## **FY2023 Current Trends in Bioinformatics**

## Lecture 2

#### Long non-coding RNAs: Genomic Junk or Regulatory Treasure?

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Bioinformatics Associate Professor (バイオインフォマティクス 准教授) [long non-coding RNAs, cell differentiation, cell-cell communication, enhancers, and more]

#### RIKEN Yokohama IMS 2011→

Postdoctoral Researcher/Research Scientist 2011−2020 Visiting Scientist 2020→



## **Bioinformatics: Definition & Utility**

Bioinformatics: broadly defined study of living systems (bio) using computational (informatics) tools



Bioinformatics (BI): **applied science** that interprets biological data using development and advancements in other sciences to **solve many important medical and biological problems**.

### **COVID-19 Pandemics**

COVID-19 (2019-2022)  $\sim$  6.5M (0.1%) global population died Spanish flu (1918-1920)  $\sim$ 50.0M (2.5%) global population died



Bioinformatics was crucial in vaccine and anti-COVID 19 drugs development!

## **Development of individual & effective treatments**

**Current:** drugs designed using data from selected having many side effects and are often ineffective.

**Goal:** diagnosis of individual patients & treatment with most effective drugs and without side effects.

#### **Ineffective Drugs:**

| Antidepressants | 38 % | <u>^^^^</u>                      |
|-----------------|------|----------------------------------|
| Asthma          | 40 % | <b>^ † † † † †</b> † † † † † † † |
| Diabetes        | 43 % | <b>^^^^^^</b>                    |
| Arthritis       | 50 % | <b>^ † † † † † †</b> † † † † †   |
| Alzheimer       | 70 % | <b>****</b> ****                 |
| Cancer          | 75 % | <b>^ † † † † † † † † †</b> †     |



<sup>→</sup> Each patient benefits from an individualized treatment.

Bioinformatics is playing a major role in sequencing and analyzing individual genomes and in research developing personalized drugs and therapies!

## Helping with increasing and ageing population

Total world population is constantly growing and many developed societies are aging, negatively affecting economic growth . This forces governments to increase the retirement age, while keeping *'older'* workers healthy and productive.



Bioinformatics is playing a major in helping to develop strategies to help handle increasing world population and is important in ageing research!

### Today we will talk about long non-coding RNAs...

#### IncRNAs : transcripts longer than 200 & without protein coding potential.

#### Features of long non-coding RNAs

- transcribed mostly by RNA polymerase II
- many are capped, spliced and polyadenylated
- very abundant in mammalian genomes
- poor sequence conservation across species
- nearby by the same mRNA across species
- lowly expressed & highly cell type specific

#### Most human/mouse genes are non-coding



Mouse Genome Database (Gencode) showing different classes of mouse genes.

### Selected IncRNAs show diverse regulatory functions

#### IncRNAs can function in a variety of molecular process including regulation in cancer.



Salehi S. et al., Journal of Cellular and Molecular Medicine 21, 3120, (2017)

### IncRNAs are NOT studied enough...



At the above rate, functional annotations of all IncRNAs would be completed ~2110.

Transcriptional noise or more functions?

### **FANTOM:** Functional Annotation of Mammalian Genomes

#### Worldwide Genomic Consortium led by RIKEN Yokohama since 2000



FANTOM Consortium 2017 Summer Meeting: Cracking mysteries of human IncRNAs



## **FANTOM 5: Computational Atlas of IncRNA Functions**



# **FANTOM CAT (CAGE Associate Transcriptome) of 27,919 human IncRNAs:** ~10,000 CAGE/RNA-seq expression profiles + Epigenome Data + Annotations



Hon, Ramilowski, et al. *Nature* 543, 2017

67% of all human lncRNAs (19,175/27,919) show various functionally relevant traits.

#### UNF 16 3,135,000-3,128,500 (ZIVE213-AST)

## FANTOM 6: Functional Screenings of IncRNAs<sup>2 KD</sup>

#### 1. Unbiased selection of 600+ IncRNAs:

- Induced Pluripotent Stem Cells (~300 IncRNAs) ٠
- Human Dermal Fibroblasts (~300 IncRNAs) .
- other cell types (more limited) •

#### 2. Antisense Oligo (ASO) knockdown mechanism:

- ASO is ~12-18 nt long DNA sequence
- designed to bind to a selected RNA transcripts

313 kb

313.1 kb

more



#### VARIABLE EXPRESSION LEVELS (CAGE EXPRESSION DATA)

#### 62% NUCLEAR & 38% CYTOPLASMIC (CELL RNA FRACTIONATION DATA)

NUC 8

#### IncRNA transcript model ASO03 ASO05 ASO<sub>06</sub> ASO<sub>01</sub> ASO<sub>02</sub> Transcription



## FANTOM 6: Human Dermal Fibroblast study overview



### ~30% IncRNAs Regulate Cell Growth & Morphology

#### **1.** Distinct cell morphologies changes

(example: three selected lncRNAs)



2. Morphology imaging processing using AI (example: one novel IncRNA target)



## **3. IncRNAs can regulate multiple morphologies** (all IncRNA in HDF data)



Ramilowski, Yip, et al. Genome Res. 30:1060, 2020

### IncRNAs show diverse molecular signatures of functions

*Molecular functions of* IncRNAs, were inferred by comparing transcriptome after each ASO KD targeting one IncRNA with the transcriptome of matching negative controls.



IncRNA ASO KDs showed a wide ranged of DE genes (left) & dysregulated pathways (right). Overall ~20% IncRNAs show biological function signatures.

Ramilowski, Yip, et al. Genome Res. 30, 1060, 2020

#### **Dendritic Cells: Function & Differentiation**

**DCs:** are professional Antigen Presenting Cells priming regulatory and cytotoxic T-cells to orchestrate a variety of adaptive immune responses upon infection and in cancers.

DCs differentiate mainly in bone marrow and mature in spleen in an IRF8-dependent manner.



**LMPP**: Lymphoid-Myeloid Primed Progenitors
**MDP**: Monocyte Dendritic Cell Progenitors

CDP: Common Dendritic Cell Progenitors
pre-cDC1/pre-cDC2: pre-Dendritic Cells
cDC1/cDC2: classical Dendritic Cells

How can we find IncRNA expression in our data?

## nf-core 1 RNA-seq Data Analysis Pipelines

Growing & diverse NGS data is NOT only a challenge for the hardware, but also requires BI pipelines to process and analyze the data reliably and reproducible using the best standards in the field.

**nf-core** is collection of 86 pipelines developed first at the Genome Institute of Sweden to process essentially any NGS data on Amazon Cloud or on own server. Anybody can develop a nf-core pipeline if it complies with the standards.

**Pipeline summary** BAM BAI GTF FASTA RSEM STAR Salmon SAMtools cat UMI-tools (sort, index, SortMeRNA fastq extract FastQC HISAT2 stats) UMI-tools dedup BBSplit Fast0C Trim Galore! picard Salmon HTML MarkDuplicates MultiOC BEDtools genomecov License:@ nf-core/ 👚 BIGWIG bedGraphToBigWig TSV StringTie rnaseq MultiQC dupRadar Preseg STAGE METHOD HTML Aligner: STAR, Quantification: Salmon (default) 1. Pre-processing DESea2 Qualimap RSeQC 2. Genome alignment & quantification Aligner: STAR, Quantification: RSEM 3. Pseudo-alignment & quantification Aligner: HISAT2, Quantification: None (PCA only) rnaseq (multiple 4. Post-processing Pseudo-aligner: Salmon, Quantification: Salmon modules) 5. Final QC



Server: 2x2TB RAM / 240CPUs

#### https://nf-co.re

### We found thousands of IncRNA specific to DC differentiation

*de-novo* gene assembly: applying nf-core & own bioinformatics pipelines to RNA-seq in-vivo data we found~6,000 novel IncRNAs in cDC differentiation time-course.



### IncRNAs are much more cell type specific than mRNAs

When plotting scaled across cell types expression (Z-score) of IncRNA (left) & mRNAs (right) across differentiation data we notice more restricted patterns of IncRNA expression.



Let's focus on DC1 specific mRNAs and lncRNAs.

### cDC1-specific mRNAs & IncRNAs form a co-regulatory network

Differential expression analysis and clustering identified 151 lncRNAs and 711 mRNAs specific to cDC1. We next looked at their expression profiles across cDC1 differentiation.



Many **cDC1-specific IncRNA & mRNAs form a highly-correlated expression network** in cDC1 differentiation. **Usually, such quilt by association suggests that genes have commonly regulated.** 

#### Making cDC1-specific protein landscape starts in early progenitors

Dendritic cells develop & establish their functional protein landscape following:

(1) chromatin activation, (2-3) chromatin structure establishment, (4) expression of specific mRNAs.



Kurotaki et al, Tamura, PNAS, 2022

### e-IncRNAs are widely transcribed from enhancer regions

We made predictions of potential enhancers regulating cDC1-specific mRNAs. We found that Many enhancers transcribe e-IncRNAs.



Contact map of cDC1 enhancer regions predicted to regulate cDC1-specific mRNAs and transcribing e-lncRNAs.

Although it is premature to conclude that e-IncRNA transcription has regulatory functions in cDC1 differentiation, yet it is worth further investigating: e-IncRNA DNA, RNA & protein binding motifs, structures, cellular localizations, etc..

## Summary

- 1. Collectively, Inc-RNAs are widely expressed in a variety of cell types, yet many are restricted to a few cell types making their studies hard.
- 2. Evidence for widespread functions of IncRNAs is growing, yet far majority of IncRNAs remain functionally uncharacterized.
- 3. Inc-RNA form co-expressed networks with mRNAs in cDC1 differentiation, yet we still do not know what exactly their roles are
- 4. Many enhancers regions express e-IncRNAs need to be further investigated