

Annotation & ML

Michael Schatz

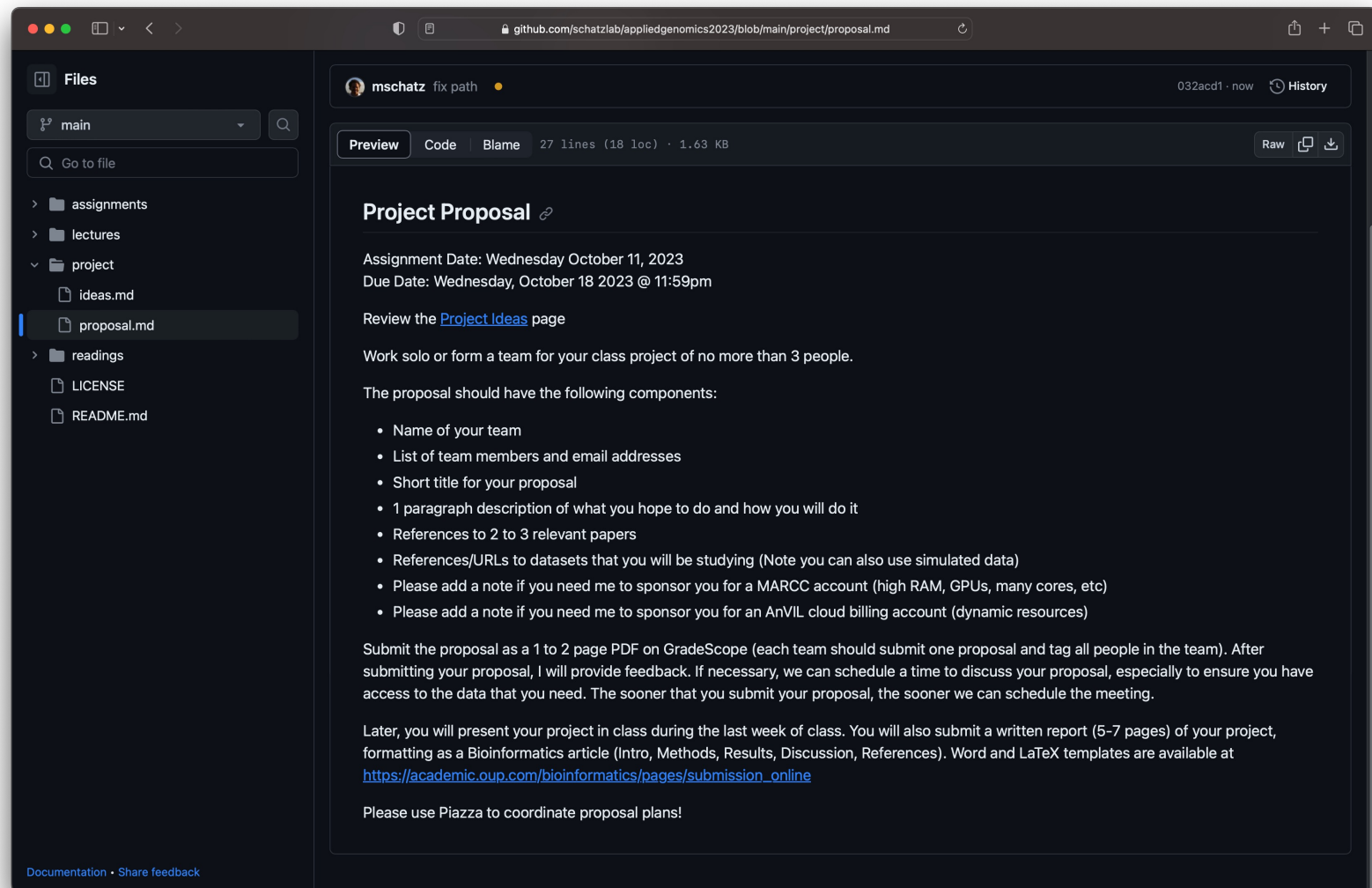
October 18, 2023

Lecture 15. Applied Comparative Genomics



Project Proposal

Due Wednesday Oct 18 by 11:59pm

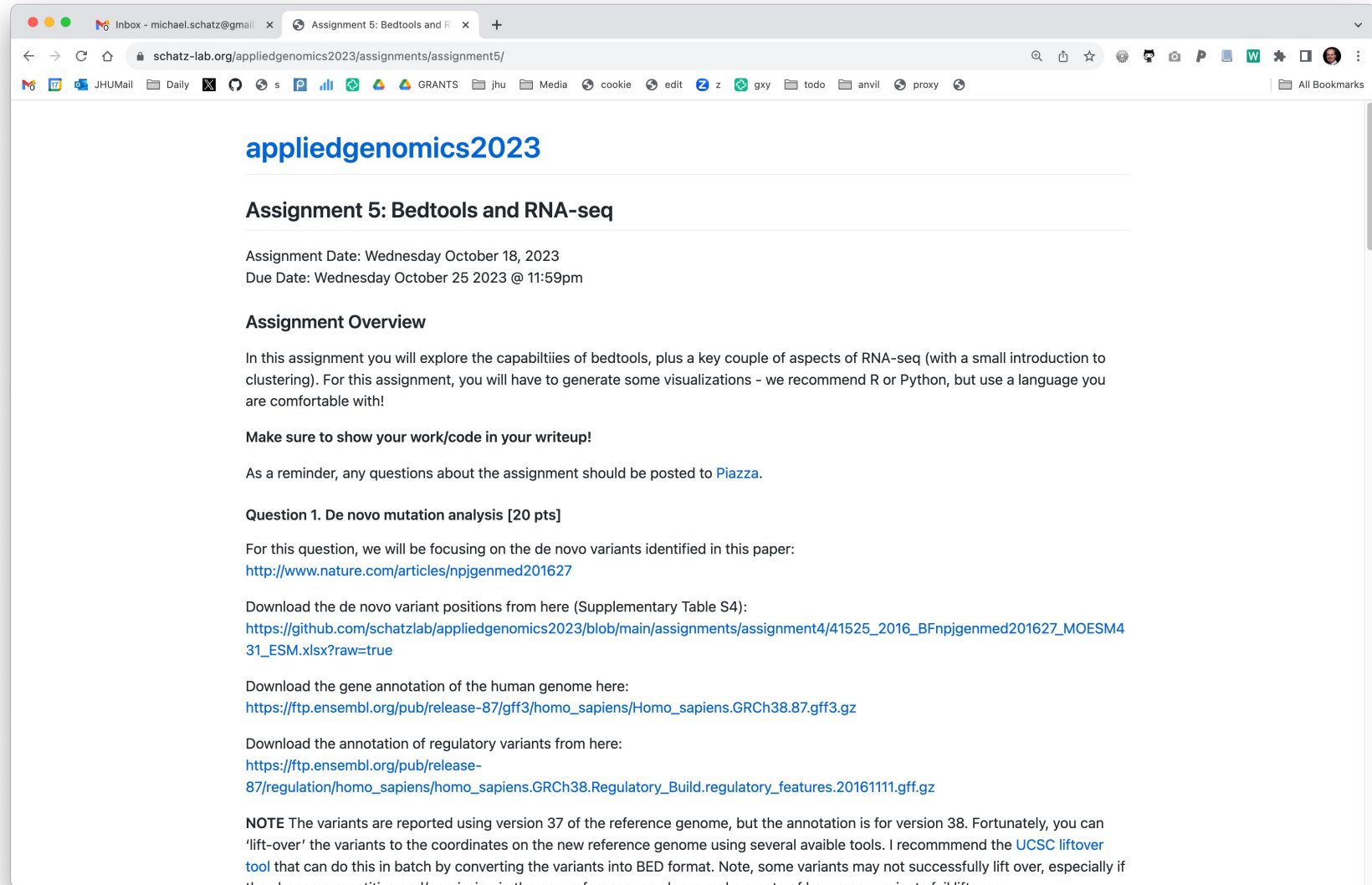


<https://github.com/schatzlab/appliedgenomics2023/blob/main/project/proposal.md>

Check Piazza for questions!

Assignment 5

Due: Wednesday Oct 25, 2023 by 11:59pm



The screenshot shows a web browser window with the URL schatz-lab.org/appliedgenomics2023/assignments/assignment5/. The page title is "appliedgenomics2023". The main heading is "Assignment 5: Bedtools and RNA-seq". Below this, the assignment date is "Wednesday October 18, 2023" and the due date is "Wednesday October 25 2023 @ 11:59pm". The section "Assignment Overview" states: "In this assignment you will explore the capabilities of bedtools, plus a key couple of aspects of RNA-seq (with a small introduction to clustering). For this assignment, you will have to generate some visualizations - we recommend R or Python, but use a language you are comfortable with!" It also says "Make sure to show your work/code in your writeup!" and "As a reminder, any questions about the assignment should be posted to [Piazza](#)." The "Question 1. De novo mutation analysis [20 pts]" section follows. It says: "For this question, we will be focusing on the de novo variants identified in this paper: <http://www.nature.com/articles/npjgenmed201627>". It then says: "Download the de novo variant positions from here (Supplementary Table S4): https://github.com/schatzlab/appliedgenomics2023/blob/main/assignments/assignment4/41525_2016_BFnpjgenmed201627_MOESM431_ESM.xlsx?raw=true". It then says: "Download the gene annotation of the human genome here: https://ftp.ensembl.org/pub/release-87/gff3/homo_sapiens/Homo_sapiens.GRCh38.87.gff3.gz". It then says: "Download the annotation of regulatory variants from here: https://ftp.ensembl.org/pub/release-87/regulation/homo_sapiens/homo_sapiens.GRCh38.Regulatory_Build.regulatory_features.20161111.gff.gz". A "NOTE" section follows: "The variants are reported using version 37 of the reference genome, but the annotation is for version 38. Fortunately, you can 'lift-over' the variants to the coordinates on the new reference genome using several available tools. I recommend the [UCSC liftover tool](#) that can do this in batch by converting the variants into BED format. Note, some variants may not successfully lift over, especially if they become repetitive and/or missing in the new reference, so please make a note of how many variants fail liftover."

<https://schatz-lab.org/appliedgenomics2023/assignments/assignment5/>

Check Piazza for questions!

Clustering Refresher

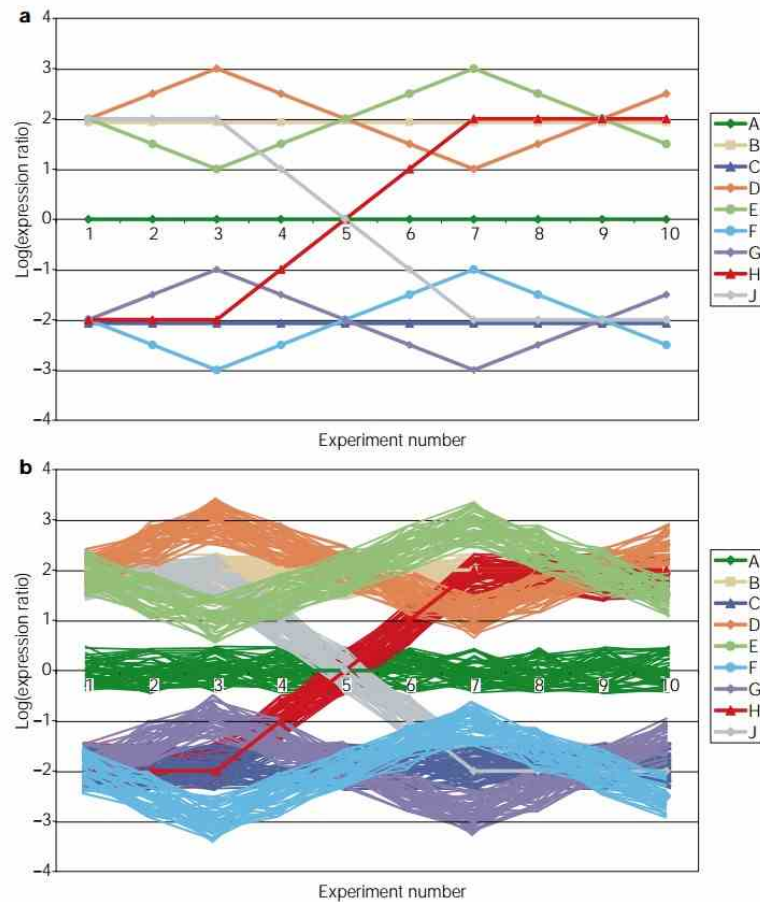
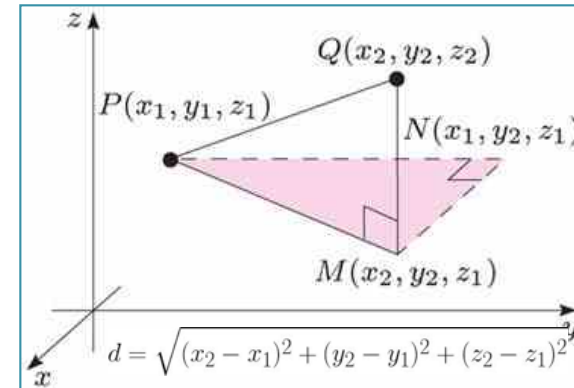
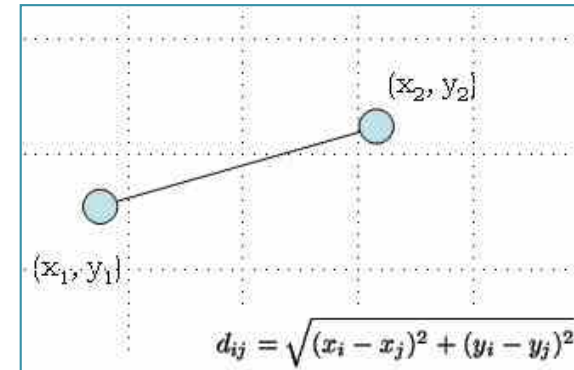


Figure 2 | **A synthetic gene-expression data set.** This data set provides an opportunity to evaluate how various clustering algorithms reveal different features of the data. **a** | Nine distinct gene-expression patterns were created with $\log_2(\text{ratio})$ expression measures defined for ten experiments. **b** | For each expression pattern, 50 additional genes were generated, representing variations on the basic patterns.

Euclidean Distance

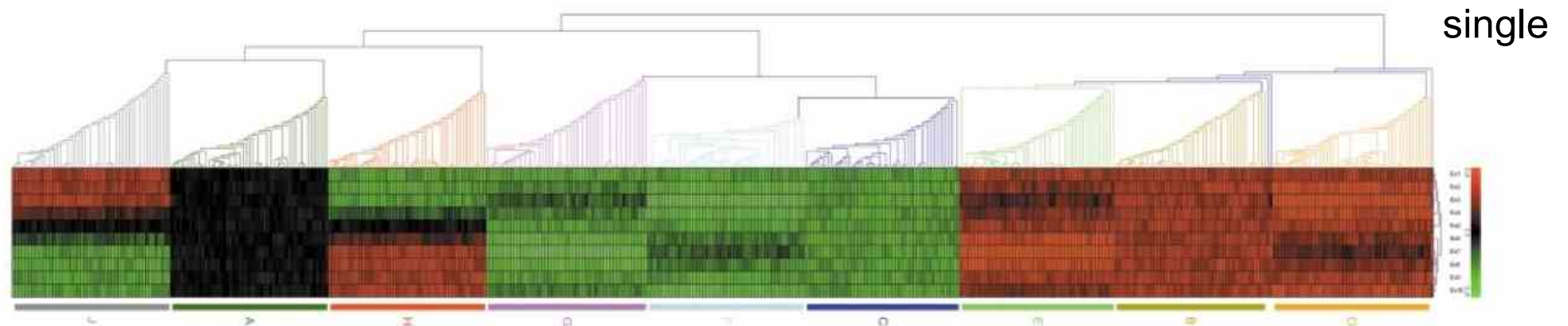
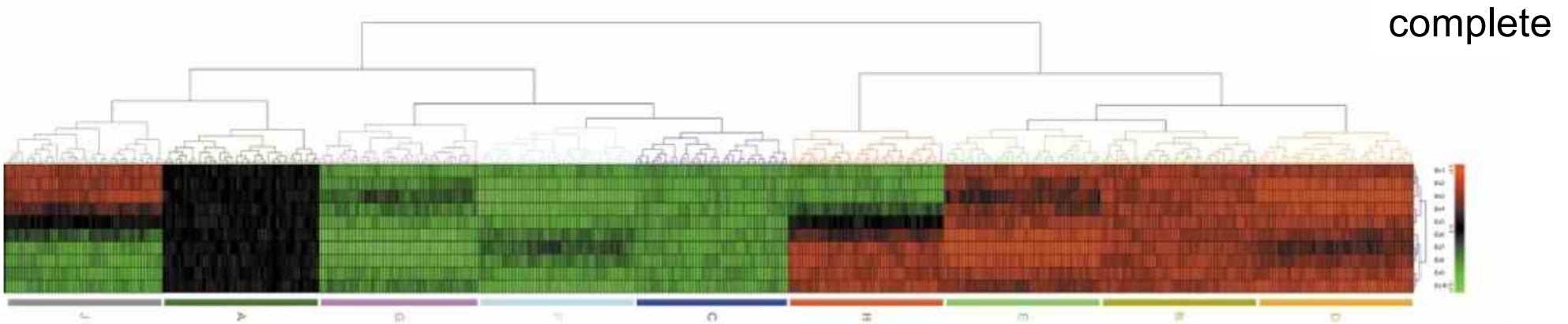
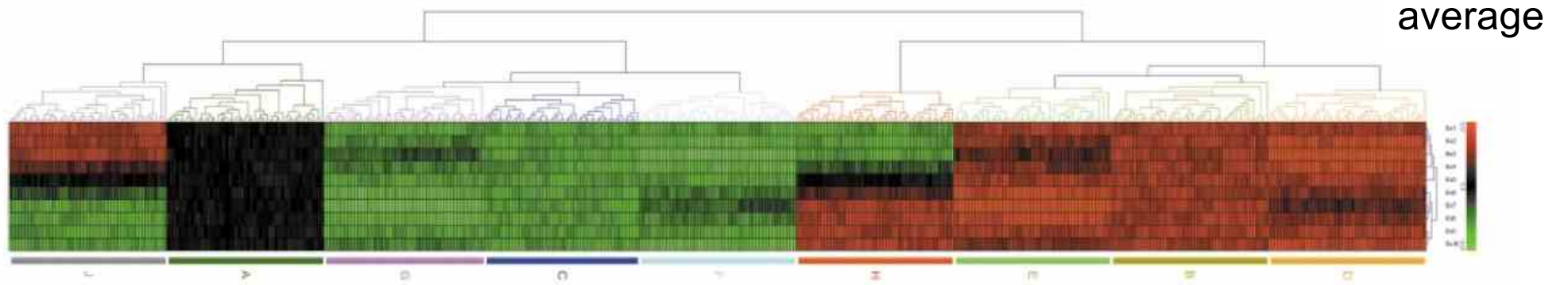


$$d(\mathbf{p}, \mathbf{q}) = d(\mathbf{q}, \mathbf{p}) = \sqrt{(q_1 - p_1)^2 + (q_2 - p_2)^2 + \dots + (q_n - p_n)^2} = \sqrt{\sum_{i=1}^n (q_i - p_i)^2}.$$

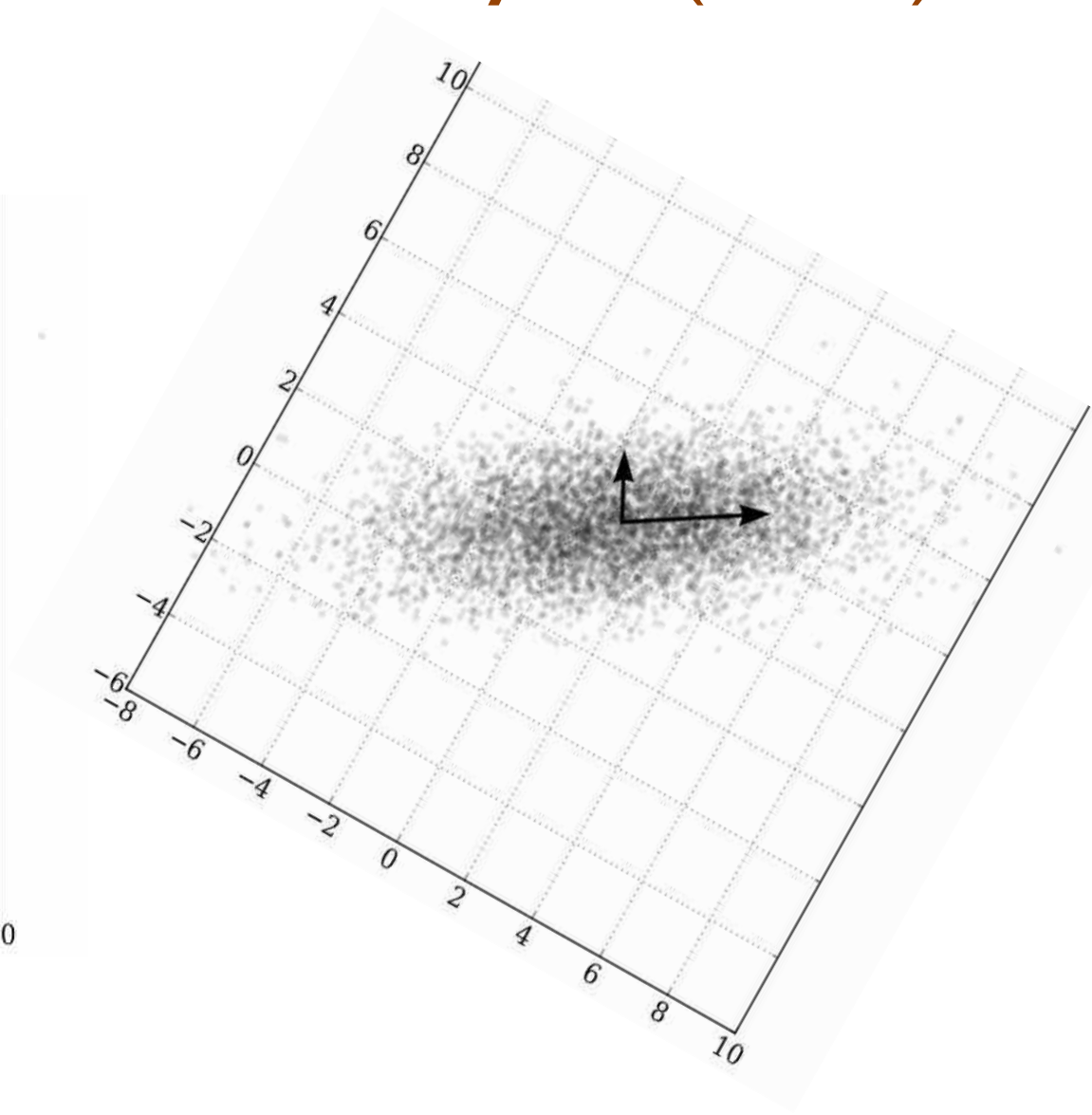
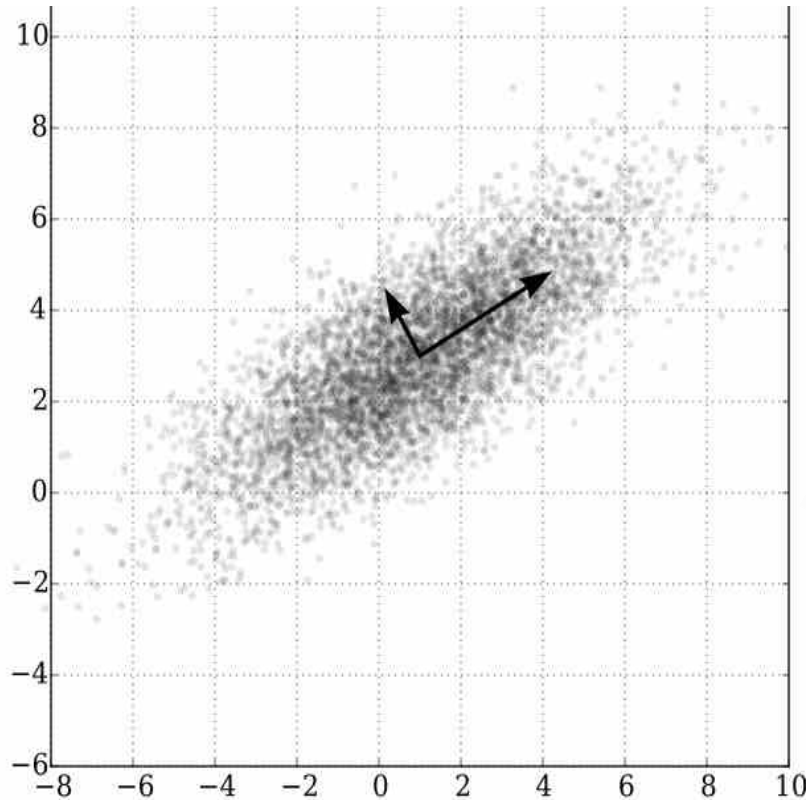
Computational genetics: Computational analysis of microarray data

Quackenbush (2001) *Nature Reviews Genetics*. doi:10.1038/35076576

Hierarchical Clustering



Principle Components Analysis (PCA)



PC1: “New X”- The dimension with the most variability

PC2: “New Y”- The dimension with the second most variability

Principle Components Analysis (PCA)

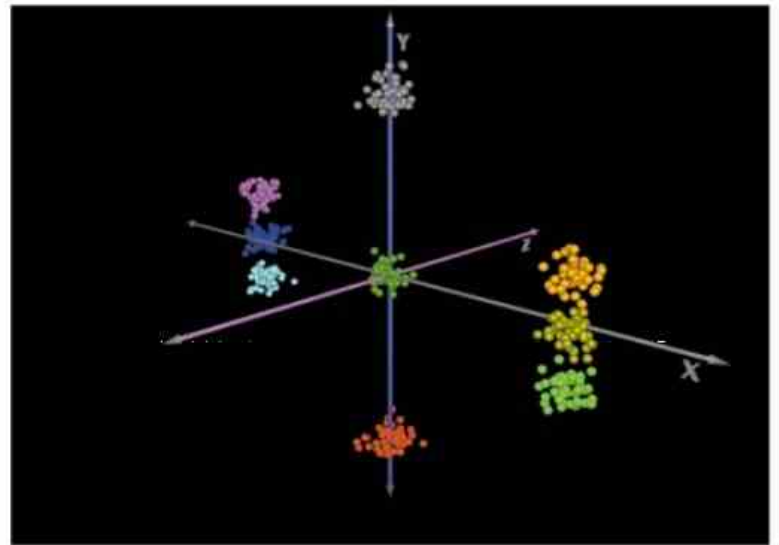
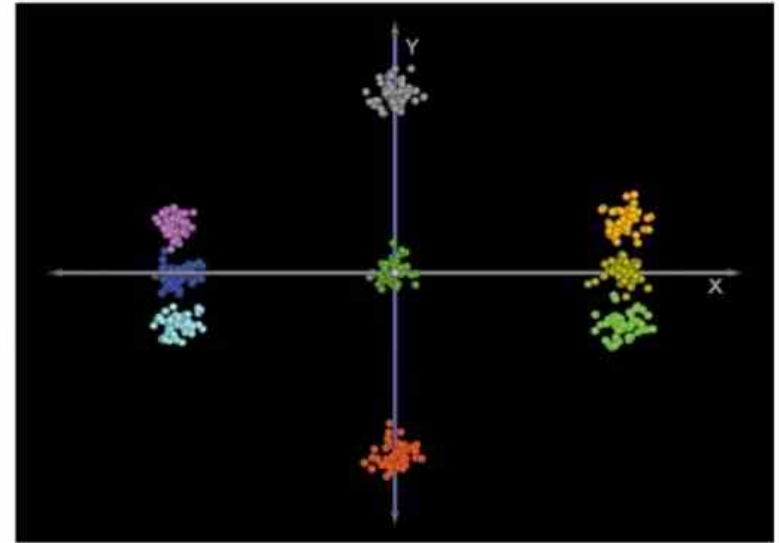
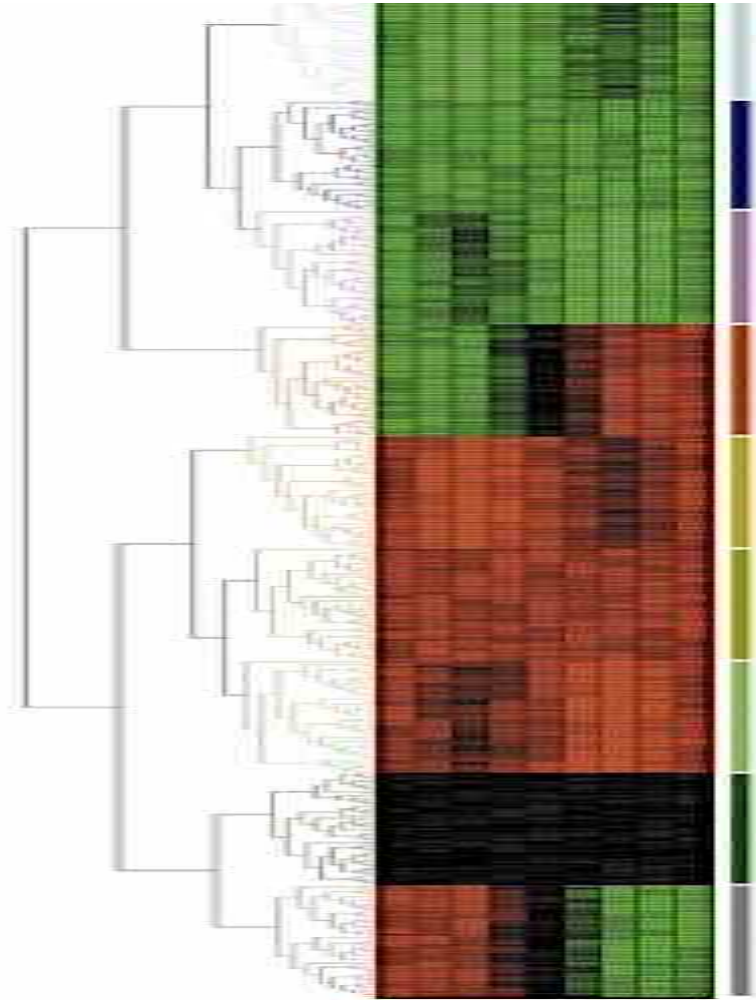
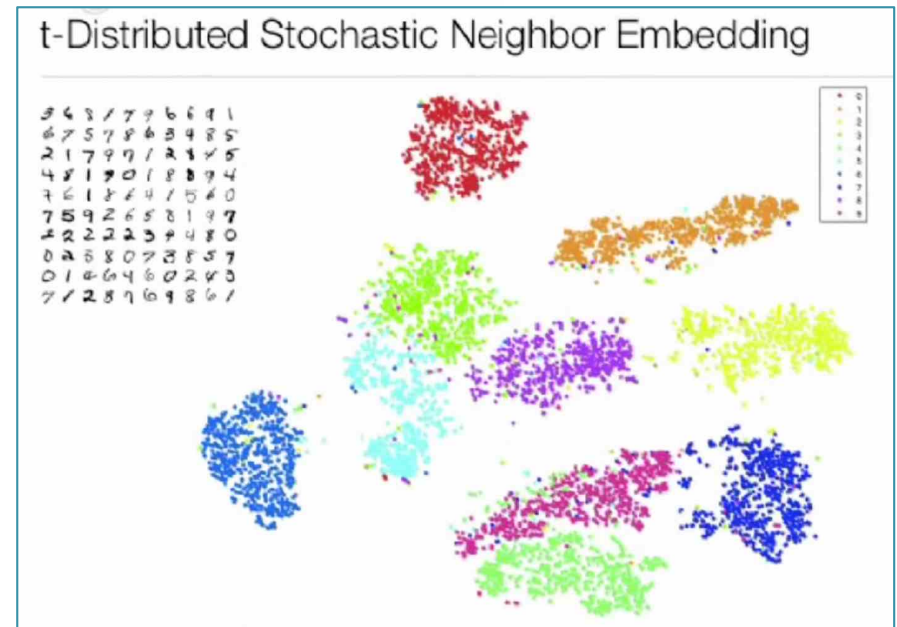
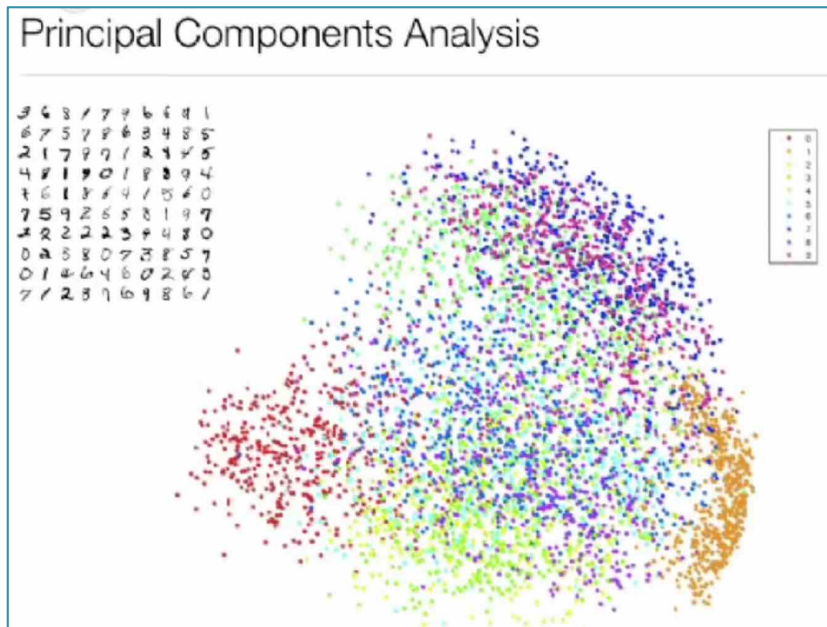
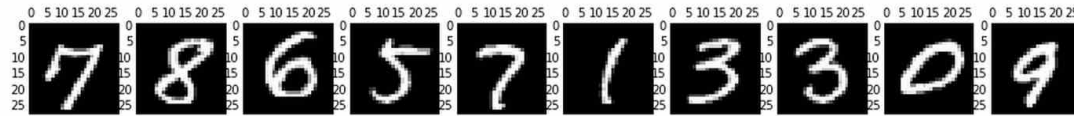


Figure 4 | **Principal component analysis.** The same demonstration data set was analysed using **a** | hierarchical (average-linkage) clustering and **b** | principal component analysis using Euclidean distance, to show how each treats the data, with genes colour coded on the basis of hierarchical clustering results for comparison.

PCA and t-SNE



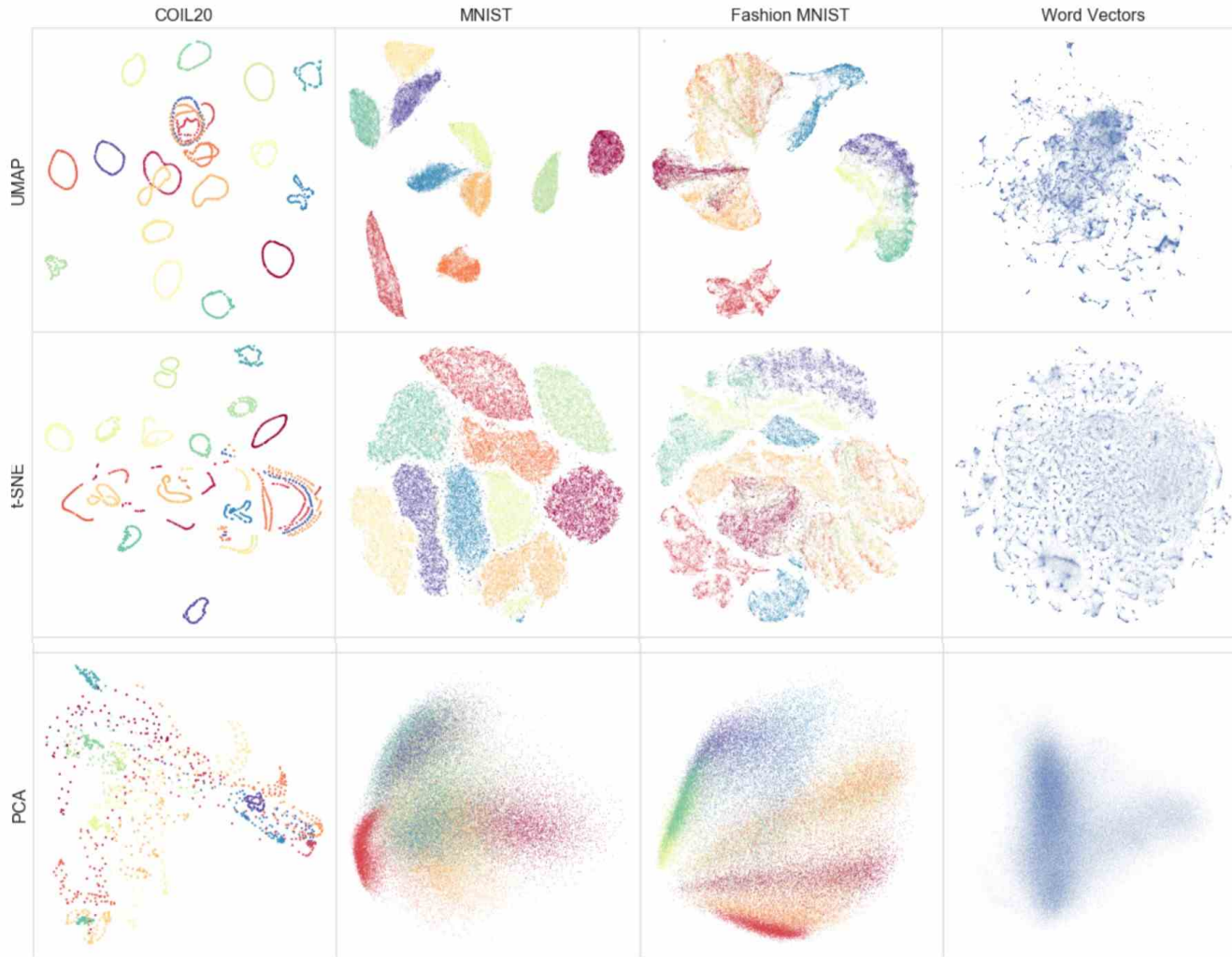
t-distributed Stochastic Neighborhood Embedding

- Non-linear dimensionality reduction technique: distances are only locally meaningful
- Rather than Euclidean distances, for each point fits a Gaussian kernel to fit the nearest N neighbors (perplexity) that define the probabilities that two points should be close together
- Using an iterative spring embedding system to place high probability points nearby

Visualizing Data Using t-SNE

<https://www.youtube.com/watch?v=RJVL80Gg3IA>

UMAP



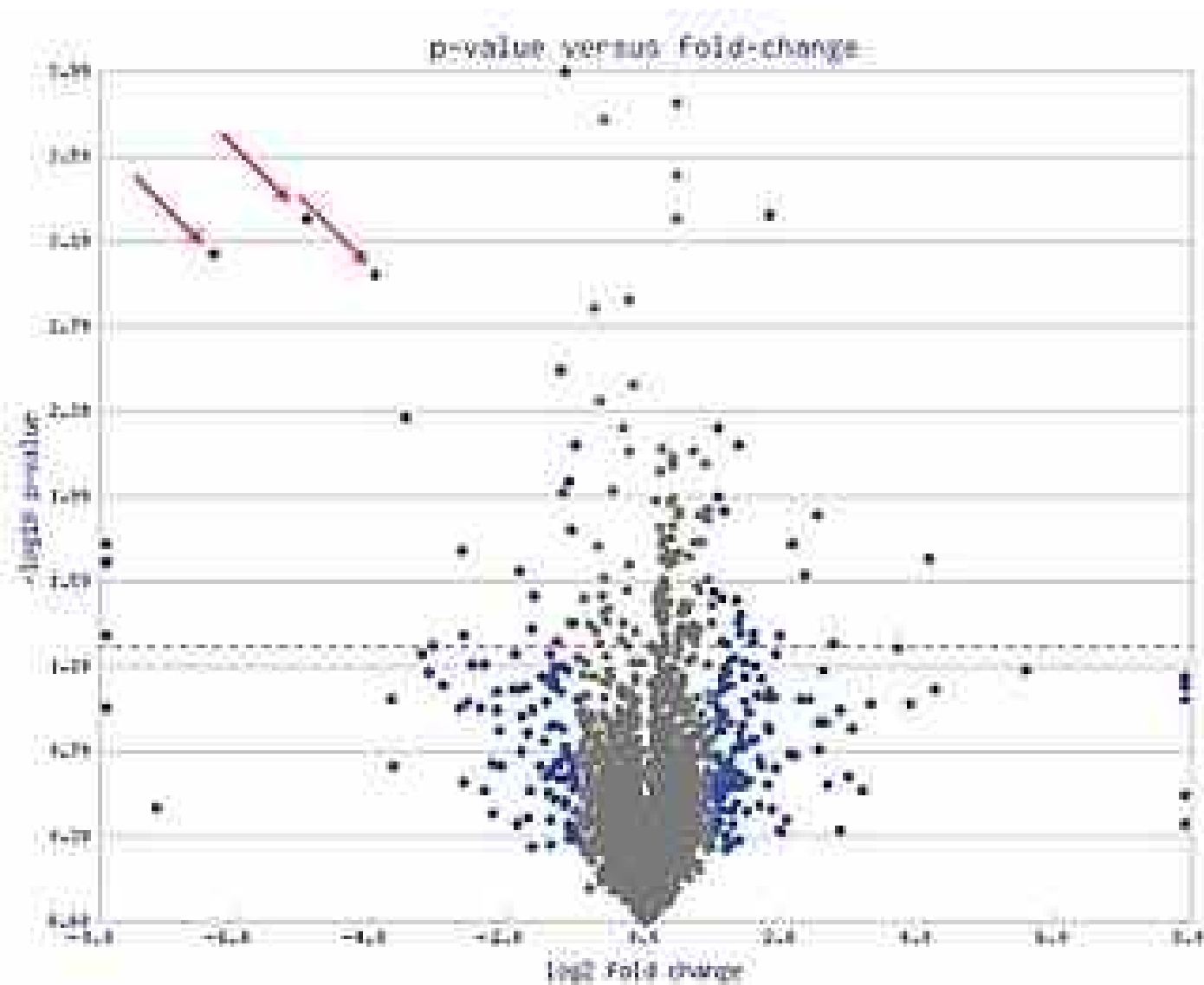
UMAP: Uniform Manifold Approximation and Projection for Dimension Reduction

McInnes et al (2018) arXiv. 1802.03426

<https://www.youtube.com/watch?v=nq6iPZVUxZU>

<https://towardsdatascience.com/how-exactly-umap-works-13e3040e1668>

Volcano Plot



https://en.wikipedia.org/wiki/Volcano_plot_%28statistics%29

JASPAR Database

Browser window showing the JASPAR Database interface for matrix profile MA0002.1.

URL: jaspar.genereg.net/matrix/MA0002.1/


Navigation menu (left): Home, About, Search, Browse JASPAR CORE, Unvalidated Profiles, Browse Collections, Tools, RESTful API, Download Data, Matrix Clusters, Genome Tracks, Enrichment Analysis (New).

Page title: Detailed information of matrix profile MA0002.1

Profile summary (Add button):

- Name: RUNX1
- Matrix ID: MA0002.1
- Class: Runt domain factors
- Family: Runt-related factors
- Collection: CORE
- Taxon: Vertebrates
- Species: [Homo sapiens](#)
- Data Type: SELEX
- Validation: 8413232
- Uniprot ID: [Q01196](#)
- Source:
- Comment: Matrix changed since last release: removal of primers and sites overlapping primers

Sequence logo (Download SVG button):




Frequency matrix (Download buttons: JASPAR, TRANSFAC, MEME, RAW PFM, Reverse comp.):

	1	2	3	4	5	6	7	8	9	10	11
A	10	12	4	1	2	2	0	0	0	8	13
C	2	2	7	1	0	8	0	0	1	2	2
G	3	1	1	0	23	0	26	26	0	0	4
T	11	11	14	24	1	16	0	0	25	16	7

Binding sites information (HTML file, FASTA file buttons):

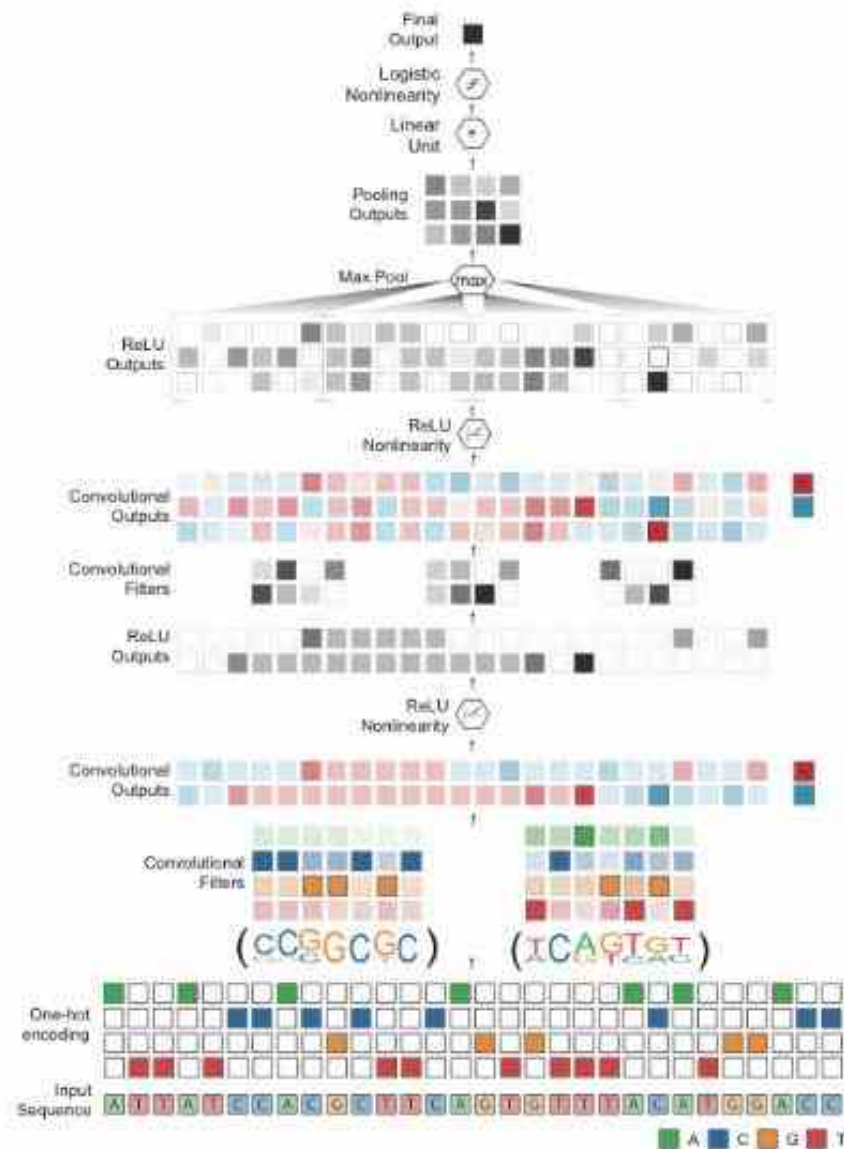
External links (PDB, UniProt, DRV, TFBSshape):

Version information (ChIP-seq centrality, First order TFFM, Detailed TFFM, Wordclouds, More details):

Matrix ID	Base ID	Version	Name	Species	Family	Class	Sequence logo
MA0002.2	MA0002	2	Runx1	Mus musculus	Runt-related factors	Runt domain factors	

<https://jaspar.genereg.net/matrix/MA0002.1/>

ML with Strings



One hot encoding to sequence classification

<https://kundajelab.github.io/dragonntutorials.html>