

AFS Seminar Series Fall 2013 October 23, 2013

Moving targets and millions of sequencing reads - Bioinformatics lessons from an international biofuels project

Dr. Brian Fristensky
Department of Plant Science
University of Manitoba
Winnipeg, Canada







Rationale

Bioinformatics - The science of management and analysis biological information, leading to biological discovery.

Bioinformatics

- best done in the context of biological research
- organizes and drives research
- •attempts to bridge the vast cultural and intellectual divides between biology and the computer and mathematical sciences







Outline

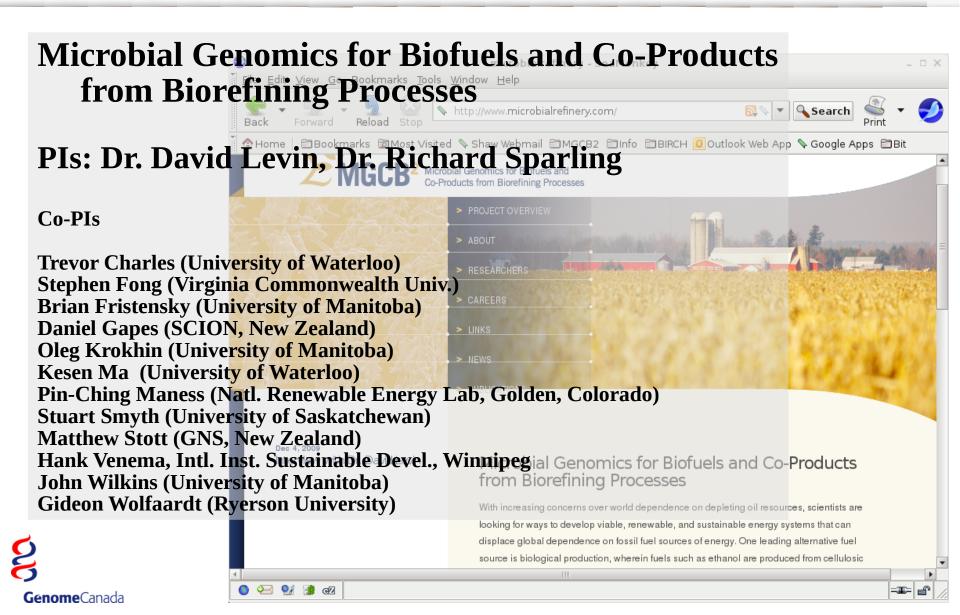
- Original conception of the MGCB2 project
- Lessons learned
 - Organizing a world-wide genomics project
 - Genome assembly
 - Genome annotation an endless game of tag
 - Gene expression a moving target
 - Getting lost in the pathways
 - The cultural and intellectual divide between biologists and bioinformaticians
- The Bio Information Technologies Lab (Bit)







Microbial genomics - MGCB²



Microbial genomics - MGCB²

Goal: Improve efficiency of producing biofuels (eg. Ethanol, Butanol, H₂) from lignocellusic feedstocks produced in agriculture (eg. biomass from wheat, flax, hemp etc.)

Strategy: Identify or engineer bacteria or bacterial consortia that can

- degrade cellulosic material into simple sugars, and
- •ferment sugars into biofuels.

These organisms would be used in industrial-scale bioreactors to produce biofuels and related co-products, such as acetate, which can be used to create biodegradable plastics.







Microbial genomics - MGCB²

Activities:

Activity 1: Metabolic profiling and genomic characterization of bacteria that can utilize lignocellulosic biomass as a sole carbon source for synthesis of biofuels, as well as bacteria that can utilize the by-products of these fermentation reactions (sugars and/or organic acids) to synthesize polyhydroxylalkanoate (PHA) biopolymers;

Activity 2: Development of enhanced proteomic screening tools for rapid identification of the metabolic pathways used by bacteria, enabling selection of bacteria with the ability to convert cellulose to biofuels and/or cellulose hydrolysis products to PHAs;

Activity 3: Bioprospecting for novel cellulolytic and biopolymer synthesizing bacteria, including isolation and characterization at the genome level and determining suitability for their intended purpose within the biorefinery; Activity 4: Metabolic engineering of selected bacteria to enhance synthesis

of desired products;

Activity 5: Development of "plurifunctional designer consortia" for industrial application that can work together synergistically to enhance substrate conversion and product synthesis; and

Activity 6: An examination of GE3LS issues relevant to the project.



Lessons learned - The central theme:

The Shifty Paradigm:

Bioinformatics is a

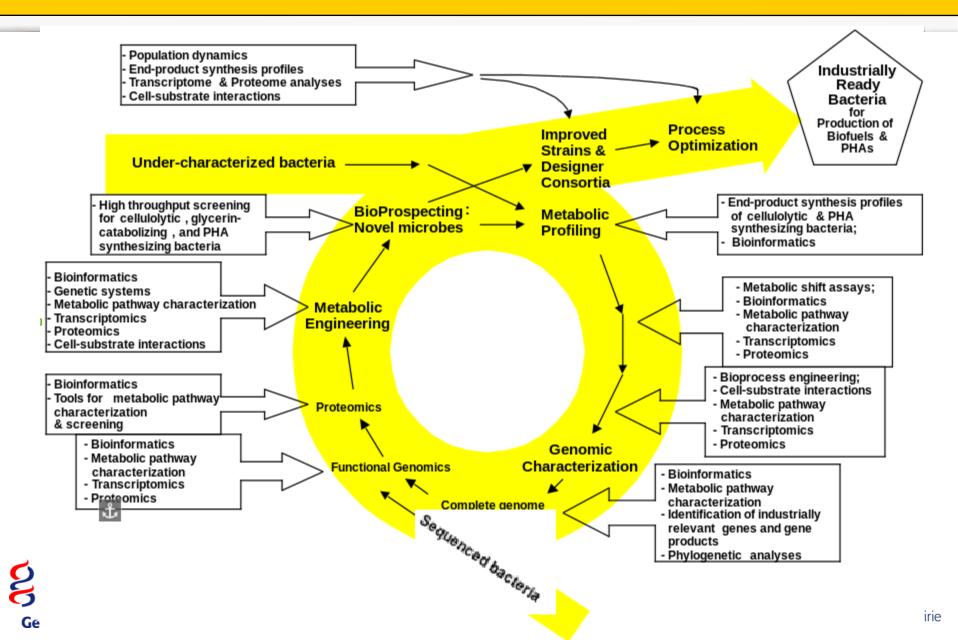
Moving Target!





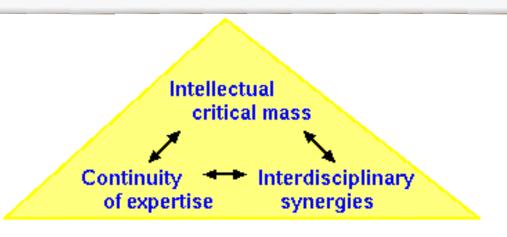






Bioinformatics Team, 2007 - 2013





Faculty Brian Fristensky Bioinformaticians
Graham Alvare
Justin Zhang

Maryam Ayat

PhD Student Abiel Roche

Research Associate Natalie Bjorklund Ruming Li Undergraduate Students
Dale Hamel
Drexler Hernandez







Location: Dept. of Computer Science

SunRay Thin clients

Mac OSX workstation/server (8 CPUs)

Linux x86_64 virtualization server (24 CPUs)

- Windows-XP
- Windows7
- Linux 64 -bit
- Linux 32-bit

Linux x86_64 test workstation/server (8 CPUs)

Xerox Phaser color printer



4 Tb offsite backup





CCU - Central Computing Unix

- Professionally-managed data centre
- Solaris, Linux, Windows
- Login servers (desktop sessions)
- Compute servers (CPU intensive jobs)
- Open area labs
- Unified RAID filesystems
- Automated offsite backup







Genome Canada Bioinformatics Innovation Centre (BIC) Univ. Calgary

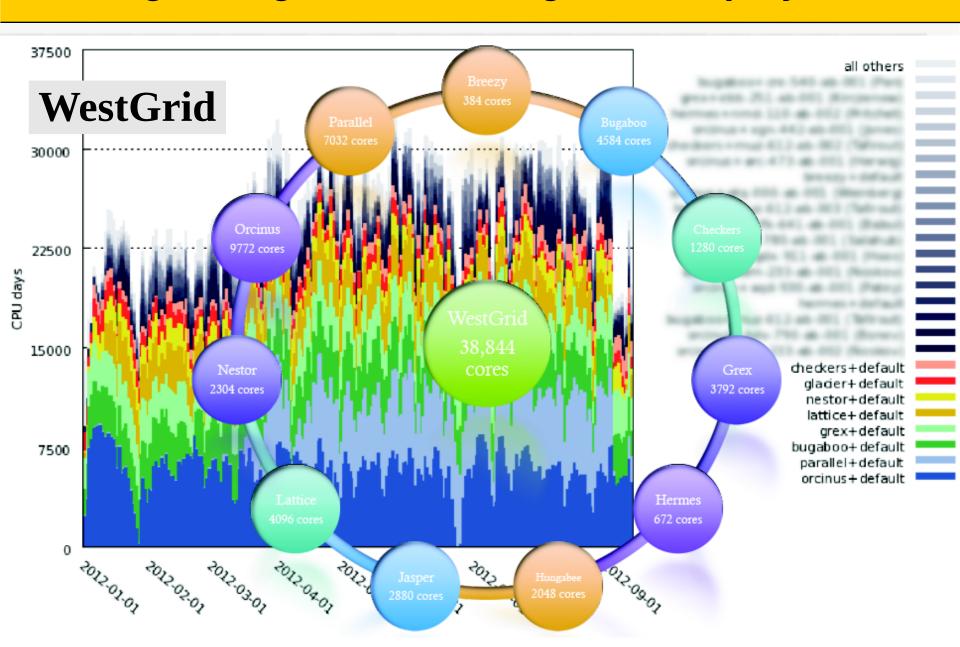
- Remote desktop sessio
- Hardware-accelerated d searches (TimeLogic)
- Data pipelines:
- MAGPIE genome assembly and annotation
- Osprey microarray design
- Phoenix metagenomics







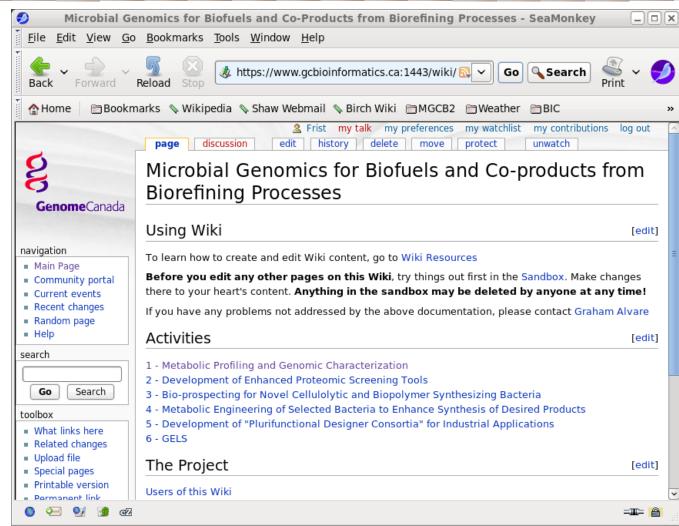




Wiki: Project-wide collaboration

A Wiki is a web site that can be edited by a group of users.

Organizes
ideas,
documents,
data as the
project
proceeds.



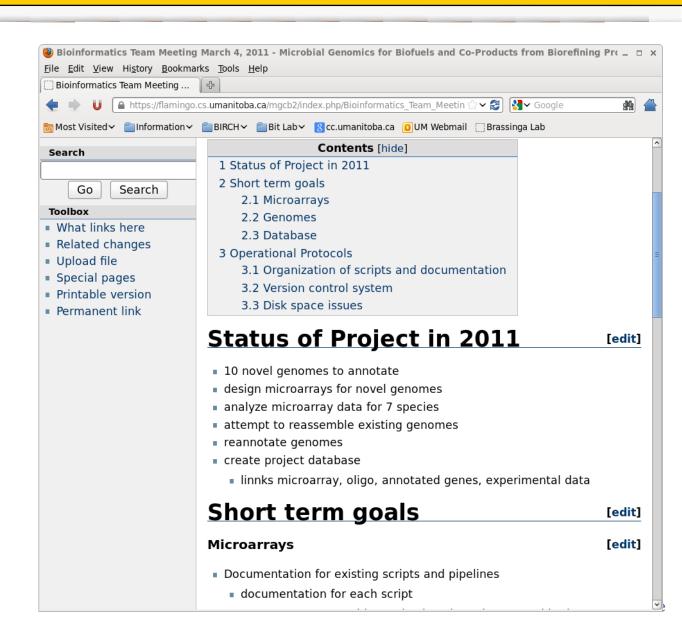




Meetings on the Wiki:

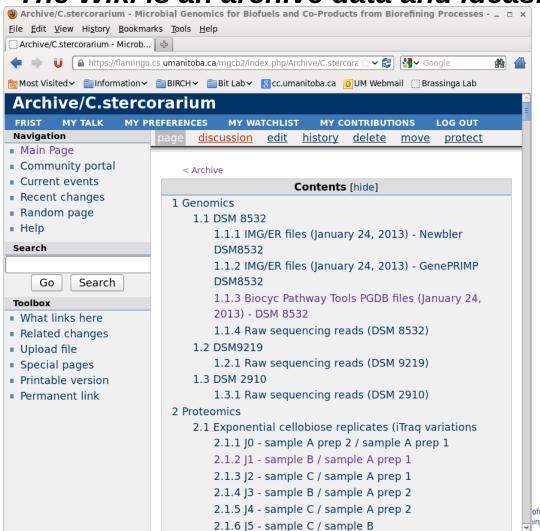
- 1) For each meeting, create an agenda in outline form.
- 2) During the meeting, fill in details as they are discussed.

The agenda becomes the minutes.





At the end of the project: The Wiki is an archive data and ideas.



Exponential cellobiose replicates [edit] (iTrag variations

Date: 2011-12-12

Experimentor: John Schellenberg

Phases: exponential

Metadata: Expnential cellobiose replicates. Samples samples A, B and C are biological replicates but sample C was prepared for analysis on a different day than A and B.

Full Metadata

- Raw MGF: https://flamingo.cs.umanitoba.ca /archive/mgcb2/csterc/raw/proteomic /csterc2Dnov9.txt
- Intermediate plotme: https://flamingo.cs.umanitoba.ca/archive/mgcb2 /csterc/intermed/proteomic/csterc2Dnov9plotme.txt
- Intermediate plotme-NR: https://flamingo.cs.umanitoba.ca/archive/mgcb2 /csterc/intermed/proteomic/csterc2Dnov9plotme-NR.txt

JO - sample A prep 2 / sample A prep 1

[edit]

GenomePrairie

ofuels and ing Processes

Organizing a genomics project - Lessons learned

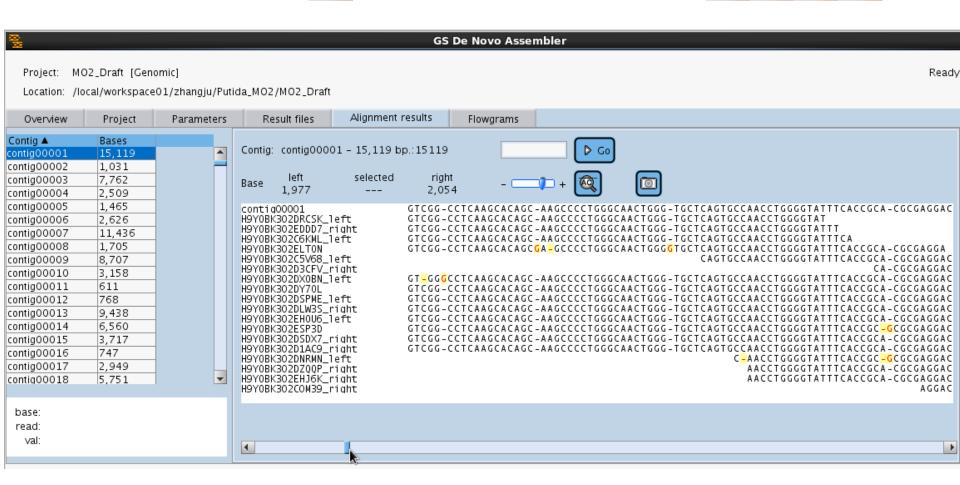
- Wikis are powerful organizing tools and easy to use.
- Free Open Source Software (FOSS) no cost, and usually better than commercial.
- Redundancy of resources is essential
- Leverage existing infrastructure wherever possible.
- Factor in time for things to go wrong!
- The cultural gap between biologists and bioinformaticians can only be bridged through long-term multidisciplinary training of bioinformaticians.
- Work on a day to day basis with biologists they are smarter than you think. :-)







Genome assembly



Genome assembly - raw reads

Name	Alias	Number of Bases	Number of Reads 454	Number of Reads HiSeq
1635	Chloroflexus	163013840	542487	0
454-1863	Isolate WC-1	80293876	242971	0
454-1866	Caldicellulosiruptor kristjanssonii	72135175	232506	0
454-1866_2	Caldicellulosiruptor kristjanssonii	0	0	0
454-1920	Clostridium termitidis	109064533	303437	0
454-1921	Clostridium novel species	98307634	284382	0
454-1922	Geobacillus debilis	74722425	207025	0
85F	85F	0	0	0
Clostridium_stercorarium_DSM 8532	Clostridium stercorarium DSM8532	84294306	237698	0
Novel_clostridium	Novel_clostridium	34309169	92277	0
P.putida_LS46_replacement	P.putida_LS46_replacement	31042996000	0	155214980
Pseudomonas_putida_LS46	Pseudomonas putida LS46	85468673	230815	0
Strain_WC1	Strain_WC1	24408440600	0	122042203
Tg-Thermococcus	Tg-Thermococcus	128812328	400318	0
Th-Thermotoga_hypogea	Th-Thermotoga hypogea	133910103	352497	0

Ontario **Genomics** Institute

Genome assembly - Thermoanaerobacter twc1

ongest Mean p) (bp)		al bases
e) (<u>Q</u> e)	N50 (bp) (bp	<u>)</u>
82175 20815	48240 25	60197
45148 20008	63283 25	61085
12571 17165	10156 25	574783
4		5148 20008 63283 25

VelvetOptimiser(insertion size 330)

VelvetOptimiser no insert size

Ray No insert size input

Ray insert size 300 sd 60

Ray No insert size input

Dozz in goet size 200 ad 60

option Longest

option N50

mix

mix

mix

Illumina

Illumina

Genome assembly - Lessons learned

- Sequencing technologies keep changing the game
- Software evolves along with seq. technology
- Evaluating software is a non-trivial problem
- Most genomes are < 100% complete
- There is no such thing as an off the shelf pipeline
- Each genome provides unique challenges
- The state of the art programs are a moving target



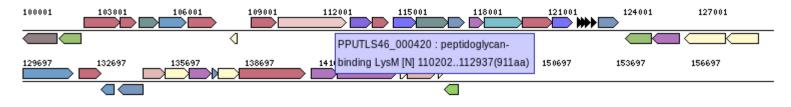




Chromosome Viewer - Colored by COG

Switch coloring to: --- Select Function --- \$

<u>Pseudomonas putida LS46 (NCBI Annotation V2) : ALPV02000001</u> (212968bp gc=0.62 depth=1.00) (coordinates **100001-150000**)



< Previous Range Next Range >

Get Nucleotide Sequence For Range

External Links:

- taxon:1193146







Example: Correspondence of gene tags between datasets (*C. thermocellum*)

```
NZ_ABVG02000001.1 gene_symbol 579372..577336(-) type 3a cellulose-binding domain protein
JW20 3317
                                                            type 3a cellulose-binding domain protein
2360 5448
            NZ ACVX01000021.1 gene symbol 26916..24880(-)
27405 0262
           NC 009012.1
                             gene_symbol 331028..330231(-) putative RNA polymerase sigma factor SigI|putative RNA po
                                                            RNA polymerase, sigma 28 subunit, SigI
           NZ ACVX01000021.1 gene symbol 27694..26897(-)
2360 5448
           NC 009012.1
                             qene_symbol 341280..343715(+) cellobiose phosphorylase|qlycosyltransferase 36
27405 0269
           NZ ACVX01000021.1 gene symbol 37944..40379(+)
                                                            glycosyltransferase 36
2360 5454
                              gene_symbol 343980..344939(+) D-isomer specific 2-hydroxyacid dehydrogenase NAD-binding
27405 0270
           NC 009012.1
2360 5454
           NZ ACVX01000021.1 gene symbol 40644..41603(+)
                                                           D-isomer specific 2-hydroxyacid dehydrogenase NAD-binding
JW20_3324
           NZ ABVG02000001.1 Cther 1654 595674..595561(-) hypothetical protein
           NZ_ACVX01000021.1 ClothDRAFT_1821 41820..41707(-)
                                                                 hypothetical protein
2360 5454
```







Example: Resolving ambiguities and conflicts The same enzyme with 3 different EC numbers!

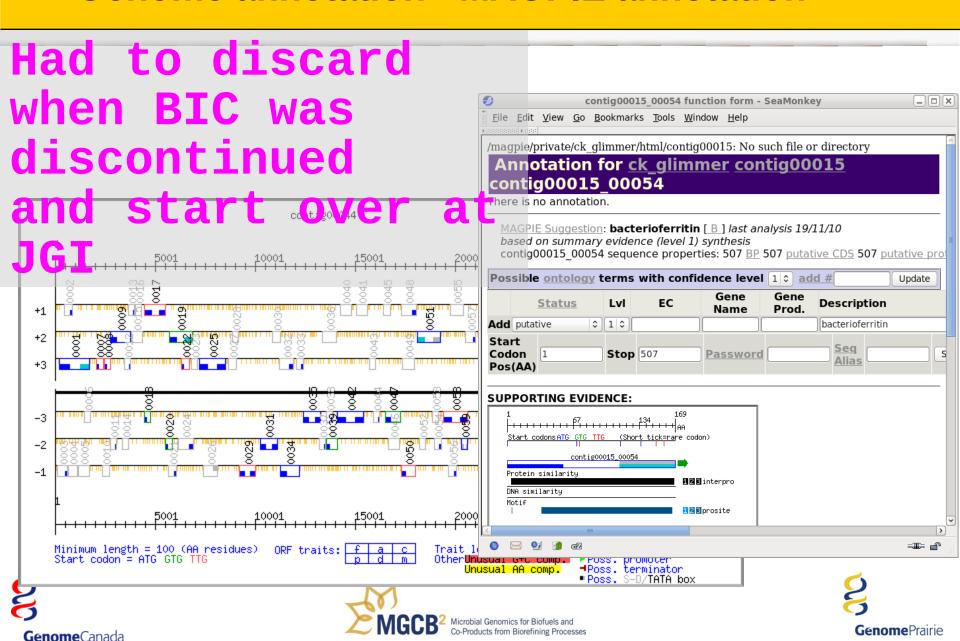
- Enzyme #1 acetaldehyde dehydrogenase EC=1.2.1.10
- Enzyme #2 alcohol dehydrogenase EC=1.1.1.1
- Enzyme #3 acetaldehyde/alcohol dehydrgenase EC=1.1.1.1 and 1.2.1.10
- If we link enzymes only to BRENDA we miss #3







Genome annotation - MAGPIE annotation



PRODIGAL prokaryotic gene
prediction
Low false positive
rate; performs well
even for genomes of
high GC%
GenePRIMP – Gene
Prediction
Improvement Pipeline

>short - 5' truncated
>long - 3' truncated

***unique - no known homologues**

dubious - too short

>split - interrupted by frameshifts

***split - interrupted by transposons**

missed - homologous to database seq.

CRISPR - clustered short pallin-

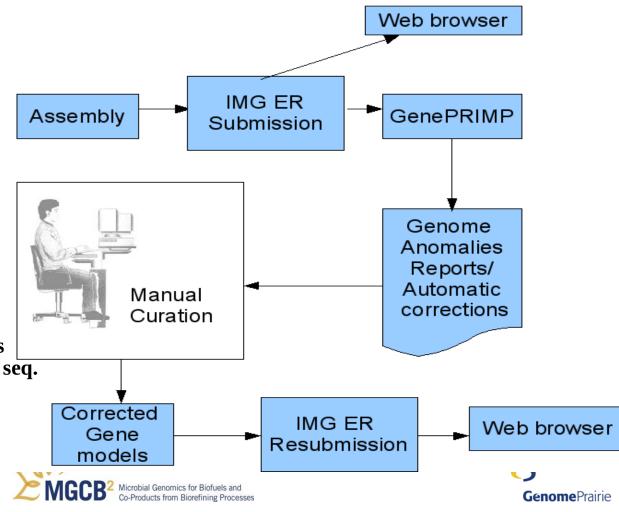
dromic repeats



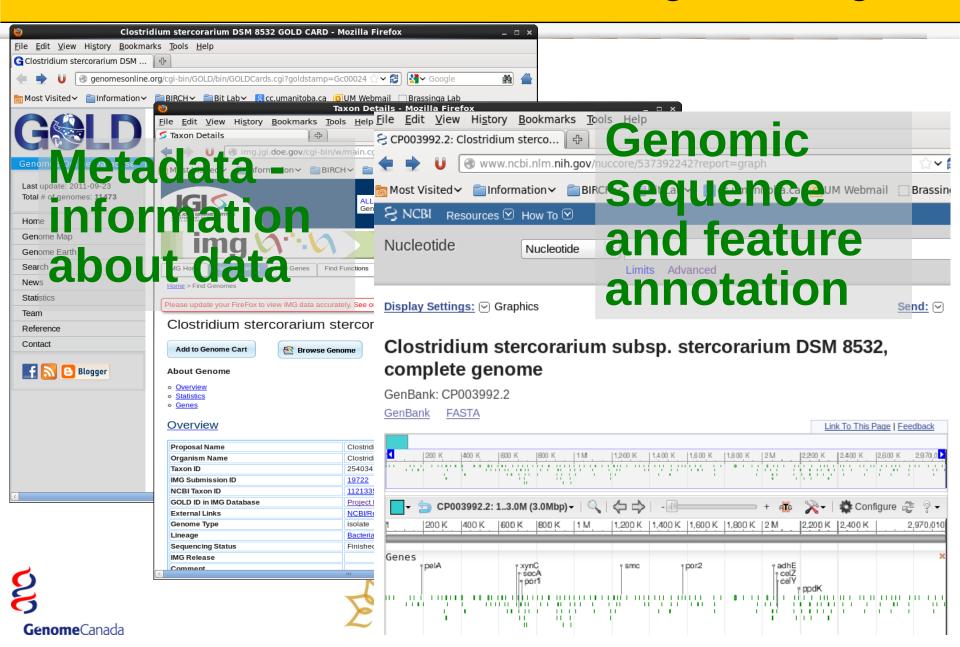
DOE Joint Genome Institute

Enabling Advances in Bioenergy & Environmental Research









Genome annotation - Lessons learned

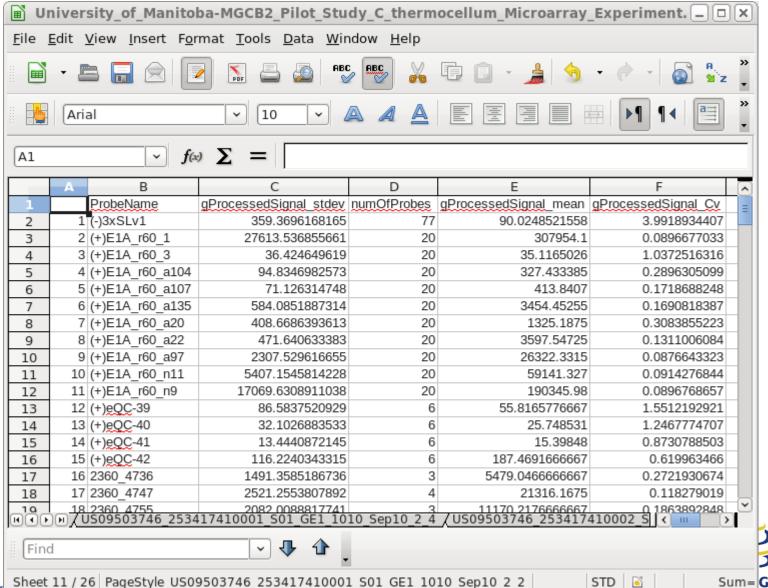
- Not only is there no off the shelf pipeline, but you better be prepared to write your own scripts to fill in the gaps, between what one program does and the next program
- Gene tags NEVER agree between different databases
- The trick is to automate as much as possible, and have the computer flag those genes that need expert human judgement to complete the annotation.







Gene expression





Sum= Genome Prairie

Gene expression - custom microarrays

For new species, you can't just buy arrays from Agilent! You must design oligos from ORFs

A further complication: We want to include ORFs from 3 *C. thermocellum* strains:

- many redundant ORFs
- gene tags different between strains







Gene expression - custom microarrays

Example: some ORFs are identical except for the start or stop codon.

Table 3. Five pairs of aligned sequences with the same base compositions except start or stop codon.		
Gene_ID	Gene sequences with identical ORF bodies	
27405_1409	TTGAAAACGTGTATTGCTTGTGGAATGCCTATGAAGGATATTTCAGACTTT//TATTTTA	
2360_5735	ATGAAAACGTGTATTGCTTGTGGAATGCCTATGAAGGATATTTCAGACTTT//TATTTTA	
JW20_4146	AAG TAA	
2360_5047	ATGCCAGGGGATCATTTATATGCTCCGTTTGTGGAAAGTGTAAAAAAAA	
27405_2041	GATT TAG	
JW20_4452	AT GAGCTTTTAT GCCGCACCGATTGCAAGGCTTATAGAGGAGTTTGAGAAG//CGCGAGATT TAA	
27405_2221	AGT TAA	
JW20_4195	GTG AGCGCGAAAATCCTTGTTGTTGATGACGAGAAAAATATAGTTGACATT//AAATTAAGT TAA	
27405_2542	TTGTGGGTATCTGTTAGCAATCAGGCATATGTTTTTTTAAATTGTGTTCTC//AAAAAAAT	
JW20_4049	TTGTGGGTATCTGTTAGCAATCAGGCATATGTTTTTTTAAATTGTGTTCTC//AAAAAAAT ATAG	







Gene expression - custom microarrays

Design one inclusive array for ORFs from 3 strains

Clostridium thermocellum

```
ATCC 27405 (DSM 1237)

JW20 (DSM 4135)

DSM 2360

orf-purge.pl - removes redundant ORFs

Agilent eArray - designs oligos

oligo-check.pl - identifies redundant oligos

oligo-maker.pl design non-overlapping uniq oligos to replace redundant oligos (Santa Lucia NN method)

rep-oligo-maker.pl restore gene annotation information for oligos designed by oligo-maker.pl
```

60-mer oligos



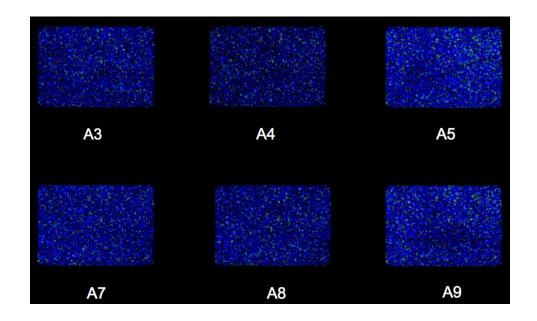




Pilot Experiment - Assesment of statistical power by resampling of biological replicates

300 genes 8 duplicate spots

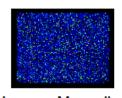
3597 genes 3 duplicate spots





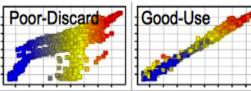


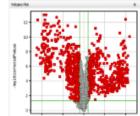




Images Manually Checked





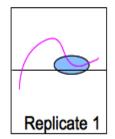


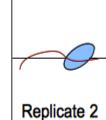
Correlation plots and volcano plots check cross sample technical quality

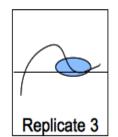
Agilent Feature Extraction software

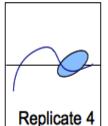
3. Normalization

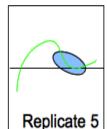
(removes variation due to non-biological factors between arrays)

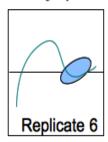




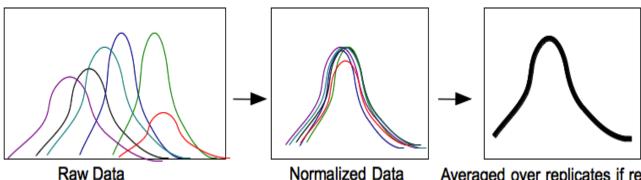




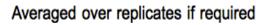




First test if we need to normalize using MA plots - Yes?





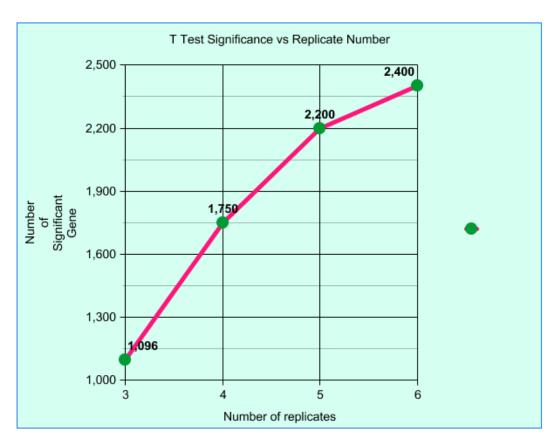




How many biological replicates are needed?

Normalized Gene Microarray 4233 probes

A - set of 6 Clostridium thermocellum 1237 exponential B - set of 6 Clostridium thermocellum 2360 exponential C - set of 5 Clostridium thermocellum 4150 exp (discarded) D - set of 6 Clostridium thermocellum 1237





stationary





RNA sequencing

- 1. > 100 million reads per sample
- 2. count # of reads for each gene
- 3. correct for different sizes of genes

Intrinsically simpler than microarrays, so fewer sources of experimental variance.







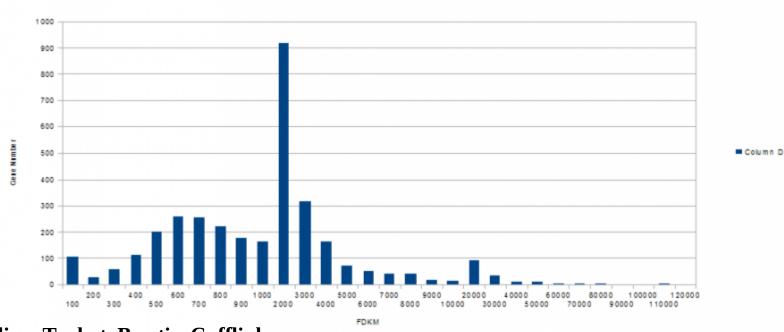
Gene expression - a moving target

Illumina RNA Seq of C. thermocellum

152 milion reads95% at least 1 alignment5% failed to align

FPKM - fragments per kilobase of transcript per million fragments mapped

FDKM Distribution



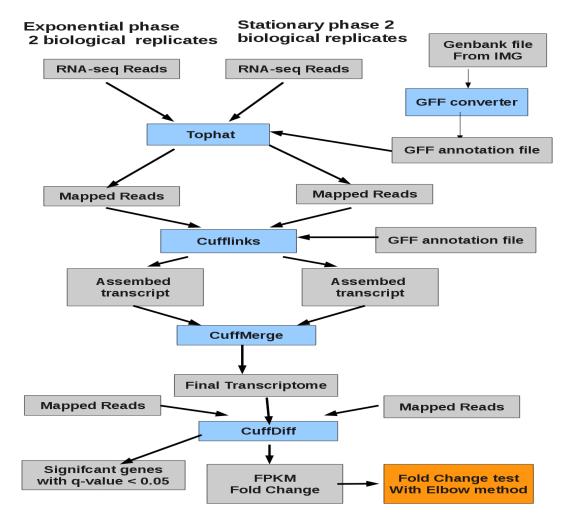
Pipeline: Tophat, Bowtie, Cufflink







Gene expression - RNAseq data pipeline









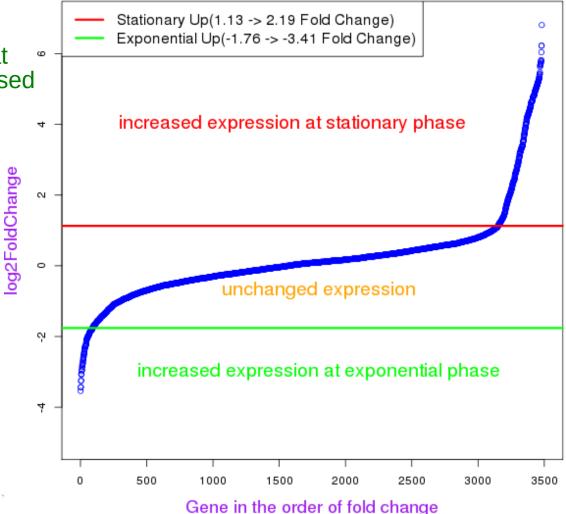
Gene expression - a moving target

How much does expression have to change, between two treatments, before we say that a gene is differentially-expressed between the two treatments?

Fold Change Test - typically uses an arbitrary cutoff of 2.0

By taking the derivative of the curve (ie. the elbow), we can choose a cutoff both for upregulated and down-regulated genes.

Rationale of Elbow Method





Gene expression - a moving target

C. thermocellum DSM1237 - exponential vs. stationary growth

COG/Significant genes of each method	Total	Elbow Method		Fold-2 Method		Cuffdiff Method	
	Genes	Up	Down	Up	Down	Up	Down
[N] Cell motility	95	5	1	53	6	29	2
[T] Signal transduction mechanisms	171	6	1	60	29	22	5
[G] Carbohydrate transport and metabolism	145	9	5	52	38	28	13
[M] Cell wall/membrane/envelope biogenesis	171	13	2	44	44	23	17
[K] Transcription	175	9	4	38	43	20	17
[S] Function unknown	188	2	1	52	53	15	15
[Z] Cytoskeleton	1	0	0	0	0	0	0
[O] Posttranslational modification, protein turnover, chaperones	89	1	2	22	23	6	8
[U] Intracellular trafficking, secretion, and vesicular transport	60	0	5	21	22	11	10
[L] Replication, recombination and repair	261	1	1	45	45	4	11
[V] Defense mechanisms	43	1	1	8	15	3	6
[Q] Secondary metabolites biosynthesis, transport and catabolism	18	0	2	3	10	0	6
[D] Cell cycle control, cell division, chromosome partitioning	38	1	1	4	16	2	6
[P] Inorganic ion transport and metabolism	93	5	1	11	28	7	12
[H] Coenzyme transport and metabolism	104	2	2	7	44	3	10
[I] Lipid transport and metabolism	46	0	7	2	29	0	20
[F] Nucleotide transport and metabolism	62	0	3	4	37	1	24
[R] General function prediction only	266	4	10	42	96	14	36
[C] Energy production and conversion	116	1	16	10	68	4	39
[E] Amino acid transport and metabolism	166	0	17	12	85	4	47
[J] Translation, ribosomal structure and biogenesis	165	2	47	11	119	3	86
total gene	2473	62	129	501	850	199	390

Gene expression - Lessons learned

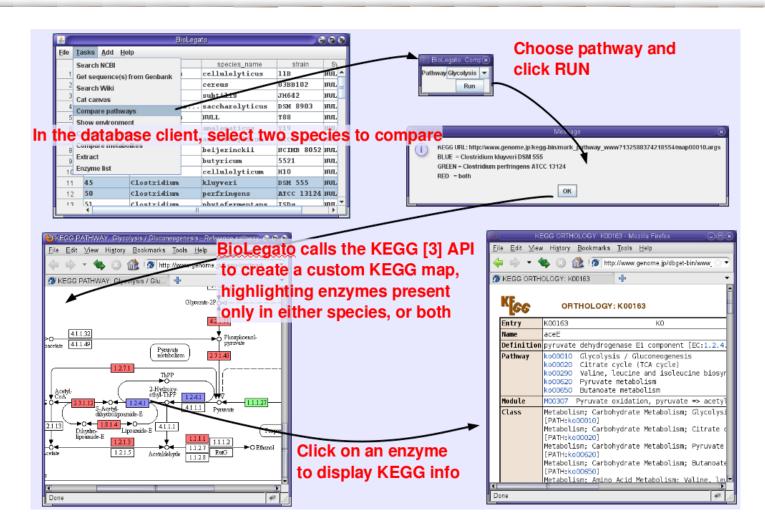
- Be prepared to write your own scripts to complete your data pipeline
- Microarrays demand 6 biological replicates
- Microarrays be prepared to throw out slides
- RNAseq largely replace microarrays
- It is a waste of time and money to do so few replicates that you have no publishable results at the end. Do fewer experiments, but do more biological replicates.







Getting lost in the systems biology pathways



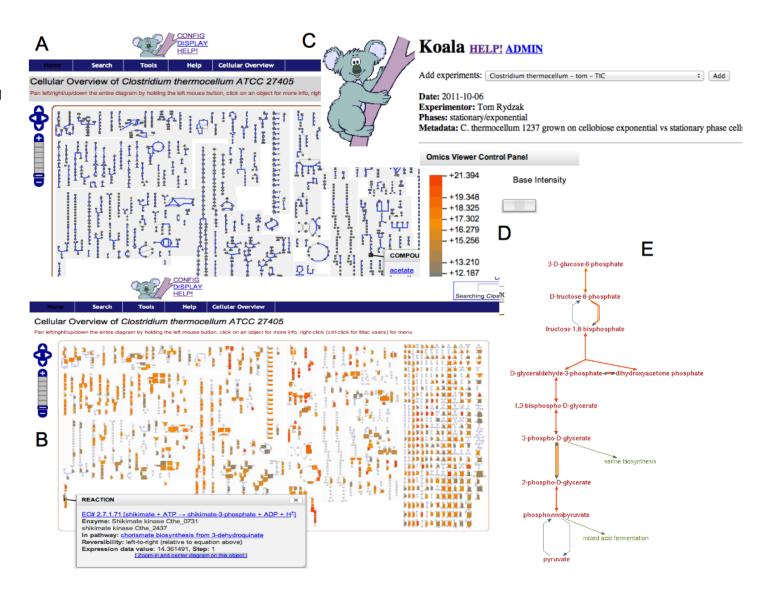






Getting lost in the systems biology pathways

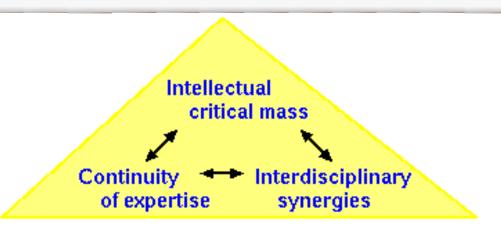
Proteomic z scores for C. thermocellus on cellobiose, comparing exponential vs. stationary cells





Biologists and Bioinformaticians





Faculty Brian Fristensky **Graham Alvare**

Justin Zhang Maryam Ayat PhD Student Abiel Roche

Research Associate Natalie Bjorklund Ruming Li Undergraduate Students
Dale Hamel
Drexler Hernandez







Biologists and Bioinformaticians - Lessons learned

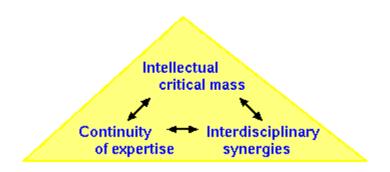
- no one person knows everything
- There is no substitute for cross-disciplinary training.
 - Train Computer Scientists in biology
 - Train Biologists in Computer Science
- Avoid strict compartmentalization of projects. Get everybody to work together on different tasks.
- Meetings are for kicking around ideas. Minimize formal presentations
- Work with biologists on a day to day basis















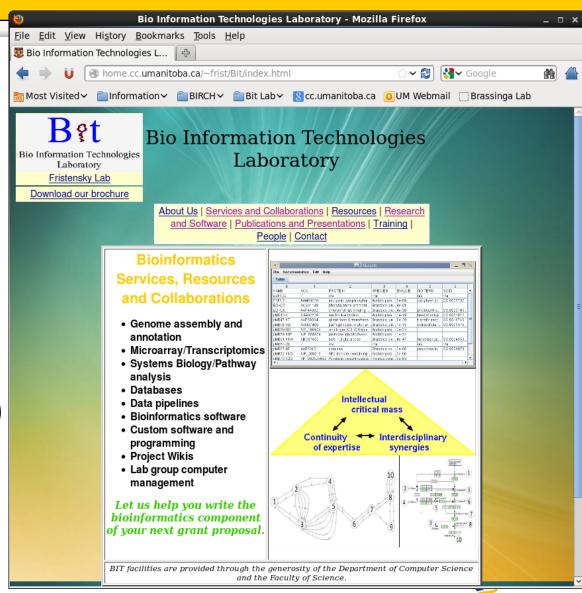


History:

Genome Canada Bioinformatics Innovation Centre (BIC) (2003 - 2011)

MGCB2 project (2008 - 2013)

Bit Lab (2012 - present)







Don't reinvent the wheel....



Work with the Bit lab









We work with you to write the grant:

- Benefit from our experience in writing grants for genomics projects
- Add credibility to your proposal
- Increase your chances of getting funded

Leverage an experienced team

- biologists
- bioinformaticians
- computer scientists

leverage our infrastructure and resources

Get results from day 1







BIRCH/BioLegato

It is MUCH harder to write a program with a graphic user interface (GUI) than to write a program that just crunches numbers.

BioLegato is a programmable graphic interface.

Create new GUIs by creating small files using the BioPCD language.







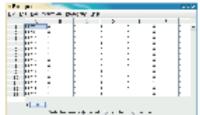




bitree – phylogenetic trees



bimarker - molecular markers

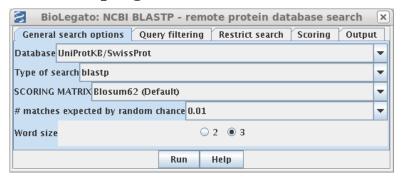








Menu to set parameters and run program:



Code:

```
tab "General search options"
var "dbase"
type combobox
label "Database"
default 0
choices
"UniProtKB/SwissProt" "swissprot"
"GenBank NonRedundant (Protein)" "nr"
"Reference proteins" "refseq_protein"
"Protein Structure Data Bank (PDB)" "pdb"
"GenBank Patented" "pat"
"Metagenomic proteins" "env_nr"
```

International Journal of Computer Applications (0975 – 8887) Volume 57– No.6, November 2012

BioPCD - A Language for GUI Development Requiring a Minimal Skill Set

Graham GM Alvare Dept of Plant Science University of Manitoba Winnipeg, MB. Canada. R3T 2N2 Abiel Roche-Lima Dept of Computer Science University of Manitoba Winnipeg MB. Canada. R3T 2N2 Brian Fristensky Dept of Plant Science University of Manitoba Winnipeg, MB. Canada. R3T 2N2

ABSTRACT

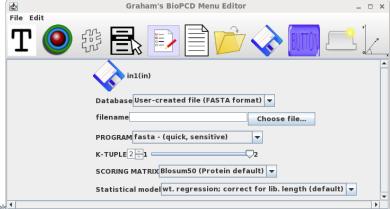
BioPCD is a new language whose purpose is to simplify the creation of Graphical User Interfaces (GUIs) by biologists with minimal programming skills. The first step in developing BioPCD was to create a minimal superset of the language referred to as PCD (Pythonesque Command Description). PCD defines the core of terminals and high-level nonterminals required to describe data of almost any type. BioPCD adds to PCD the constructs necessary to describe GUI components and the syntax for executing system commands. BioPCD is implemented using JavaCC to convert the grammar into code. BioPCD is designed to be terse and readable and simple enough to be learned by copying and modifying existing BioPCD files. We demonstrate that BioPCD can easily be used to generate GUIs for existing command line programs. Although BioPCD was designed to make it easier to run bioinformatics programs, it could be

many languages. Because of rapid advancement in the field, there are always new programs appearing in the literature that replace the current existing "favorite" of researchers working in that field. The work required to modify an existing GUI to handle the new program is also a limiting factor. An additional problem is that many programs are not written with extensibility in mind.

The need for easy ways to create GUIs is particularly important in bioinformatics. Bioinformatics is an interdisciplinary field, in which computer methodologies are applied to the analysis of biological data. The most critical limiting factor in bioinformatics is not computational, but rather human. The complexity of the data, along with the enormous datasets generated, often push the limits of computer resources and algorithmic rigor. However, few biologists have any formal training in computers. Thus, the user group with the greatest need for simple GUI interfaces to

GenomePrairie

Point-and-click PCD editor

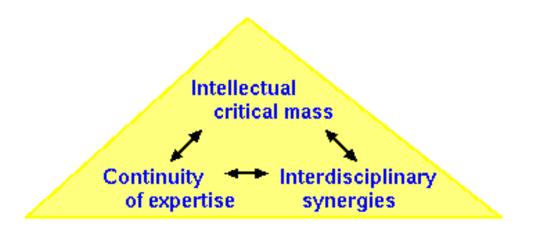






Industry level standards for

- data security
- data integrity and backups
- server availability
- software engineering



We're bilingual. We speak:

- the language of biology
- the language of bioinformatics







Research Partner Logos

















Canada Foundation for Innovation Fondation canadienne



Agriculture and Agri-Food Canada

Agriculture et Agroalimentaire Canada



















international du

International Institute for Sustainable Development

