

Presentation Slides

Guidelines and Examples

January 3, 2017

Saarland University
Chair for Clinical Bioinformatics



Introduction

Purpose of these slides

- ✓ Slide layout, color scheme and font
- ✓ Figures, tables, formulas
- ✓ Other tips and references

✗ Exact description of how slides should look like

👉 There is **no** single perfect solution for any presentation

Layout, Color Scheme and Font

Some guidelines for the layout

Basic elements

- Section/slide title – for “global” orientation
- Slide counter – helps in navigation during Q&A

Optional elements

- Presentation title and date
- Institution name/logo
- ...

All these elements should not take too much **space**

- I.e. main part ($\geq 80\%$) is reserved for the slide content
- N.B. the slide real-estate is limited; use it efficiently

Some guidelines for the color scheme

- ☞ Appropriate **contrast** between text and background
 - Dark background/light font or Light background/dark font
 - May depend on the presentation room or beamer – **test early**, if possible
 - If not sure use light background and dark font
- ☞ No "aggressive" color combinations, e.g. red and green
- ☞ **Few** main colors, no "rainbow" color scheme
 - Optional: same color scheme for layout and graphics
- ☞ **Plain background** is in most cases the best choice

Some guidelines for the font

- ☞ Neutral and easy to read, **not** *"something like that"*
- ☞ Sufficiently large, e.g. 18pt for main text
- ☞ Avoid using only capital letters
- ☞ Use a different style for titles/keywords, e.g. in **bold**

Figures, Tables, Formulas

- ☞ Captions/numbering (optional)
- ☞ Appropriate figure **resolution**
 - All relevant details should be recognizable
 - Figures should **not** be pixelated
- ☞ **Consistent** size/placement (alignment)
 - If multiple figures on same slide
- ☞ **Omit** irrelevant details
 - E.g. screenshots – select only relevant area
- ☞ **Highlight** important details
- ☞ Add image **source**
 - Below the figure or on a separate reference slide

Figures: How it COULD be done



Figure 1: *Figure caption*

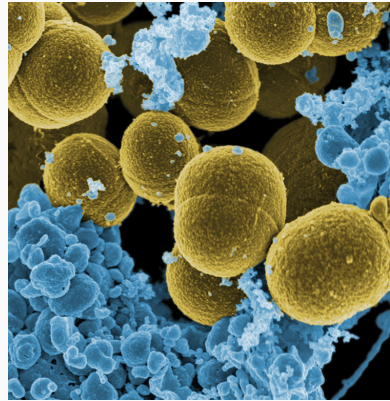
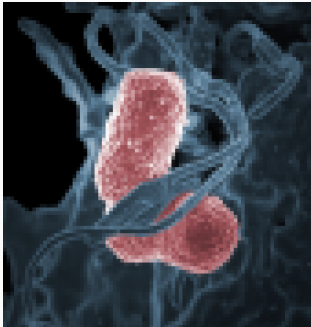


Figure 2: *Another figure caption*

Figures: How it should NOT be done



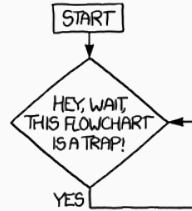
Figures: When to use?



How something looks like



Illustration of a method, e.g. NGS



Workflow



Results/data as graphs

- ☞ Captions/numbering (optional)
- ☞ **Structure** the table
 - E.g. header, row blocks, column blocks
- ☞ **Highlight** important data by font family or color
- ☞ **Omit irrelevant** information
 - **Condense** the information; do **not** simply copy & paste
 - More space for important data
- ☞ **Consistent** alignment within the cells

Tables: How it COULD be done



X	Y	Z
block 1
block 1
block 1
block 2
block 2	Highlight	...
block 2

Table 1: Example table

Tables: How it should NOT be done



X	Y	Z	An unimportant column	A	B	C
...
...
...
...
...
...
...
...
...

- ☞ Use specific **font** for variables
 - Do **not** use the same font as for regular text
- ☞ It is advisable to use formula editor/environment
- ☞ **Explain** the variables in the formula



This is an example equation for variable X :

$$X = a \times b + Y - \alpha$$

where Y is the input variable and a , b and α are constants

Formulas: How it should NOT be done



This is an example equation for variable X:

$$X = a * b + Y - \text{alpha}$$

Structure

Title slide

- ☞ Presentation **title**, e.g. title of the publication
 - If presenting a paper add author names
 - If author list is too long, abbreviate it, e.g. last names of first three authors *et al.*
- ☞ Your **name**
- ☞ Presentation **purpose**, e.g. seminar
- ☞ Presentation **date**
- ☞ Optional: institution/group, logo

Outline/Overview

- ☞ Main **points** of the presentation
- ☞ **Avoid** general and uninformative keywords, i.e. no "Introduction", "Methods" etc.
- ☞ Instead, **concisely** motivate the main problem, how it is addressed, and what are the main improvements/conclusions

Methods

- ☞ Essential theoretical background
- ☞ E.g. workflow, structure, formulas etc.
- ☞ If necessary, provide reasonable simplifications for the purpose of the presentation but know the intricate details for the Q&A

Results

- 👉 Used data: How was it generated? Processed?
- 👉 Analysis steps
- 👉 Relevant results (figures, tables)
- 👉 **Emphasize** and highlight key results

Summary

- ☞ Summary of the approach
- ☞ Summary of the results
- ☞ Conclusions
- ☞ Advantages/drawbacks
- ☞ Future work

Other

- ☞ References:
 - All used papers, books, articles, image sources etc.
 - google.com or wikipedia.org are **not sufficient**, yet may be used as **starting points** of your literature research
- ☞ Optional: "Thank you" slide
- ☞ Appendix: Additional information and/or results, information requiring dedicated/explicit explanation etc.

Other suggestions

- If the paper includes **supplemental material** – get it, it may contain additional explanations and important information
- Look through the **references** used in the paper – some things not explained in the paper may be found in there
- Preparing a presentation includes almost always additional **literature research** (apart from the mentioned references)

- ☞ Export slides to **PDF** if sharing them with someone
 - Same appearance on different operating systems
 - For non-standard fonts, make sure to **embed** them in the PDF
- ☞ Avoid **crowded** slides:
 - **Reduce content**: As little as possible and as much as necessary
 - **Split** into multiple slides, if necessary
- ☞ Choose **appropriate** way of representing information
 - E.g., visualize **complex** things by a **figure** instead of text/formula (if appropriate)
- ☞ Use **simple examples** for your explanations
 - You may have non-experts in the audience
- ☞ **Highlight** important details in text, figures, tables, formulas

- ☞ **No sentences** or **long phrases** (exceptions: quotes)
- ☞ **Paraphrase**, i.e. no copy-paste from paper
- ☞ Check appropriate use of whitespace – it distracts otherwise
 - **One** whitespace **after** a punctuation mark, e.g., comma or period
 - **No** whitespace **before** a punctuation mark

- **Practice** your talk in front of someone, it will help you to
 - Estimate the length (a bit shorter preferred over much longer)
 - Get additional feedback, possibly from non-experts
 - **Talk to the audience**, do not look at the slides all the time
 - If necessary, use flashcards or other notes that you can put in front of you
 - N.B. do **not** simply read from your notes either
 - Try to **avoid** making distracting gestures, sounds (e.g. "Um")
 - **Explain** all needed details when showing
 - Formulas → What is computed? Variables?
 - Figures → What is plotted/drawn? Legend? Axes?
 - Tables → Column/row content?
- before** interpreting
- **Be prepared** to explain all terms/methods/statements on your slides

References

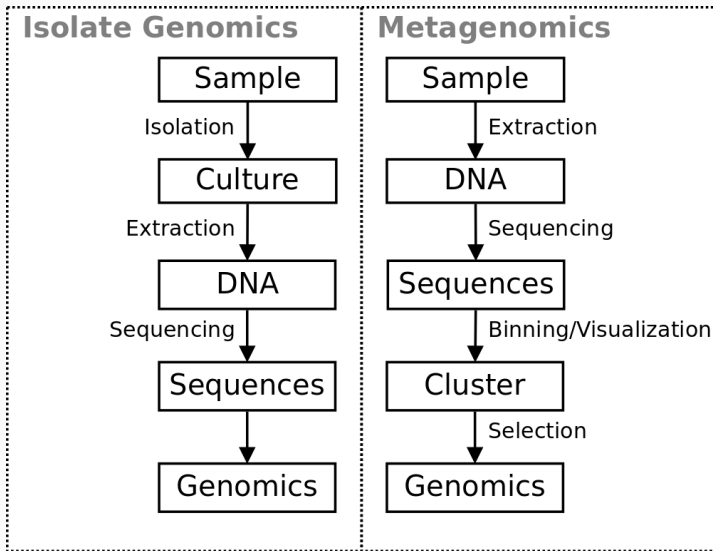
- Ten Secrets to Giving a Good Scientific Talk
- Elsevier: How to give a dynamic scientific presentation
- Butterick's Practical Typography - Presentations
- L^AT_EX
 - A high-quality typesetting system for writing scientific articles, theses, presentations
 - Freely available, there are many tutorials
 - Many features, e.g. mathematical environment, bibliography, automatic numbering for figures, tables and equations
- Gimp
 - Freely available
 - Can be used to create high-resolution screenshots from PDFs

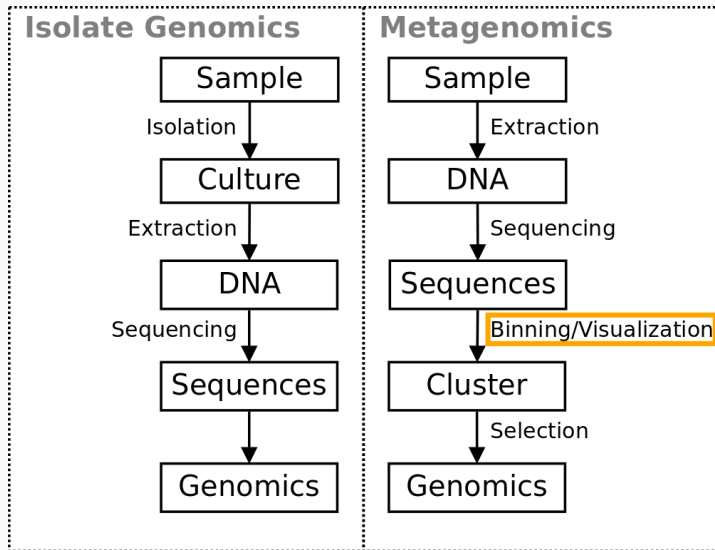
Presentation Example

Masterseminar

Visualization of metagenomic data utilizing coverage information

Dominik Wermke





GCTGC **TGC** GGC GGGT GCGT GGCATCCGGGGCACGGTGGAGATGCGGGAG



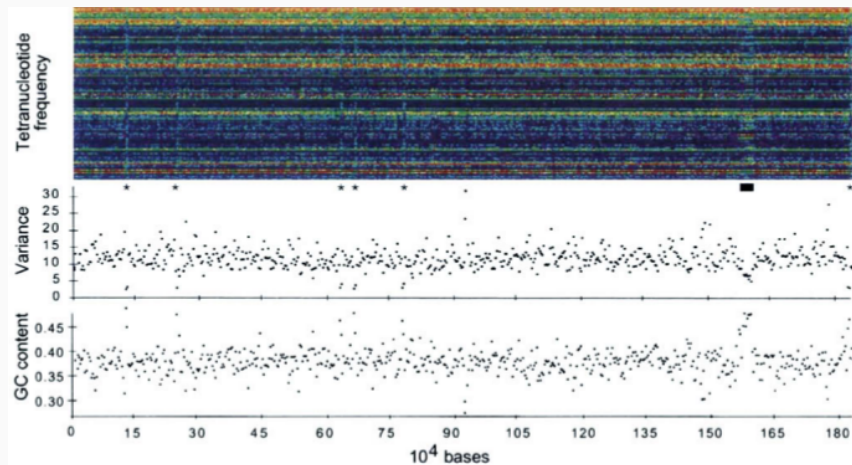
GGT GCG GCG GGT GCG
 GTG CGG CGG GTG CGT
 TGC GGC GGG TGC GTG



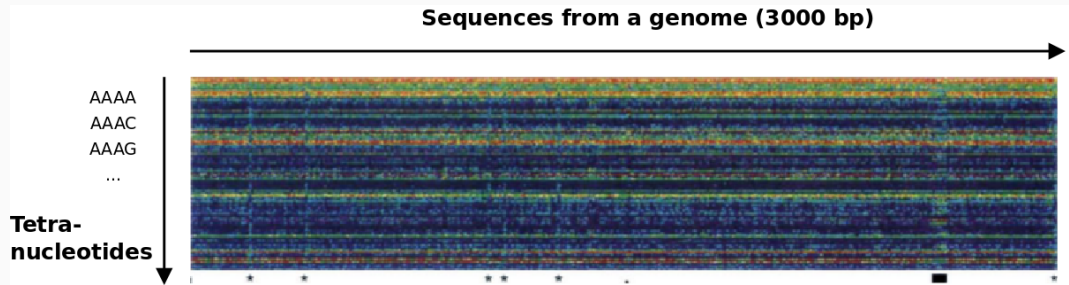
CGG	CGT	GGC	GCG	GGG	GGT	GTG	TGC
2	1	1	3	1	2	3	2

k	2	3	4	5
dimension	16	64	256	1024

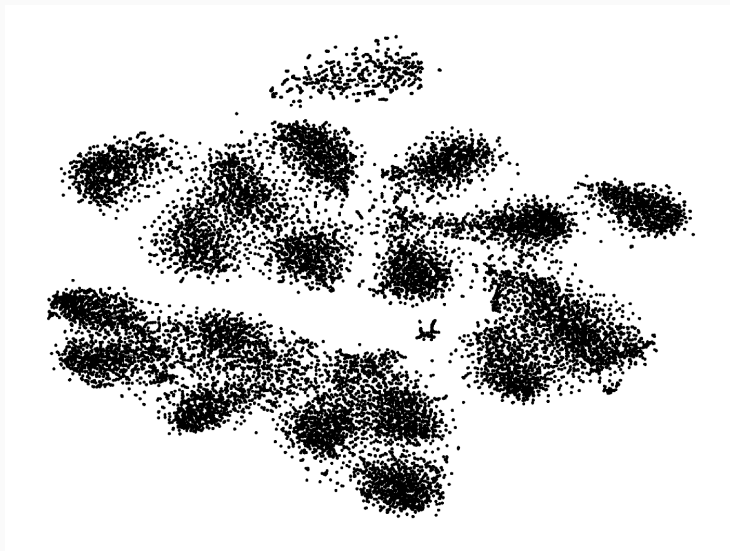
K-mers

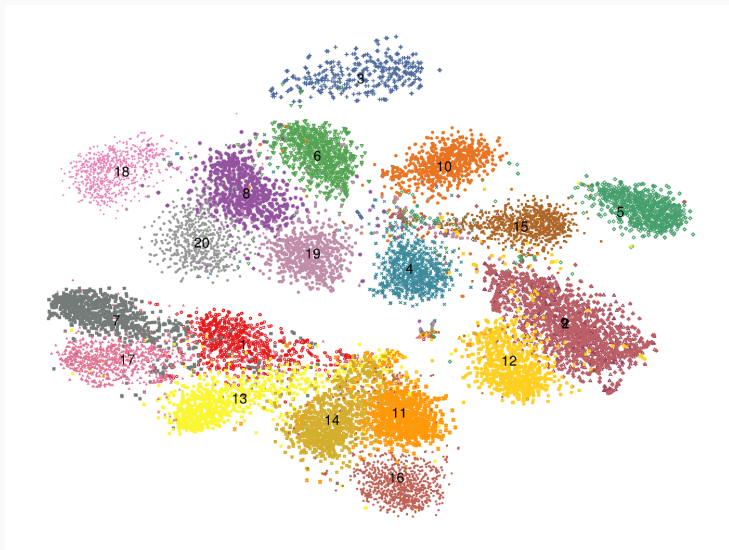


[1]



[1]

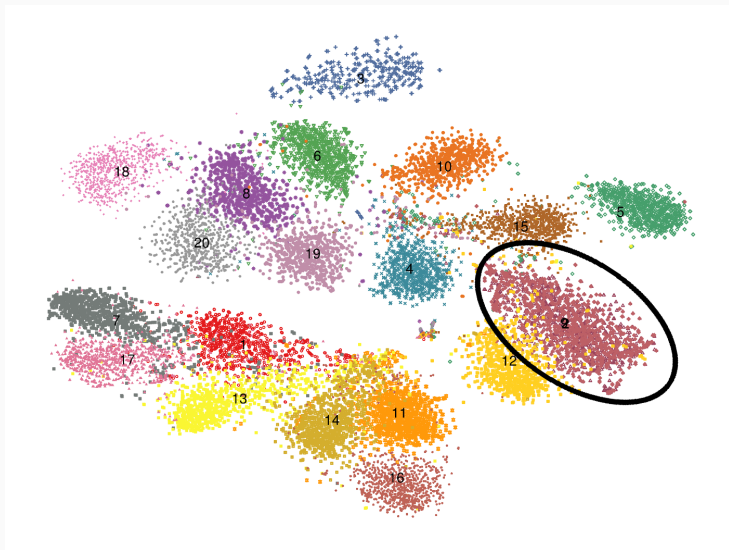




Classes:

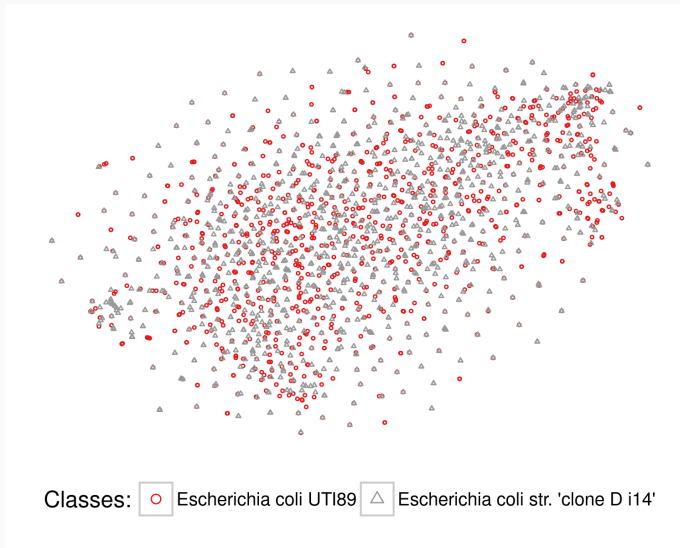
- | | |
|---|--|
| ○ | (1) <i>Leifsonia xyli</i> |
| △ | (2) <i>Escherichia coli</i> UTI89 |
| + | (3) <i>Candidatus Carsonella ruddii</i> |
| × | (4) <i>Haemophilus influenzae</i> |
| ◇ | (5) <i>Bacillus amyloliquefaciens</i> |
| ▽ | (6) <i>Brachyspira hyodysenteriae</i> |
| ⊠ | (7) <i>Geodermatophilus obscurus</i> |
| * | (8) <i>Rickettsia prowazekii</i> |
| ⊠ | (9) <i>Escherichia coli</i> str. 'clone D i14' |
| ⊕ | (10) Uncultured Termite group 1 bacterium |
| ⊗ | (11) <i>Maricaulis maris</i> |
| ⊞ | (12) <i>Marinobacter psychrophilus</i> |
| ⊠ | (13) <i>Methylobacterium nodulans</i> |
| ⊞ | (14) <i>Aminobacter aminovorans</i> |
| ■ | (15) <i>Bacillus clausii</i> |
| ● | (16) <i>Bordetella hinzii</i> |
| ▲ | (17) <i>Brachybacterium faecium</i> |
| ◆ | (18) <i>Campylobacter subantarcticus</i> |
| ● | (19) <i>Candidatus Amoebophilus asiaticus</i> |
| ● | (20) <i>Baumannia cicadellincola</i> |

Visualization

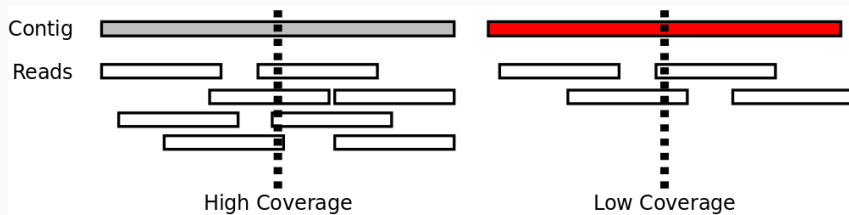


Classes:

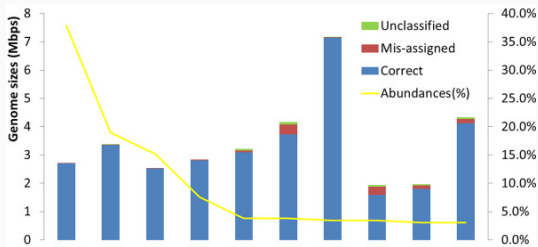
- (1) *Leifsonia xyli*
- △ (2) *Escherichia coli* UT189
- + (3) *Candidatus Carsonella ruddii*
- × (4) *Haemophilus influenzae*
- ◇ (5) *Bacillus amyloliquefaciens*
- ▽ (6) *Brachyspira hyodysenteriae*
- ⊠ (7) *Geodermatophilus obscurus*
- * (8) *Rickettsia prowazekii*
- ◇ (9) *Escherichia coli* str. 'clone D i14'
- ⊕ (10) Uncultured Termite group 1 bacterium
- ⊗ (11) *Maricaulis maris*
- ⊕ (12) *Marinobacter psychrophilus*
- ⊗ (13) *Methylobacterium nodulans*
- ⊕ (14) *Aminobacter aminovorans*
- (15) *Bacillus clausii*
- (16) *Bordetella hinzii*
- ▲ (17) *Brachybacterium faecium*
- ◆ (18) *Campylobacter subantarcticus*
- (19) *Candidatus Amoebophilus asiaticus*
- (20) *Baumannia cicadellincola*



Coverage

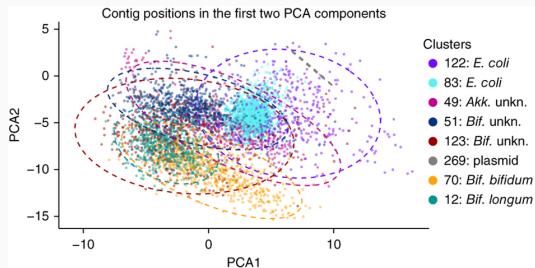


MaxBin:



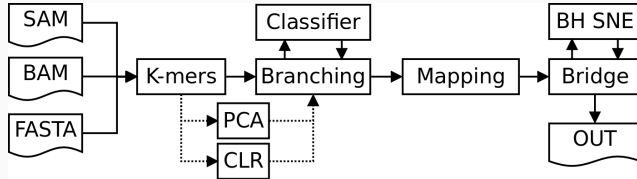
[2]

CONCOCT:

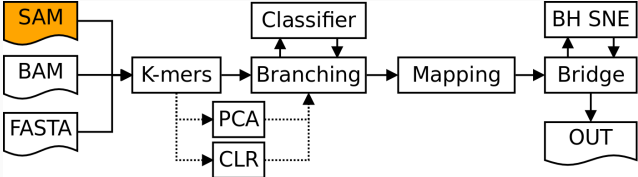


[3]

Implementation

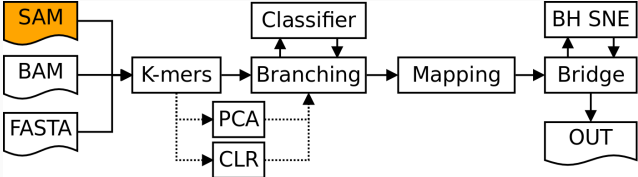


Implementation



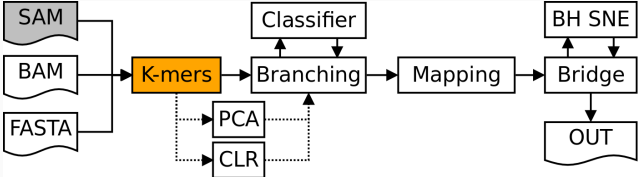
1	0	1	483	42	100M	*	0	0	GCAGTCGCGTATTCATCGCG	
2	16	1	372	42	100M	*	0	0	TGCTCGAACGTCTGCAAAG	
3	0	1	646	42	100M	*	0	0	CAGCGCCGCTGATGGCGCGG	
4	16	2	61	42	100M	*	0	0	GAGTTTTAACGACGAACGTG	
5	0	2	390	42	100M	*	0	0	AGCGGATGAGCTTTGCGCTG	

Implementation



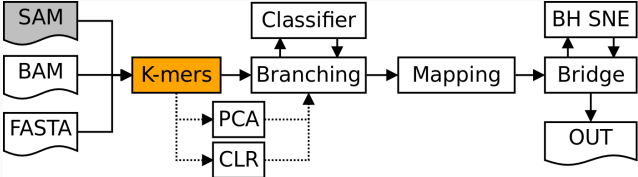
1	0	1	483	42	100M	*	0	0	GCAGTCGCGTATTCATCGCG	
2	16	1	372	42	100M	*	0	0	TGCTCGAACGTCTGCAAAG	
3	0	1	646	42	100M	*	0	0	CAGCGCCGCTGATGGCGCGG	
4	16	2	61	42	100M	*	0	0	GAGTTTTAACGACGAACGTG	
5	0	2	390	42	100M	*	0	0	AGCGGATGAGCTTTGCGCTG	

Implementation



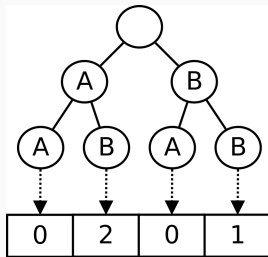
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2	16	1	372	42	100M	*	0	0	TGCTCGAACGTCTGCAAAG	
3	0	1	646	42	100M	*	0	0	CAGCGCCGCTGATGGCGCGG	
4	16	2	61	42	100M	*	0	0	GAGTTTTAACGACGAACGTG	
5	0	2	390	42	100M	*	0	0	AGCGGATGAGCTTTGCGCTG	

Implementation



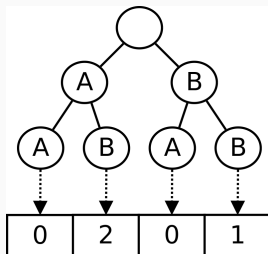
```
GCAGTCGCGTATTCATCGCG  
TGCTCGAACGTCTGCAAAG  
CAGCGCCGCTGATGGCGCGG  
GAGTTTTAACGACGAACGTG  
AGCGGATGAGCTTTGCGCTG
```

Implementation



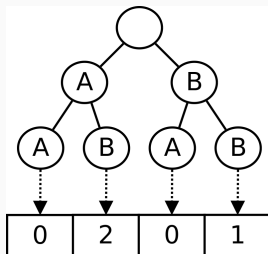
```
GCAGTCGCGTATTCATCGCG  
TGCTCGAACGTCTGCAAAG  
CAGCGCCGCTGATGGCGCGG  
GAGTTTTAACGACGAACGTG  
AGCGGATGAGCTTTGCGCTG
```

Implementation



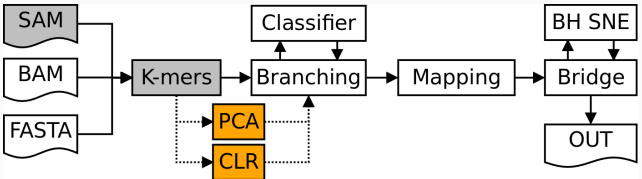
AAA	AAC	AAG	AAT	ACA	ACC	ACG	ACT	...
0	0	0	0	0	0	0	0	...
2	1	1	0	0	0	1	0	...
0	0	0	0	0	0	0	0	...
0	2	0	0	0	0	3	0	...
0	0	0	0	0	0	0	0	...

Implementation



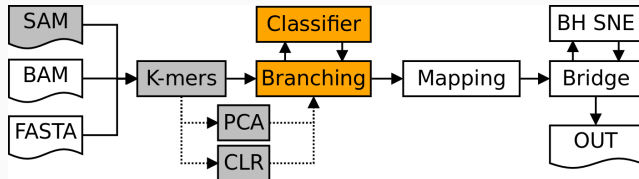
AAA	AAC	AAG	AAT	ACA	ACC	ACG	ACT	...
0	0	0	0	0	0	0	0	...
0.111	0.056	0.056	0	0	0	0.056	0	...
0	0	0	0	0	0	0	0	...
0	0.111	0	0	0	0	0.167	0	...
0	0	0	0	0	0	0	0	...

Implementation



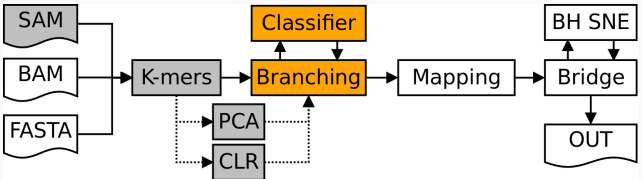
AAA	AAC	AAG	AAT	ACA	ACC	ACG	ACT	...
0	0	0	0	0	0	0	0	...
0.111	0.056	0.056	0	0	0	0.056	0	...
0	0	0	0	0	0	0	0	...
0	0.111	0	0	0	0	0.167	0	...
0	0	0	0	0	0	0	0	...

Implementation



AAA	AAC	AAG	AAT	ACA	ACC	ACG	ACT	...
0	0	0	0	0	0	0	0	...
0.111	0.056	0.056	0	0	0	0.056	0	...
0	0	0	0	0	0	0	0	...
0	0.111	0	0	0	0	0.167	0	...
0	0	0	0	0	0	0	0	...

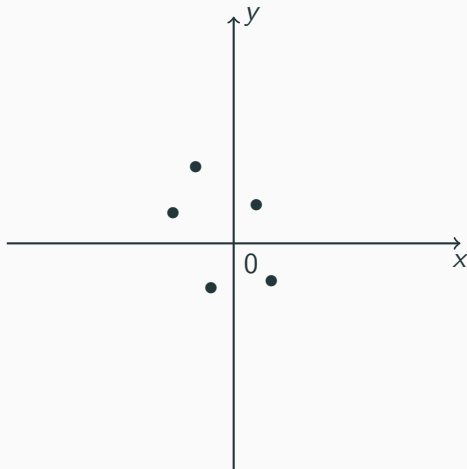
Implementation



ID	AAA	AAC	AAG	AAT	ACA	ACC	ACG	ACT	...
1	0	0	0	0	0	0	0	0	...
2	0.111	0.056	0.056	0	0	0	0.056	0	...
3	0	0	0	0	0	0	0	0	...
4	0	0.111	0	0	0	0	0.167	0	...
5	0	0	0	0	0	0	0	0	...

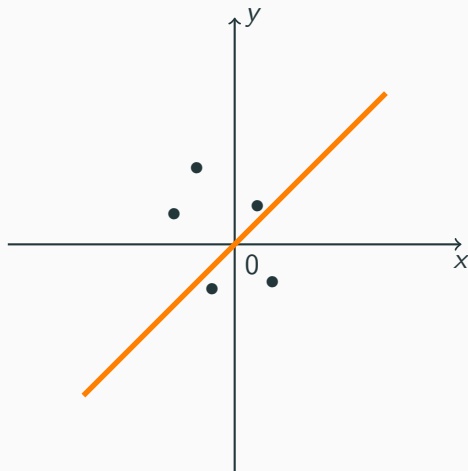
Implementation

1,2,3,4,5

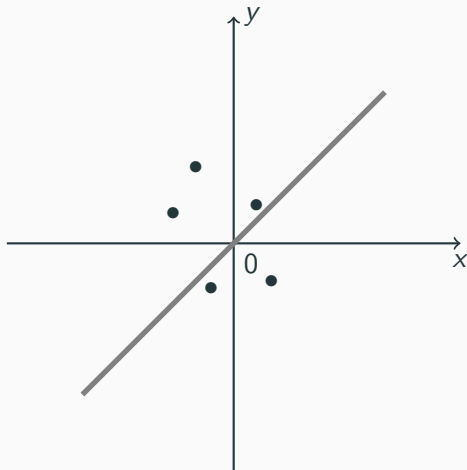
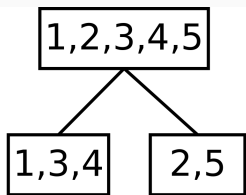


Implementation

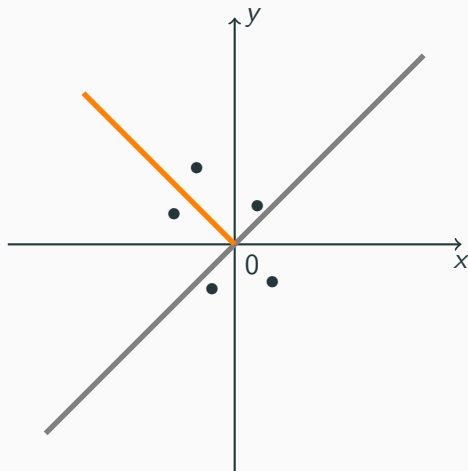
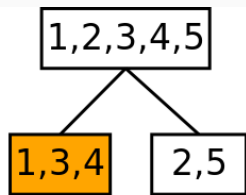
1,2,3,4,5



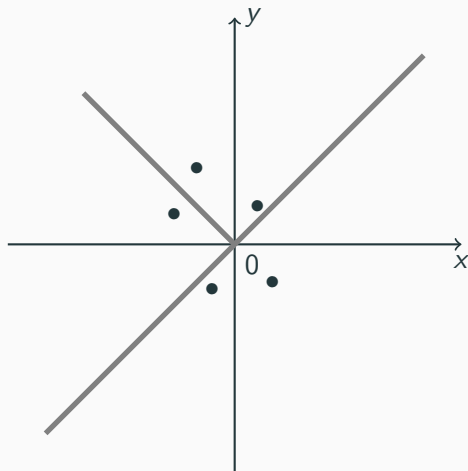
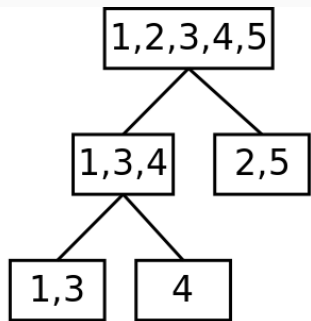
Implementation



Implementation



Implementation



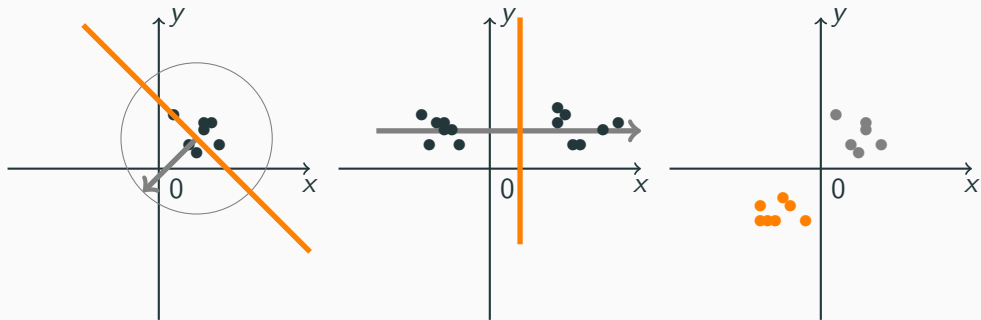
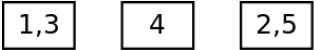
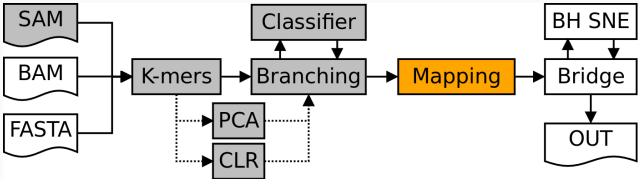


Figure 3: Mean classifier (left), Variance classifier (middle), 2-means (right)

Implementation



Implementation

1	0	1	483	42	100M	*	0	0	GCAGTCGCGTATTCATCGCG	
2	16	1	372	42	100M	*	0	0	TGCTCGAACGTCTGCAAAG	
3	0	1	646	42	100M	*	0	0	CAGCGCCGCTGATGGCGCG	
4	16	2	61	42	100M	*	0	0	GAGTTTAAACGACGAACGTG	
5	0	2	390	42	100M	*	0	0	AGCGGATGAGCTTTGCGCTG	

Contig ID Read IDs

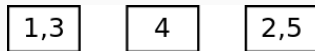
1	1, 2, 3
2	4, 5

1,3	4	2,5
-----	---	-----

Implementation

Contig ID	Subspace 1	Subspace 2	Subspace 3
1	2 reads	0 reads	1 reads
2	0 reads	1 reads	1 reads

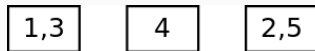
Contig ID	Read IDs
1	1, 2, 3
2	4, 5



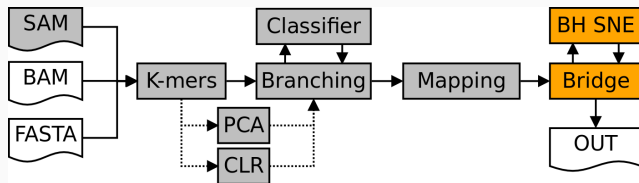
Implementation

	x1	x2	x3
Contig 1	2	0	1
Contig 2	0	1	1

Contig ID	Read IDs
1	1, 2, 3
2	4, 5

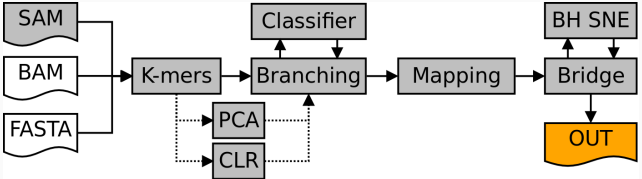


Implementation



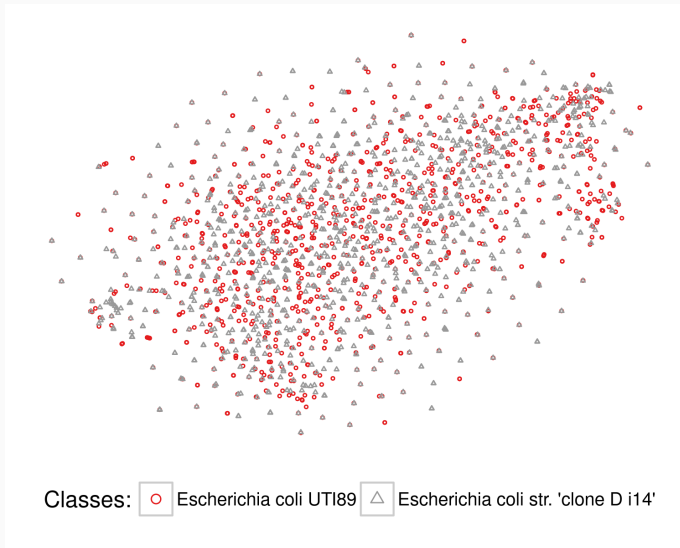
	x1	x2	x3
Contig 1	2	0	1
Contig 2	0	1	1

Implementation

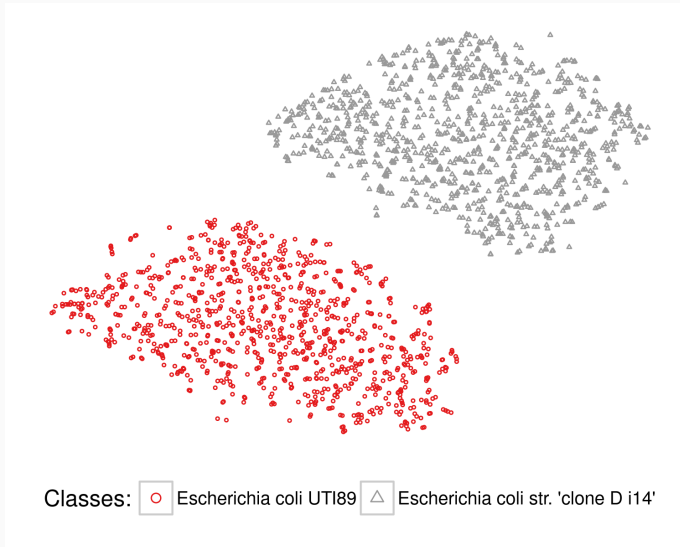


	x	y
Contig 1	0.345	1.234
Contig 2	-0.456	2.341

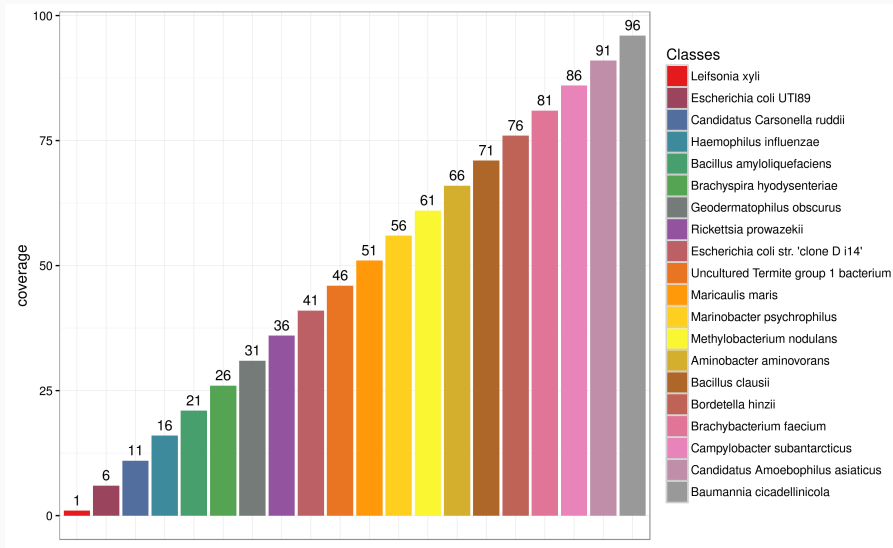
Two classes



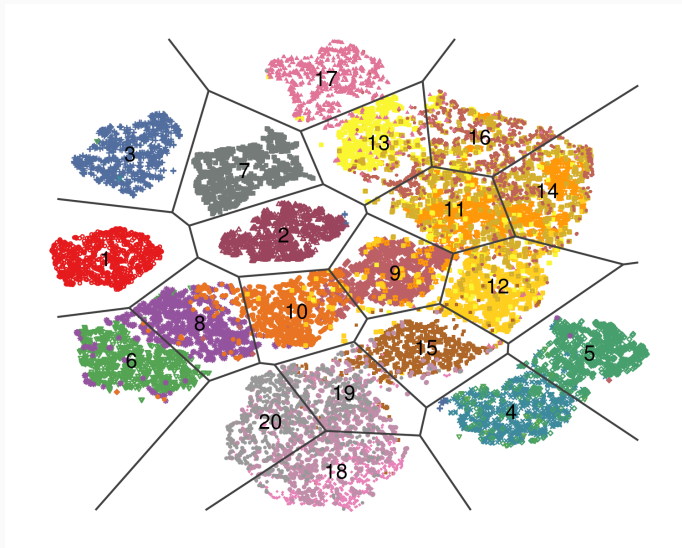
Two classes



Data Set 1 (Linear)



Data Set 1 (Linear)



Classes:

- | | |
|---|--|
| ○ | (1) <i>Leifsonia xyli</i> |
| △ | (2) <i>Escherichia coli</i> UTI89 |
| + | (3) <i>Candidatus Carsonella ruddii</i> |
| × | (4) <i>Haemophilus influenzae</i> |
| ◇ | (5) <i>Bacillus amyloliquefaciens</i> |
| ▽ | (6) <i>Brachyspira hyodysenteriae</i> |
| ⊠ | (7) <i>Geodermatophilus obscurus</i> |
| * | (8) <i>Rickettsia prowazekii</i> |
| ⊠ | (9) <i>Escherichia coli</i> str. 'clone D i14' |
| ⊕ | (10) Uncultured Termite group 1 bacterium |
| ⊗ | (11) <i>Maricaulis maris</i> |
| ⊞ | (12) <i>Marinobacter psychrophilus</i> |
| ⊞ | (13) <i>Methylobacterium nodulans</i> |
| ⊞ | (14) <i>Aminobacter aminovorans</i> |
| ■ | (15) <i>Bacillus clausii</i> |
| ● | (16) <i>Bordetella hinzii</i> |
| ▲ | (17) <i>Brachybacterium faecium</i> |
| ◆ | (18) <i>Campylobacter subantarcticus</i> |
| ● | (19) <i>Candidatus Amoebophilus asiaticus</i> |
| ● | (20) <i>Baumannia cicadellinicola</i> |

Data Set 1 (Linear)

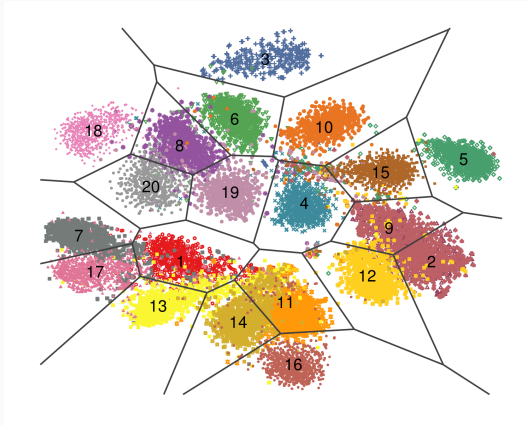


Figure 4: VizBin

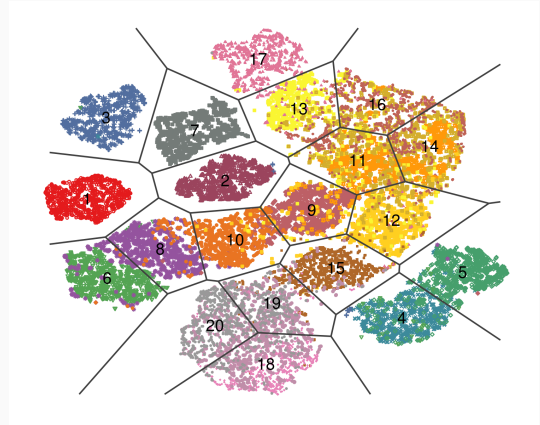


Figure 5: Implementation

Data Set 1 (Linear)

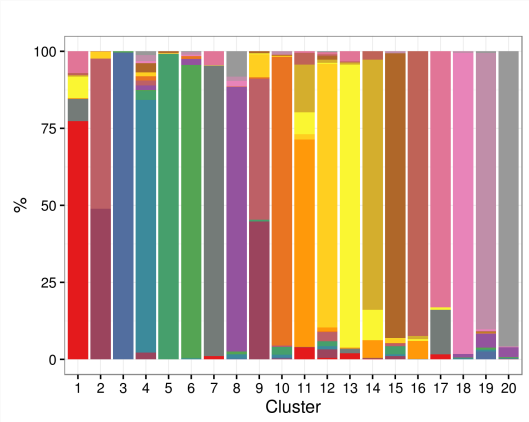


Figure 6: VizBin (Mean: 84.97%)

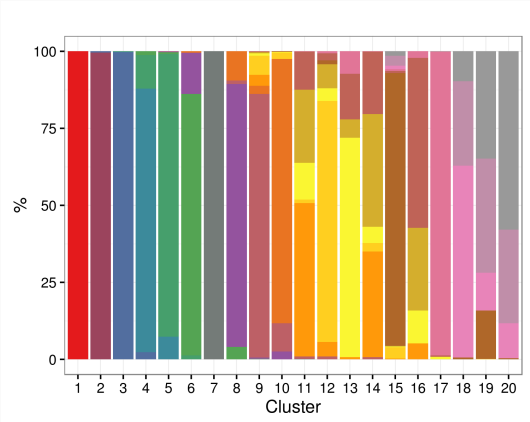
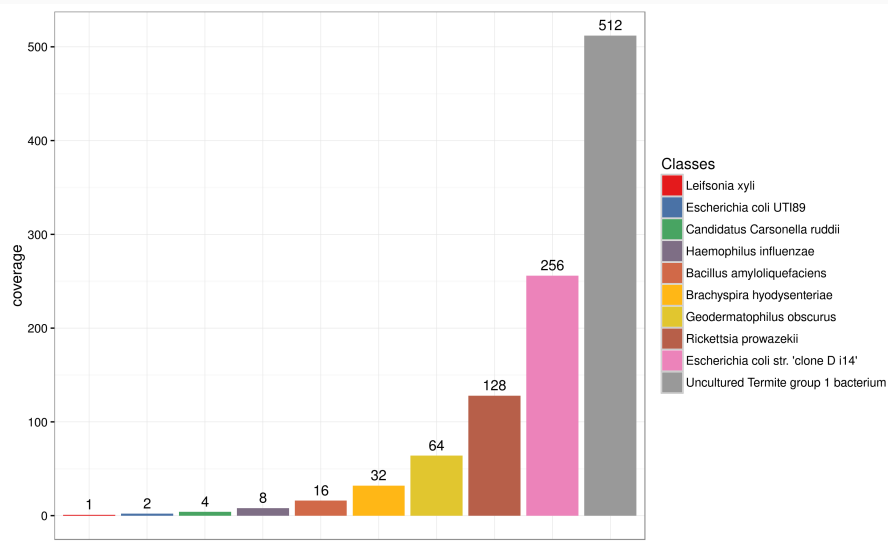
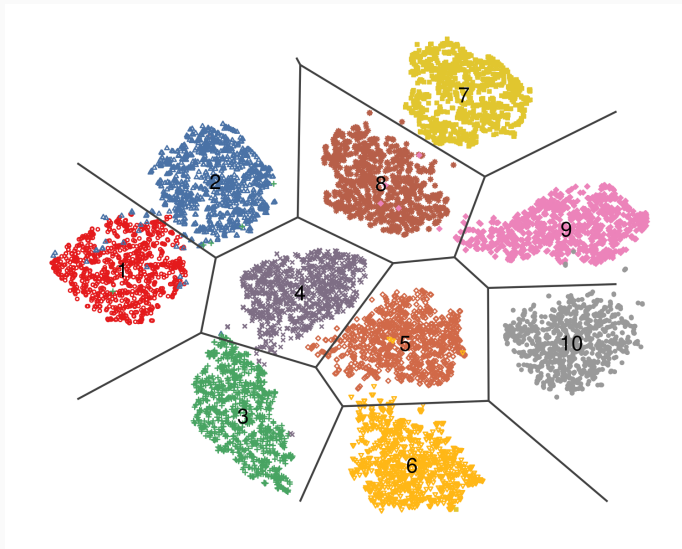


Figure 7: Implementation (Mean: 77.67%)

Data Set 2 (Exponential)



Data Set 2 (Exponential)



Classes:

- | | |
|---|--|
| ○ | (1) <i>Leifsonia xyli</i> |
| △ | (2) <i>Escherichia coli</i> UTI89 |
| + | (3) <i>Candidatus Carsonella ruddii</i> |
| × | (4) <i>Haemophilus influenzae</i> |
| ◇ | (5) <i>Bacillus amyloliquefaciens</i> |
| ▽ | (6) <i>Brachyspira hyodysenteriae</i> |
| ⊠ | (7) <i>Geodermatophilus obscurus</i> |
| * | (8) <i>Rickettsia prowazekii</i> |
| ◇ | (9) <i>Escherichia coli</i> str. 'clone D i14' |
| ⊕ | (10) Uncultured Termite group 1 bacterium |

Data Set 2 (Exponential)

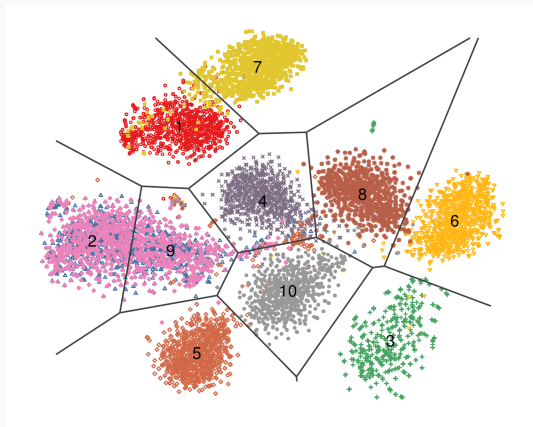


Figure 8: VizBin

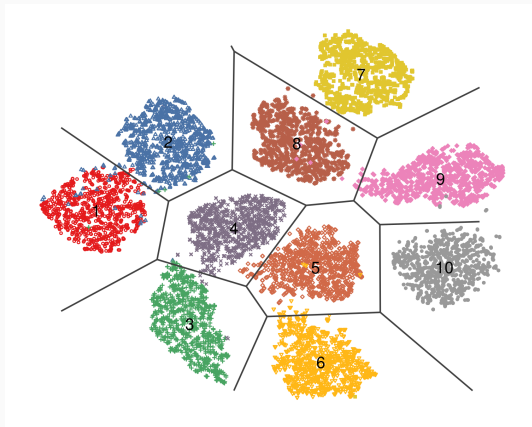


Figure 9: Implementation

Data Set 2 (Exponential)

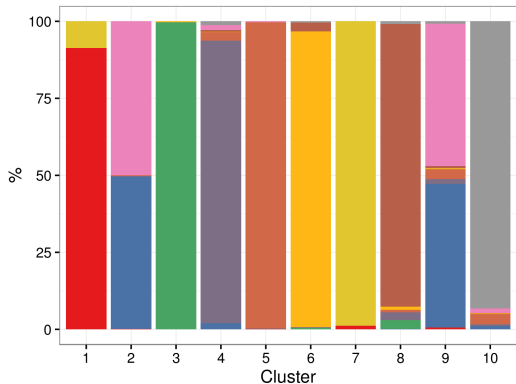


Figure 10: VizBin (Mean: 85.78%)

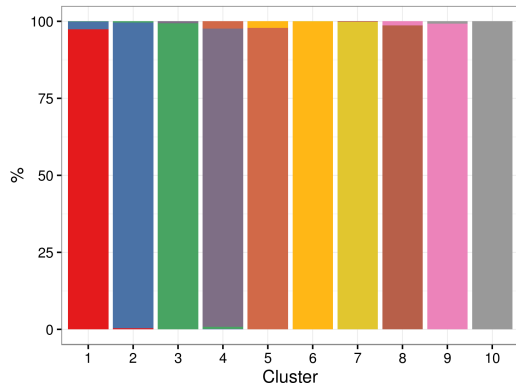
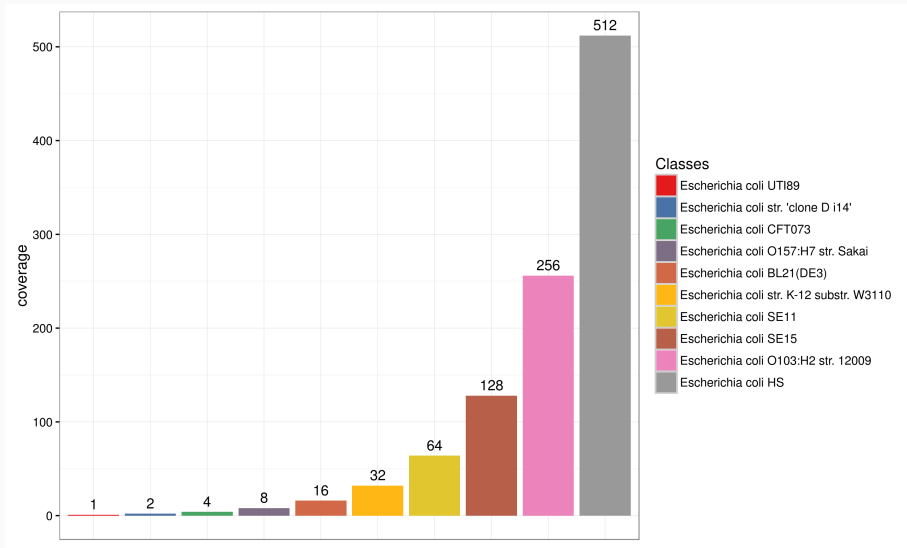
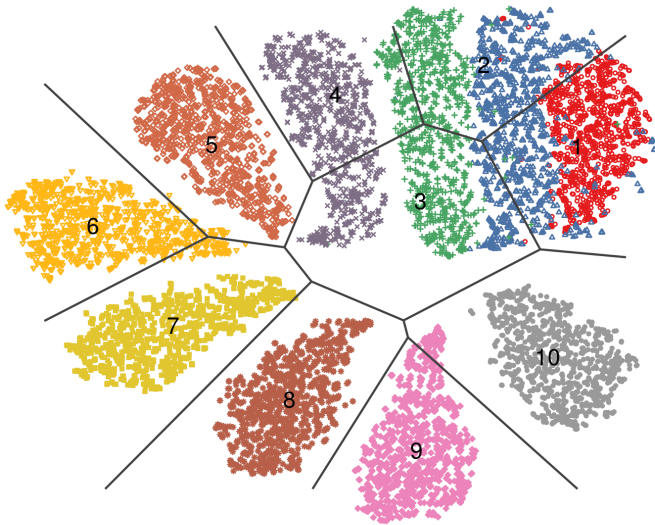


Figure 11: Implementation (Mean: 98.83%)

Data Set 3 (Similar Organisms)



Data Set 3 (Similar Organisms)



Classes:

- | | |
|---|---|
| ○ | (1) <i>Escherichia coli</i> UTI89 |
| △ | (2) <i>Escherichia coli</i> str. 'clone D i14' |
| + | (3) <i>Escherichia coli</i> CFT073 |
| × | (4) <i>Escherichia coli</i> O157:H7 str. Sakai |
| ◇ | (5) <i>Escherichia coli</i> BL21(DE3) |
| ▽ | (6) <i>Escherichia coli</i> str. K-12 substr. W3110 |
| ■ | (7) <i>Escherichia coli</i> SE11 |
| ● | (8) <i>Escherichia coli</i> SE15 |
| ◇ | (9) <i>Escherichia coli</i> O103:H2 str. 12009 |
| ⊕ | (10) <i>Escherichia coli</i> HS |

Data Set 3 (Similar Organisms)

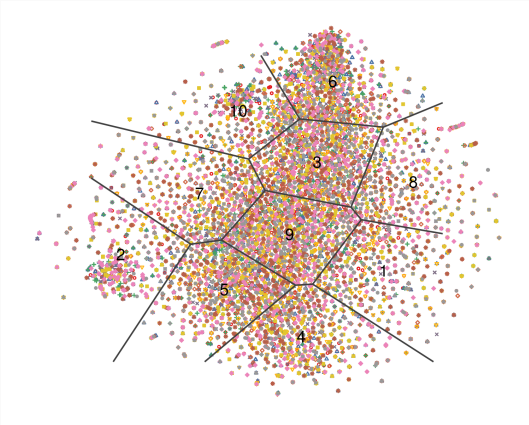


Figure 12: VizBin

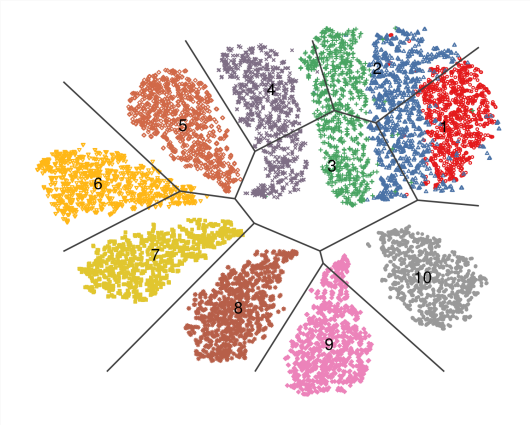


Figure 13: Implementation

Data Set 3 (Similar Organisms)

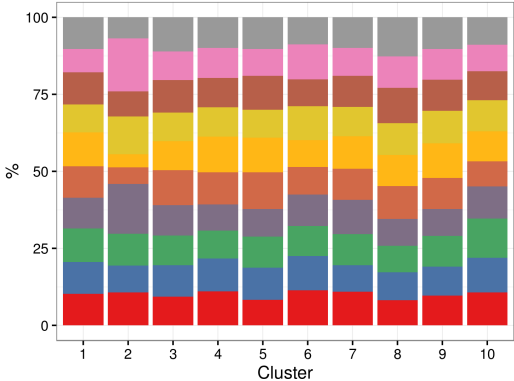


Figure 14: VizBin (Mean: 9.83%)

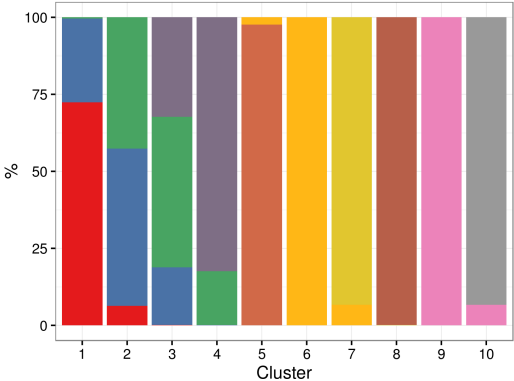
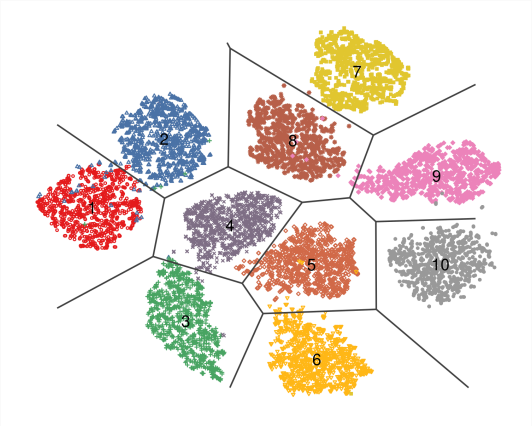
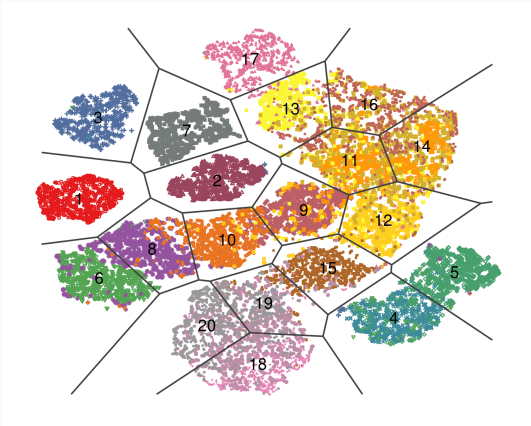
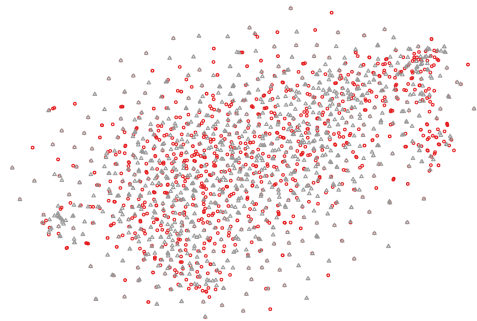


Figure 15: Implementation (Mean: 83.89%)

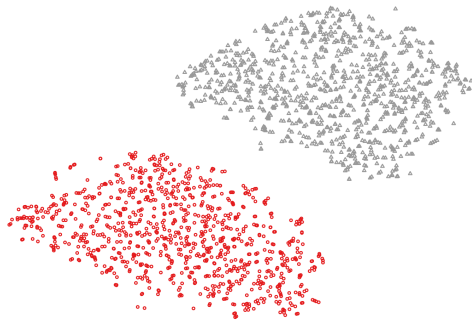
Conclusion





Conclusion



Classes: Escherichia coli UTI89 Escherichia coli str. 'clone D i14'



Classes: Escherichia coli UTI89 Escherichia coli str. 'clone D i14'

-  Noble PA, Citek RW and Ogunseitan OA.
Tetranucleotide frequencies in microbial genomes.
Electrophoresis
19(4), p. 528–35
-  Yu-Wei Wu, Yung-Hsu Tang, Susannah G Tringe, Blake A Simmons and Steven W Singer
MaxBin: an automated binning method to recover individual genomes from metagenomes using an expectation-maximization algorithm.
Microbiome
2:26



J.Alneberg et al.

Binning metagenomic contigs by coverage and composition.

Nature Methods

11, p. 1144–1146

Appendix

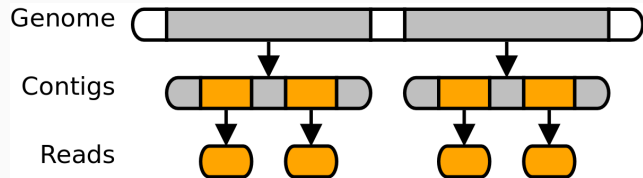
Name	Assembly Accession
<i>Leifsonia xyli</i> CTCB07	GCF_000007665.1_ASM766v1
<i>Candidatus Carsonella ruddii</i> HT	GCF_000287295.1_ASM28723v1
<i>Haemophilus influenzae</i> 86-028NP	GCF_000016485.1_ASM1648v1
<i>Bacillus amyloliquefaciens</i> TA208	GCF_000195515.1_ASM19551v1
<i>Brachyspira hyodysenteriae</i> WA1	GCF_000022105.1_ASM2210v1
<i>Geodermatophilus obscurus</i> DSM 43160	GCF_000025345.1_ASM2534v1
<i>Rickettsia prowazekii</i> Dachau	GCF_000277225.1_ASM27722v1
<i>Uncultured Termite group 1 bacterium</i> Rs-D17	GCF_000146025.2_ASM14602v1
<i>Maricaulis maris</i> MCS10	GCF_000014745.1_ASM1474v1
<i>Marinobacter psychrophilus</i> 20041	GCF_001043175.1_ASM104317v1
<i>Methylobacterium nodulans</i> ORS 2060	GCF_000022085.1_ASM2208v1
<i>Aminobacter colombiense</i> DSM 12261	GCF_000025885.1_ASM2588v1
<i>Bacillus clausii</i> KSM-16	GCF_000009825.1_ASM982v1
<i>Bordetella hinzii</i> F582	GCF_001078275.1_ASM107827v1
<i>Brachybacterium faecium</i> DSM 4810	GCF_000023405.1_ASM2340v1
<i>Campylobacter subantarcticus</i> LMG 24374	GCF_000816265.1_ASM81626v1
<i>Candidatus Amoebophilus asiaticus</i> 5a2	GCF_000020565.1_ASM2056v1
<i>Candidatus Baumannia cicadellincola</i> Hc	GCF_000013185.1_ASM1318v1

continued on next slide

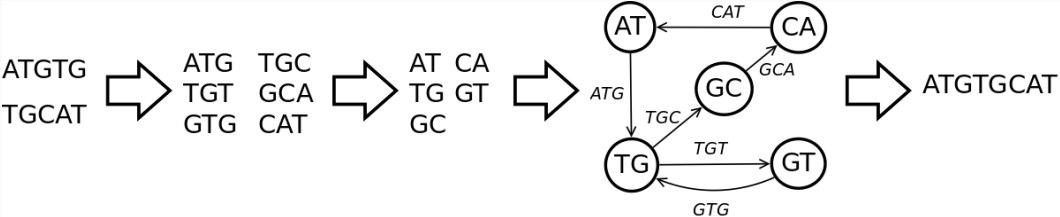
Appendix

Name	Assembly Accession
<i>Escherichia coli</i> UTI89	GCF_000013265.1_ASM1326v1
<i>Escherichia coli</i> clone D i14	GCF_000233895.1_ASM23389v1
<i>Escherichia coli</i> CFT073	GCF_000007445.1_ASM744v1
<i>Escherichia coli</i> O157:H7 str. Sakai	GCF_000008865.1_ASM886v1
<i>Escherichia coli</i> BL21(DE3)	GCF_000009565.1_ASM956v1
<i>Escherichia coli</i> str. K-12 substr. W3110	GCF_000010245.2_ASM1024v1
<i>Escherichia coli</i> SE11	GCF_000010385.1_ASM1038v1
<i>Escherichia coli</i> SE15	GCF_000010485.1_ASM1048v1
<i>Escherichia coli</i> O103:H2 str. 12009	GCF_000010745.1_ASM1074v1
<i>Escherichia coli</i> HS	GCF_000017765.1_ASM1776v1

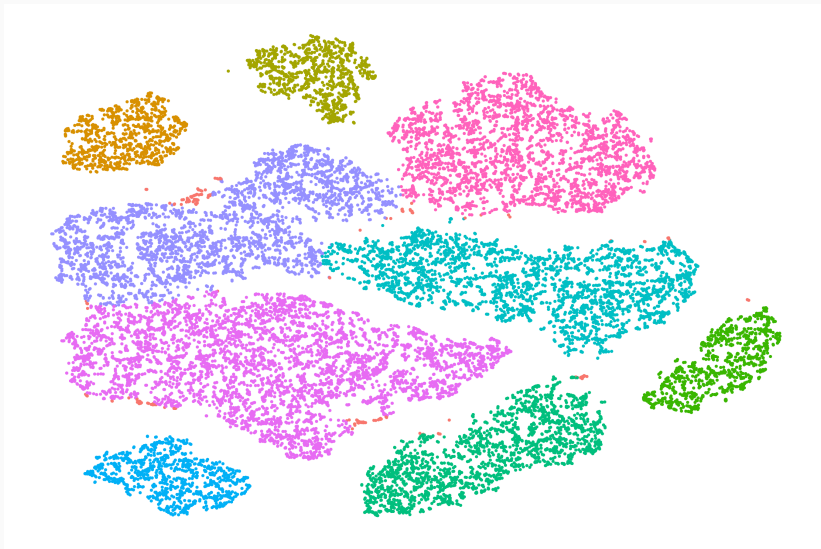
Appendix



Appendix



Appendix



Appendix

High Dimensional:

$$p_{i|i} = 0 \quad p_{j|i} = \frac{\exp -d(x_i, x_j)^2 / 2\sigma_i^2}{\sum_{k \neq i} \exp -d(x_i, x_k)^2 / 2\sigma_i^2} \quad (1)$$

$$p_{ij} = \frac{p_{j|i} + p_{i|j}}{2N} \quad (2)$$

Low Dimensional (Student-t):

$$q_{ij} = \frac{\left(1 + \|y_i - y_j\|^2\right)^{-1}}{\sum_{k \neq l} \left(1 + \|y_k - y_l\|^2\right)^{-1}} \quad (3)$$

Combined:

$$\text{KL}(P||Q) = \sum_{i \neq j} p_{ij} \log \frac{p_{ij}}{q_{ij}} \quad (4)$$