

Using Topological Data Analysis to Study Glandular Architecture

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TDA-Bio Workshop
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Joint Work With

- Carola Wenk (Tulane, CS)
- J. Quincy Brown (Tulane, BME)

⁰NSF DMS / NIH Planning Grant: 1557716 (MSU) and 1557750 (Tulane)

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- John Sheppard (MSU, CS)
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- Brian Summa (Tulane, CS)
- Pete Lawson (Tulane, BME)
- Eric Berry (MSU, Math)
- Sush Majhi (Tulane, Math)
- Alan Cleary (MSU, CS)
- Sawyer Payne (MSU, CS Undergrad)

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Prostate Cancer

The Question is *Will He Outlive It?*

- More than 225,000 cases per year (USA).
- One in seven men will be diagnosed.
- Treatments: surgery, chemo, radiation, hormone therapy.
- Either slowly-growing and benign or fast-growing and dangerous.
- Surgery / radiation benefits questionable for SG/B.
- Surgery / radiation side effects not desirable.
- ... therefore, active surveillance.

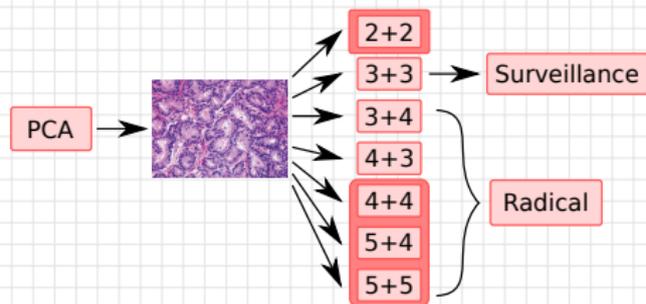
Prostate Cancer

Diagnosis

PCA

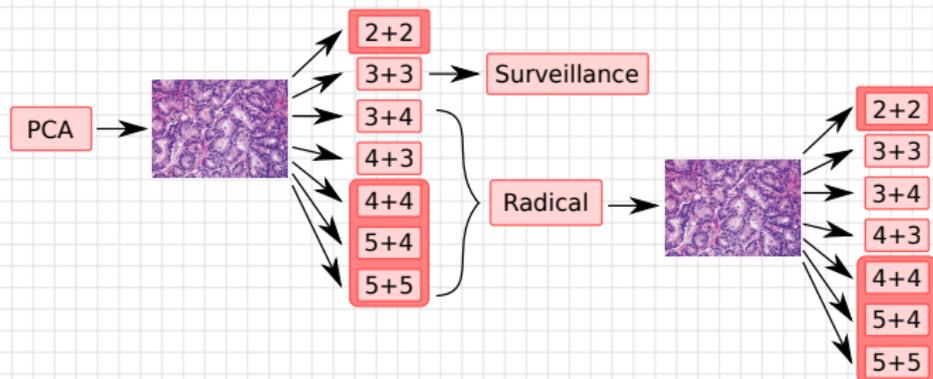
Prostate Cancer

Diagnosis



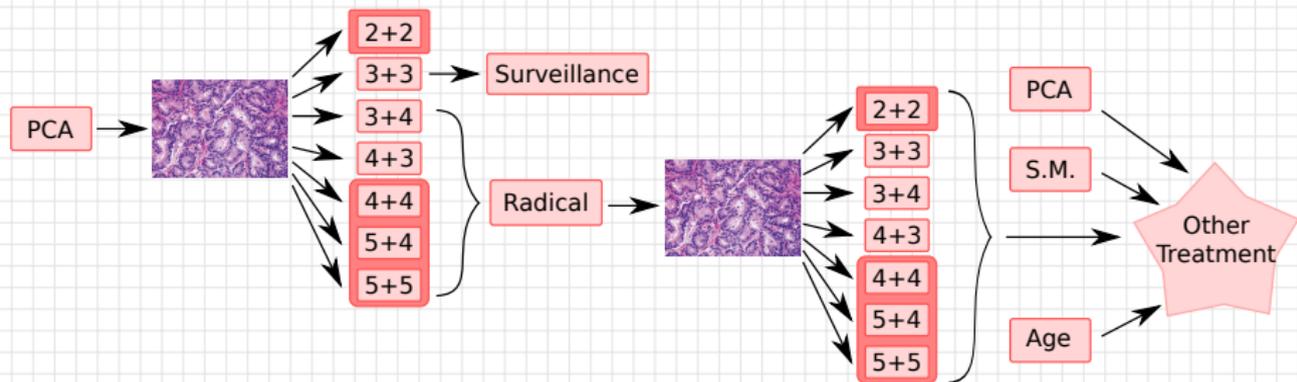
Prostate Cancer

Diagnosis



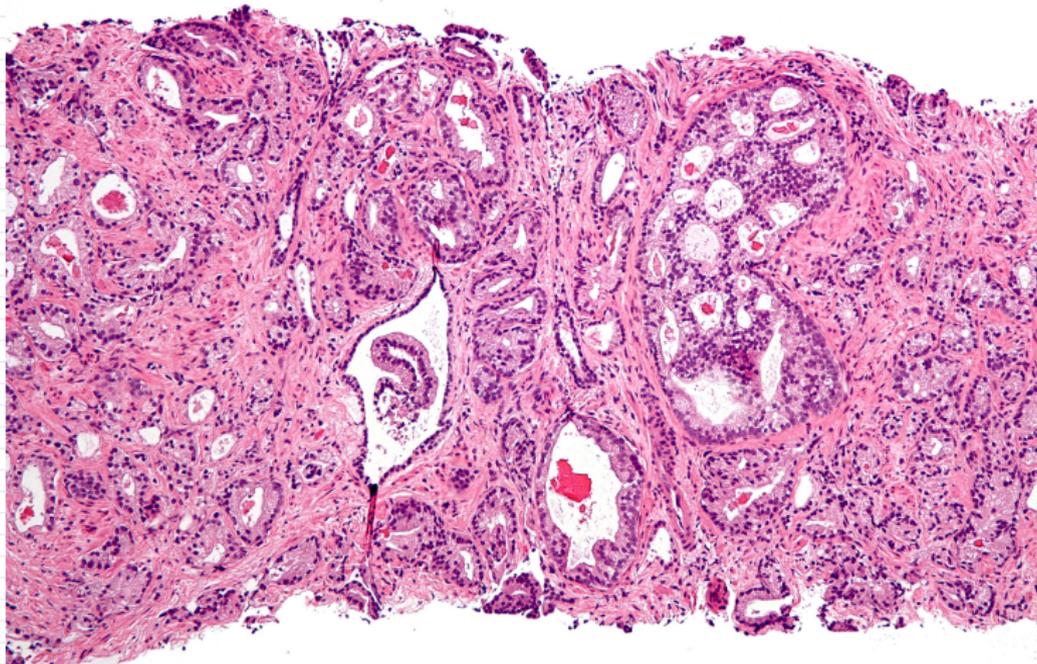
Prostate Cancer

Diagnosis

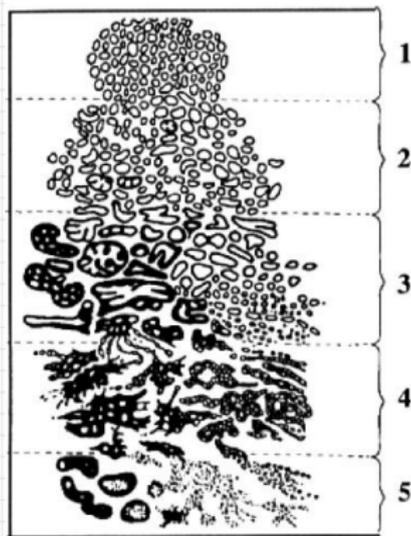


Biopsy and Prostatectomy Slides

How to Describe Glandular Architecture



Gleason Grading



Grade 1: well-defined, nicely packed

Grade 2: larger, more tissue, less uniform

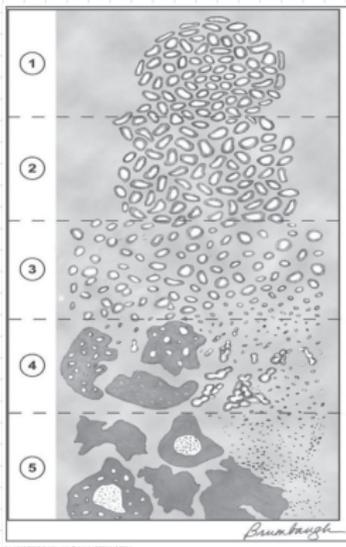
Grade 3: less defined glands, some cribriform

Grade 4: fused glands, open lumens

Grade 5: no glandular definition, sheets of cells

⁰Donald Gleason, 1966, image from *The Gleason Grading System: A Complete Guide for Pathologist and Clinicians* by Epstein

Gleason Grading



Grade 1: well-defined, nicely packed

Grade 2: larger, more tissue, less uniform

Grade 3: less defined glands

Grade 4: fused glands, open lumens, cribriform

Grade 5: no glandular definition, sheets of cells

⁰2005 Consensus, image from *The Gleason Grading System: A Complete Guide for Pathologist and Clinicians* by Epstein

Learning to Grade

The Gleason Grading System: A Complete Guide for Pathologists and Clinicians



Wolters Kluwer

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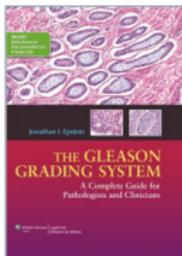
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The Gleason Grading System

A COMPLETE GUIDE FOR PATHOLOGIST AND CLINICIANS

By [Jonathan I. Epstein](#)

Category: [Medical, Pathology](#)

Hardback | 9781451172829 | July 2012 | 224 pages

List Price: **£129.00**

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DESCRIPTION

REVIEWS (1)

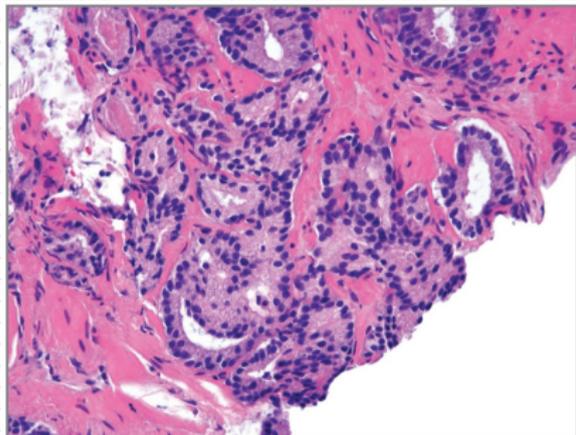
SPECIFICATIONS

The Gleason Grading System: A Complete Guide for Pathologists and Clinicians provides exhaustive coverage of the updated Gleason Grading System, which deals not only with pathology but also with the associated clinical correlations and prognosis.

The Gleason Grading System is the most important prognostic marker of prostate cancer, which is critical to patient management and drives therapies across all disciplines dealing with prostate cancer. In addition to an extensive number of photographs, this book discusses in detail clinically related issues that are crucial for the urologist, radiotherapist, and oncologist to know, such as predicting upgrading and downgrading from needle biopsy to radical prostatectomy, risk of Gleason grading change over time, significance of tertiary grade patterns, and prognosis and implications related to various Gleason scores and different therapies. Images that were particularly difficult for contributing pathologists sent in for consultation are used in addition to classic examples, as these cases are the most informative in showing the difficulties with Gleason grading. This book is a valuable tool not only for surgical pathologists from the resident level to seasoned practitioners but also for urology residents, urologists, medical oncologists, and radiation oncologists.

Glandular Architecture

Discrete-vs-Fused Glands



Gleason 3

Discrete glands.

Gleason 4

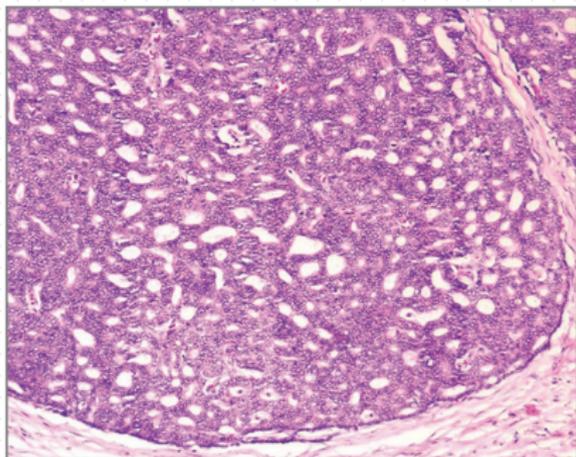
Presence of fused glands.

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⁰Image source: Epstein, *The Gleason Grading System*

Glandular Architecture

Cribriform Pattern



Gleason 4

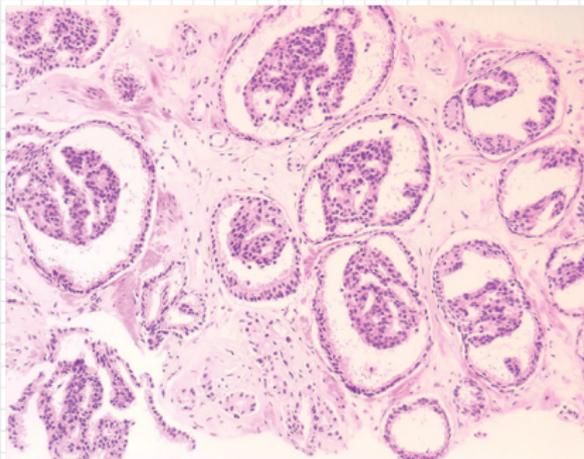
A gland with numerous small holes.

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⁰Image source: Epstein, *The Gleason Grading System*

Glandular Architecture

Glomeruloid Structures



Gleason 3,4

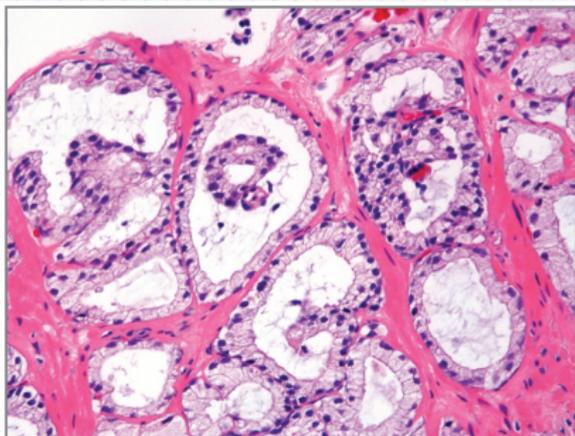
Intraluminal cribriform, single point of attachment.

⁰Image source:

http://www.nature.com/modpathol/journal/v17/n3/fig_tab/3800050f9.html

Glandular Architecture

Telescoping Glands



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Gleason 3

Telescoping (gland in gland) may mimic Glomeroid.

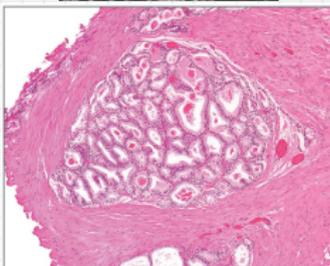
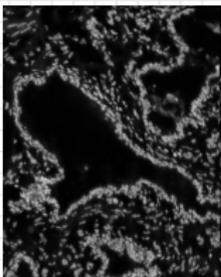
Gleason 4

Actual glomeroid pattern.

⁰Image source: Epstein, *The Gleason Grading System*

Glandular Architecture

Distribution of Glandular Shape and Size



Gleason 1

Uniform distribution of gland size. Round.

Gleason 3

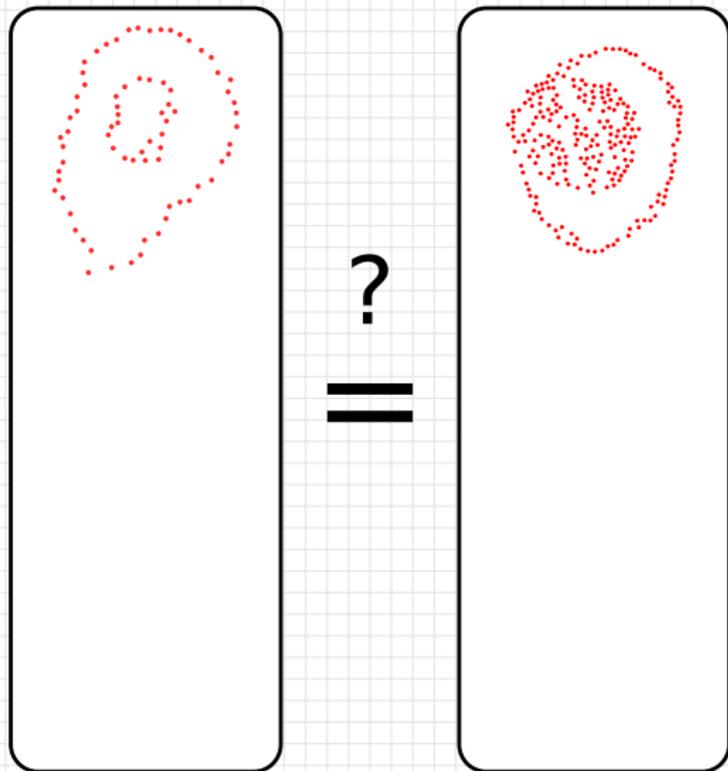
Irregularly separated glands.

Gleason 4

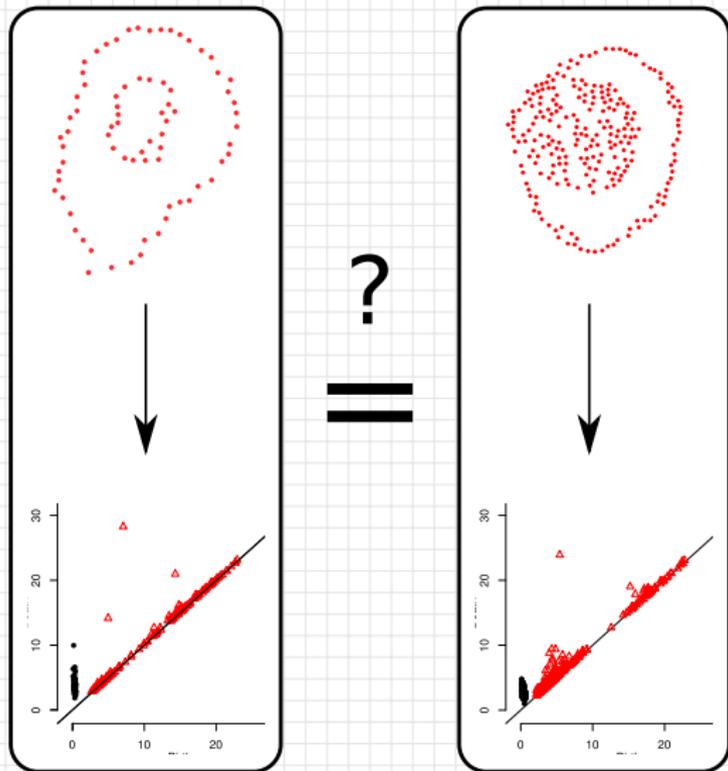
Poorly formed glands.

⁰Image source: Epstein, *The Gleason Grading System*

Persistent Homology

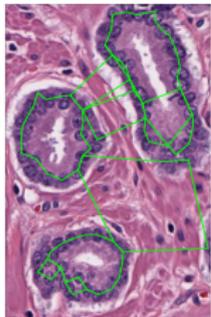


Persistent Homology



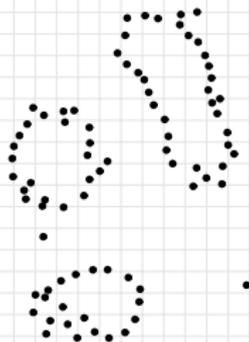
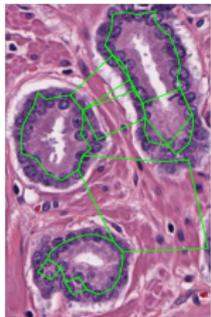
Quantifying the Process

TDA



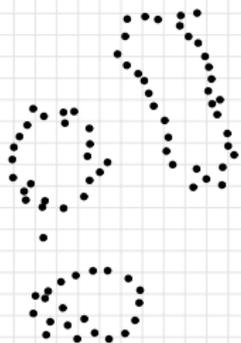
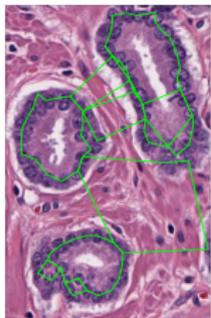
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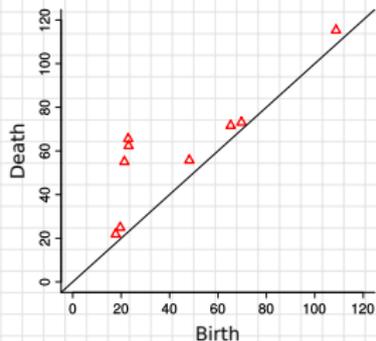
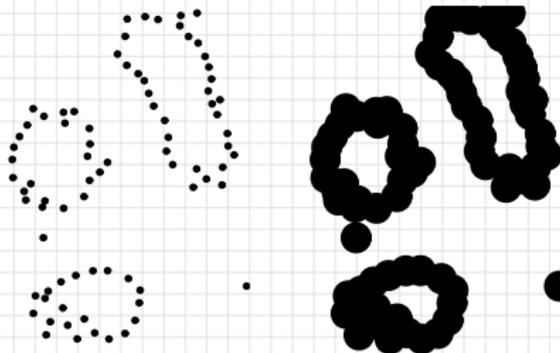
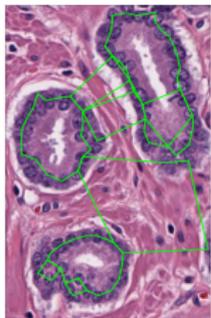
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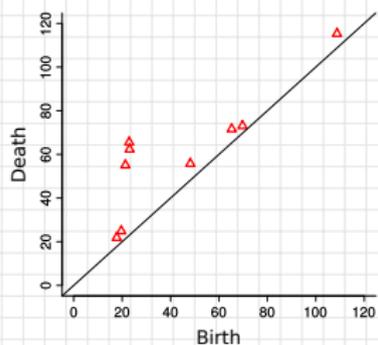
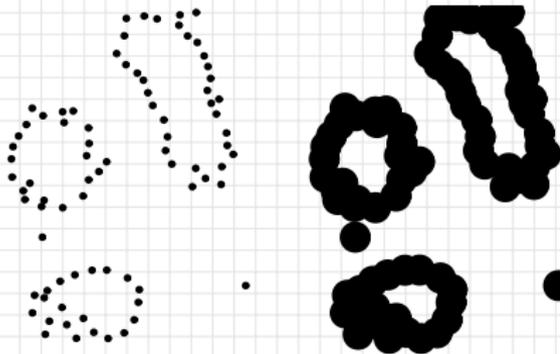
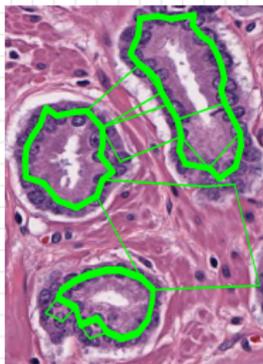
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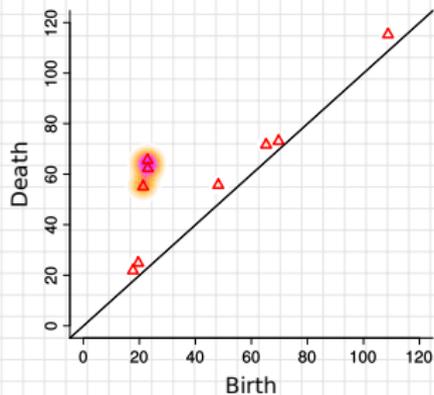
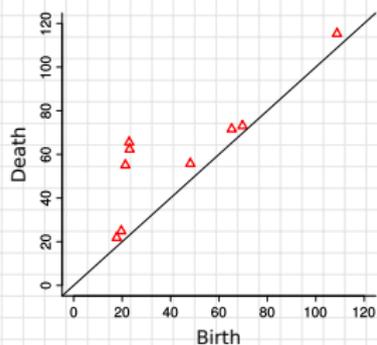
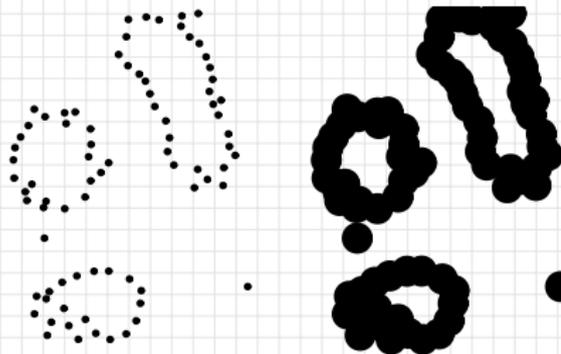
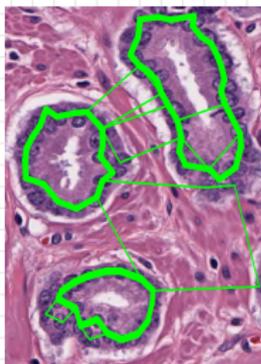
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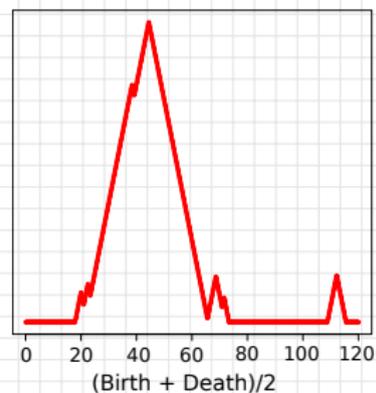
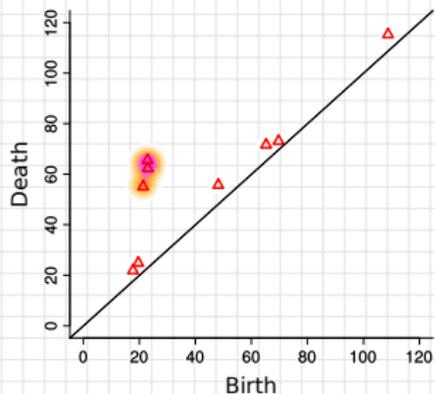
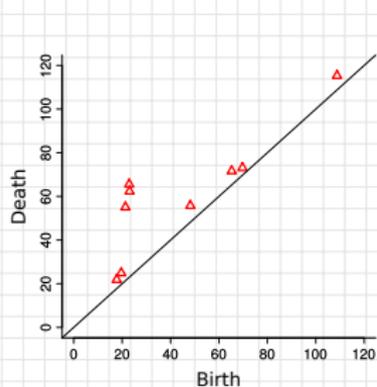
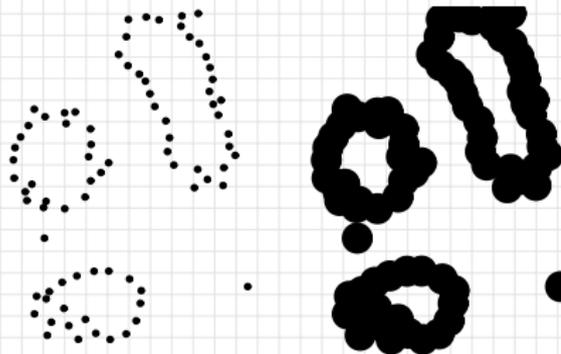
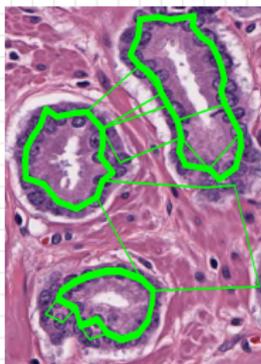
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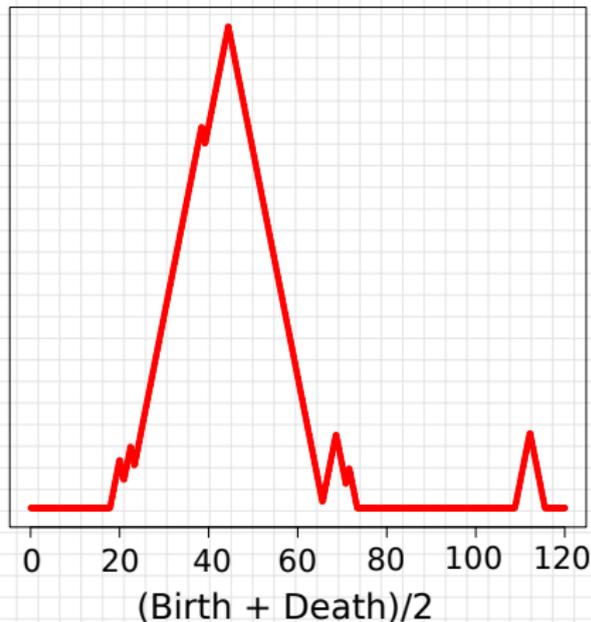
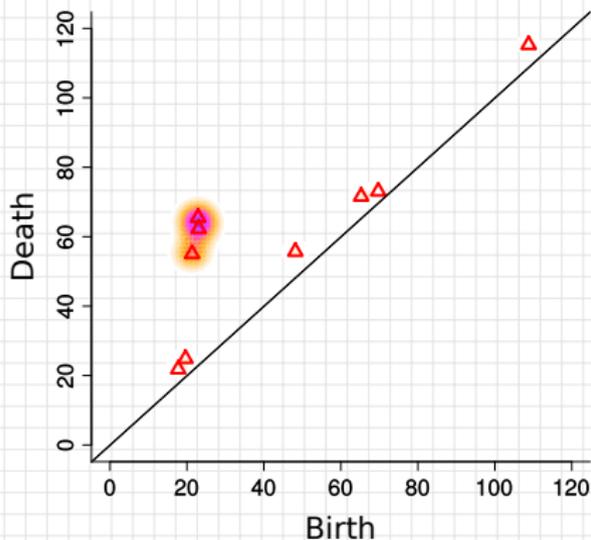


Quantifying the Process

TDA



Functional and Vectorized Summaries



Aside: Hypothesis Testing

Upcoming Paper

The *Euler Characteristic* curve seems to be the most discriminating among the functional summaries when using the Hotelling Test^a.

^aJoint work with Jessi Cisewski, Wojciech Hellwing, Mark Lovell, Alessandro Rinaldo, Larry Wasserman, Mike Wu

Collaboration

OuBBD Visualizer Cases Sides ▾ Logout

Annotations Slide Case

Name
Another annotation

Notes
These are some notes about another annotation

Is Tumor
 Yes No

Extraprostatic Extension
 Yes No

Gleason Score [more ▾](#)
 3+4 4+3 4+4 4+5 5+3 5+4 5+5

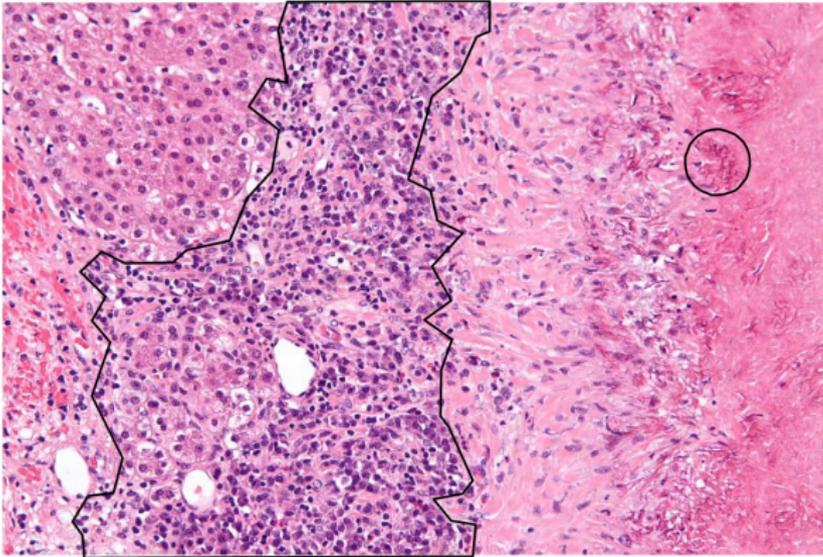
Primary Gleason Score
 n/a 1 2 3 4 5

Secondary Gleason Score
 n/a 1 2 3 4 5

Tertiary Gleason Score
 n/a 1 2 3 4 5

Glandular Architecture [show ▾](#)

Some annotation [✎](#) [📌](#)

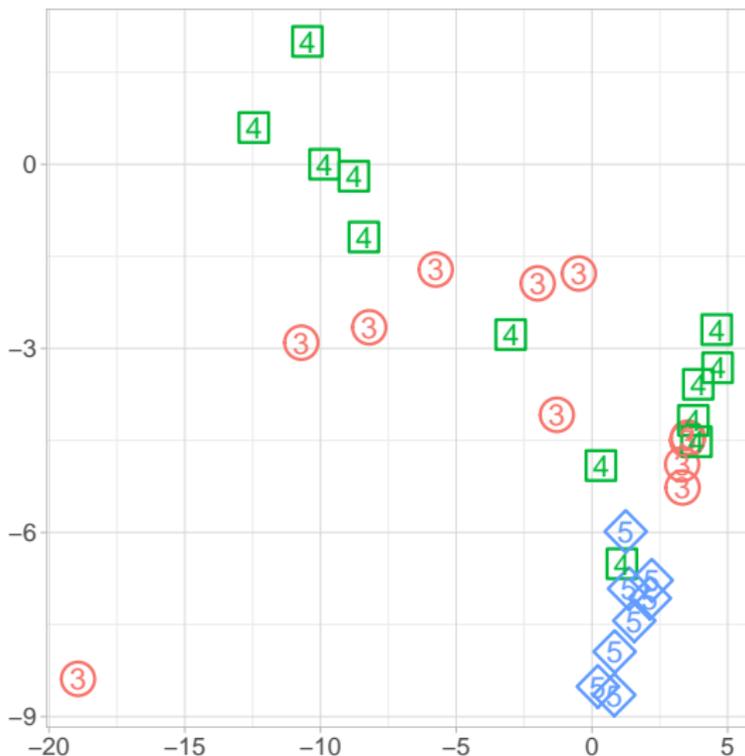


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Comparing Purely Graded Images

Initial Results



Analyzing DeBruijn Graphs

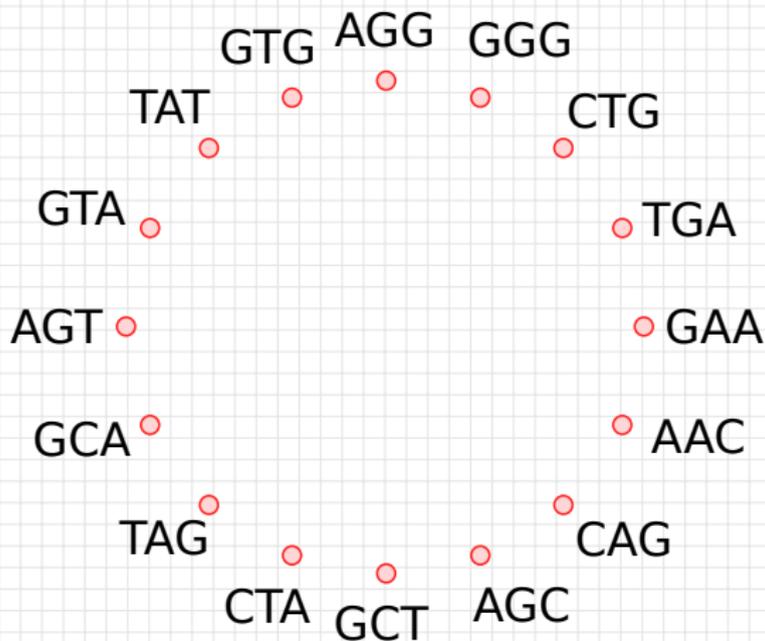
Joint work with Alan Cleary and Brendan Mumeey

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Analyzing DeBruijn Graphs

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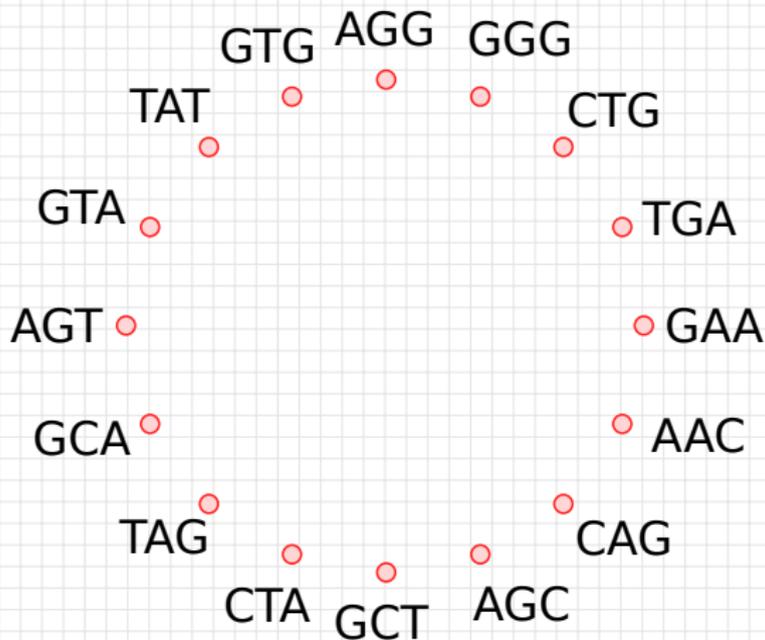
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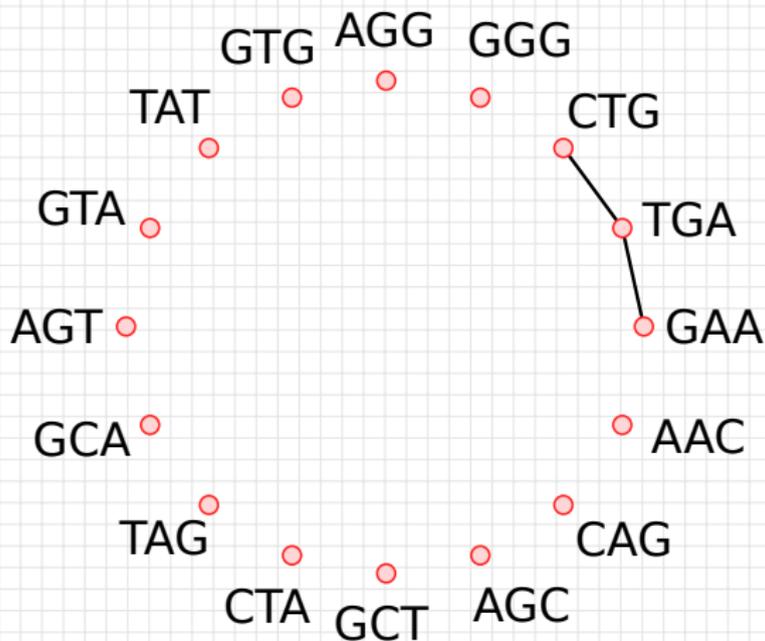
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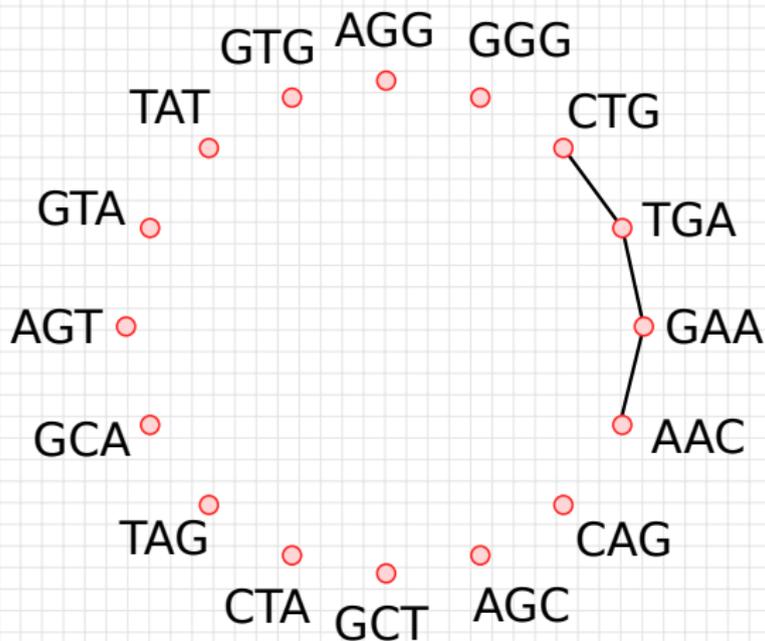
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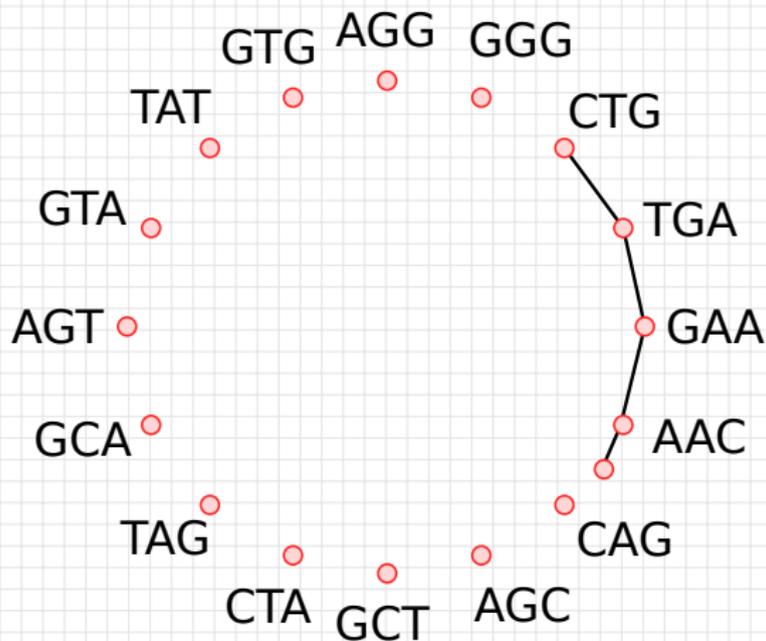
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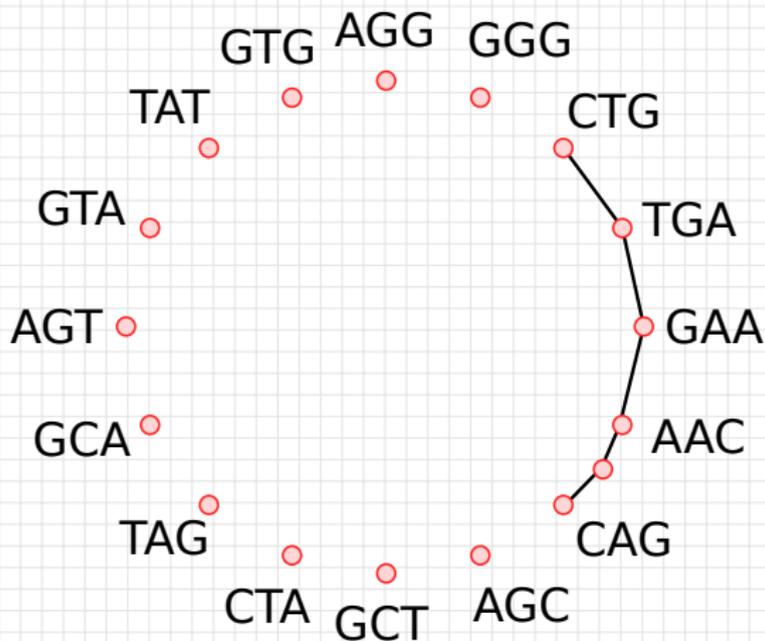
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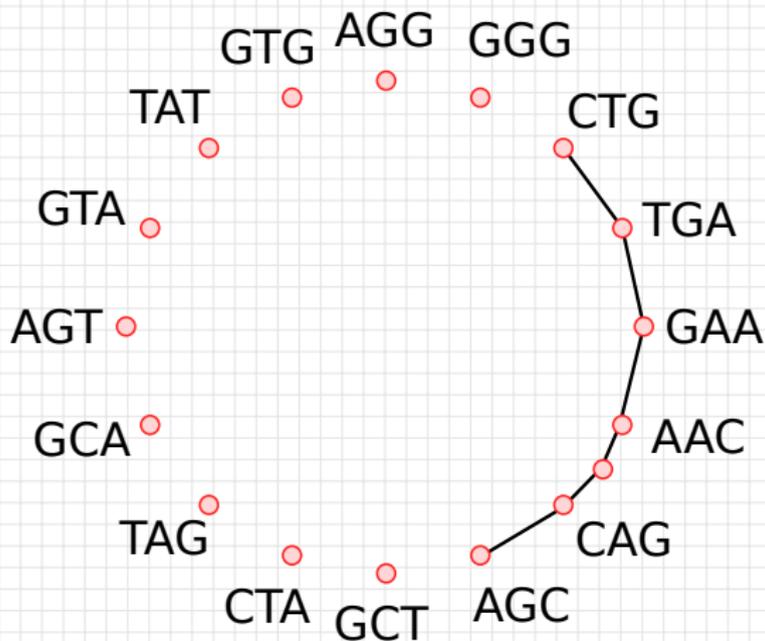
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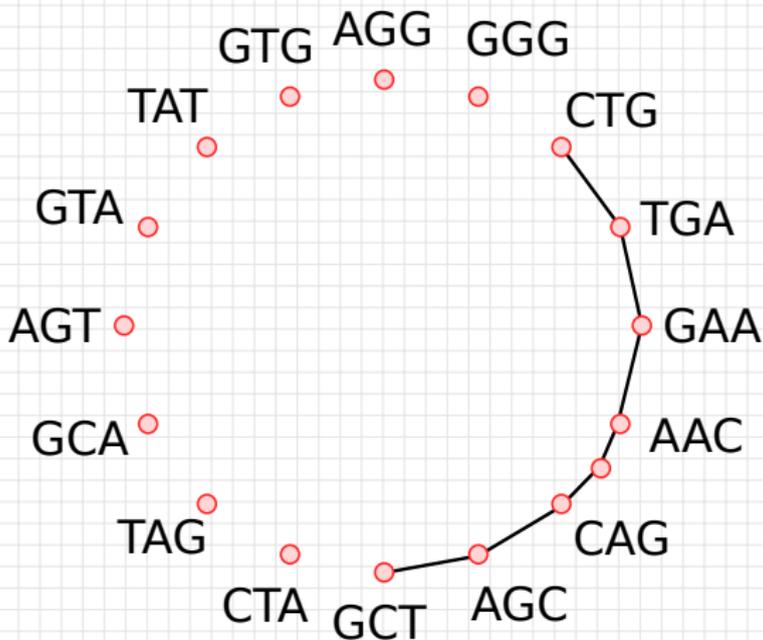
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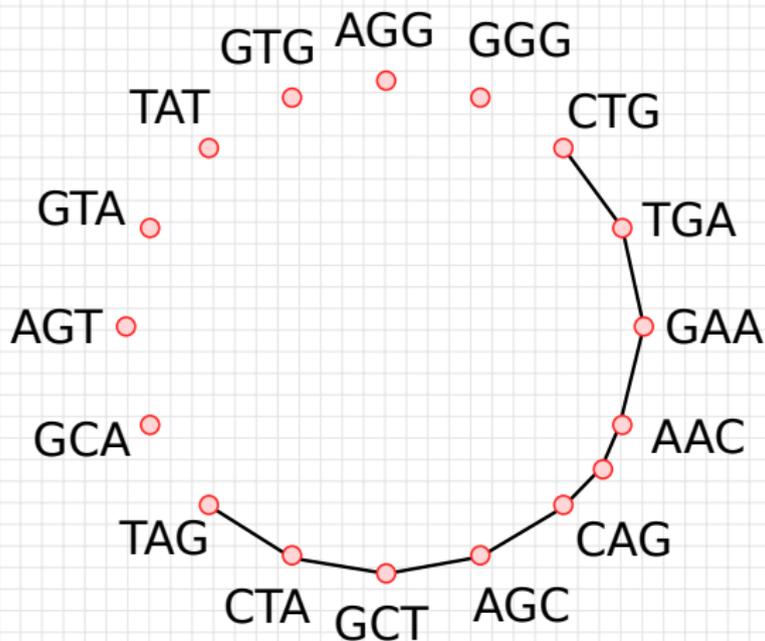
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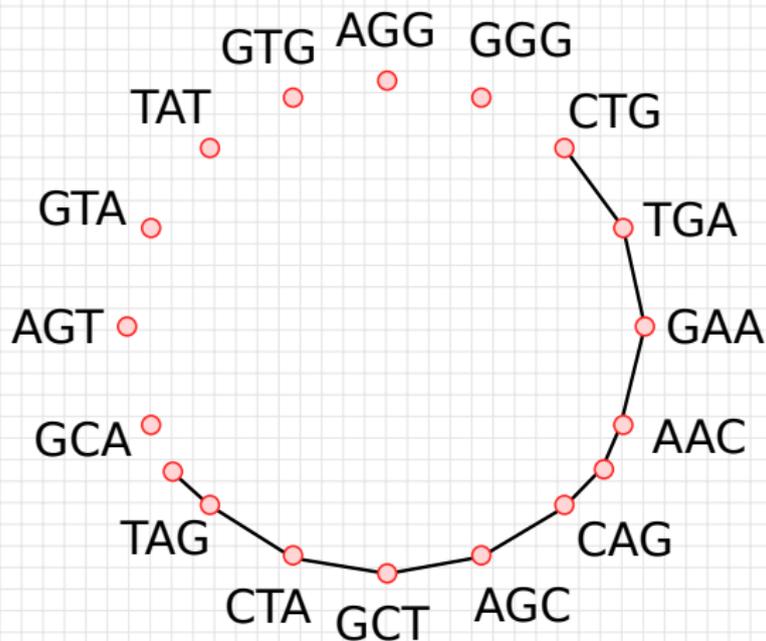
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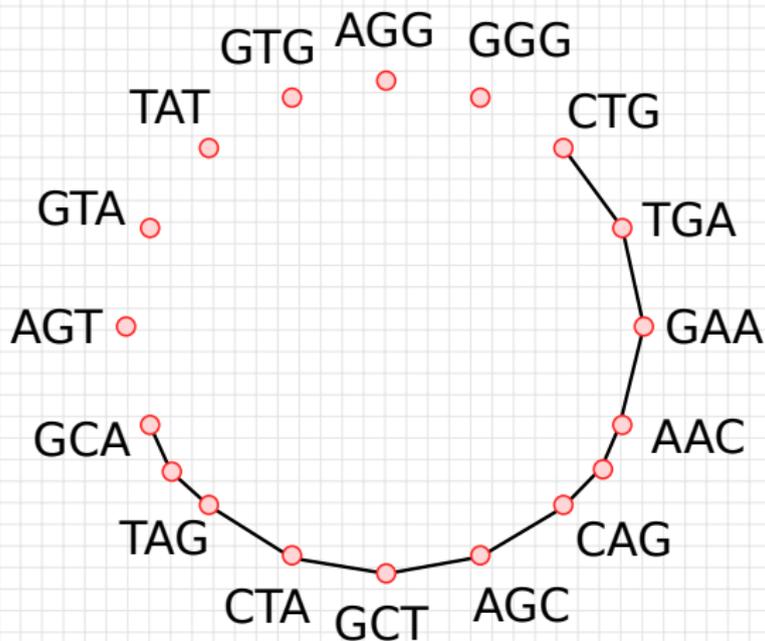
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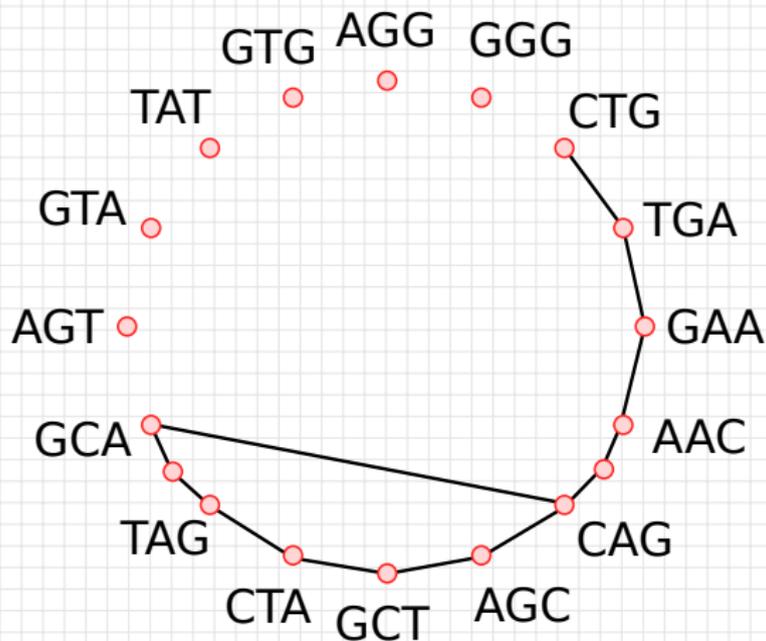
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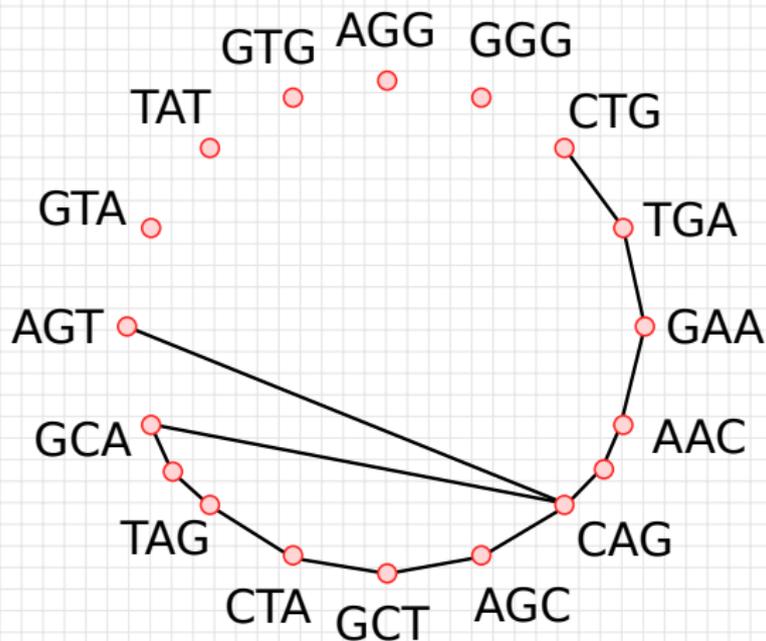
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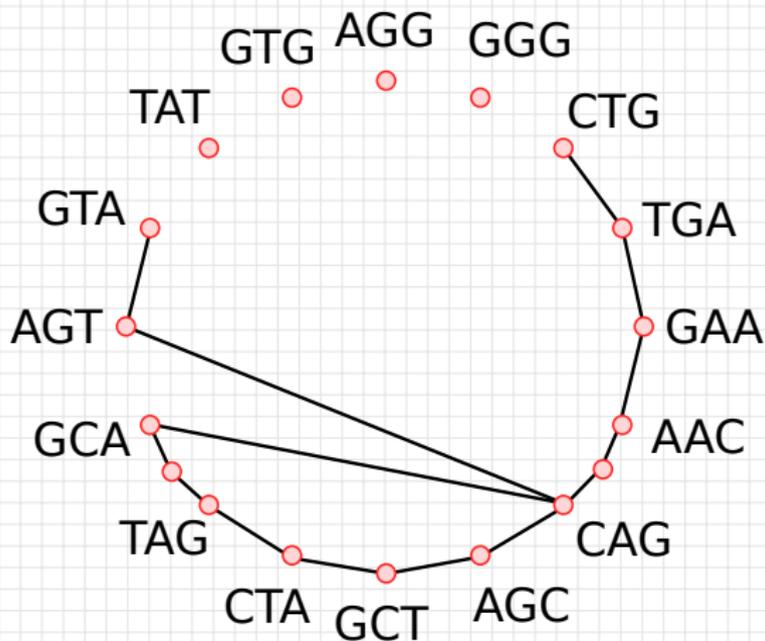
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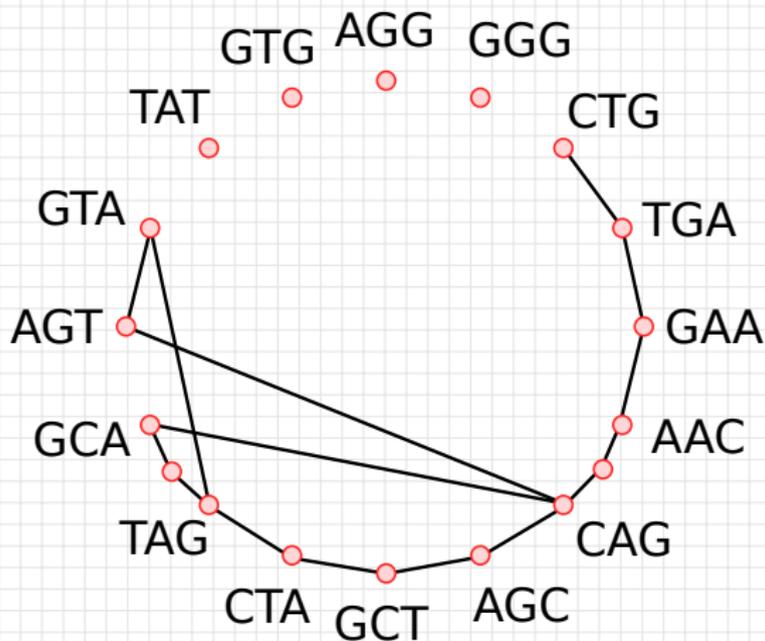
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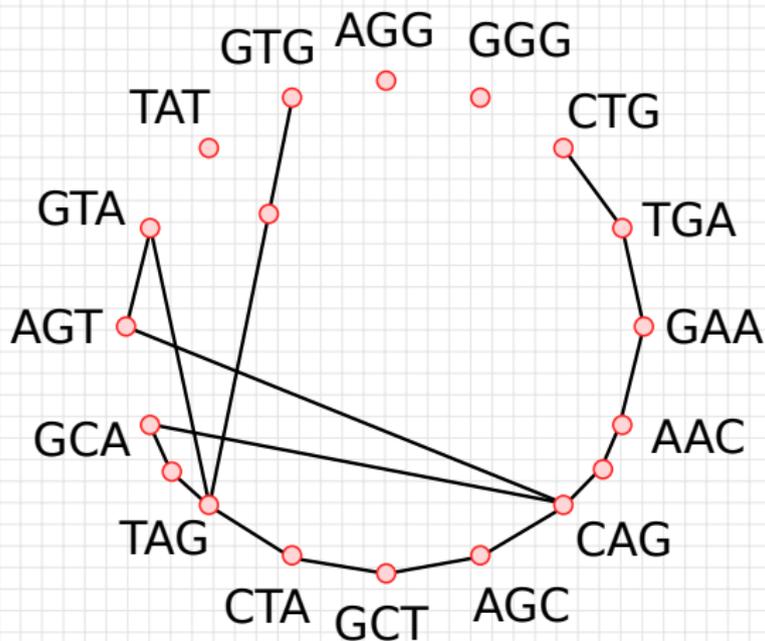
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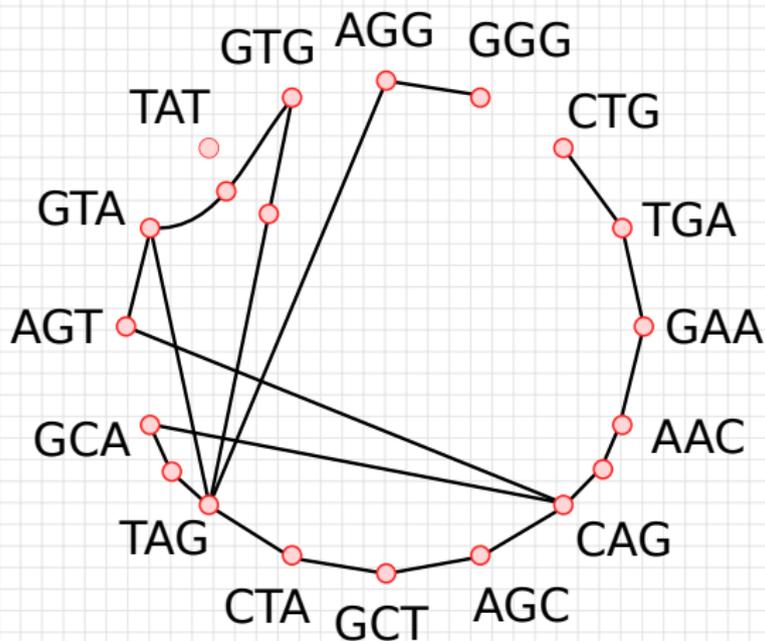
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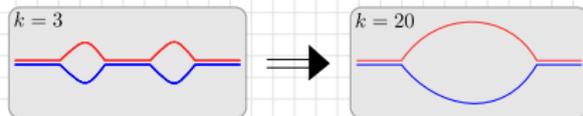


Bubbles in DeBruijn Graphs



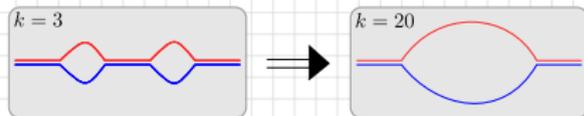
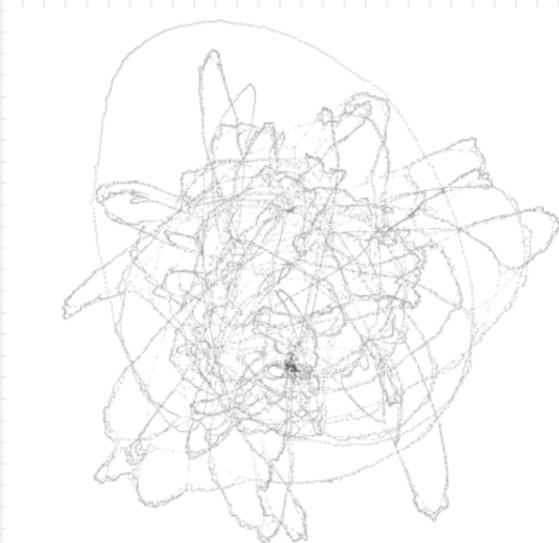
⁰Nature article: *De Novo Assembly and Genotyping of Variants using Colored De Bruijn Graphs* by Iqbal, Caccamo, Turner, Flicek, McVean

Bubbles in DeBruijn Graphs



⁰Nature article: *De Novo Assembly and Genotyping of Variants using Colored De Bruijn Graphs* by Iqbal, Caccamo, Turner, Flicek, McVean

Bubbles in DeBruijn Graphs



a Heterozygous



Homozygous



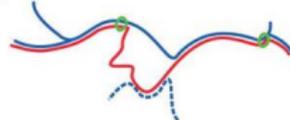
Repeat

c Repeat

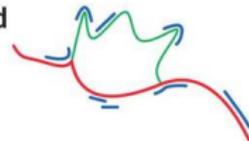


Polymorphic site

b

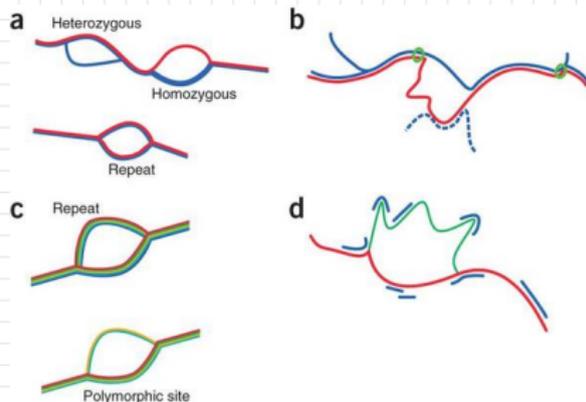
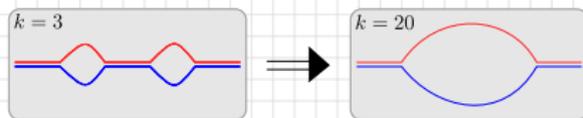
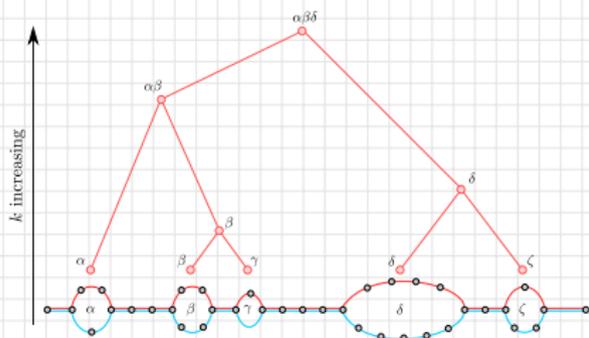


d



⁰Nature article: *De Novo Assembly and Genotyping of Variants using Colored De Bruijn Graphs* by Iqbal, Caccamo, Turner, Flicek, McVean

Bubbles in DeBruijn Graphs



⁰Nature article: *De Novo Assembly and Genotyping of Variants using Colored De Bruijn Graphs* by Iqbal, Caccamo, Turner, Flicek, McVean

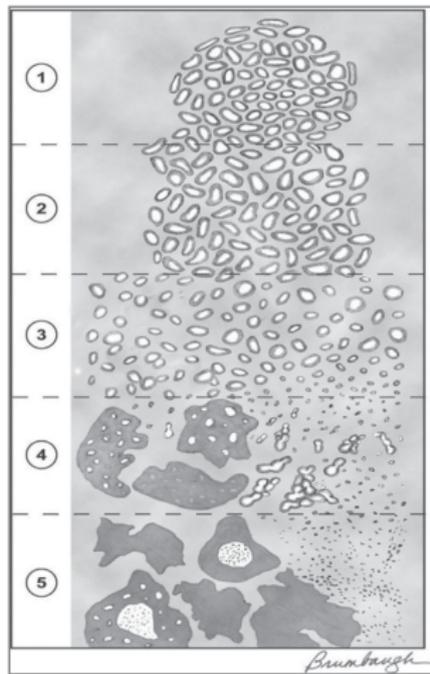
TDA R Package

Maintained by Fasy, Kim, and Maria

- Front-end to various TDA libraries
- Plotting Diagrams
- Landscapes, Silhouettes
- Statistical Techniques (including confidence sets)
- (Soon) Intensity Plots

Thank You!

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