number of match strings: 1

Match string:
GTCGGGTAAATTCCGTCCCGCTTGAATGGTGTAACCATCTCTTGACTGTCTCGGCTATAGACTCG
GTGAAATCCAGGTACGGGTGAAGACACCCGTTAGGCGCAACGGGACGGAAAGACCCC
Description: This sequence comes from [look up entry in .gbff
annotation file using the position information below]
Fasta: CP001872.fna
Position: 338240
Strand: forward
Fasta: CP001872.fna
Position: 82469
Strand: forward

- If there are several different perfectly repeated subsequences of the same maximum length, find all of them.
- If a longest subsequence is present multiple times in either sequence, please report all locations of the subsequence.


## Edge cases

## >test genome 1

AAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAA
АААААААААААААААААААААААААААААААААААААААААААААААААА

>test genome 2
TTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTT ITTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTT TTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTTT
>test genome 3
сССССССССССССССССССССССССССССССССССССССССССССССССС СССССССССССССССССССССССССССССССССССССССССССССССССС CCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCCC

- If run on 1 \& 2
- Program runs as usual
- searches both strands!
- If run on 1 \& 3
- No match!

Don't need to handle no-match edge case for HW1
Good to think about edge cases while programming!

## Idea: tracking match length during sort (?)

## Idea:

To speed up the algorithm by computing the longest matching string during the sort (since you would be checking the nearest neighbors during the sort anyways)

## Why it likely slows down, rather than speeds up - low-level implementation details:

"Yes, you'd save some time at the end step (passing through the sorted list), but at the cost of extra time per comparison that almost certainly would outweigh it. As I mentioned in the lecture, cache misses (memory accesses outside of cache) are actually the main time cost in the suffix array method. In your suggested method you need to save information regarding the best match lengths seen thus far for each suffix which takes a fair amount of memory ( 8 N bytes or so, if N is the sequence length), and accessing that will cause a lot of cache misses, potentially one for each comparison. That's potentially NlogN extra cache misses (in addition to the ones for accessing the sequence). You would save some cache misses at the final step (passing through the sorted list), because you'd no longer have to retrieve the sequences to know how long their match to the neighbor is, since you've saved that. But that's only N cache misses. So you're potentially adding NlogN cache misses to save potentially N cache misses, a net loss." -Phil

