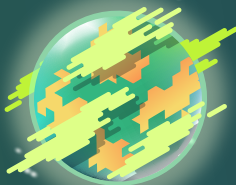


BEAM me up:

A tale of Bounded Expansion Algorithms in Metagenomics



Blair D. Sullivan
NC State University
blair_sullivan@ncsu.edu

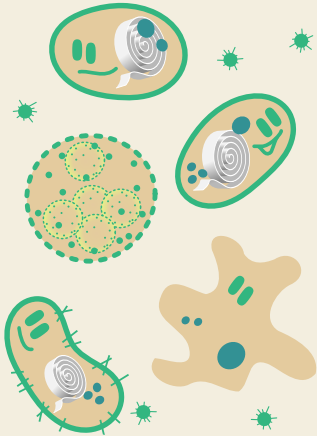
Workshop on Structural
Sparsity, Logic and Algorithms



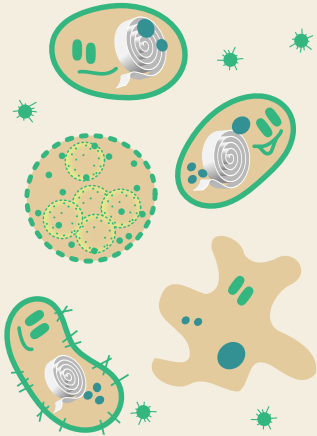
Part I

The scientific story

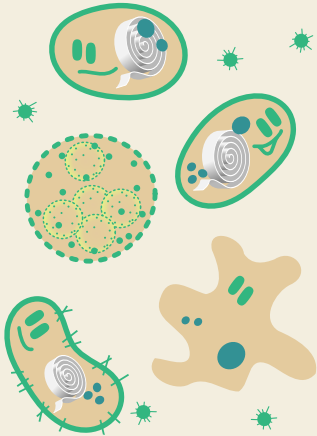
Metagenomics



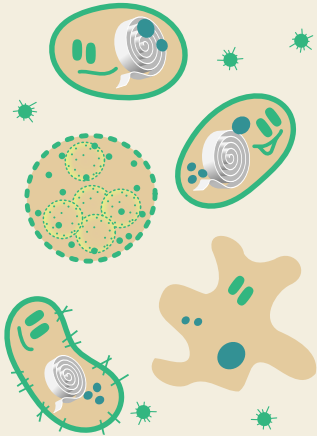
Metagenomics



Metagenomics



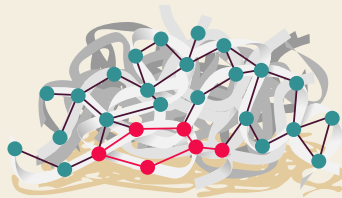
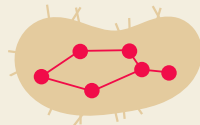
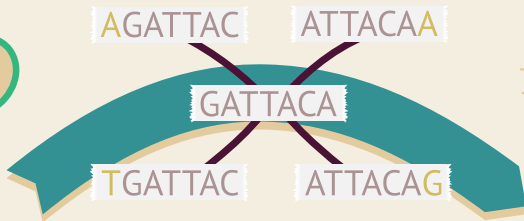
Metagenomics



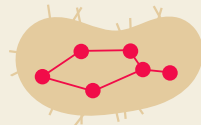
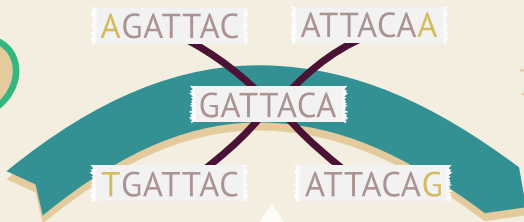
De-Bruijn graphs



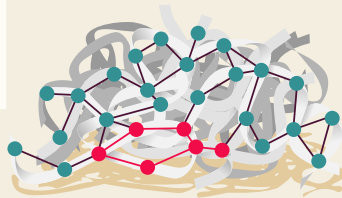
De-Bruijn graphs



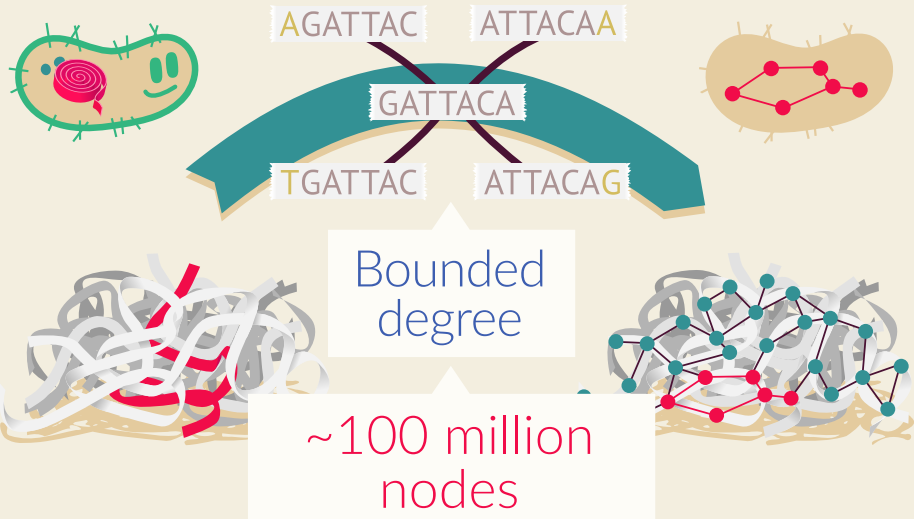
De-Bruijn graphs



Bounded
degree



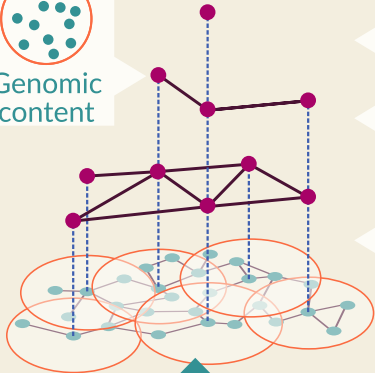
De-Bruijn graphs



CATLAS Overview



Genomic
content



Domset



r-Domset



de-Bruijn
graphs

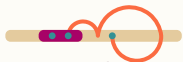


r-DTFAs



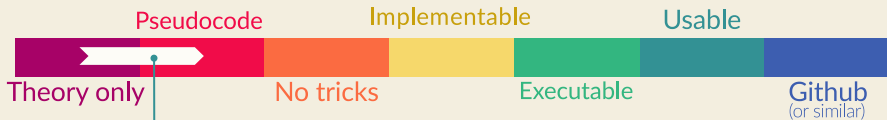
Dvořák's
Algorithm*

Engineering Dvořák's algorithm



$wcol_{2r}$

Approximation is
terrible in practice



Dvořák Z. Constant-factor approximation
of the domination number in sparse graphs.

European Journal of Combinatorics.

2013 Jul 31;34(5):833-40.

Engineering Dvořák's algorithm



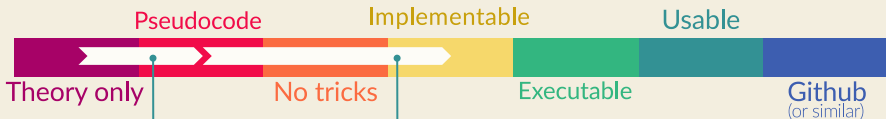
$$\text{wcol}_{2r}$$

Approximation is terrible in practice



$$\Delta^-(\vec{G}_{2r})$$

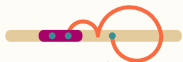
Approximation is terrible in practice



Dvořák Z. **Constant-factor approximation of the domination number in sparse graphs.**
European Journal of Combinatorics.
2013 Jul 31;34(5):833-40.

Reidl F. **Structural sparseness and complex networks.**
(Doctoral dissertation, Dissertation, Aachen, Techn. Hochsch., 2015).

Engineering Dvořák's algorithm



$$wcol_{2r}$$

Approximation is terrible in practise



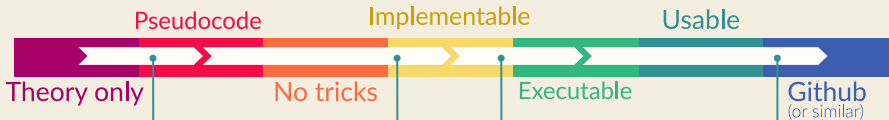
$$\Delta^-(\vec{G}_{2r})$$

Approximation is terrible in practise



$$\Delta^-(\vec{G}_r)$$

Approximation is tunable (heuristic)



Dvořák Z. **Constant-factor approximation of the domination number in sparse graphs.** European Journal of Combinatorics. 2013 Jul 31;34(5):833-40.

Reidl F. **Structural sparseness and complex networks.** (Doctoral dissertation, Dissertation, Aachen, Techn. Hochsch., 2015).

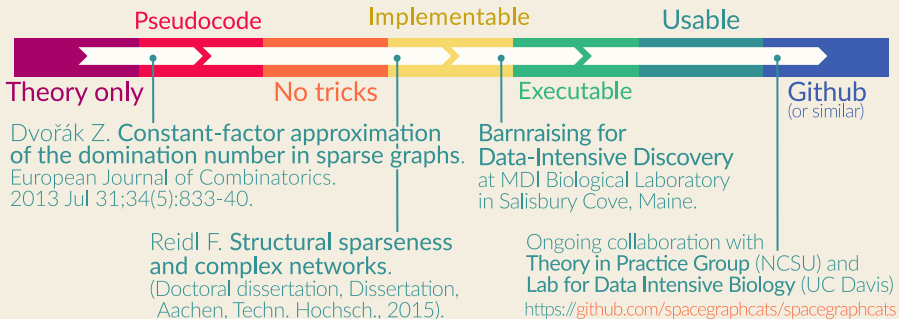
Barnraising for **Data-Intensive Discovery** at MDI Biological Laboratory in Salisbury Cove, Maine.

Ongoing collaboration with **Theory in Practice Group (NCSSU)** and **Lab for Data Intensive Biology (UC Davis)**
<https://github.com/spacegraphcats/spacegraphcats>

Engineering Dvořák's algorithm

For input a graph G and integers r, t our algorithm computes an $2(t + 2)\Delta^-(\vec{G}_{2r})\Delta^-(\vec{G}_r)$ -approximate r -dominating set. Importantly, it computes only the r th dtf-augmentation \vec{G}_r .

Fudge-factor t : small t yield better approximation guarantee in the worst case, but larger dominating sets in practice!



CATLAS-1 (spacegraphcats)



de-Brujin
graphs



BCALM 2



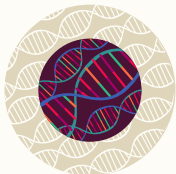
contracted
DBGs



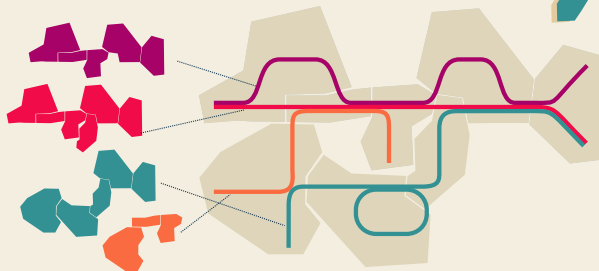
Dvořák's
Algorithm



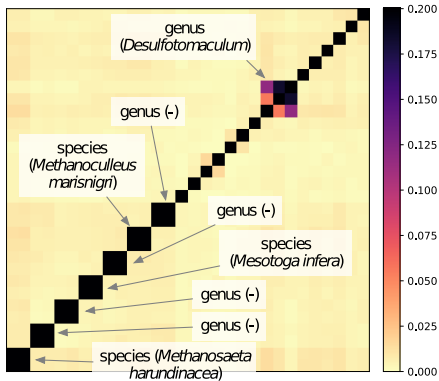
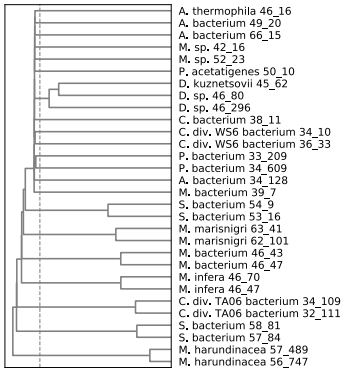
Domset



Genome
neighbourhoods



CATLAS-1 Results



Genus

Species

Strain



Marek



Michał

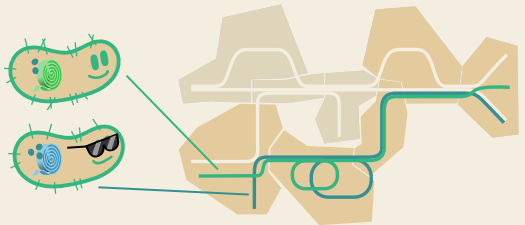
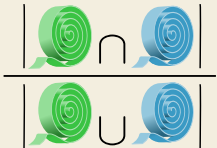
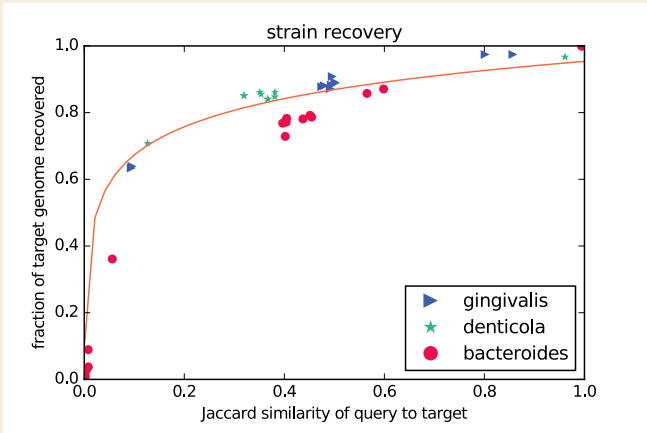


Marcin

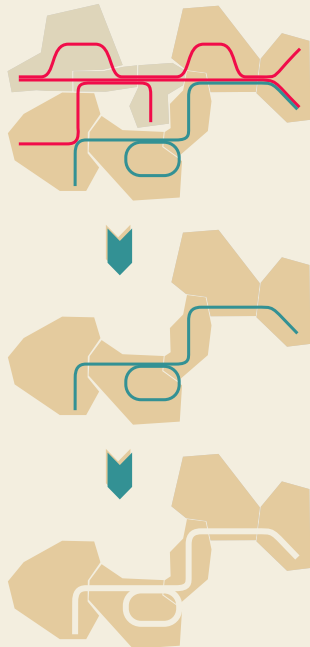
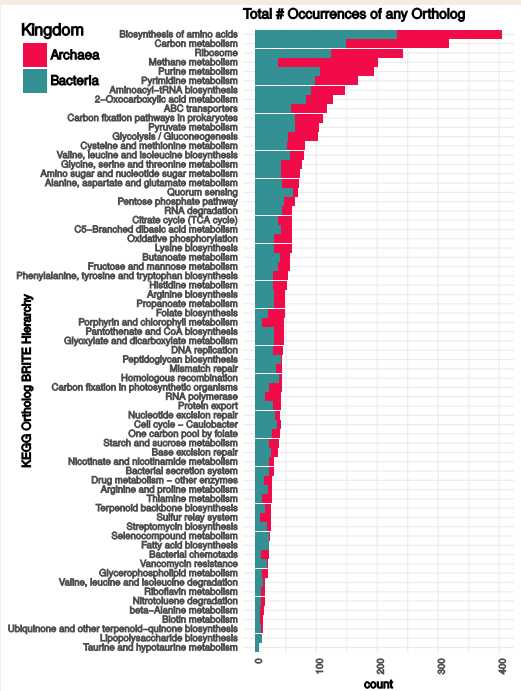


Marx
(Dániel)

CATLAS-1 Results



CATLAS-1 Results



Part II

The *real* story





A long time ago, in a galaxy far, far away...



~~A long time ago, in a galaxy far, far away...~~
In May 2016, at a barn raising in rural Maine...



"Sparse Graph Cuts"



The barnraising crew

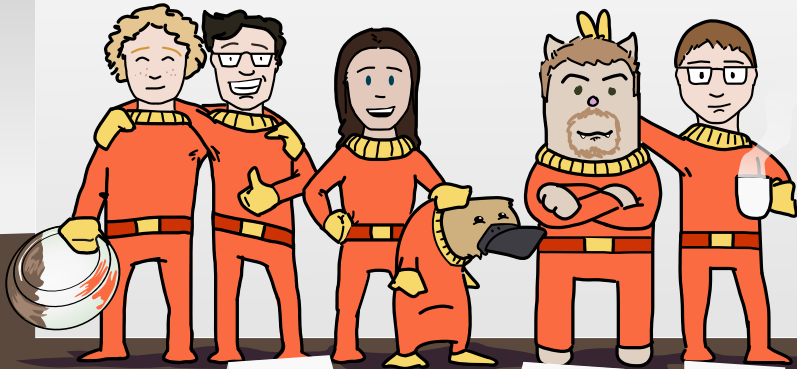
Felix
Reidl

Mike
O'Brien

Blair
Sullivan

Titus
Brown

Dominik
Moritz



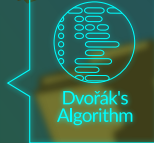
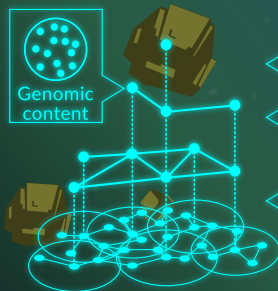
NCSU

UC Davis

UW



Spacegraphcats



GORDON AND BETTY
MOORE
FOUNDATION



#slack



jupyter

GitHub

HackMD





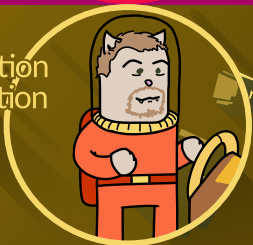
18 Months later.



Translation:
Method design
Course planning



Data-wrangling
Target identification
Biological validation



Scalability
Feature development
Implementation





BIOLOGY!

WRONG!

BAD DATA!

BUG!

WRONG!

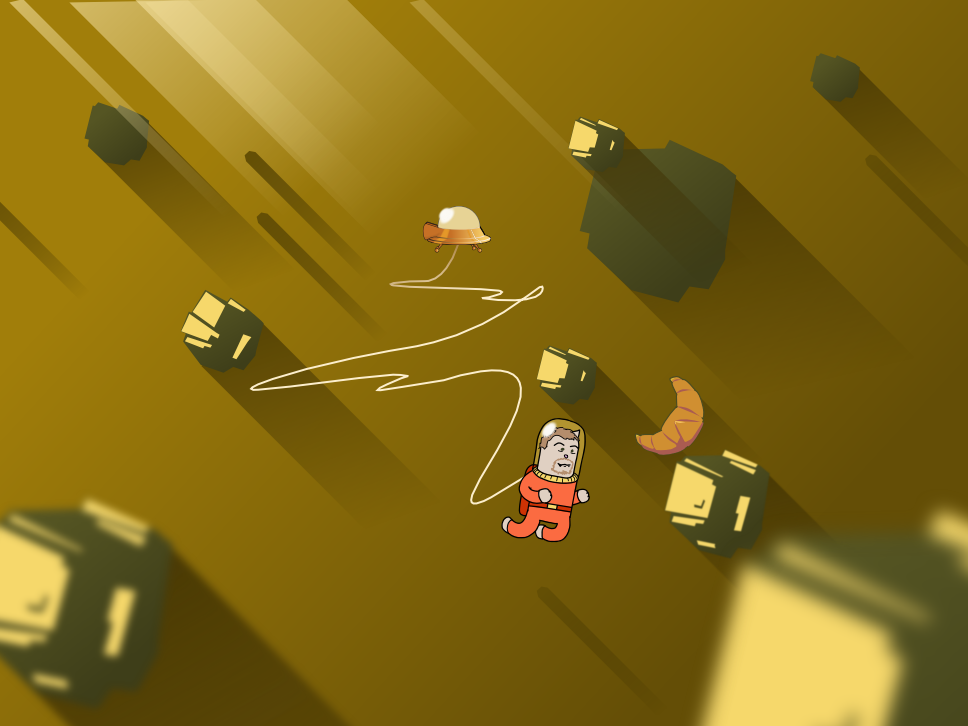
BUG!

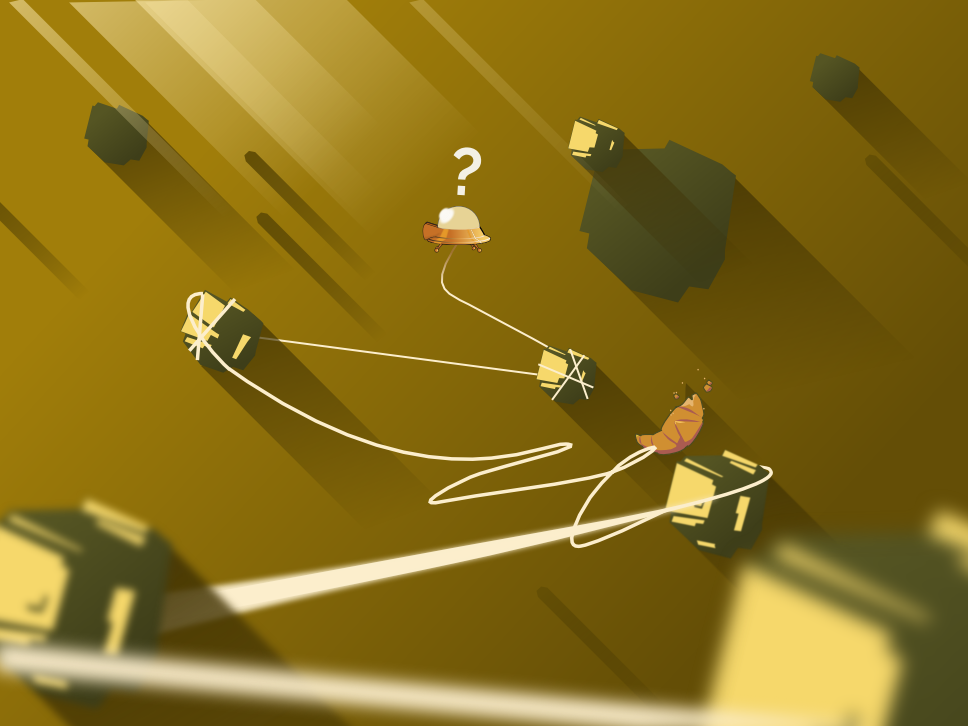
BAD!

TOO SLOW!

BUG!

BUG!





r-domset with $r > 1$

frontier search
in CATLAS

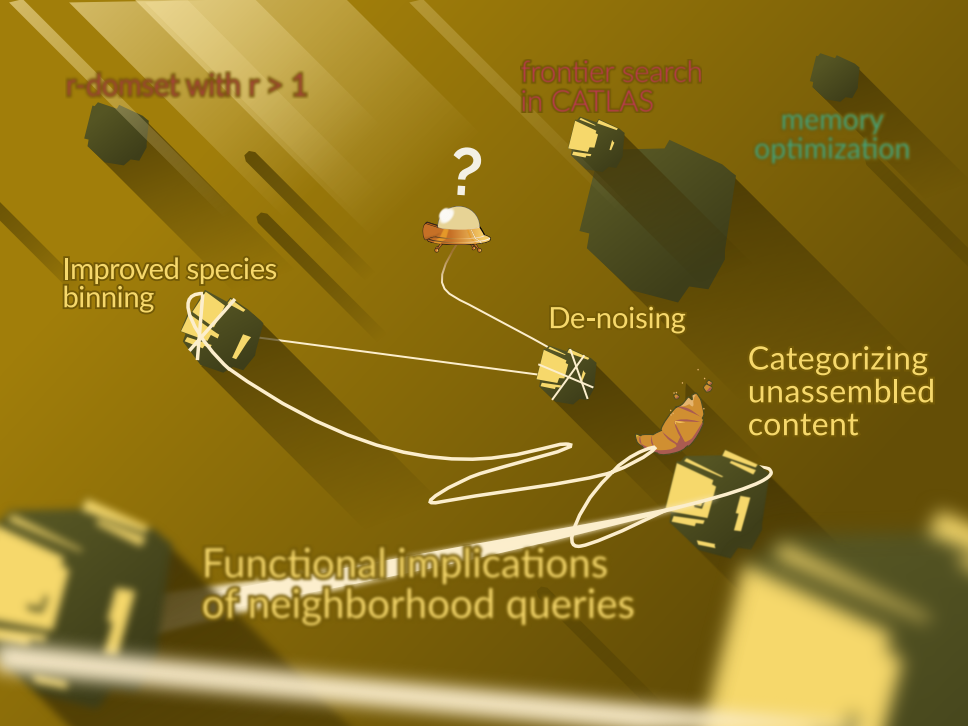
memory
optimization

Improved species
binning

De-noising

Categorizing
unassembled
content

Functional implications
of neighborhood queries



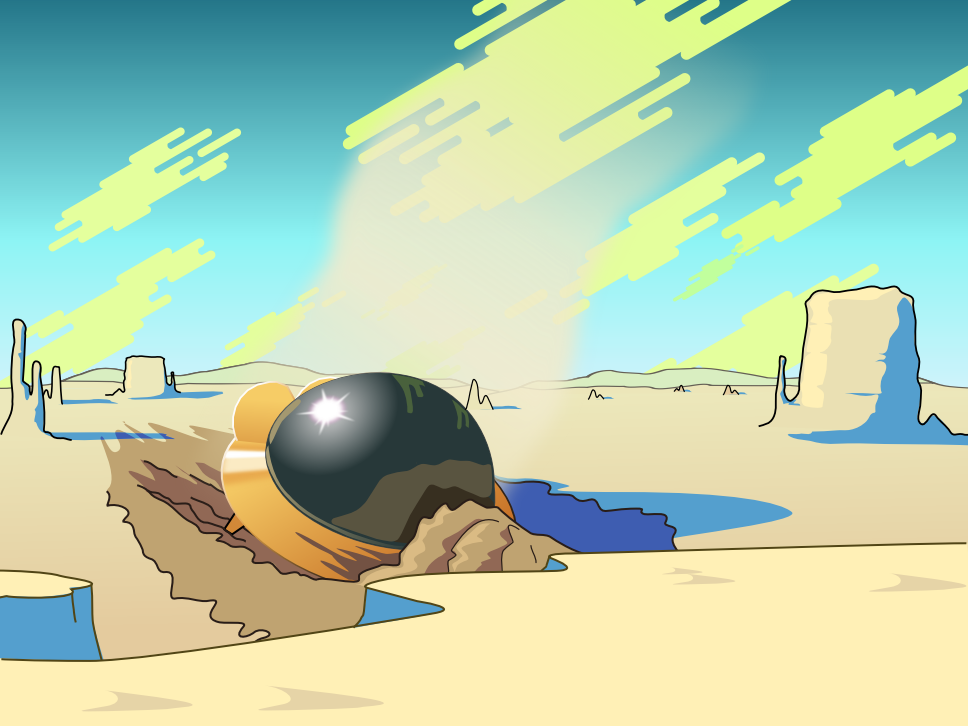


















PROJECT SPACEGRAPHCATS

Felix
Reidl

Mike
O'Brien

Blair
Sullivan

Taylor
Reiter

Titus
Brown

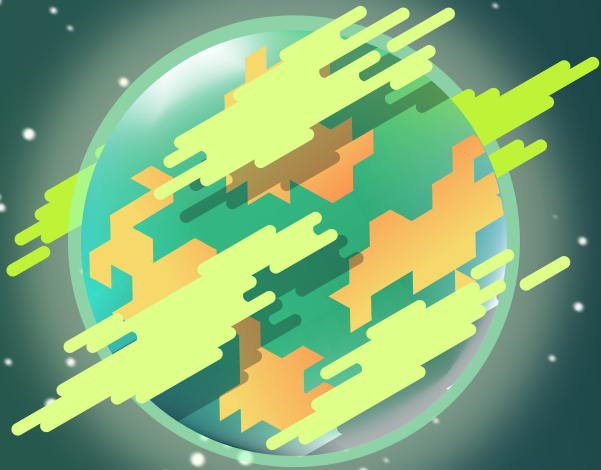
Dominik
Moritz



NCSU

UC Davis

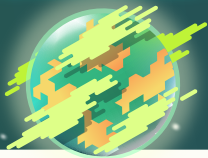
UW





“The efficient computation of dominating sets will open up a whole new range of possibilities in bioinformatics.”

C. Titus Brown, Associate Professor at UC Davis



“spacegraphcats will transform the way biologists interact with genome assemblies.

It allows us to access previously discarded sequencing information thereby allowing more robust functional characterization.”



Taylor Reiter, his much more eloquent student



The efficient computation of dominating sets will open up a whole new range of possibilities in bioinformatics.

E. Topaloglu, Professor at UC Davis



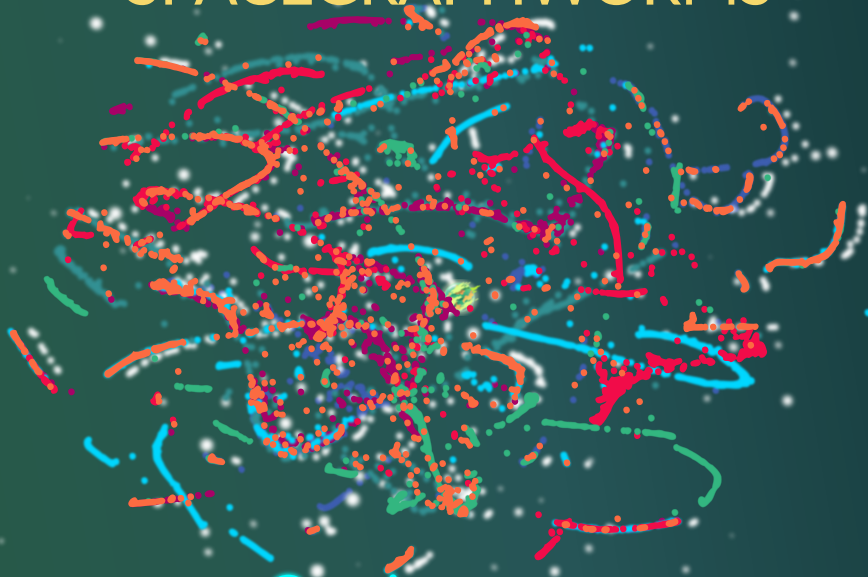
Genomic graphs will transform the way biologists interact with genome assemblies.

It allows us to access previously discarded sequencing information thereby allowing more robust functional characterization.

Yael Fisher, PhD student at MIT



SPACEGRAPHWORMS



Coming soon...