



# Targeted capture and resequencing of whole exomes in breast cancer

**Patrick Tarpey**  
Cancer Genome Project



# Breast Cancer

Breast cancer is the most common cancer in the UK

In 2007 in the UK almost 45,700 women were diagnosed with breast cancer (125 women/day)

8 in 10 breast cancers are diagnosed in women aged 50 and over.

Estimated risk at birth up to and including:	UK (2001–2005)
age 24	1 in 15,300
age 29	1 in 2,300
age 39	1 in 200
age 49	1 in 52
age 59	1 in 22
age 69	1 in 14
age 79	1 in 10
age 84	1 in 9
Lifetime risk	1 in 9

# Breast Cancer

Almost 2 out of 3 women with breast cancer now survive their disease beyond 20 years

In the 1970s around 5 out of 10 breast cancer patients survived the disease beyond five years. Now it's 8 out of 10

9 out of 10 of women diagnosed with stage I breast cancer survive the disease beyond five years.

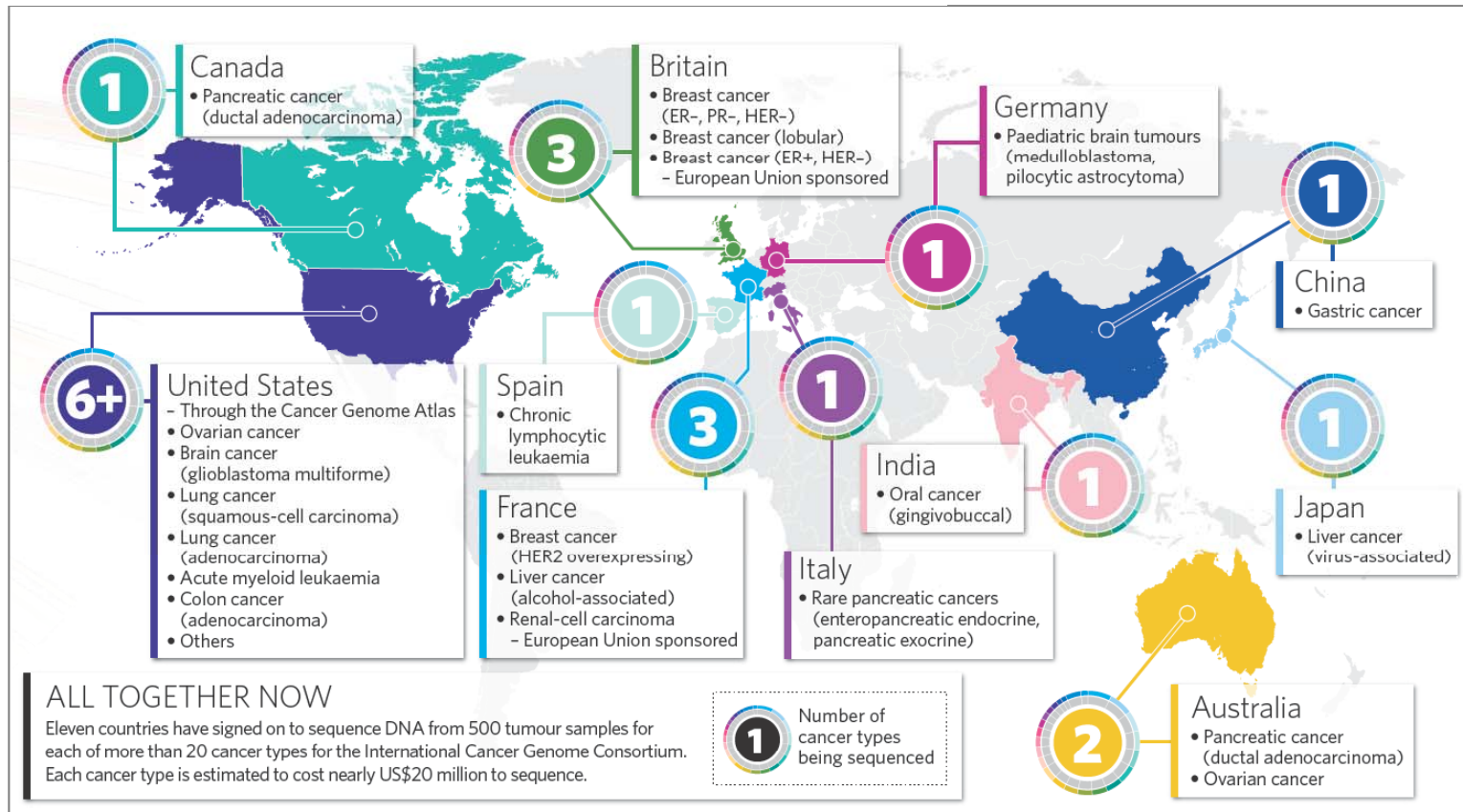
This drops to around 1 out of 10 diagnosed with stage IV

# Breast Cancer

## Breast cancer subtypes

- ER-, HER2-, PR- (triple negative)
- ER-, HER2+ tumors
- ER+, HER2+ tumors
- **ER+, HER2-, PR+ tumors; ductal-type**
- **ER+, HER2-, PR- tumors; ductal-type**
- Invasive lobular carcinoma
- “Rare” histological special types

# International Cancer Genome Consortium (ICGC)



# International Cancer Genome Consortium (ICGC)

## Variants under investigation

**base substitutions**

**insertions, deletions**

copy number changes

Translocations

other chromosomal rearrangements

# Intragenic Variants

## Sanger sequencing

## Candidate genes, small nos. of samples

BRIEF COMMUNICATIONS

nature genetics

### A screen of the complete protein kinase gene family identifies diverse patterns of somatic mutations in human breast cancer

Philip Stephens<sup>1</sup>, Sarah Edkins<sup>1</sup>, Helen Davies<sup>1</sup>, Chris Greenman<sup>1</sup>, Charles Cox<sup>1</sup>, Chris Hunter<sup>1</sup>, Graham Biggs<sup>1</sup>, Jon Teague<sup>1</sup>, Raffaella Smith<sup>1</sup>, Claire Stevens<sup>1</sup>, Sarah O'Meara<sup>1</sup>, Adrian Parker<sup>1</sup>, Patrick Tarpey<sup>1</sup>, Tim Aivi<sup>1</sup>, Andy Barthorpe<sup>1</sup>, Lisa Brackenbury<sup>1</sup>, Gemma Buck<sup>1</sup>, Adam Butler<sup>1</sup>, Jody Clements<sup>1</sup>, Jennifer Cole<sup>1</sup>, Ed Dicks<sup>1</sup>, Ken Edwards<sup>1</sup>, Simon Forbes<sup>1</sup>, Matthew Gorton<sup>1</sup>, Kristian Gray<sup>1</sup>, Kelly Halliday<sup>1</sup>, Rachel Harrison<sup>1</sup>, Katy Hills<sup>1</sup>, Jonathan Hinton<sup>1</sup>, David Jones<sup>1</sup>, Vivienne Kosmidou<sup>1</sup>, Ross Laman<sup>1</sup>, Richard Lugg<sup>1</sup>, Andrew Menzies<sup>1</sup>, Janet Perry<sup>1</sup>, Robert Patey<sup>1</sup>, Katrin Raine<sup>1</sup>, Rebecca Shepherd<sup>1</sup>, Alexandra Small<sup>1</sup>, Helen Solomon<sup>1</sup>, Yvonne Stephens<sup>1</sup>, Calli Tofts<sup>1</sup>, Jennifer Varian<sup>1</sup>, Anthony Webb<sup>1</sup>, Sofie West<sup>1</sup>, Sara Widaa<sup>1</sup>, Andrew Yates<sup>1</sup>, Francis Brasseur<sup>2</sup>, Colin S Cooper<sup>3</sup>, Adrienne M Flanagan<sup>4</sup>, Anthony Green<sup>5</sup>, Maggie Knowler<sup>6</sup>, Suet Y Leung<sup>7</sup>, Leonard H J Loosjans<sup>8</sup>, Bruce Malkowicz<sup>9</sup>, Marco A Pierotti<sup>10</sup>, Bin Teh<sup>11</sup>, Siu T Yuen<sup>12</sup>, Andrew G Nicholson<sup>13</sup>, Sunil Lakhani<sup>14</sup>, Douglas F Easton<sup>15</sup>, Barbara L Weber<sup>16</sup>, Michael R Stratton<sup>17</sup>, P Andrew Futreal<sup>18</sup> & Richard Wooster<sup>1</sup>

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We examined the coding sequence of 518 protein kinases, ~1.3 Mb of DNA per sample, in 25 breast cancers. In many tumors, we detected no somatic mutations. But a few had numerous somatic mutations with distinctive patterns indicative of either a mutator phenotype or a past exposure.

We detected 92 somatic mutations, 90 base substitutions and two in-frame deletions (The Catalogue of Somatic Mutations in Cancer; Supplementary Table 1 online) in the complete protein kinase gene family (Supplementary Table 2 online). Of these, 58 base substitutions caused missense amino acid changes, 12 caused translational termination codons, 6 were at conserved positions in splice sites and 14 were silent (synonymous) changes.

The somatic mutations were distributed unevenly among the breast cancers that we examined. Twelve primary breast cancers had no somatic mutations; two had a single mutation each and one had two mutations. The remaining primary breast cancer (PD0119, an invasive pleomorphic lobular cancer in an 84-year-old woman, which we found by immunohistochemistry to be estrogen receptor-positive and E-cadherin-, *ERBB2*- and *TP53*-negative; Supplementary Table 3 online) had 52 somatic mutations, all base substitutions. The mutations in this cancer had a distinctive pattern (Fig. 1). Mutations occurred with a high frequency at C/G base pairs (36%, 50 of 52), with many C/G→G/C transversions (44%, 22 of 50). Mutations occurred in a specific sequence context ( $P = 0.047$ ); specifically, at C/G base pairs, 94% (47 of 50) were 5' to a T/A base pair, compared with an expected frequency of 26% (Fig. 1b).

In contrast to the primary breast cancers, eight of the nine immortal breast cancer cell lines had at least one somatic mutation. The cell line with the largest number of somatic mutations, HCC2218 (derived from an invasive ductal carcinoma from a 38-year-old female, which was estrogen receptor-negative and *ERBB2*- and *TP53*-positive), had a mutational spectrum similar to that of PD0119 (Fig. 1a). All eleven of the somatic mutations detected in HCC2218 were at C/G base pairs, most were C/G→G/C transversions (56%, 6 of 11), and all arose at C/G base pairs 5' to T/A base pairs. The mutational spectra of HCC2218 and PD0119 differed from those of other cancers in the set ( $P = 0.000$  for heterogeneity) and from that of *TP53*-deficient from several hundred breast cancers (Fig. 1 and Supplementary Tables 4 and 5 online). The results indicate that a previously hidden diversity of mutational processes exists in breast cancer.

The high frequency and distinctive pattern of somatic mutations observed in PD0119 and HCC2218 are probably due to a mutator phenotype (e.g., due to a DNA-repair defect), although mutagenic exposure cannot be excluded. *BRCAl* and *BRCa2* have been implicated in DNA repair. We did not find a truncating mutation in *BRCAl* or *BRCa2* in either PD0119 or HCC2218, but we did find one in a breast cancer cell line (HCC1395) that does not seem to have their characteristic mutational features. Neither PD0119 nor HCC2218 shows microsatellite instability (Supplementary Methods online). Therefore, it is unlikely that abnormalities in *BRCAl*, *BRCa2* or mismatch-repair genes account for the mutational spectra observed in PD0119 and HCC2218. These mutational spectra are also not readily attributable to other known DNA-repair defects. Yeast mutants

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# Intragenic Variants

**Illumina exome sequencing**

**All genes, large nos. of samples (recurrence)**

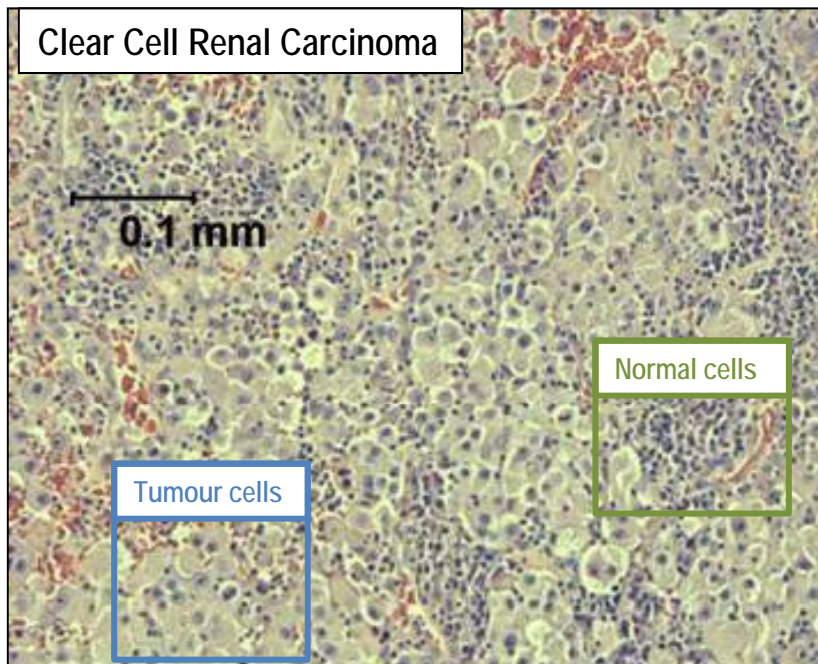


# Intragenic Variants

## Illumina exome sequencing

All genes, large nos. of samples

Higher sensitivity

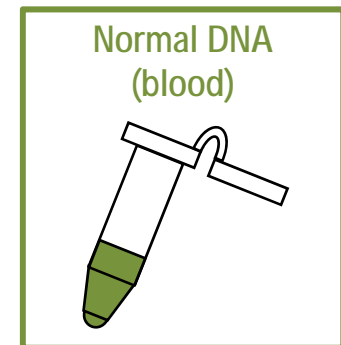
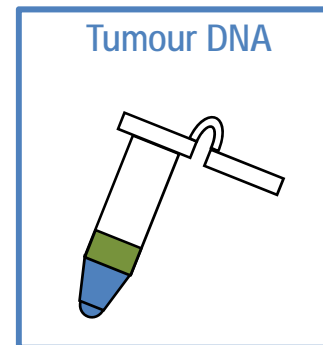
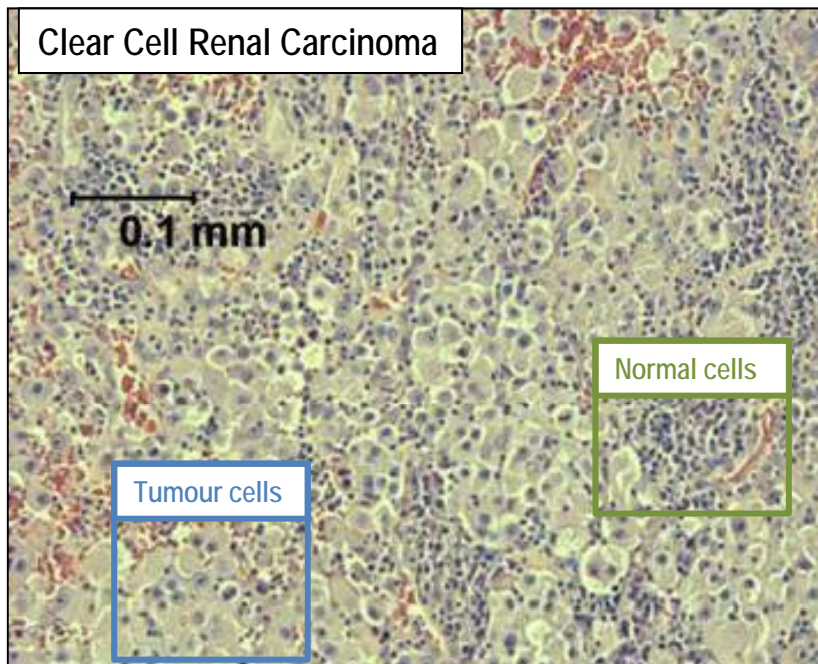


# Intragenic Variants

## Illumina exome sequencing

All genes, large nos. of samples

Higher sensitivity

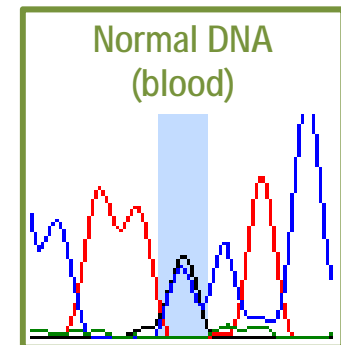
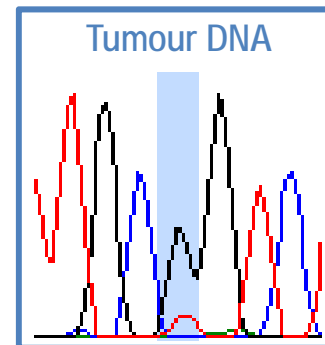
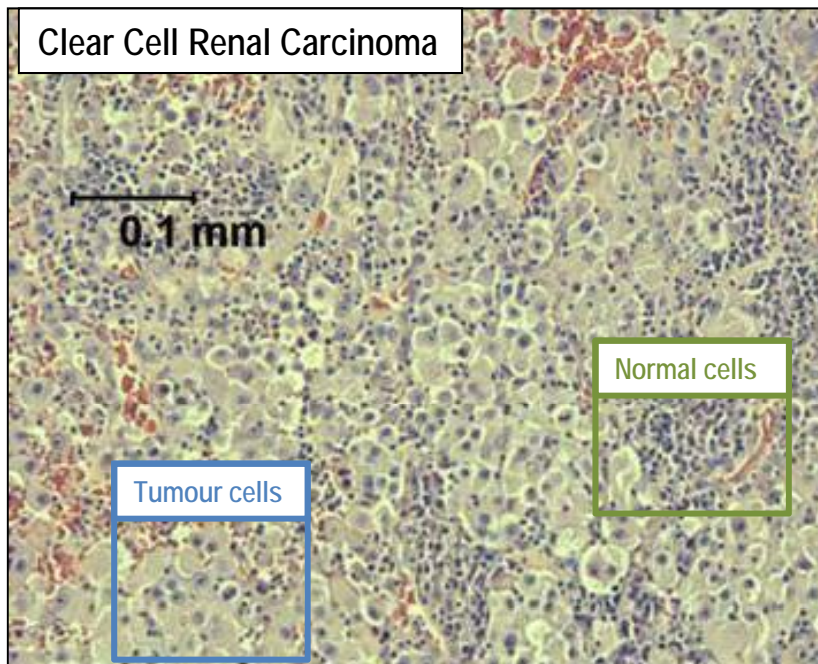


# Intragenic Variants

## Illumina exome sequencing

All genes, large nos. of samples

Higher sensitivity



# Intragenic Variants

## **Illumina exome sequencing**

All genes, large nos. of samples

Higher sensitivity

Acquire all variants simultaneously

# Samples screened

## **Sporadic breast cancer**

28 breast cancer primary tumours

3 breast cancer cell lines

# Samples screened

## **Sporadic breast cancer**

28 breast cancer primary tumours [SOMATIC]

3 breast cancer cell lines [SOMATIC]

# Samples screened

## **Sporadic breast cancer**

28 breast cancer primary tumours [SOMATIC] [GERMLINE]

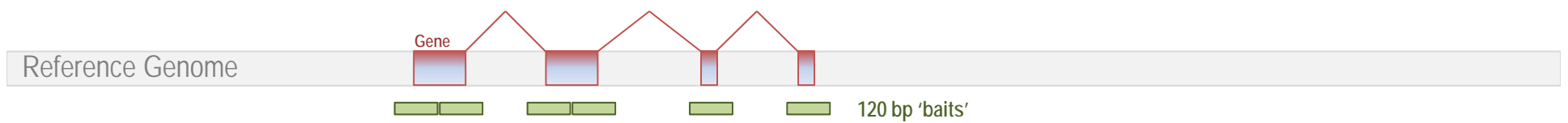
3 breast cancer cell lines [SOMATIC]

# Exome Resequencing





# Sanger SureSelect Exome



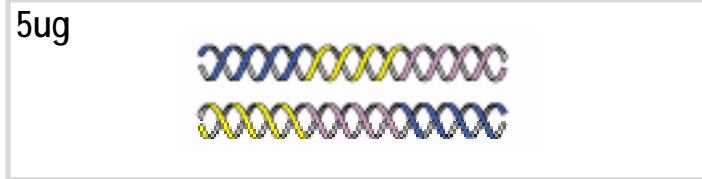
21,416 Protein Coding Genes

1664 miRNA's

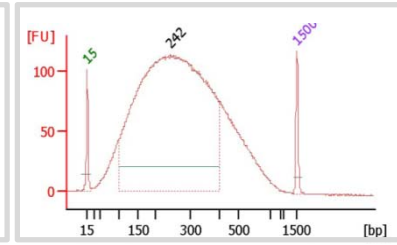
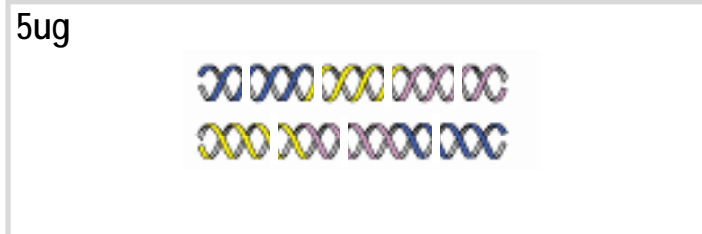
50.3 Mb target

# SureSelect Protocol

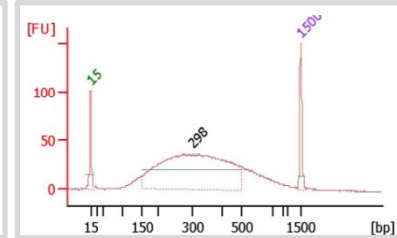
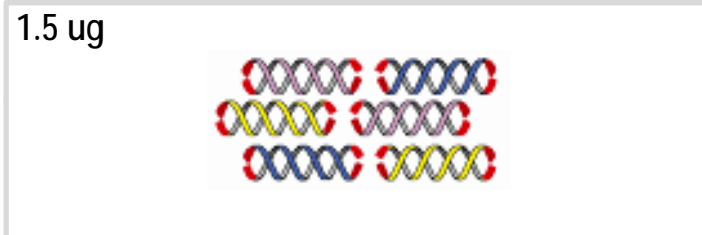
Genomic DNA



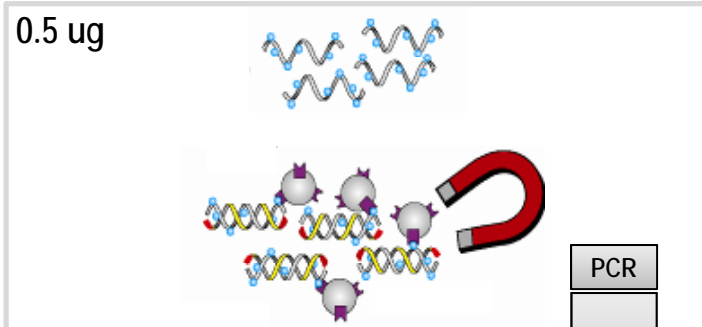
Fragment  
(Covaris)



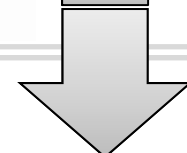
Ligate adapters  
(Library)



Hybridise

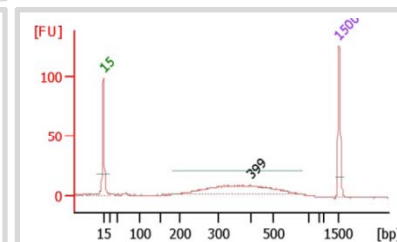
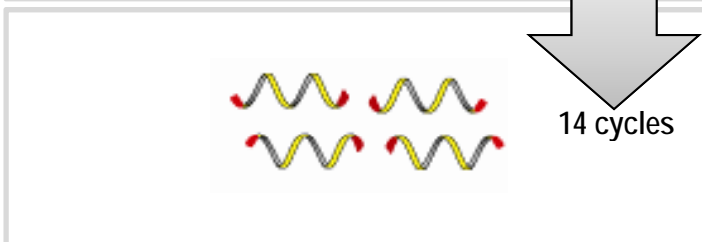


PCR

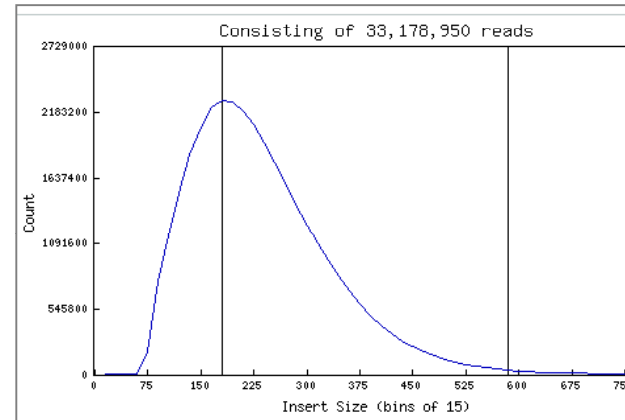


14 cycles

Elute and amplify

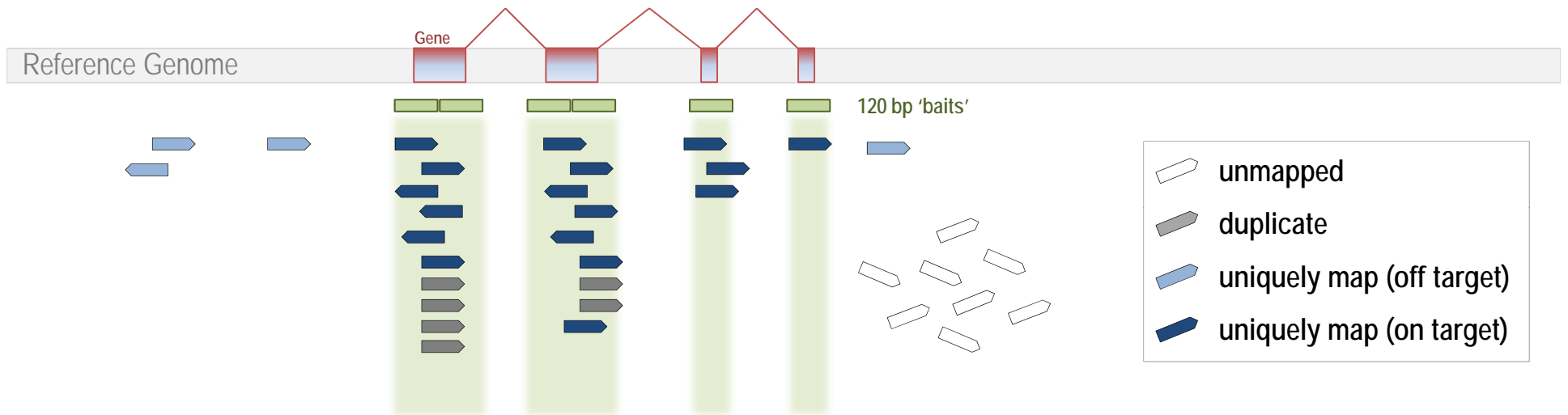


# Paired-end sequencing

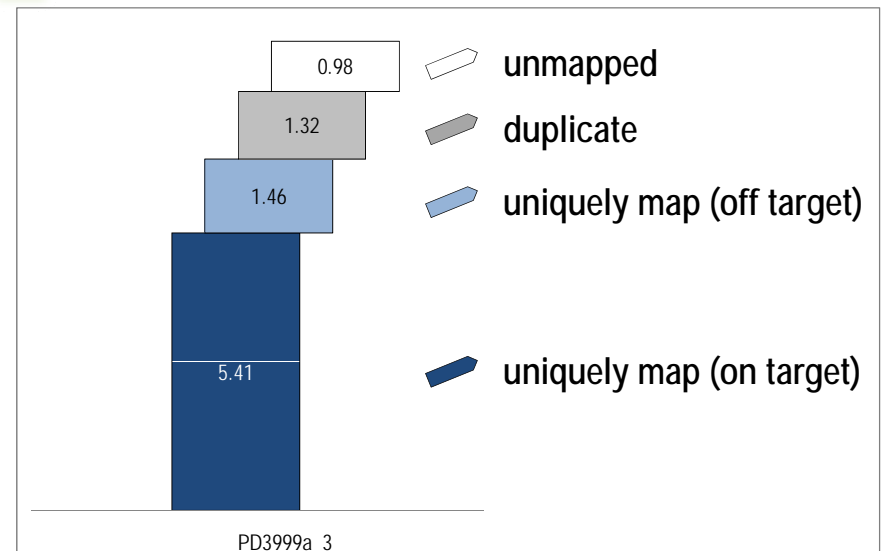
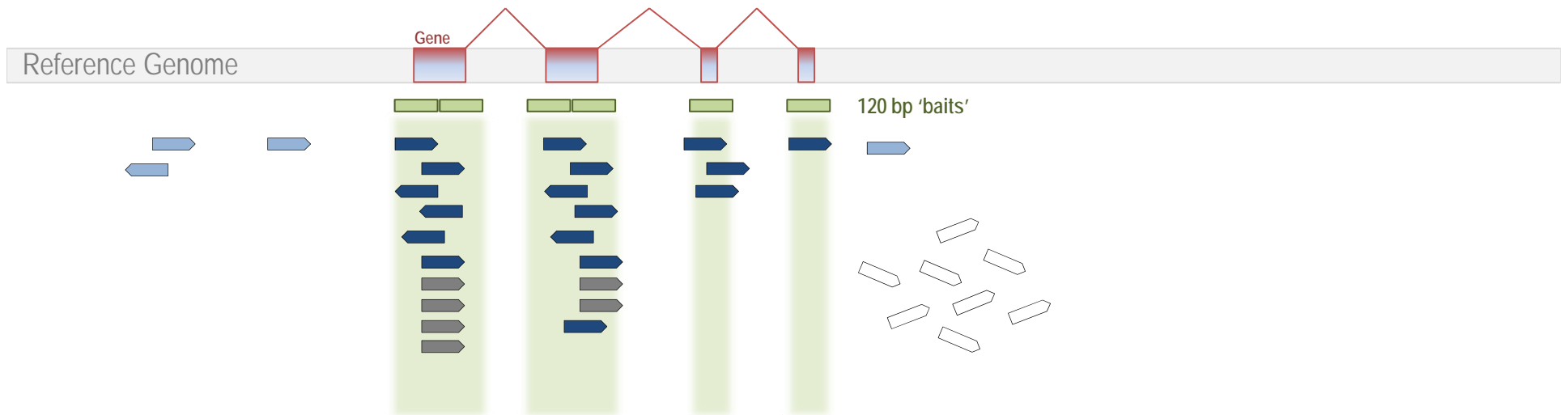


# Performance Metrics

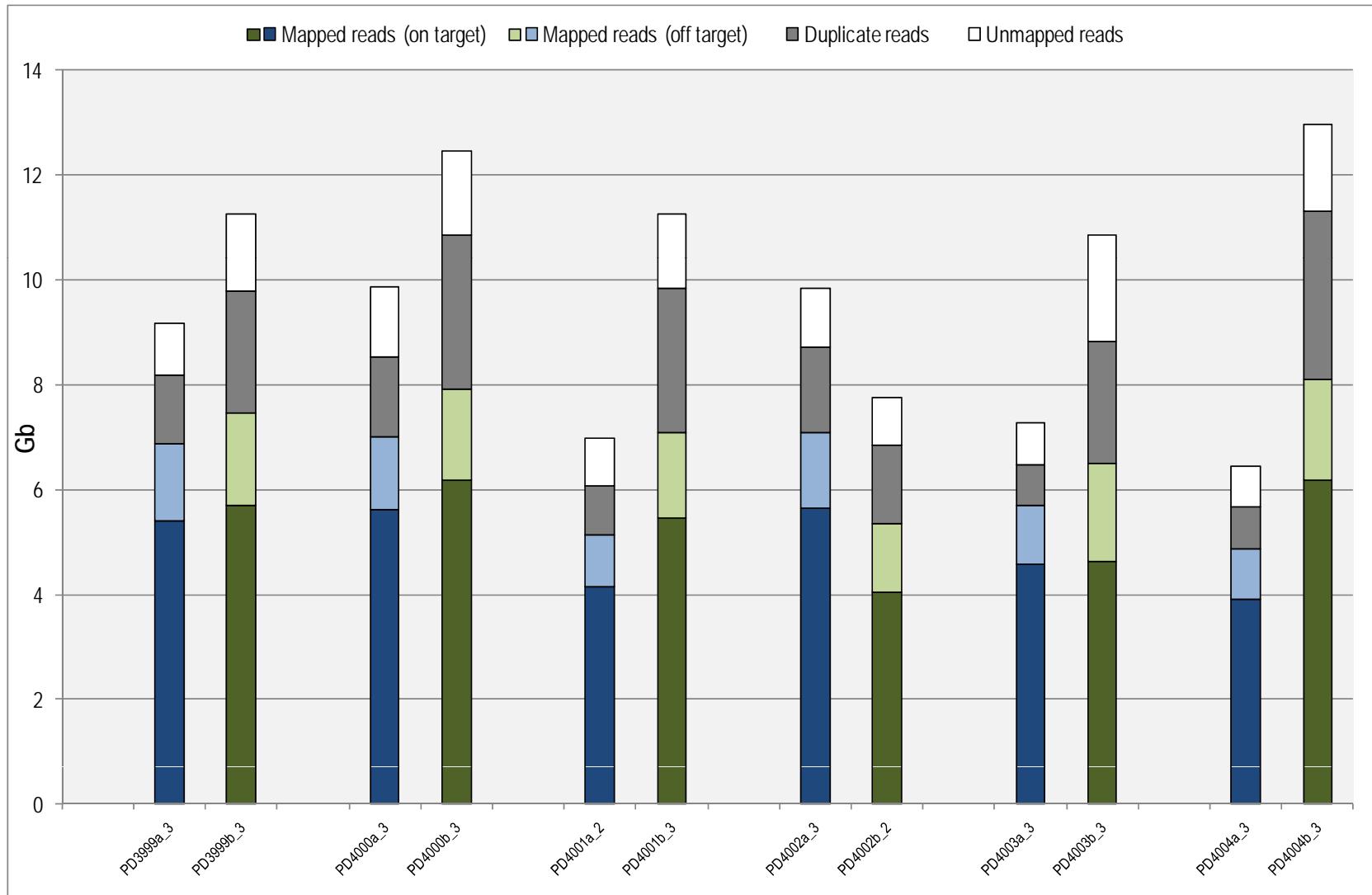
# Sanger SureSelect Exome



# Performance Metrics

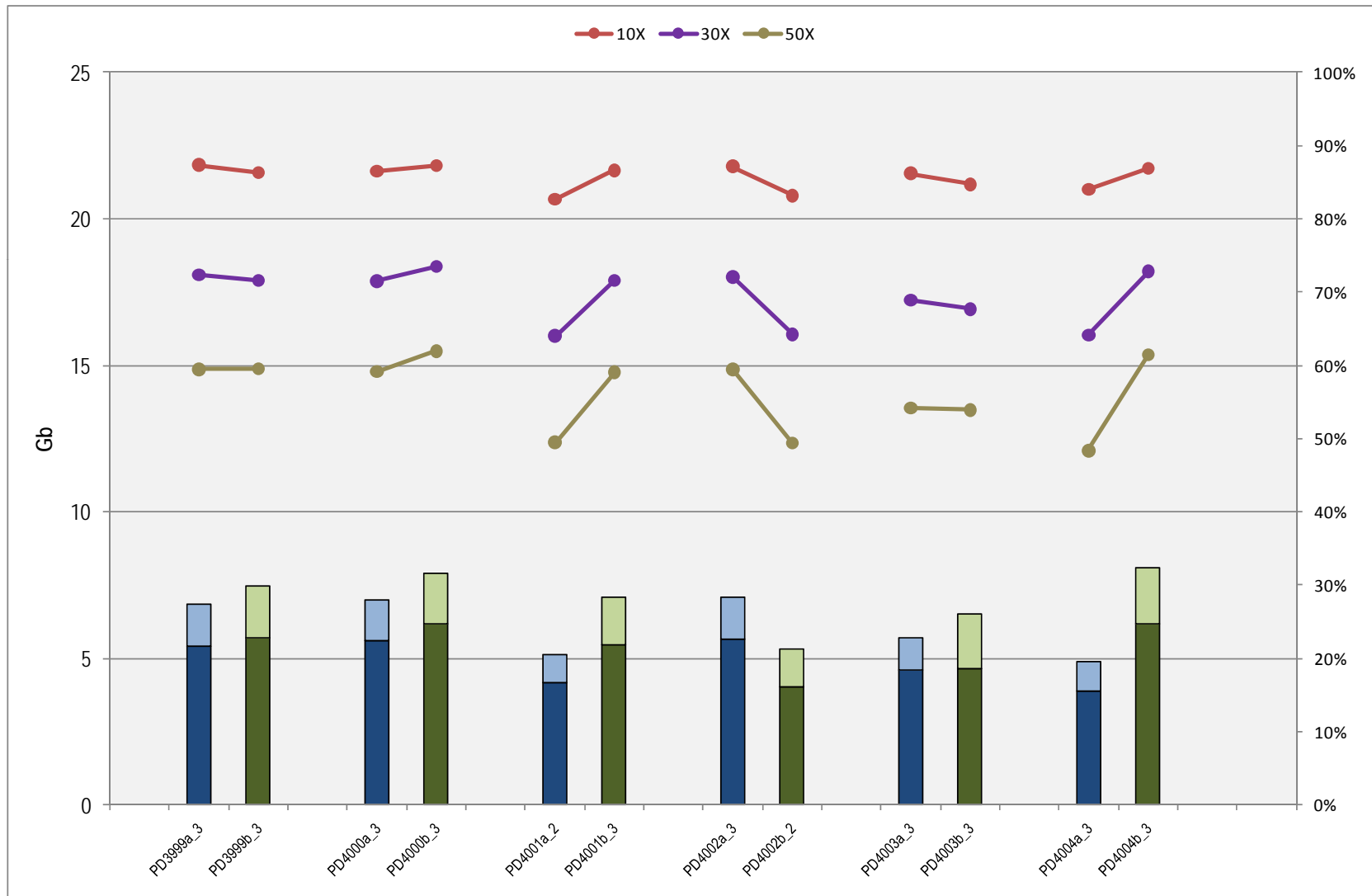


# Sequence Metrics

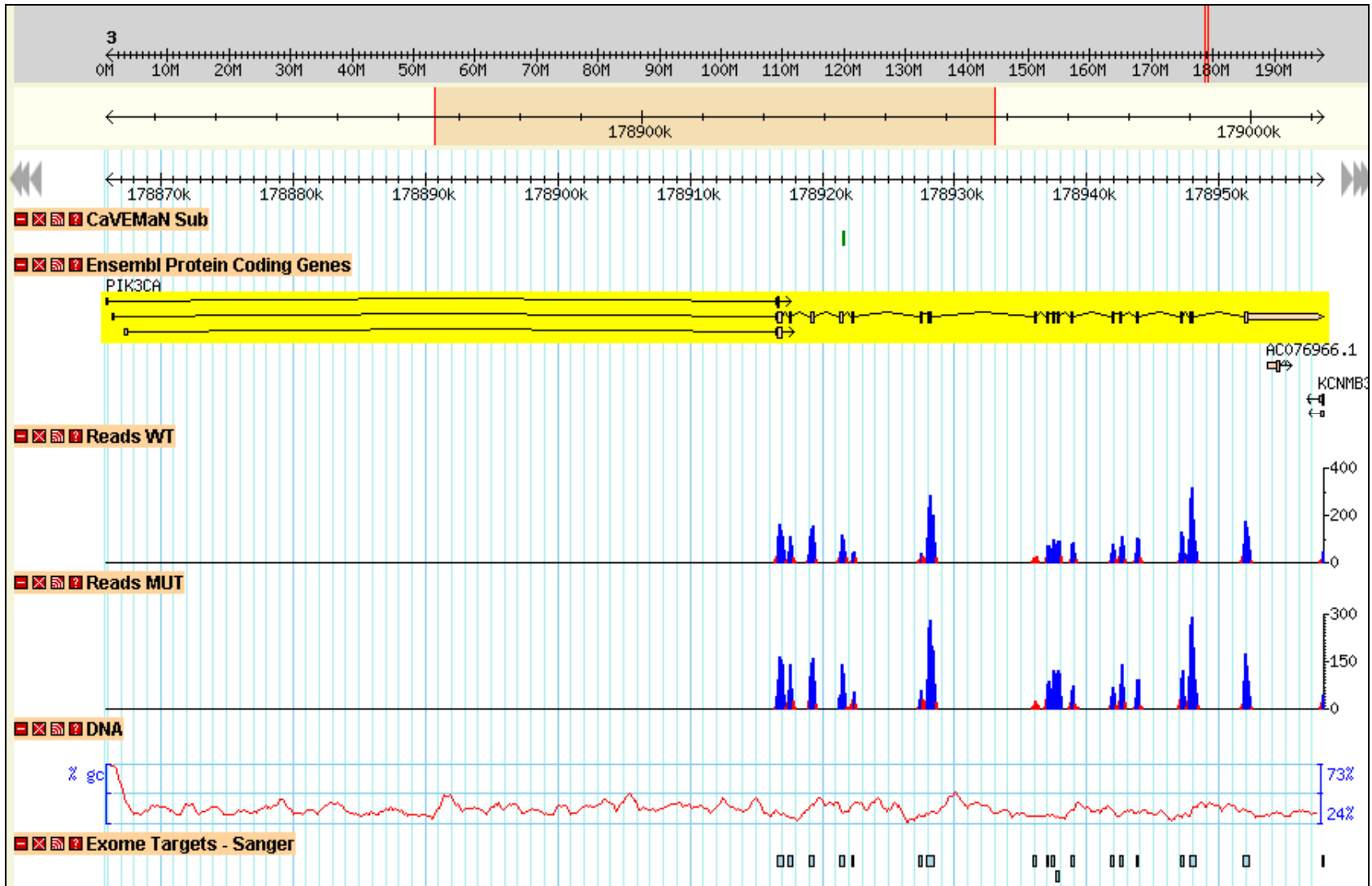




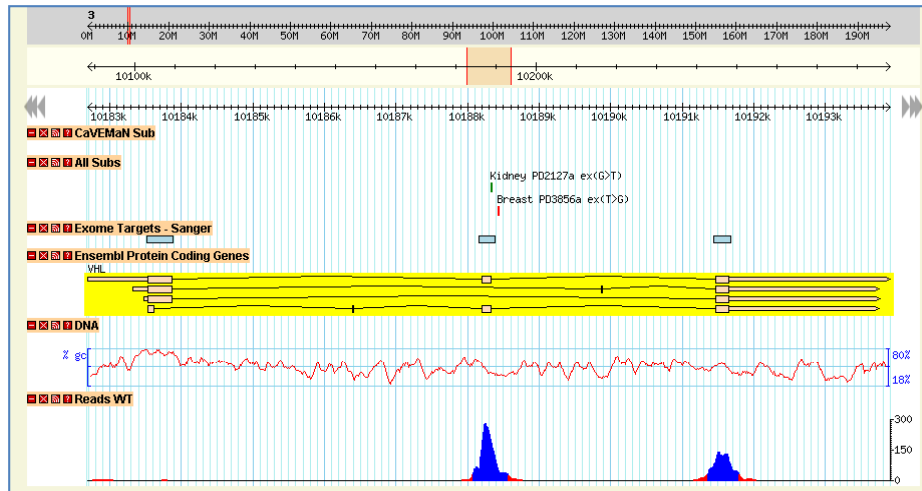
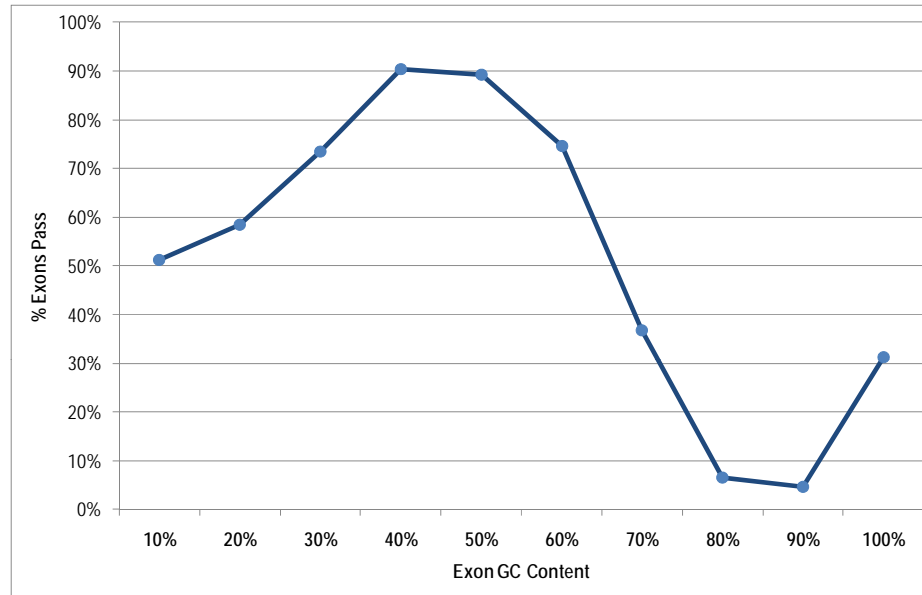
# Coverage Metrics



# Gbrowse:PIK3CA



# GC Effect



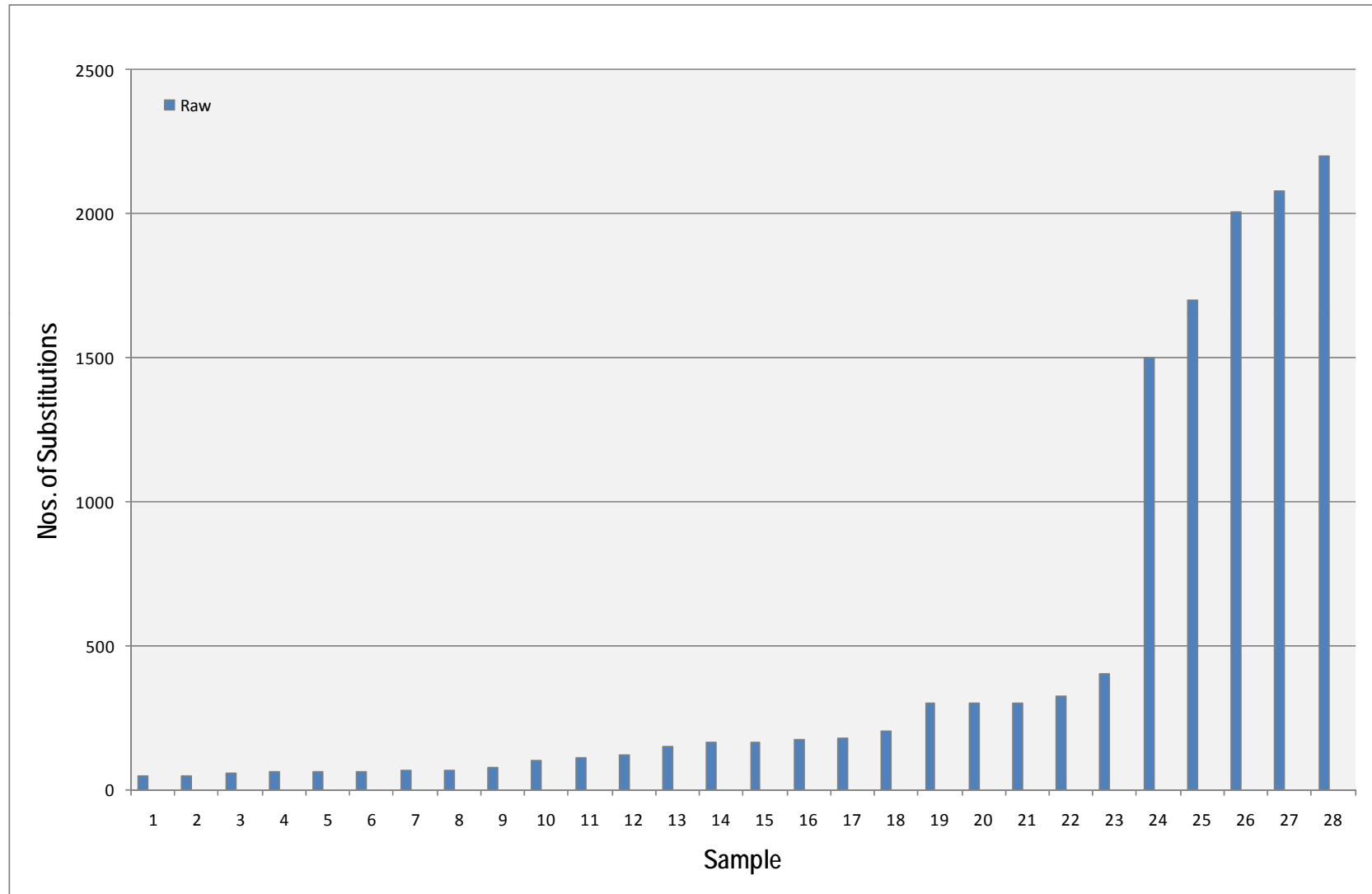
# Variant Detection

**Caveman: Substitutions**

**Pindel: Insetions/Deletions**

# Variant Detection: Specificity

# Caveman: Specificity



# Caveman: Specificity

CTTAGCGGTAGCCCCTTGGTTTCCGTGGCAACGGAAAATGGCGCGGGAGCGGTAGCCCCTTAAATTAGCGGTAGCCCCTTAAACTGCGGCGGGCATTAGCATAGCATGATAGCCCCT

TCCGTGGCAACGGAAAATGGCGCGGGAGCGGTAGCCCCTTAAATTAGCGG

GTGGCAACGGAAAATGGCGCGGGAGCGGTAGCCCCTTAAATTAGCGGTAG

GCAACGGAAAATGGCGCGGGAGCGGTAGCCCCTTAAATTAGCGGTAGCCC

CCTTGGTTTCCGTGGCAACGGAAAATGGCGCGGGAGCGGTAGCCCCTTAA

AAATGGCGCGGGAGCGGTAGCCCCTTAAATTAGCGGTAGCCCCTTAAACT

TCCGTGGCAACGGAAAATGGCGCGGGAGCGGTAGCCCCTTAAATTAGCG

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AAAATGGCGCGGGAGCGGTAGCCCCTTAAATTAGCGGTAGCCCCTTAAAC

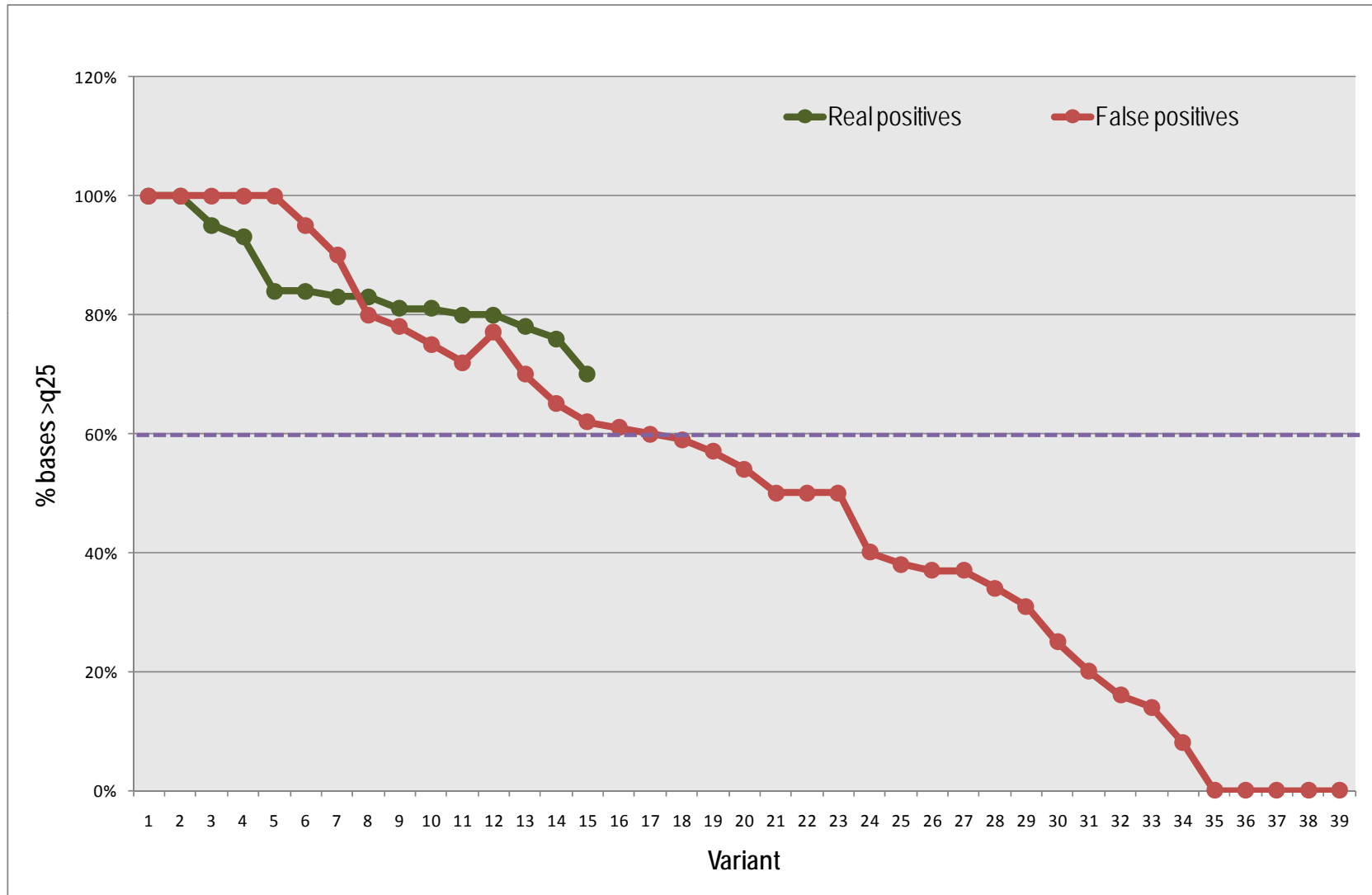
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GTAGCCCCTTGGTTTCCGTGGCAACGGAAAATGGCGCGGGAGCGGTAGCC

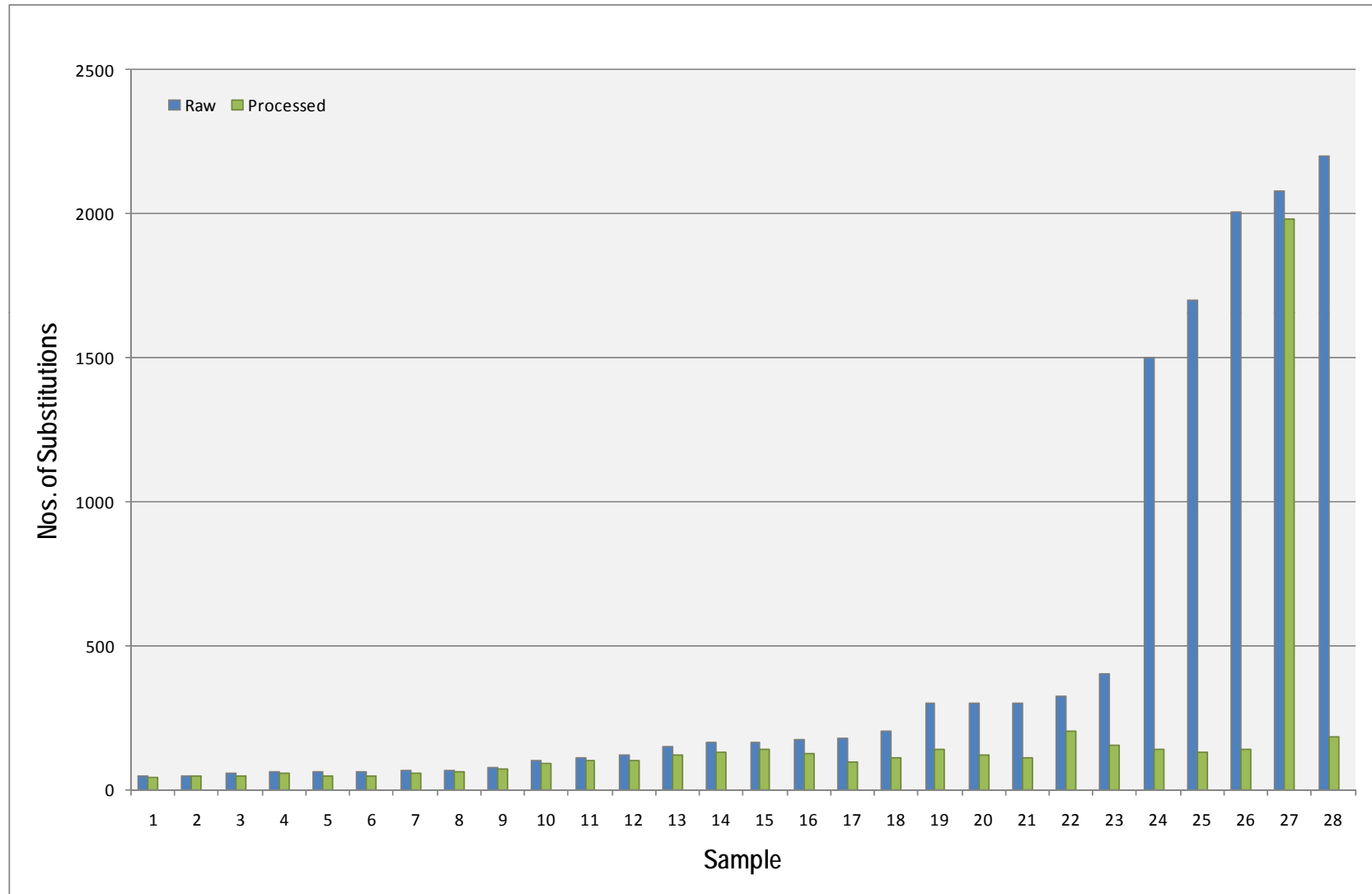
- Quality score of variant bases
- Position of variant bases within 76bp read
- Representation of variant bases on both strands

# Post-Processing: Base q Score

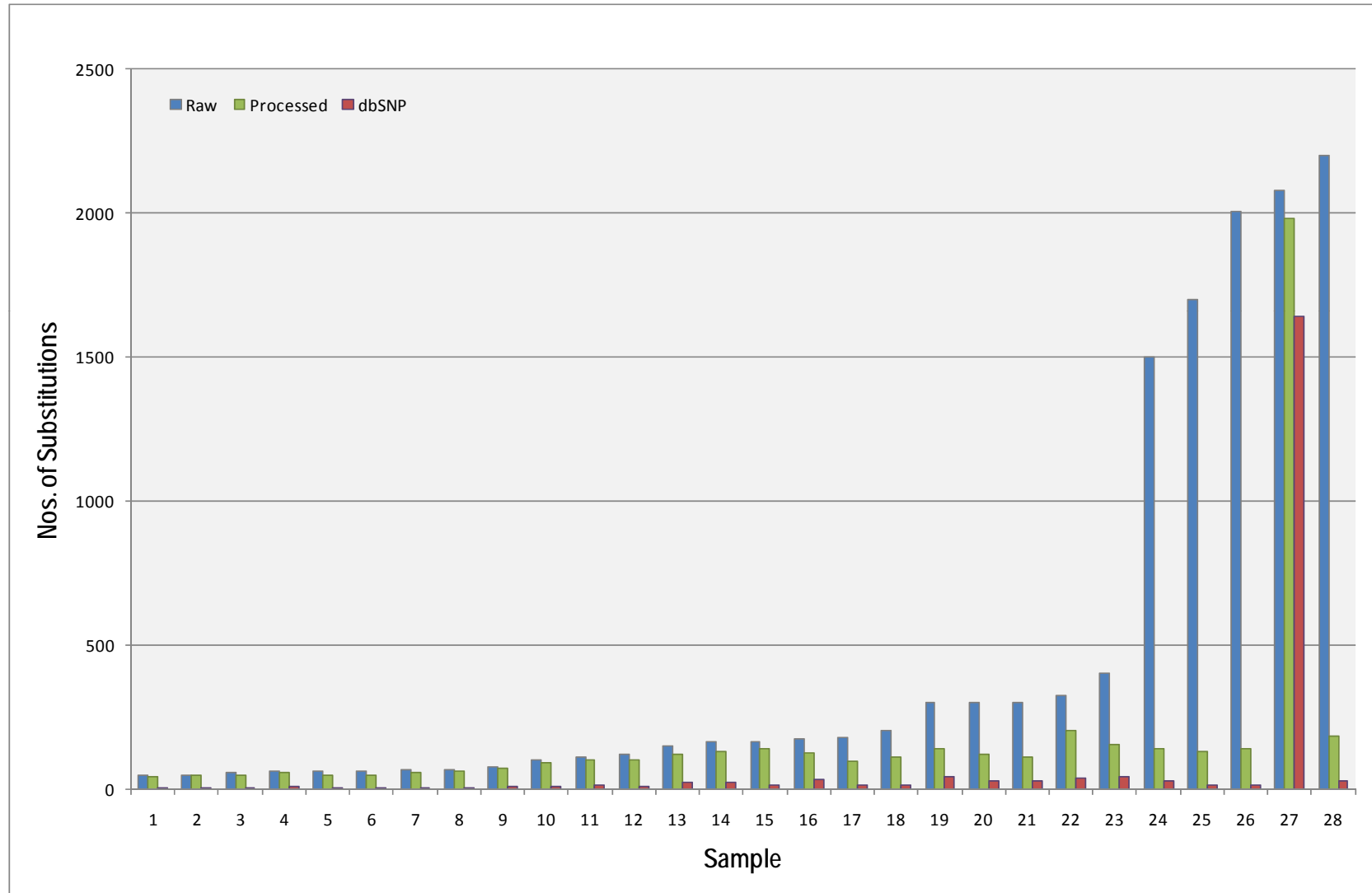




# Caveman: Specificity



# Caveman: Specificity

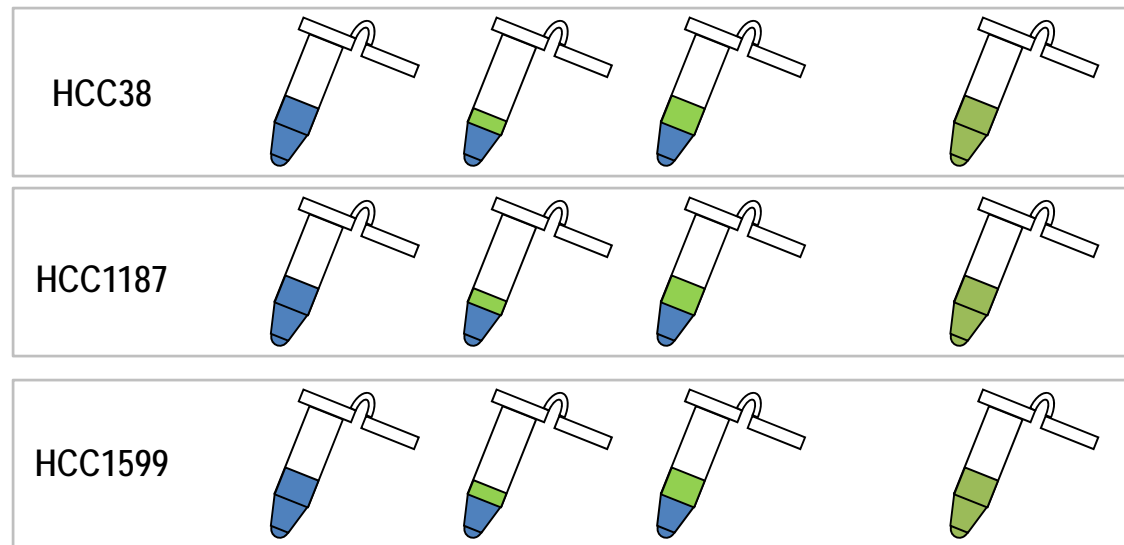


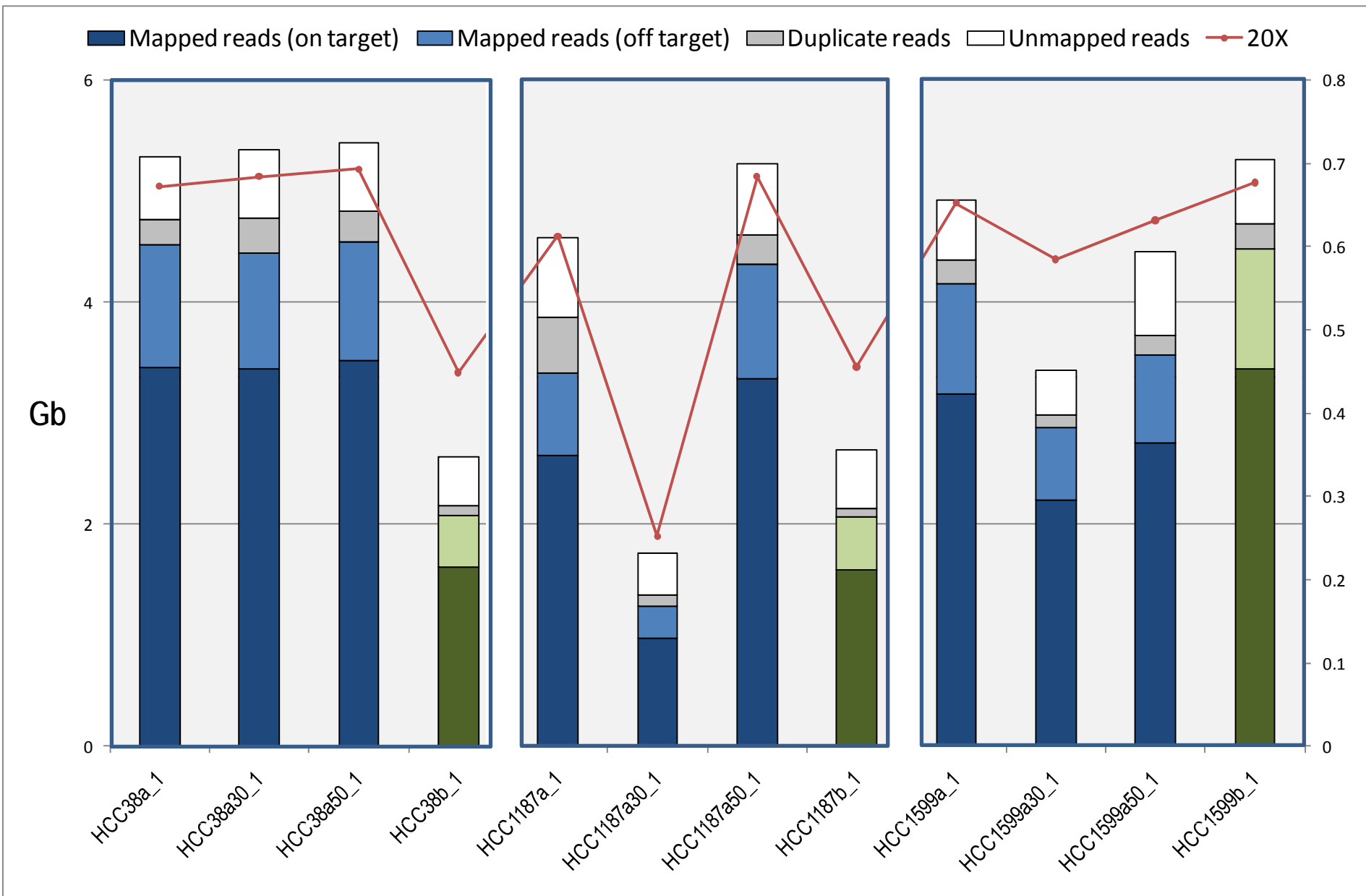
# Variant Detection: Sensitivity

## The Genomic Landscapes of Human Breast and Colorectal Cancers

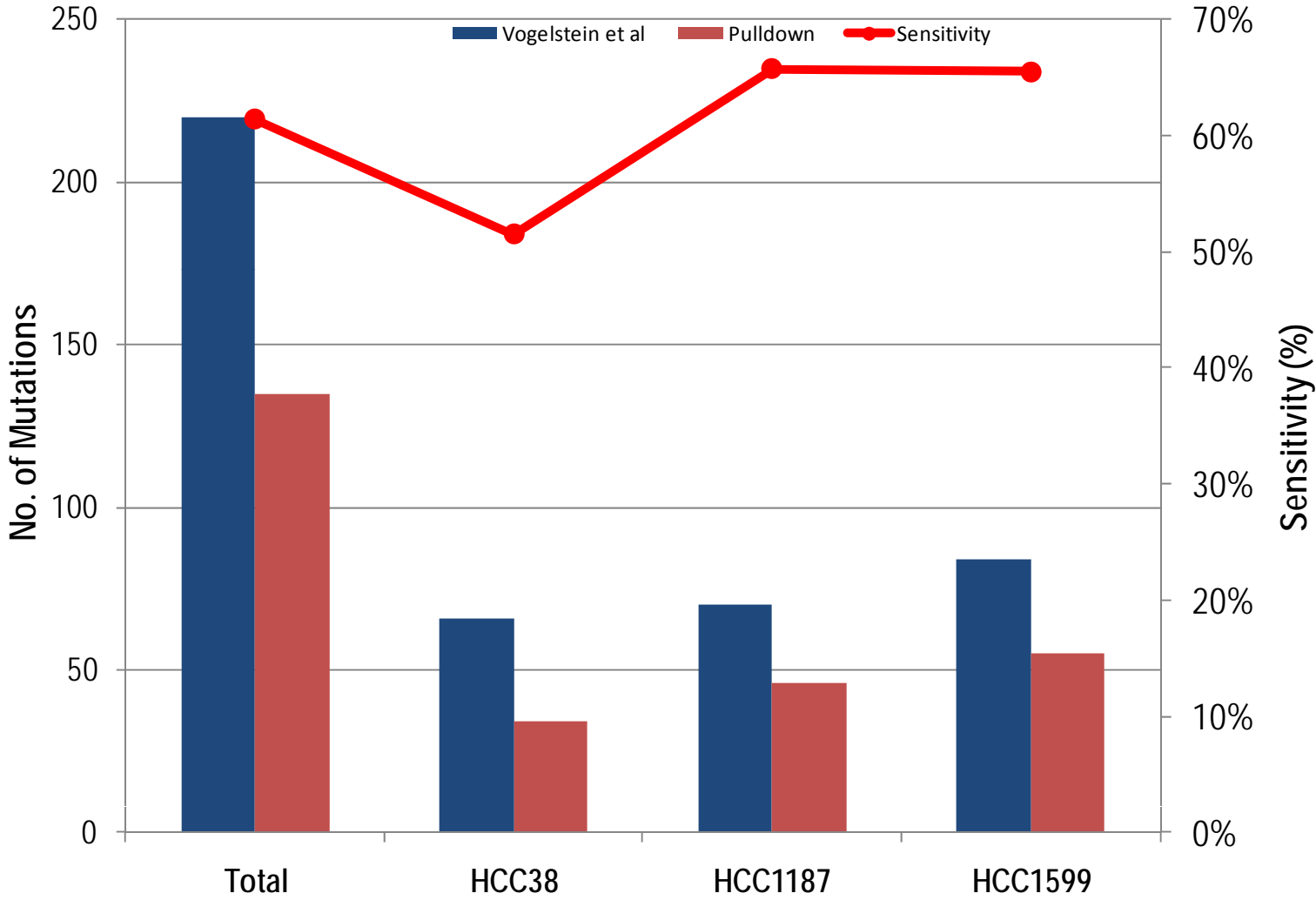
Laura D. Wood,<sup>1\*</sup> D. Williams Parsons,<sup>1\*</sup> Siân Jones,<sup>1\*</sup> Jimmy Lin,<sup>1\*</sup> Tobias Sjöblom,<sup>1\*†</sup>  
Rebecca J. Leary,<sup>1</sup> Dong Shen,<sup>1</sup> Simina M. Boca,<sup>1,2</sup> Thomas Barber,<sup>1,‡</sup> Janine Ptak,<sup>1</sup>  
Natalie Silliman,<sup>1</sup> Steve Szabo,<sup>1</sup> Zoltan Dezso,<sup>3</sup> Vadim Ustyansky,<sup>3</sup> Tatiana Nikolskaya,<sup>3,4</sup>  
Yuri Nikolsky,<sup>3</sup> Rachel Karchin,<sup>5</sup> Paul A. Wilson,<sup>5</sup> Joshua S. Kaminker,<sup>6</sup> Zemin Zhang,<sup>6</sup>  
Randal Croshaw,<sup>7</sup> Joseph Willis,<sup>8</sup> Dawn Dawson,<sup>8</sup> Michail Shipitsin,<sup>9</sup> James K. V. Willson,<sup>10</sup>  
Saraswati Sukumar,<sup>11</sup> Kornelia Polyak,<sup>9</sup> Ben Ho Park,<sup>11</sup> Charit L. Pethiyagoda,<sup>12</sup>  
P. V. Krishna Pant,<sup>12</sup> Dennis G. Ballinger,<sup>12</sup> Andrew B. Sparks,<sup>12,§</sup> James Hartigan,<sup>13</sup>  
Douglas R. Smith,<sup>13</sup> Erick Suh,<sup>13</sup> Nickolas Papadopoulos,<sup>1</sup> Phillip Buckhaults,<sup>7</sup> Sanford D. Markowitz,<sup>14</sup>  
Giovanni Parmigiani,<sup>1||</sup> Kenneth W. Kinzler,<sup>1||</sup> Victor E. Velculescu,<sup>1||</sup> Bert Vogelstein<sup>1||</sup>

■ Tumour  
■ Normal

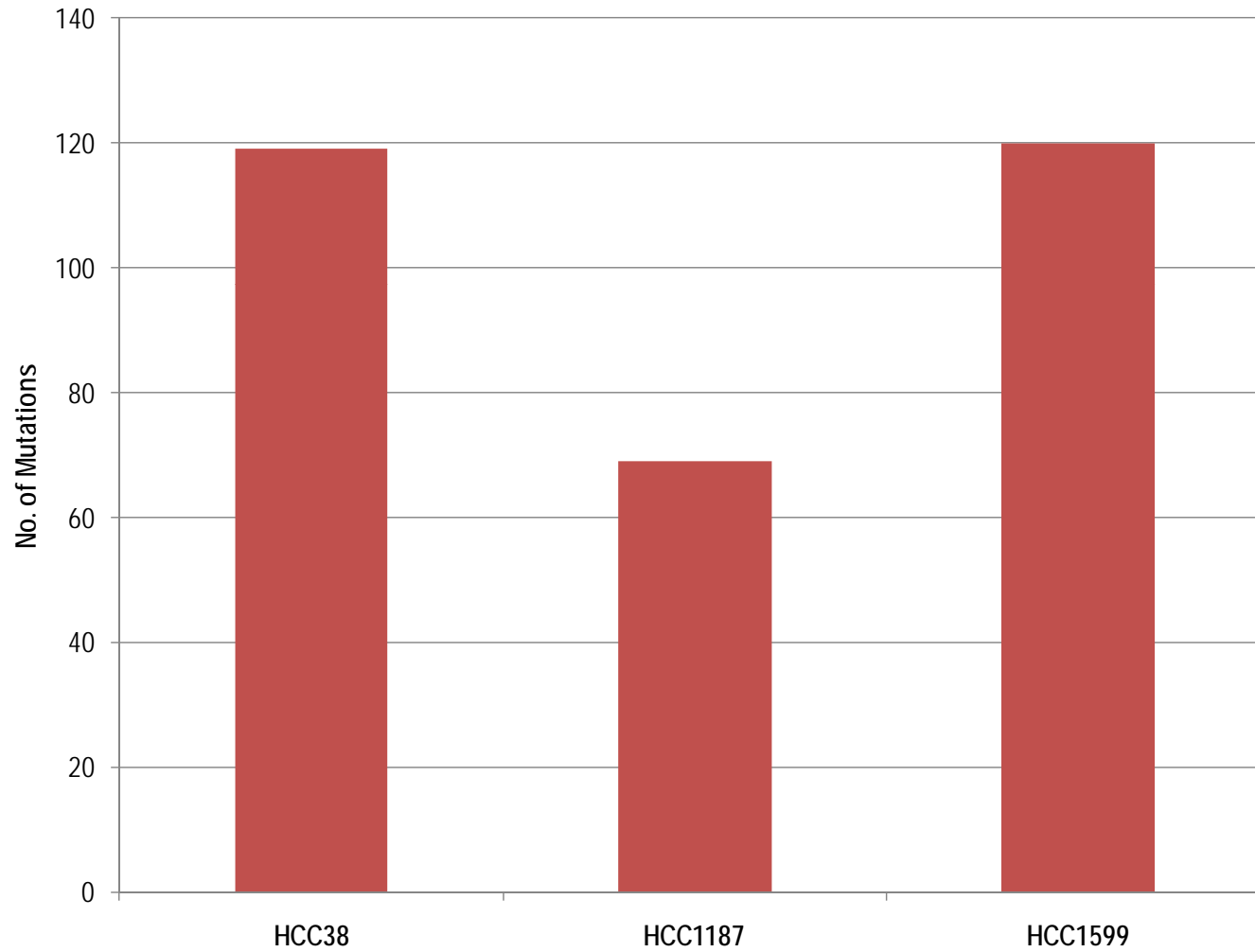




# Variant Detection: Sensitivity



# Novel Substituions

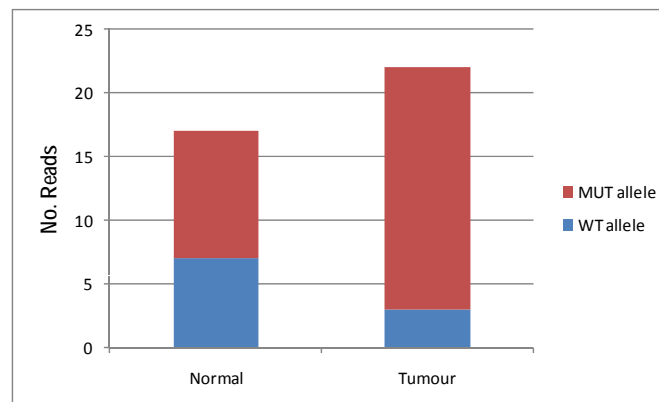


# Germline Variants in Known Cancer Genes

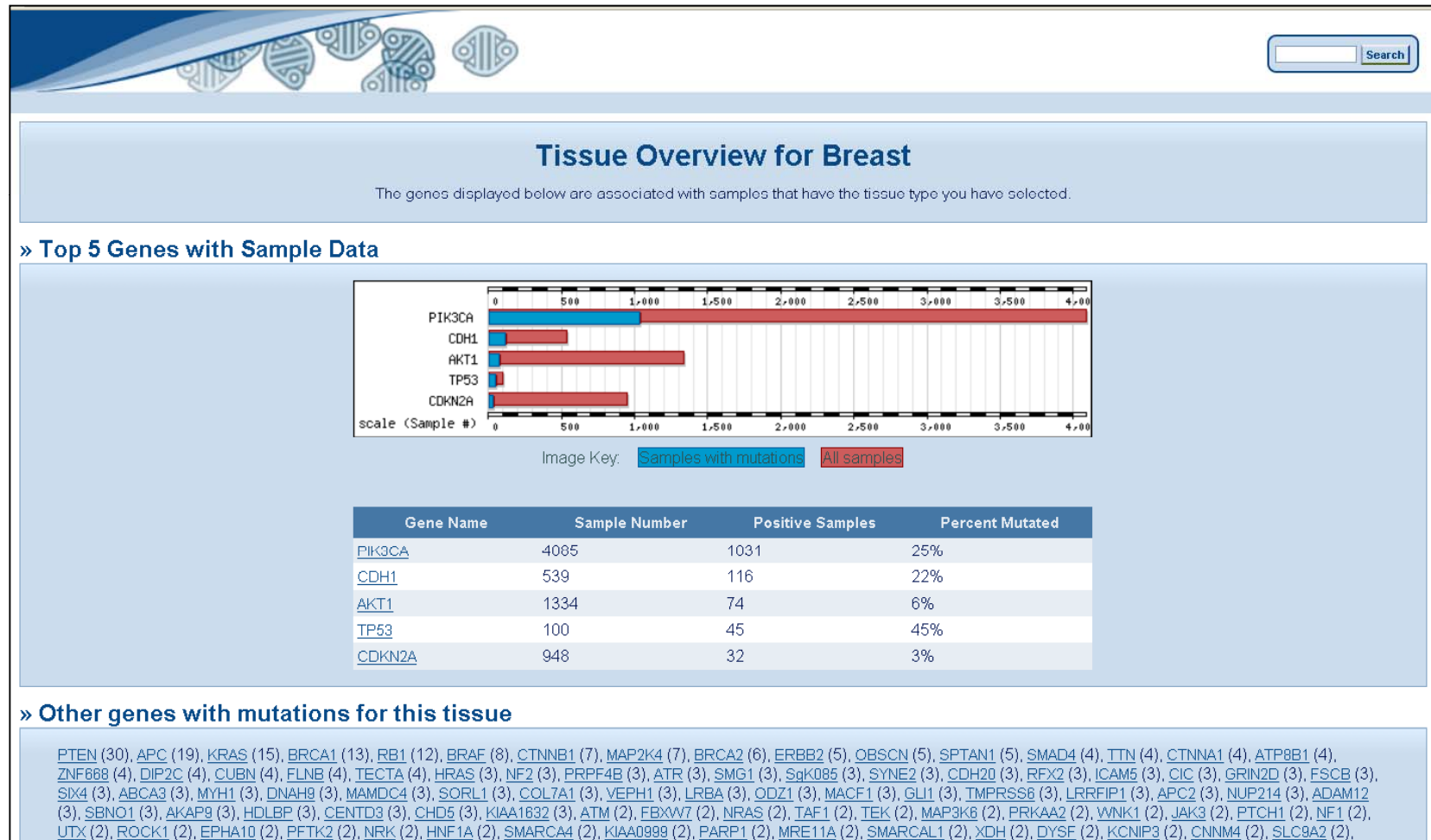
## 28 Sporadic breast cancer cases

CHEK2: W411X

BRCA2: del4bp

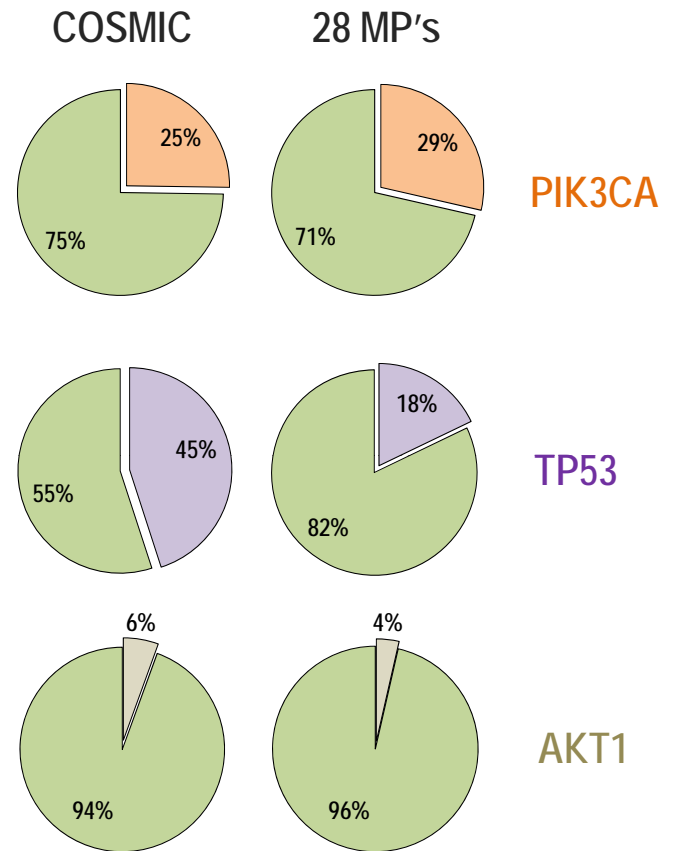


# Somatic Variants in Known Cancer Genes





Sample	PIK3CA	TP53	Other
PD3849a			
PD3852a			
PD3853a			
PD3854a			
PD3856a	PIK3CA: H1047R		
PD3857a	PIK3CA: H1047R		
PD3858a			
PD3983a	PIK3CA: H1047R		
PD3984a			
PD3985a	PIK3CA: H1047R	TP53: R306*	
PD3986a		TP53: Ess splice	
PD3987a		TP53: Y220C	
PD3988a	PIK3CA: H1047R		
PD3989a	PIK3CA: E545K		
PD3990a			
PD3991a		TP53:G245S	
PD3992a	PIK3CA: H1047R		
PD3993a			
PD3994a	PIK3CA: N354K		
PD3995a			AKT1: E17K
PD3996a			PTEN: Y27D NF1: -1G>T
PD3997a			
PD3998a			
PD3999a			
PD4000a			
PD4001a			
PD4002a		TP53: H179Y	
PD4003a			
PD4004a			

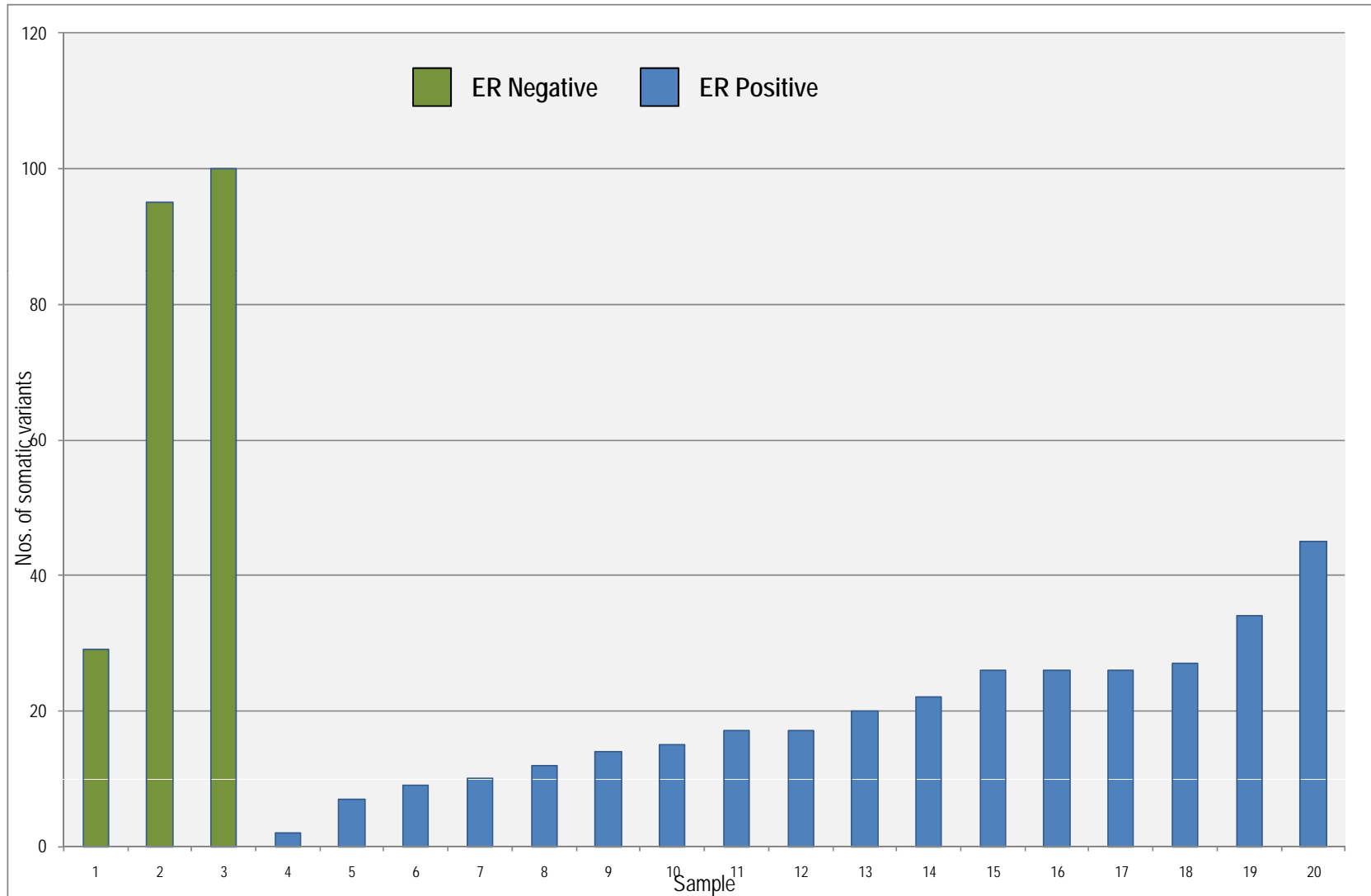


# Novel Somatic Variants

**638** Confirmed Somatic Subs

**38** Confirmed Somatic InDels

# Novel Somatic Variants



# Summary

**Exome resequencing has proven to be robust and effective for somatic variant detection**

**Candidate genes are being followed up in additional breast cancer cases**

**Many additional breast cancer whole exomes are being processed**

**Applying protocol to additional cancer types**



**Mike Stratton**  
**Andy Futreal**  
**Peter Campbell**

Phil Stephens  
Ignacio Varela  
Calli Latimer  
Serena Nik Zainal  
Keiran Raine  
David Jones  
Mingming Jia  
Andrew Menzies  
David McBride  
Graham Bignell  
Helen Davies  
Wendy Haynes  
Catherine Leroy  
Meng-Lay Lin  
Rebecca Shepherd  
Juok Cho

Adam Butler  
Lucy Stebbings  
Kelly Halliday  
Simon Forbes  
Elisabeth Dawson  
Sally Bamford  
David Beare  
Gurpreet Bhamra  
Nidhi Bindal  
Claire Stevens  
Laura Muddie  
Andrew Barthorpe  
Arjunan Rajasingham  
Stuart McLaren  
Sancha Martin  
King Wai Lau

Alison Coffey  
Eleanor Howard

Dan Turner  
Lira Mamanova

Felix Kokocinski  
Carol Scott  
Kai Ye



**The Wellcome Trust**