	The Cancer Genome Atlas (TCGA) & International Cancer Genome Consortium (ICGC)				
UNSW AUSTRALIA	Session 4 – Rebecca Poulos				
Never Stand Still	Medicine Prince of Wales Clinical School				

### Introductory bioinformatics for human genomics workshop, UNSW $20^{th} - 21^{st}$ April 2017



ADULT CANCER PROGRAM







### Facts on cancer

An estimated 134,000 new cases of cancer will be diagnosed in Australia this year, with that number set to rise to 150,000 by 2020

Cancer is a leading cause of death in Australia. In 2014, > 44,000 people died from cancer, accounting for about 3 in every 10 deaths.

Source: Cancer Council Australia (2017)



## Cancer is a disease of the genome

- Challenges in treating cancer:
  - Every patient is different
  - Every tumour is different, even in the same patient
  - Tumours can be highly heterogeneous
  - High rate of genomic abnormalities (few drivers, many passenger mutations)

Image from Thompson & Compton *Chromosome Res* 2011.

#### Healthy 46 chromosomes



#### Example cancer 59 chromosomes





Types of changes	Some common technologies used to study these changes
<ul><li>DNA mutations</li><li>Point mutations</li><li>Insertions &amp; deletions</li></ul>	WGS; WXS

WGS = whole genome sequencing, WXS = whole exome sequencing RRBS = reduced representation bisulfite sequencing, WGBS = whole genome bisulfite sequencing



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DNA structural variations	WGS
Copy number variation (CNV)	CGH array; SNP array; WGS

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mRNA expression changes	mRNA expression array; RNA-seq

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Copy number variation (CNV)	CGH array; SNP array; WGS	
DNA methylation	Methylation array; RRBS; WGBS	
mRNA expression changes	mRNA expression array; RNA-seq	
miRNA expression changes	miRNA expression array; miRNA-seq	
Protein expression	Protein arrays; mass spectrometry	

WGS = whole genome sequencing, WXS = whole exome sequencing RRBS = reduced representation bisulfite sequencing, WGBS = whole genome bisulfite sequencing



## Goal of cancer genomics

- Identify changes in the genomes of tumors that drive cancer progression
- Understand how normal cells become cancerous
- Identify new targets for therapy
- Select drugs based on the genomics of the tumour i.e. personalised therapy



## Cancer Sequencing Projects The Cancer Genome Atlas (TCGA) TCGA

- Led by NIH
- Initiated in 2006 (as a pilot program ) and expanded in 2009

	Pilot	Project Expansion	Analysis Completion
2005	2006-2009	2010-2014	2015-2016
NCAB Report	GBM Report	Image: Constraint of the constra	10,000 cases complete

### Aim:

To make the genomes of 20 cancers publically available

### Update today:

33 cancer types & subtypes analysed (11,000 samples)



## **TCGA** pipeline





## **Types of Cancers**

#### Breast

- Ductal carcinoma
- Lobular carcinoma
- Central nervous system
  - Glioblastoma multiforme
  - Lower grade glioma
- Endocrine
  - Adrenocortical carcinoma
  - Papillary thyroid carcinoma
  - Paraganglioma and pheochromocytoma
- Gastrointestinal
  - Cholangiocarcinoma
  - Colorectal Adenocarcinoma
  - Liver Hepatocellular Carcinoma
  - Pancreatic Ductal Adenocarcinoma
  - Stomach-Esophageal Cancer
- Gynecological
  - Cervical Cancer
  - Ovarian Serous Cystadenocarcinoma
  - Uterine Carcinosarcoma
  - Uterine Corpus Endometrial Carcinoma

- Head and neck
  - Squamous cell carcinoma
  - Uveal melanoma
- Hematologic
  - Acute myeloid leukemia
  - Thymoma
- Skin
  - Cutaneous melanoma
- Soft tissue
  - Sarcoma
- Thoracic
  - Lung Adenocarcinoma
  - Lung Squamous Cell Carcinoma
  - Mesothelioma
- Urologic
  - Chromophobe Renal Cell Carcinoma
  - Clear Cell Kidney Carcinoma
  - Papillary Kidney Carcinoma
  - Prostate Adenocarcinoma
  - Testicular Germ Cell Cancer
  - Urothelial Bladder Carcinoma



### Datasets

### Data types

- Clinical data
- Images
- Microsatellite instability
- DNA sequencing
- miRNA sequencing
- Protein expression
- mRNA & RNA sequencing
- Array-based expression
- DNA methylation
- Copy number

### Data access tiers

- Open access
  - De-identified
  - Requires no certification
- Controlled access
  - No direct identifiers

Request (DAR) form

- Must complete Data Access

UNSW THE UNIVERSITY OF NEW SOUTH WALES

## Genomic Data Commons (GDC)

 TCGA data is stored on the Genomic Data Commons (GDC) data portal: <u>https://portal.gdc.cancer.gov/</u>

GDC Data Portal	🐓 Data 🛄 Analysis		<b>Q</b> Quick Se	earch 🖷 Login 📜 Cart 🚺 🏭 GDC A
Harmonized Cancer Datasets Genomic Data Commons Data P	ortal	1.500	Cases by Primary Site	3
Get Started by Exploring: Projects	Data	1.000		
Perform Advanced Search Queries, such as: Cases of kidney cancer diagnosed at the age of 20 and below	736 Cases 1,519 Files			lii maaaaa.
CNV data of female brain cancer cases	459 Cases 1,788 Files	unet with rest and you don the	المحمد عليهم المحمد المرجد المتحد عليه المحمد المحمد المحمد	
Gene expression quantification data in TCGA-GBM project	166 Cases 522 Files	the an all are in all other the o	and the tray prost of some block by the	Certain Contrast part part contrast fer them per unophylo bie C
DATA PORTAL SUMMARY Data Release 5.0 - March 16, 2017	PRIM.	ARY SITE	CASES 14,551	FILES 274,724
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DATA PORTAL SUMMARY       Provide the second s	PRIM       39       Documentation       Learn how to use the GDC Data Portal such as:       M   Browse Data using Facet Search	to its full potential with common topics	CASES 14,551 GDC Applications The GDC Data Portal is a robus researchers and bioinformaticity analysis. The GDC applications	FILES 274,724 Ist data-driven platform that allows cancer ans to search and download cancer data for s include:
DATA PORTAL SUMMARY       PF         Data Release 5.0 - March 16. 2017       Improvement         Infrastructure       Data is continuously being processed and harmonized by the GDC.         View GDC system statistics:       View GDC system statistics:         Compute Infrastructure       12,800 Cores       87.96 TB RA         Storage Infrastructure       4.98 PB Used       5.42 PB Tota	PRIM         39         Documentation         Learn how to use the GDC Data Portal such as:         M         Browse Data using Facet Search         H	to its full potential with common topics	CASES 14,551 GDC Applications The GDC Data Portal is a robus researchers and bioinformaticits analysis. The GDC applications	FILES Participation Platform that allows cancer ans to search and download cancer data for is include: Plata Transfer Tool API
DATA PORTAL SUMMARY       PF         Data Release 5.0 - March 16. 2017       Improvement         Infrastructure       Data is continuously being processed and harmonized by the GDC.         Vew GDC system statistics:       Vew GDC system statistics:         Compute Infrastructure       12,800 Cores       87.96 TB RA         Storage Infrastructure       4.98 PB Used       5.42 PB Tota         View Data Download Statistics Report >       Vew	PRIM         39         Documentation         Learn how to use the GDC Data Portal such as:         M         Browse Data using Facet Search         M         Browse Data using Facet Search         Project Based Data Availability	arry site 29 to its full potential with common topics	CASES 14,551 GDC Applications The GDC Data Portal is a robus researchers and bioinformaticia analysis. The GDC applications Data Portal	FILES Participation FILES 274,724 est data-driven platform that allows cancer ans to search and download cancer data for s include: Data Transfer Tool API
DATA PORTAL SUMMARY       PF         Data Release 5.0 - March 16. 2017       Improvement         Infrastructure       Data is continuously being processed and harmonized by the GDC.         Vew GDC system statistics:       Compute Infrastructure         12,800 Cores       87.96 TB RA         Storage Infrastructure       4.98 PB Used       5.42 PB Tota         View Data Download Statistics Report >	PRIM         39         Documentation         Learn how to use the GDC Data Portal such as:         M         Browse Data using Facet Search         M         Browse Data using Facet Search         Project Based Data Availability         Controlled Access Data	arry site 29 to its full potential with common topics	CASES 14,551 GDC Applications The GDC Data Portal is a robus researchers and bioinformaticia analysis. The GDC applications Data Portal W	FILES 274,724 est data-driven platform that allows cancer ans to search and download cancer data for is include: Data Transfer Tool API Data Transfer Tool API



### Exploring the "Data" option...

Cases Files	« Hide Filters	Start searching by selecting a facet	or try the Advanced Searc	ch			¢ Advanced
Add a Ca	se/Biospecimen Filter						
~ Case		Summary Cases (14,551) Fi	iles (274,724)				Browse Annotations
Q Search for Case Id		■ Add all files to the Cart ▲ Do	bwnload Manifest				
✓ Case Submitter ID Press	efix						
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✓ Primary Site	Q	2/4,/24		14,001		470.57 TB	
Kidney	1,681						
Brain	1,133	Fie Counts by Project	<b>=</b>	File Counts by Access Level	<b>=</b>	File Counts by Data Format	
Nervous System	1,127						
Breast	1,098						
Lung	1,089 24 More						
✓ Cancer Program							
TCGA	11,315						
TARGET	3,236	39 Projects		2 Access Levels		7 Data Formate	5
✓ Project	Q						
TARGET-NBL	1,127	Fie Counts by Primary Site	<b></b>	File Counts by Data Type	<b></b>	File Counts by Experimental Strate	gy 🎟
TCGA-BRCA	1,098						
TARGET-AML	988						
TARGET-WT	652						
TCGA-GBM	617						
	<u>34 More</u>						
✓ Disease Type	٥						

#### Search and filter files using this utility



### Let's find all processed RNAseq data for colorectal cancer...

Cases	Files	« Hide Filters	
		Add a Case/Biospecimen Filter	
∽ Ca	se		
Q	Search fo	r Case Id	
✓ Case Submitter ID Prefix			
Q	Q Search for Submitter Id		
✓ Primary Site Q O			
Colorectal 633			
Kid	ney	1,681	





### Let's find all processed RNA-seq data for colorectal cancer...





### Let's find all processed RNA-seq data for colorectal cancer...





## Genomic Data Commons (GDC)

- The GDC data portal is very user-friendly
- GDC is ideal for downloading data in large tab delimited format – perfect for a bioinformatician
- However, data portal files are difficult to use for the average biologist
- Fortunately there are some alternatives:
  - cBioPortal (<u>www.cbioportal.org/</u>)
  - ICGC data portal (<u>http://dcc.icgc.org/</u>)



## cBioPortal (<u>www.cbioportal.org/</u>)

- A data analysis portal to TCGA data
- Provides functions for visualisation, analysis and download of data.
- Maintained by Memorial Sloan-Kettering Cancer Center





## Features of cBioPortal

- Visualising frequency of mutations
- Correlation between occurrence of mutations
- Correlation of expression and CNV or methylation
- Visualisation of mutations
- Survival analysis
- Network analysis

Gao et al (2013) Sci. Signal





Visualize, analyze, discover.

ABOUT

NEWS

TOOLS



VISUALIZE YOUR DATA

The cBioPortal for Cancer Genomics provides **visualization**, **analysis** and **download** of largescale **cancer genomics** data sets.

Please adhere to the TCGA publication guidelines when using TCGA data in your publications.

**Please cite** Gao et al. *Sci. Signal.* 2013 & Cerami et al. *Cancer Discov.* 2012 when publishing results based on cBioPortal.



#### Query Download Data

Select Cancer Study:	
Search	<ul> <li>No studies selected.</li> </ul>
▼… □ All (121)	
🕶 🗋 Adrenal Gland (1)	
Adrenocortical Carcinoma (1	1)
🔤 🗌 Adrenocortical Carcir	noma (TCGA, Provisional) 92 samples
➡ 🔲 Biliary Tract (5)	
🔶 🗌 Cholangiocarcinoma (4)	
- U Intrahepatic Cholang	jiocarcinoma (Johns Hopkins University, Nat Genet 2013) 40 samples
U Intrahepatic Cholang	jiocarcinoma (Johns Hopkins University, Nat Genet 2013) 40 samples (National Cancer Centre of Singapore, Nat Genet 2013) 15 samples
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	Jiocarcinoma (Johns Hopkins University, Nat Genet 2013) 40 samples (National Cancer Centre of Singapore, Nat Genet 2013) 15 samples (National University of Singapore, Nat Genet 2012) 8 samples and CNA O Only Mutation O Only CNA Query Language (OQL)

# What's New Comparison of the second second

#### The Portal contains 121 cancer studies. [Details]



RAS/RAF alterations in colorectal cancer BRCA1 and BRCA2 mutations in ovarian cancer POLE hotspot mutations in endometrial cancer TP53 and MDM2/4 alterations in GBM PTEN mutations in GBM in text format BRAF V600E mutations across cancer types Patient view of an endometrial cancer case What People are Saying

> "I want to thank you for the nice, useful and user-friendly interface you have generated and shared with the



In this query, we are telling cBioPortal to perform an analyse comparing all AML samples with ERG mutation or CNA and those without ERG mutation nor CNA.

Query Download Data



### OncoPrint



9 out of 191 samples have alteration in ERG:

- 8 samples have amplifications of ERG
- 1 sample has a deep deletion of ERG

### **Plots – correlation ERG expression with CNA**

Samples with amplification possibly have higher expression

Horizontal Axis					
Genetic Profile O Clinical Attribute		14			
		14			
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Vertical Axis	Sec	9 -			
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Download SVG PDF Data					

### **Survival analysis**



### **Network analysis**

Modify Quer	y Acute My Tumor Samples w	<b>/eloid Le</b> i ithOVA data (19	<b>ukemia (TCC</b> 11.samples)/11.Gene	GA, Provisional)					Gen	ie Set / Pat	hway i	s altered in 9	(4.7%) 0	of queried	samples
OncoPrint	Mutual Exclusivity	Plots	Mutations	Co-Expression	Enrichments	Survival	Network	CN Segments	Download	Bookmark					
The networ Download t	k below contains 1 he complete netwo Topology View	7 nodes, i rk in Grap	including you ohML or SIF fo out Lege	APK1	SPDEF ERF	equently a Reader plu edges for d	<sup>™</sup> Itered neigh gin is requir letails. Rigl	bor genes (out of ed for importing nt-click edges f	f a total of 17) GraphML). or detailed p	, rocess-leve	Genes Filter 0 EHF ELF1 ELF3 ELF5 ERF ERG ETV3 FEV GABPA MAPK1 MAPK1 MAPK3 MAPK6 MAPK7 MAPK8 SPDEF	ork view. Interactions Drugs of Speci rugs Gene Neighbors by Submit New 5	Details ified Gene s Alteratio MA	Help +5 v n (%) x 0 p	

This network analysis is not that interesting, but it could be more useful with a larger input gene set.

### Bookmark



### You can make a URL to immediately share analysis with collaborators



### Gene summaries across cancer types

Query	Downlo	ad Data				
Select Ca	ancer Study:					
Search				-	All studies selected. Deselect all	<ul> <li>Select all cancers</li> </ul>
	(121) ←					
÷	Adrenal Glan	d (1)				
•	- 🗹 Adrenoco	rtical Carcinom	ə (1)			
	🔤 🗹 🗹	nocortical Ca	cinoma (TC	GA, F	Provisional) 92 samples	
<b>* S</b>	Biliary Tract (	(5)				
•	🗝 🗹 Cholangio	ocarcinoma (4)				Select the type of
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Select Da	ata Type Prio	rity: ® Mutat	on and CNA	On	ly Mutation  Only CNA	
Select Pa	atient/Case	Select an Optio	n		•	
	Т	o build your own	case set, try ou	ut our e	enhanced Study View.	Type in gene - can
Enter Ge	ne Set: A	dvanced: Onc	o Query Lan	guag	e (OQL)	 accept any number.
User-defir	ned List				•	(For this example,
ERG						we will look at ERG)

### Gene summaries across cancer types



## **Cancer Sequencing Projects**

### International Cancer Genome Consortium (ICGC)



International Cancer Genome Consortium

- Collaboration between 22 countries
- Initiated in 2007
- Aim:

To catalogue genomic abnormalities in tumours from 50 different cancer types & subtypes

- Update today: 70 projects, 21 primary sites, >16,246 tumour DNA data
- Uses data from TCGA and the Sanger Cancer Genome Project



## Working groups

	INTERNATIONAL CANCER GENOME CONSORTIUM (ICGC) WORKING GROUPS						
Clinical and Pathology Issues	Quality Standards of Samples	Genome Analyses	Informed Consent and Privacy Protections	Sample Size/Study Design	Data Management/ Databases and Coordination	Data Release, Data Tiers, Intellectual Property, and Publications	
Lynda Chin Jean-Yves Blay William Dalton Tony Green Stan Hamilton Timothy Ley Ed Liu Paul Mischel Kenneth Pienta Rajiv Sarin Daniel Tan	<b>Peter Lichter</b> Carolyn Compton Andy Futreal Youyong Lu Miguel Angel Piris	<b>Mike Stratton</b> Olli Kallioniemi Ed Liu Marco Marra John McPherson Brad Ozenberger Henk Stunnenberg Daniel Tan Brandon Wainwright Rick Wilson	Bartha Knoppers Martin Bobrow Wylie Burke Kazuto Kato Karen Kennedy Brad Ozenberger Daniel Tan Susan Wallace Henry Yang	<b>Eric Lander</b> Ron DePinho Doug Easton Gaddy Getz Partha P. Majumder	Lincoln Stein Cameron Brennan Arul Chinnaiyan Peter Good Joe Gray J Gowrishankar David Haussler David Housman Tim Hubbard Subha Madhaven Paul Spellman	Mark Guyer Daniela Gerhard Karen Kennedy Brad Ozenberger	



### **ICGC** Samples

Biliary Tract Cancer	Biliary Tract Cancer	Bladder Cancer	Esophageal Cancer	Eye Cancer	Gastric Cancer
Japan 💿	Singapore 🚥	China	United Kingdom 🔛	France	China 🗖
Bladder Cancer	Blood Cancer	Blood Cancer	Gastric Cancer	Gastric Cancer	Head And Neck Cancer
United States	China	Singapore	Japan 🔹	United States 🥌	United States
Blood Cancer	Blood Cancer	Blood Cancer	Head and Neck Cancer	Head and Neck Cancer	Liver Cancer
South Korea 🗱	United States	United States	Mexico 🚺	United States	China
Bone Cancer	<u>Bone Cancer</u>	Brain Cancer	Liver Cancer	Liver Cancer	Liver Cancer
France	United Kingdom <b>⊞</b>	Canada 📢	France	Japan •	United States 🧮
Brain Cancer	Brain Cancer	Brain Cancer	Lung Cancer	Lung Cancer	Lung Cancer
China	United States	United States	China 📩	South Korea 🐱	United States 🧮
Breast Cancer China	Breast Cancer European Union / United Kingdom 💼 🔛	Breast Cancer France	Lung Cancer United States 📕	Malignant Lymphoma Germany <b>—</b>	Melanoma Brazil 💿
Breast Cancer	Breast Cancer	Breast Cancer	Nasopharyngeal Cancer	Non-Hodgkin Lymphoma	Oral Cancer
Mexico	South Korea	South Korea	China	Mexico	India 🚍
Breast Cancer	Breast Cancer	Cervical Cancer	<u>Ovarian Cancer</u>	Ovarian Cancer	Ovarian Cancer
United Kingdom ₩	United States	United States	Australia 🎦	China 📩	United States 🤤
Chronic Lymphocytic Leukemia Spain <mark>■</mark>	Chronic Myeloid Disorders United Kingdom 🔛	Colon Cancer United States	Pancreatic Cancer Australia 🔚	Pancreatic Cancer Australia 🔚	Pancreatic Cancer Canada 💽
Colorectal Cancer	Endometrial Cancer	Esophageal Cancer	Pancreatic Cancer	Pancreatic Cancer	Pediatric Brain Tumors
China 🗖	United States 📑	China	China 📥	United States	Germany





### Data Release 23 Dec 7, 2016

Donor Distribution by Primary Site



Cancer projects	70
Cancer primary sites	21
Donors with molecular data in DCC	16,246
Total Donors	19 <mark>,30</mark> 5
Simple somatic mutations	46,693,172
Mutated Genes	57,658



## Data types

- Mandatory:
  - Genomic DNA analyses of tumors (and matching control DNA) are core elements of the project.
- Complementary (Recommended):
  - Additional studies of DNA methylation and RNA expression are recommended on the same samples that are used to find somatic mutations.
- Optional:
  - Proteomic analyses
  - Metabolomic analyses
  - Immunohistochemical analyses



## Data access policy

ICGC Open Access	ICGC Controlled Access
Datasets	Datasets
<ul> <li>Cancer Pathology         <ul> <li>Histologic type or subtype</li> <li>Histologic nuclear grade</li> </ul> </li> <li>Patient/Person         <ul> <li>Gender</li> <li>Age range</li> </ul> </li> <li>Gene Expression (normalized)</li> <li>DNA methylation</li> <li>Genotype frequencies</li> <li>Computed Copy Number and Loss of Heterozygosity</li> <li>Newly discovered somatic variants</li> </ul>	<ul> <li>Detailed Phenotype and Outcome Data</li> <li>Patient demography Risk factors</li> <li>Examination</li> <li>Surgery/Drugs/Radiation</li> <li>Sample/Slide</li> <li>Specific histological features</li> <li>Protocol</li> <li>Analyte/Aliquot</li> <li>Gene Expression (probe-level data)</li> <li>Raw genotype calls</li> <li>Gene-sample identifier links</li> <li>Genome sequence files</li> </ul>



### ICGC data portal (<u>http://dcc.icgc.org/</u>)

#### Click on cancer projects Click on cancer projects Cancer Projects Cancer Projects Cancer Projects Cancer Projects Cancer Projects Cancer Search Canc

#### About Us

The C ICGC Data Portal provides tools for visualizing, querying and downloading the data released quarterly by the consortium's member projects.

To access ICGC controlled tier data, please read these instructions.

New features will be regularly added by the DCC development team. ➡ Feedback is welcome.

#### Data Release 20 November 27th, 2015

Donor Distribution by Primary Site

#### Tutorial

EXAMPLE QUERIES

- 1. BRAF missense mutations in colorectal cancer
- Most frequently mutated genes by high impact mutation in stage III malignant lymphoma
- Brain cancer donors with frameshift mutations and having methylation data available



## Cancer project view





#### BREAST CANCER - TCGA, US

#### Summary

Mutated Genes

Mutations

Donors

Publications

Page Filters

Mutation Impact
 High
 Low
 Unknown

#### Summary

Code	BRCA-US
Name	Breast Cancer - TCGA, US
Primary Site	Breast
Tumour Type	Breast cancer
Tumour Subtype	Ductal & lobular
Countries	United States
Number of donors in PCAWG	92
Number of donors with molecular data in DCC	1,045
Total number of donors	1,099

#### Experimental Analyses

non-NGS	2107 samples from 1045 donors
WGS	19 samples from 19 donors
WXS	970 samples from 955 donors
RNA-Seq	1177 samples from 1041 donors
miRNA-Seq	1153 samples from 1026 donors

🛓 Download Sample Sheet

#### Raw data is available at

The Cancer Genome Atlas

Cancer Genomics Hub

An approved 🗹 data access request is required.

#### Available Data Types

Clinical Data	1,099 donors
Simple Somatic Mutations (SSM)	955 donors
Copy Number Somatic Mutations (CNSM)	1,045 donors
Structural Somatic Mutations (StSM)	
Simple Germline Variants (SGV)	
Array-based DNA Methylation (METH-A)	1,013 donors
Sequence-based DNA Methylation (METH-S)	
Array-based Gene Expression (EXP-A)	529 donors
Sequence-based Gene Expression (EXP-S)	1,041 donors
Protein Expression (PEXP)	298 donors
Sequence-based miRNA Expression (miRNA)	1,026 donors
Exon junction (JCN)	

OPEN IN 🛢 DCC Data Releases



#### Most Frequently Mutated Genes

OPEN IN ADVANCED SEARCH | GENOME VIEWER









![](_page_42_Picture_1.jpeg)

### Looking at mutations in specific genes

![](_page_43_Figure_1.jpeg)

#### About Us

The CICGC Data Portal provides tools for visualizing, querying and downloading the data released quarterly by the consortium's member projects.

To access ICGC controlled tier data, please read these instructions.

New features will be regularly added by the DCC development team. Seedback is welcome.

#### Data Release 20 November 27th, 2015

Donor Distribution by Primary Site

![](_page_43_Picture_8.jpeg)

#### Tutorial

EXAMPLE QUERIES

- 1. BRAF missense mutations in colorectal cancer
- Most frequently mutated genes by high impact mutations in stage III malignant lymphoma
- Brain cancer donors with frameshift mutations and having methylation data available

![](_page_43_Picture_14.jpeg)

![](_page_44_Picture_1.jpeg)

#### Annotation

Low

Reactome Pathways	ARMS-mediated activation CREB phosphorylation through the activation of Ras Frs2-mediated activation MAP2K and MAPK activation Negative feedback regulation of MAPK pathway
GO Terms	ATP binding CD4-positive, alpha-beta T cell differentiation Fc-epsilon receptor signaling pathway MAP kinase kinase kinase activity MAPK cascade
Curated Gene Set	Cancer Gene Census

### Then scroll down...

![](_page_44_Picture_5.jpeg)

### Cancer Distribution

1,144 DONORS AFFECTED BY 1,244 MUTATIONS ACROSS 43 PROJECTS

![](_page_45_Figure_3.jpeg)

![](_page_45_Figure_4.jpeg)

Showing 43 projects

X of Donors Affected

Project	Site	Tumour Type	Tumour Subtype	# Donors affected •	# Mutations
MELA-AU	Skin	Skin cancer	Melanoma	149 / 183 ( <i>81.42</i> %)	501
SKCA-BR	Skin	Melanoma		48 / 66 (72.73%)	81
THCA-US	Head and neck	Head and Neck cancer	Thyroid carcinoma	238 / 400 (59.50%)	5
THCA-SA	Head and neck	Thyroid cancer	Papillary thyroid carcinoma	8 / 15 <i>(53.33</i> %)	2
ESAD-UK	Esophagus	Esophageal cancer	Esophageal adenocarcinoma	58 / 119 (48.74%)	93
SKCM-US	Skin	Skin cancer	Cutaneous melanoma	148 / 33 <mark>5 (44.18%)</mark>	22
LIRI-JP	Liver	Liver cancer	Hepatocellular carcinoma (Virus associated)	83 / 260 (31.92%)	131
OV-AU	Ovary	Ovarian cancer	Serous cystadenocarcinoma	29 / 93 ( <mark>31.18%</mark> )	46
PACA-CA	Pancreas	Pancreatic cancer	Ductal adenocarcinoma	55 / 204 (26.96%)	75
MALY-DE	Blood	Malignant Lymphoma	Germinal center B-cell derived lymphomas	10 / 44 (22. <mark>73%</mark> )	19
PRAD-UK	Prostate	Prostate cancer	Adenocarcinoma	21 / 108 (19.44%)	21
RECA-EU	Kidney	Renal cancer	Renal cell carcinoma (Focus on but not limited to clear cell subtype)	18 / 95 (18.9 <mark>5%)</mark>	23
COAD-US	Colorectal	Colon cancer	Adenocarcinoma	33 / 216 (15.28%)	11
LINC-JP	Liver	Liver cancer	Hepatocellular carcinoma (Virus associated)	30 / 244 (12.30%)	34

![](_page_45_Picture_7.jpeg)

### Cancer Distribution

1,144 DONORS AFFECTED BY 1,244 MUTATIONS ACROSS 43 PROJECTS

![](_page_46_Figure_3.jpeg)

## More detailed information

#### Showing 43 projects

Project	Site	Tumour Type	Tumour Subtype	# Donors affected •	# Mutations
MELA-AU	Skin	Skin cancer	Melanoma	149 / 183 (81.42%)	501
SKCA-BR	Skin	Melanoma		48 / 66 (72.73%)	81
THCA-US	Head and neck	Head and Neck cancer	Thyroid carcinoma	238 / 400 (59.50%)	5
THCA-SA	Head and neck	Thyroid cancer	Papillary thyroid carcinoma	8 / 15 <i>(53.33%</i> )	2
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COAD-US	Colorectal	Colon cancer	Adenocarcinoma	33 / 216 (15.28%)	11
LINC-JP	Liver	Liver cancer	Hepatocellular carcinoma (Virus associated)	30 / 244 (12.30%)	34

![](_page_46_Picture_7.jpeg)

OPEN IN ADVANCED SEARCH

### Cancer Distribution

1,144 DONORS AFFECTED BY 1,244 MUTATIONS ACROSS 43 PROJECTS

![](_page_47_Figure_3.jpeg)

OPEN IN ADVANCED SEARCH

### Click for more detail on the mutations

#### Showing 43 projects

Project	Site	Tumour Type	Tumour Subtype	# Donors affected •	# Mutations
MELA-AU	Skin	Skin cancer	Melanoma	149 / 183 (81.42%)	501
SKCA-BR	Skin	Melanoma		48 / 66 (72.73%)	81
THCA-US	Head and neck	Head and Neck cancer	Thyroid carcinoma	238 / 400 (59.50%)	5
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COAD-US	Colorectal	Colon cancer	Adenocarcinoma	33 / 216 <i>(15.28%</i> )	11
LINC-JP	Liver	Liver cancer	Hepatocellular carcinoma (Virus associated)	30 / 244 (12.30%)	34

![](_page_47_Picture_8.jpeg)

### Hover over the section of the graph to see what region it represents

![](_page_48_Figure_1.jpeg)

![](_page_48_Picture_2.jpeg)

## **Advanced Search**

Find out which cancers commonly have BRAF missense mutations

![](_page_49_Figure_2.jpeg)

![](_page_49_Picture_3.jpeg)

## **Advanced Search**

Find out which cancers commonly have BRAF missense mutations

![](_page_50_Figure_2.jpeg)

![](_page_50_Picture_3.jpeg)

## Advanced Search

### Find out which cancers commonly have BRAF missense mutations

![](_page_51_Figure_2.jpeg)

![](_page_51_Figure_3.jpeg)

Most common cancers with BRAF missense mutations are thyroid cancer and melanoma.

![](_page_51_Picture_5.jpeg)

## Limitations of data portal

- The data portal is mutation centric
  - i.e. All queries are related to retrieving tumours/samples with particular mutations in a particular gene
- If you just want expression/methylation data for a particular gene you still have to download the data

![](_page_52_Picture_4.jpeg)

![](_page_53_Picture_0.jpeg)

![](_page_53_Picture_1.jpeg)

### Downloading data from ICGC

![](_page_54_Figure_1.jpeg)

![](_page_54_Picture_2.jpeg)

Note: go back to Advance search on home page

### Downloading data from ICGC

![](_page_55_Figure_1.jpeg)

![](_page_55_Picture_2.jpeg)

### Downloading data from ICGC

![](_page_56_Figure_1.jpeg)

7

![](_page_56_Picture_2.jpeg)

![](_page_57_Picture_0.jpeg)

DATA REPOSITORIES

## Click through filters to choose what data you want

![](_page_57_Figure_3.jpeg)

Files Donors												
Eile			121,167 Files		2 11,	371 Donors	())	1.26 PB				
Enter File ID, Name or Ob	ject ID	Show	ving <b>1</b> - <b>25</b> of	<b>121,167</b> files	Then dov	wnload	the d	ata you s	selected	ł	🖺 SAVE DON	OR SE
<ul> <li>Repository</li> </ul>			File ID 🔻	Donor 👙	Repository	Project 🌲	Study	Data Type 🌲	Strategy 👙	Format	Size	<u>laid</u>
🗖 🛆 AWS - Virginia	14,897		▲ FI99998	DO15366	CGHub	HNSC-US		Aligned Reads	RNA-Seq	BAM	6.89 GB	
Collaboratory	8,762		▲ FI99996	DO14274	CGHub	HNSC-US		Aligned Reads	RNA-Seq	BAM	3.52 GB	
PCAWG - Barcelona	4,820		🔒 FI99994	D014462	CGHub	HNSC-US		Aligned Reads	miRNA-Seq	BAM	97.27 MB	
PCAWG - Chicago (IC	5,038		▲ FI99992	DO14169	CGHub	HNSC-US		Aligned Reads	miRNA-Seq	BAM	221.17 MB	
PCAWG - Chicago (T	12,968		A F199990	DO14158	CGHub	HNSC-US		Aligned Reads	miRNA-Seq	BAM	435.70 MB	
- Data Tura			▲ FI99988	DO16061	CGHub	HNSC-US		Aligned Reads	miRNA-Seq	BAM	192.24 MB	
• Data Type			▲ FI99986	DO14686	CGHub	HNSC-US		Aligned Reads	WGS	BAM	183.91 GB	
Aligned Reads	76,380		▲ FI99984	DO14408	CGHub	HNSC-US		Aligned Reads	miRNA-Seq	BAM	187.34 MB	
Clinical	9,491		▲ FI99982	DO14286	CGHub	HNSC-US		Aligned Reads	RNA-Seq	BAM	7.27 GB	
StSM	7,890		▲ FI99980	DO14246	CGHub	HNSC-US		Aligned Reads	miRNA-Seq	BAM	385.00 MB	
SGV	5,288		▲ FI9998	DO217962	PCAWG - Heidelberg	BRCA-EU	PCAWE	CNSM	WGS	VCF	1.83 KB	
	▼ 3 more		▲ FI99978	DO14886	CGHub	HNSC-US		Aligned Reads	RNA-Seq	BAM	5.41 GB	
<ul> <li>Experimental Strate</li> </ul>	≘gy		▲ FI99976	D014214	CGHub	HNSC-US		Aligned Reads	RNA-Seq	BAM	6.69 GB	
WGS	44,253		▲ FI99974	DO14218	CGHub	HNSC-US		Aligned Reads	miRNA-Seq	BAM	192.05 MB	

The advantage of ICGC is that data for all samples is in a single file so it is easier to work with in Excel (if file is small) or Galaxy (if file is big).

![](_page_57_Picture_6.jpeg)

### COSMIC database

### http://cancer.sanger.ac.uk/cosmic

![](_page_58_Figure_2.jpeg)

![](_page_58_Picture_3.jpeg)

### Cancer Gene Census

<b>E</b>		MIC mutations in d	cancer										
Home 🔻	Resources <b>v</b>	Curation	▼ Tools ▼	Data 🔻	News <b>v</b>	Help 🔻	About <b>v</b> Se	arch COSMIC					Login 🕚
Census	Breakdown A	bbreviations											
The cance <u>Cancer</u> 岱 a	r Gene Census i and <u>supplement</u>	s an ongoing al analysis int	effort to catalogi formation related	ue those ge d to the pap	nes for which per is also ava	mutations ha ilable.	ve been causally ii	mplicated in cancer. The o	original census a	nd analysis	was published i	n <u>Nature Re</u>	<u>views</u>
The census and lympho and 10% sł	is not static but r mas. Currently, m now both somatic	ather is updated nore than 1% o and germline m	d regularly/as need f all human genes nutations.	led. In partic are implicate	ular we are gra ed via mutation	teful to Felix Mit in cancer. Of th	elman and his collea ese, approximately 9	gues in providing information 0% have somatic mutations	on more genes in in cancer, 20% be	volved in unc ar germline n	ommon transloca nutations that pre	tions in leuka dispose to ca	emias ncer
Show 10	<ul> <li>entries</li> </ul>								Export: CSV	/ TSV Sear	ch:		
Gene Symbo	Name	Entrez GeneId 🝦	Genome Location 🍦	Chr Band 🌲	Somatic ♦	Germline ♦	Tumour Types(Somatic	Tumour )	Cancer Syndrome 🍦	Tissue Type 🍦	Molecular Genetics 🝦	Role in Cancer 🍦	4
ABI1	abl- interactor 1	<u>10006</u> 岱	10:26748570- 26860863 <i>e</i> !	10p11.2	yes		AML			L	Dom	TSG	т
<u>ABL1</u>	v-abl Abelson murine leukemia viral oncogene homolog 1	<u>25</u> සි	9:130835447- 130885683 Joi e!	9q34.1	yes		CML; ALL; T-ALL			L	Dom	oncogene	T;
<u>ABL2</u>	c-abl oncogene 2; non- receptor tyrosine kinase	<u>27</u> 샵	1:179107718- 179143044 Joine et	1q24- q25	yes		AML			L	Dom	oncogene	т
ACKR3	atypical chemokine receptor 3	<u>57007</u> 🖗	<b>[6<sup>7</sup> e!</b> 2:-	2q37.3	yes		lipoma			М	Dom	oncogene	т
ACSL3	acyl-CoA synthetase long-chain family member 3	<u>2181</u> &	2:222908773- 222941654 Join e!	2q36	yes		prostate			E	Dom		т

![](_page_59_Picture_2.jpeg)

## Summary

- There are global cancer genome sequencing projects with publically available data
- TCGA data can downloaded or easily viewed through cBioPortal
- ICGC data can be downloaded or viewed from the user interface
- COSMIC database allows you to easily select cancer-associated genes

![](_page_60_Picture_5.jpeg)

## Exercises

- Download patient clinical annotations for AML (TCGA dataset) using GDC data portal and then using the ICGC data portal.
- 2. Using the ICGC data portal:
  - a. What is the cancer with most frequent RUNX1 mutations?
  - b. Which cancer has the most RUNX1 frameshift mutations?
- 3. Using cBioPortal and COSMIC:
  - a. Do kidney renal papillary cell carcinoma patients with BAP1 mutations have worse survival than those without?
  - b. Is this gene listed in the Cancer Gene Census and, if so, what is its role in cancer?

![](_page_61_Picture_8.jpeg)