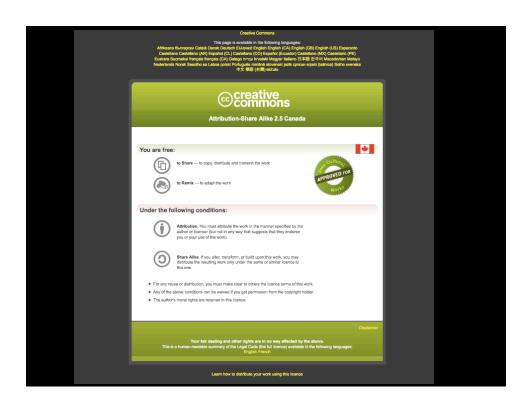
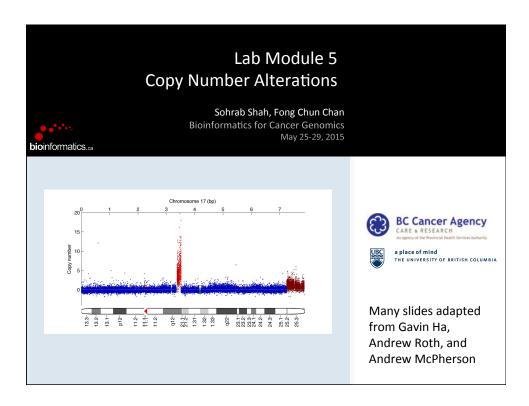


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Lab Module 5: Learning Objectives

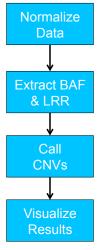
- Understand the basic workflow for identifying CNVs
- 2. Apply methods to identify CNAs in array and sequencing data
- 3. Visualize and interpret the results of CNA analyses

Getting Started

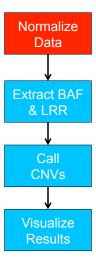
- The "Installation" wiki page shows installation of tools used in this module
- The "PrepData" wiki page details where we obtained the data
- The "Lab" wiki page shows the steps taken in this lab
- We will work through the "Lab" wiki page. You can use the "Installation" and "PrepData" wiki pages as references if interested

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Analysis Of CNAs using Arrays







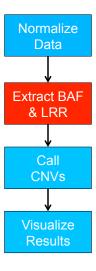
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Step 1: Normalize Data

- Because DNA does not hybridize with the same efficiency in all experiments, some normalization must be done
- Methods for normalization depend on the platform (e.g. Affymetrix SNP 6.0, Illumina)
- Software (Affymetrix SNP 6.0)
 - Affymetrix Power Tools
 http://www.affymetrix.com/support/developer/powertools/index.affx
 - Using R the AROMA package can be used http://www.aroma-project.org/
- For this tutorial we will use the Affymetrix Power Tools
 - Comprehensive description of the entire normalization process can be found here:

http://www.openbioinformatics.org/penncny/penncny_tutorial_affv_gw6.htm

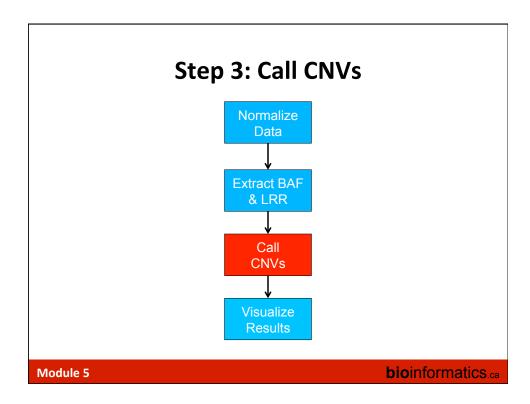




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Step 2: Extract BAF and LRR

- SNP genotyping arrays can measure how many copies of the A and B alleles are present
- Most tools prefer to work with B allele frequencies (BAF) and Log R Ratio (LRR):
 - BAF = B / (A+B)
 - LRR = log(A + B) log(x)
 - x is the intensity we would expect from a probe at normal copy number
- We need to convert the normalized outputs from the arrays to these values
- For this tutorial we used normalize_affy_geno_cluster.pl supplied as part of the PennCNV package http://www.openbioinformatics.org/penncnv/



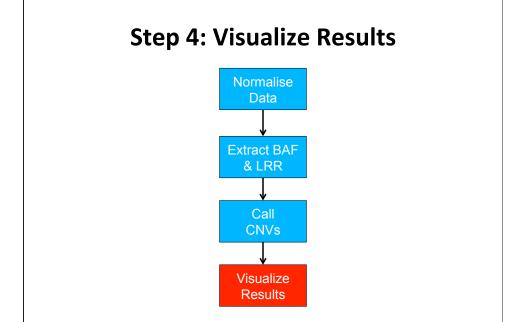
Step 3: Call CNVs

- Calling CNVs converts the BAF and LRR measurements across the many probes (~1.8 million for Affymetrix SNP 6.0) to predictions of copy number segments
- Calling CNVs in tumour genomes is challenging due to:
 - Normal contamination
 - Germline polymorphisms
 - Genomic heterogeneity of tumour cells
 - Ploidy i.e. baseline LRR

Step 3: Call CNVs

- Software (a few examples):
 - OncoSNP (https://sites.google.com/site/oncosnp/)
 - PICNIC (http://www.sanger.ac.uk/genetics/CGP/Software/PICNIC/)
 - ASCAT (http://heim.ifi.uio.no/bioinf/Projects/ASCAT/)
 - HAPSEG (https://confluence.broadinstitute.org/display/CGATools/HAPSEG)
- · For this tutorial we will use OncoSNP:
 - It is well documented
 - Handles all the confounding factors in a statistically sound framework

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Step 4: Visualize Results

- · OncoSNP results can be found in the module package:
 - content/results/oncosnp
- The plot files HCC1143.*.ps.gz provide a nice summary figure of the data

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CNV Analysis using Sequencing Data

- Conceptually, CNV analysis for sequencing and array data follows the same workflow
- The main difference is that we start from aligned read data (BAM) instead of raw array data (CEL, etc)
- A new issue that arises with sequencing data is mappability:
 - Some regions of the genome are easier to map reads to than other regions

CNV Analysis using Sequencing Data

- Software (a few examples)
 - OncoSNP-Seq (https://sites.google.com/site/oncosnpseq/)
 - HMMCopy/TITAN (http://compbio.bccrc.ca/software/titan)
 - SomitCA ((http://www.bioconductor.org/packages/release/bioc/html/SomatiCA.html)

- ..

• Today we will HMMCopy/TITAN because they are published and relatively mature

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Browse Segment Data in IGV

- 1. Download METABRIC_DatasetI997.seg from the wiki
 - 997 breast cancer copy number alterations predicted from SNP6 arrays (Curtis C*, Shah SP*, et al., Nature, 2012)
- 2. Open IGV
- 3. Switch reference genome to "Human hg18"
- 4. File -> Load from File...
- 5. Tracks -> Fit Data to Window

Module 5

