



**DISCLOSURE:**  
**nothing to declare**

**Roberta Maestro**  
**CRO Aviano**



# **NEXT GENERATION SEQUENCING**

## **a zoom on sarcoma genetics/genomics**

**Roberta Maestro**  
**CRO Aviano**



# 100 YEARS OF CANCER GENETICS

Boveri hypothesizes that chromosome alterations contribute to cancer

1914

Philadelphia chromosome: the first chromosome abnormality identified in a human tumor

1960

Knudson formulates the "two-hits" hypothesis for retinoblastoma development

Identification viral protooncogenes

1971

Novell proposes the clonal evolution of tumor

1976

Cloning of the first human oncogene (H-Ras)

1982

Cloning of the first tumor suppressor (RB)

1987

Launch of the Human Genome Project

1990

Launch of the Cancer Genome Project

1999

Human Genome Project completed

2002

miRNA implicated in cancer

2003

Launch of the Cancer Genome Atlas

2004

First Cancer Exomes sequenced

2005

Launch of the International Cancer Genome Consortium

2006

First Cancer Genome sequenced

2007

2008

By Jan 2014, over 500 mutated cancer genes (Cancer Gene Census)

2009

2014

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First Cancer Exomes sequenced

First Cancer Genome sequenced

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DNA duplication    Recombinant DNA

1944

DNA and inheritance

1953

DNA structure

1958

Genetic code

1960-63

1972

DNA sequencing

1977

1985

PCR

1986

Automated sequencing (Sanger)

1994

Microarrays

2005

NGS  
Massively parallel seq.

2007

First individual human genomes (Sanger, 2007; NGS, 2008)

2008

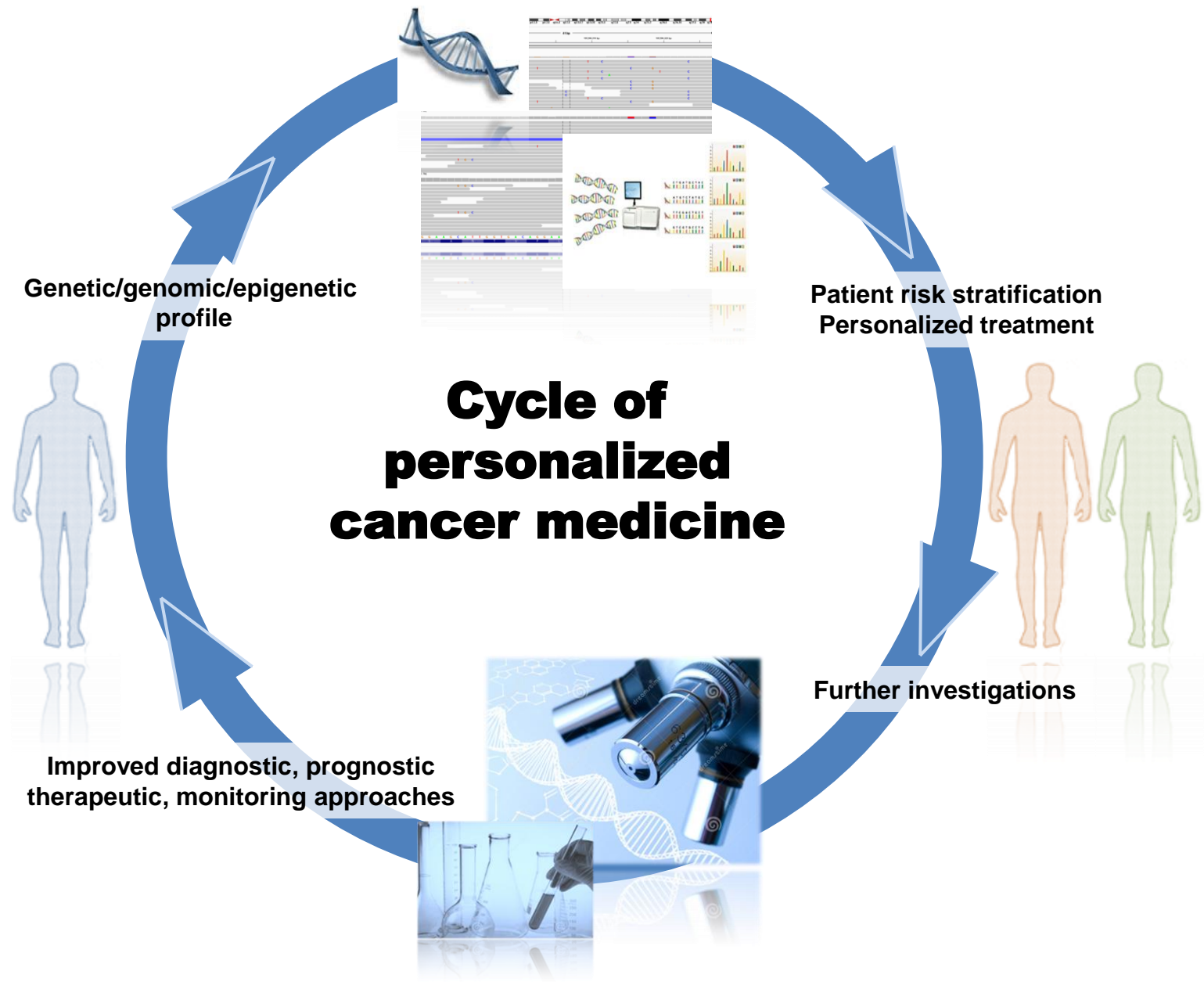
2010

First single-molecule sequencing

# **Cancer Genome Consortia**

## **OVERALL GOALS**

- **characterization of the whole spectrum of genomic/genetic alterations within single tumors and across tumor types**
- **discrimination btw relevant and irrelevant mutations (drivers vs passengers)**
- **identification of prominent pathways involved in cancer**
- **identification of patterns that underpin specific cancer phenotypes (clonal evolution, histology, aggressiveness, resistance/sensitivity to therapies ...)**
- **identification of potentially “actionable” molecules and mutation moieties**
- **pave the way to individualized treatments based on the genetic portrait of tumor and patient**



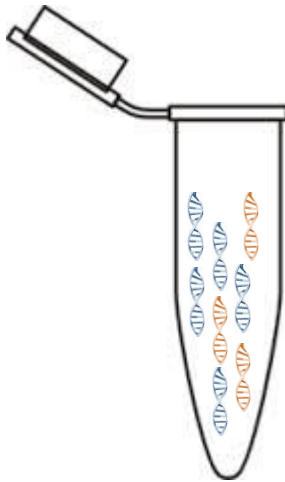
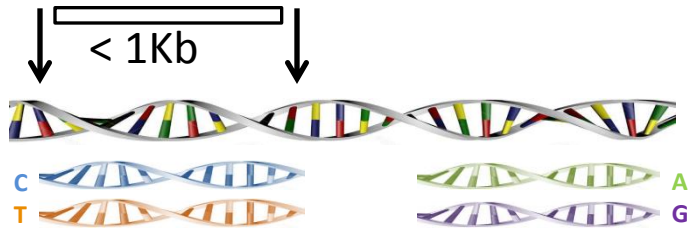


# **The NGS REVOLUTION**

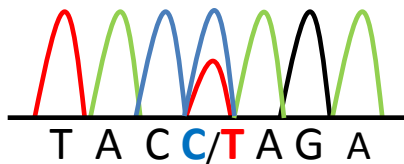
**How did it start and  
where are we now?**

# 1st generation sequencing

## *Sanger Sequencing*



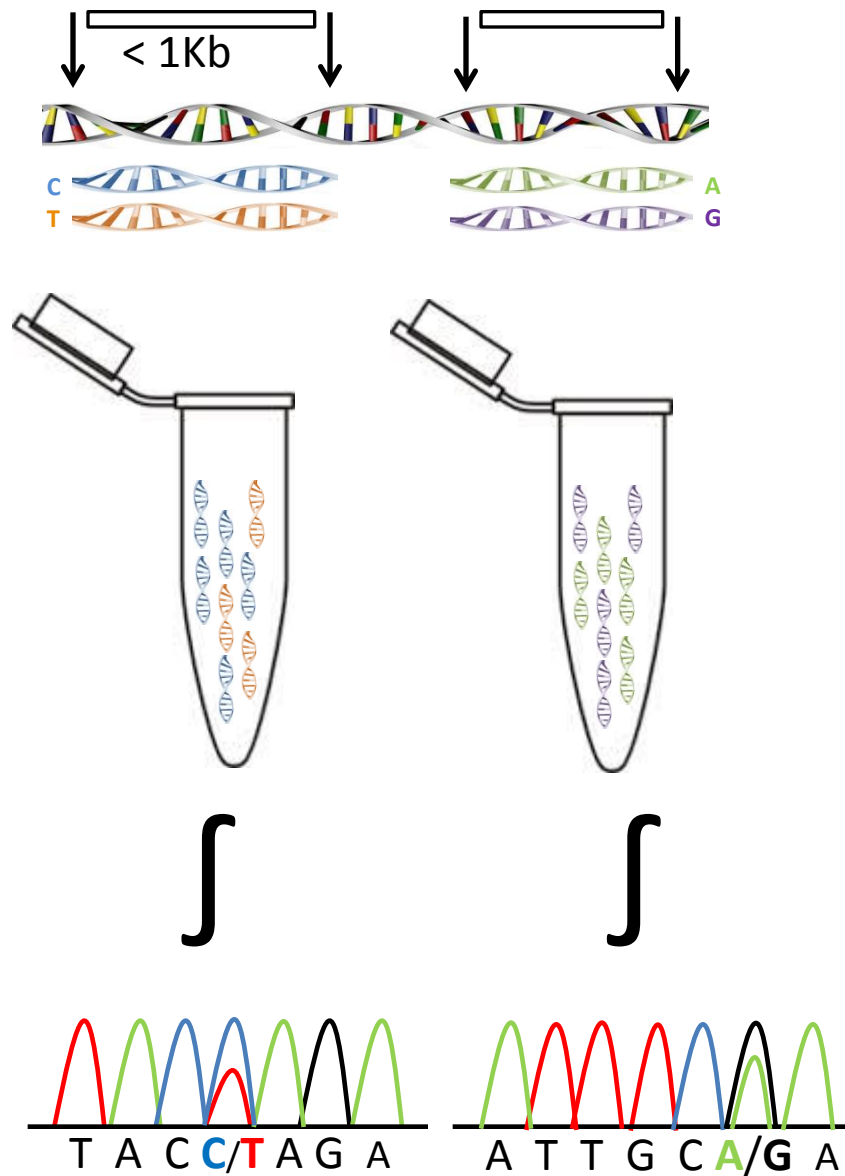
∫





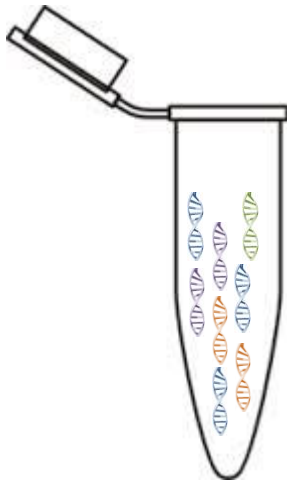
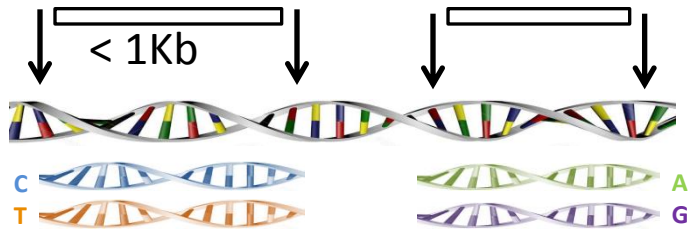
# 1st generation sequencing

## *Sanger Sequencing*

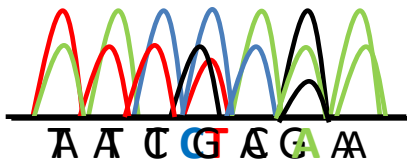


# 1st generation sequencing

## *Sanger Sequencing*

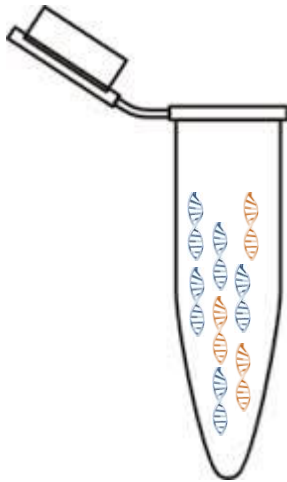
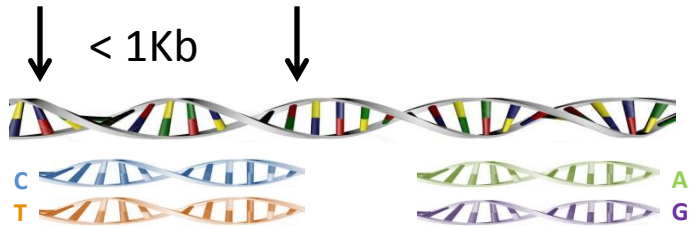


∫

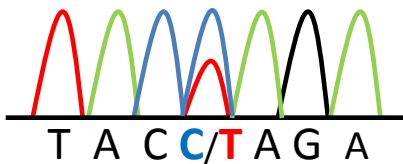


## 1st generation sequencing

*Sanger Sequencing*

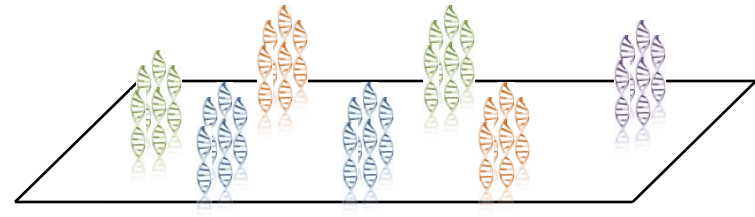
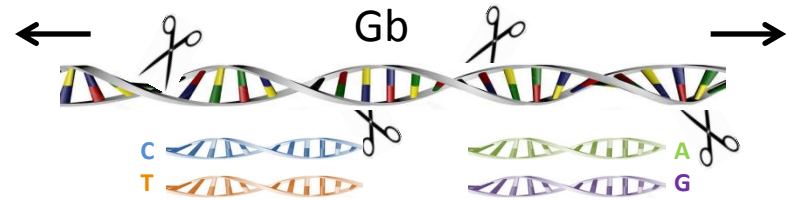


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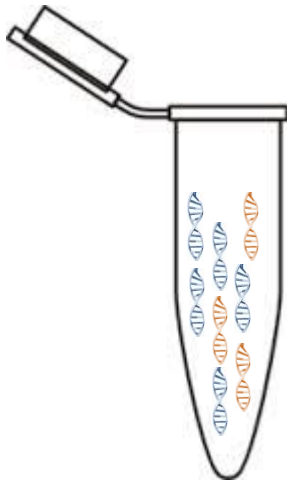
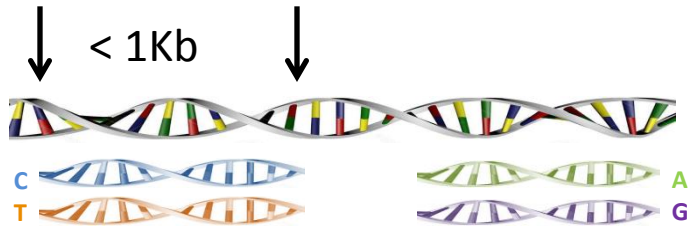


## 2nd generation sequencing

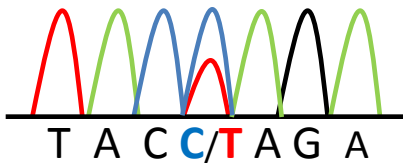
*Massively Parallel Sequencing*



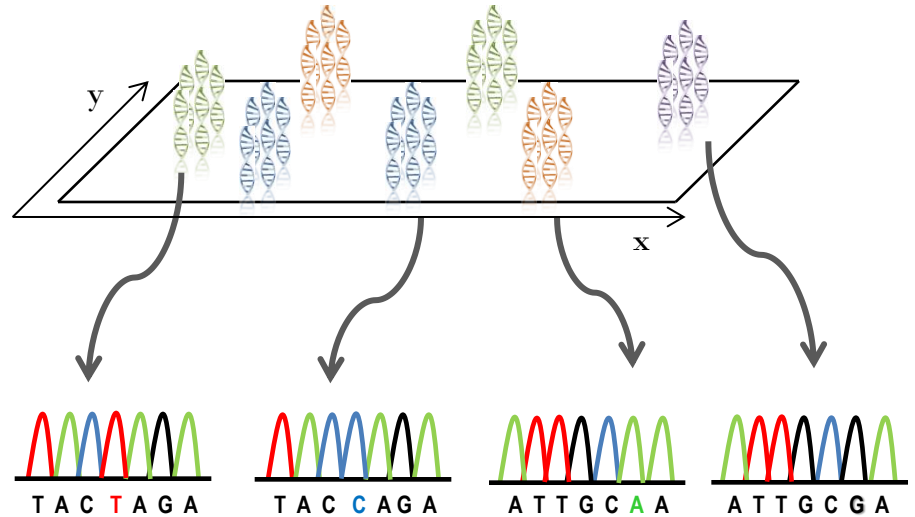
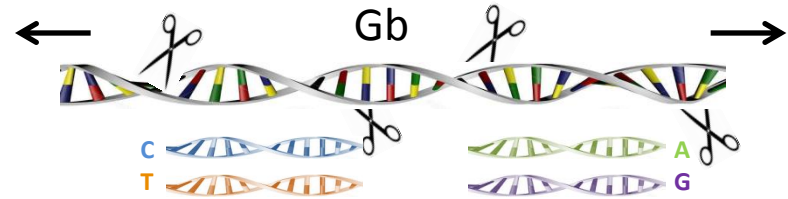
## 1st generation sequencing *Sanger Sequencing*



↓

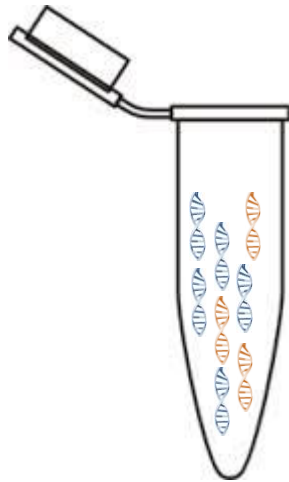
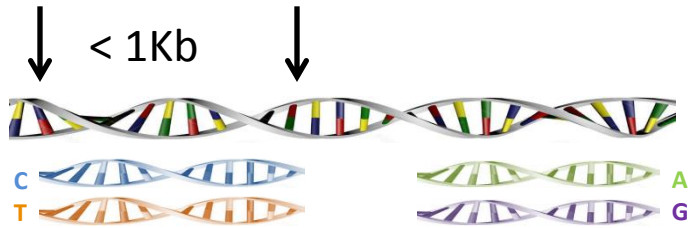


## 2nd generation sequencing *Massively Parallel Sequencing*

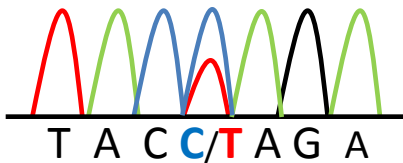


# 1st generation sequencing

## Sanger Sequencing

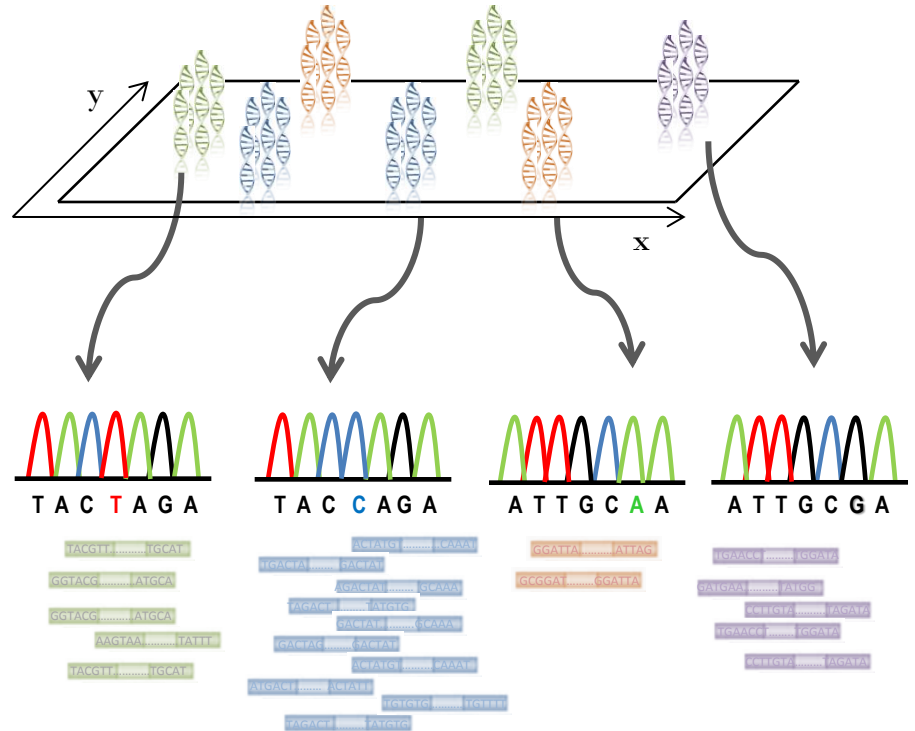
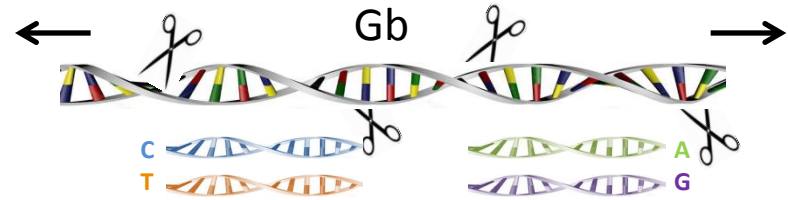


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# 2nd generation sequencing

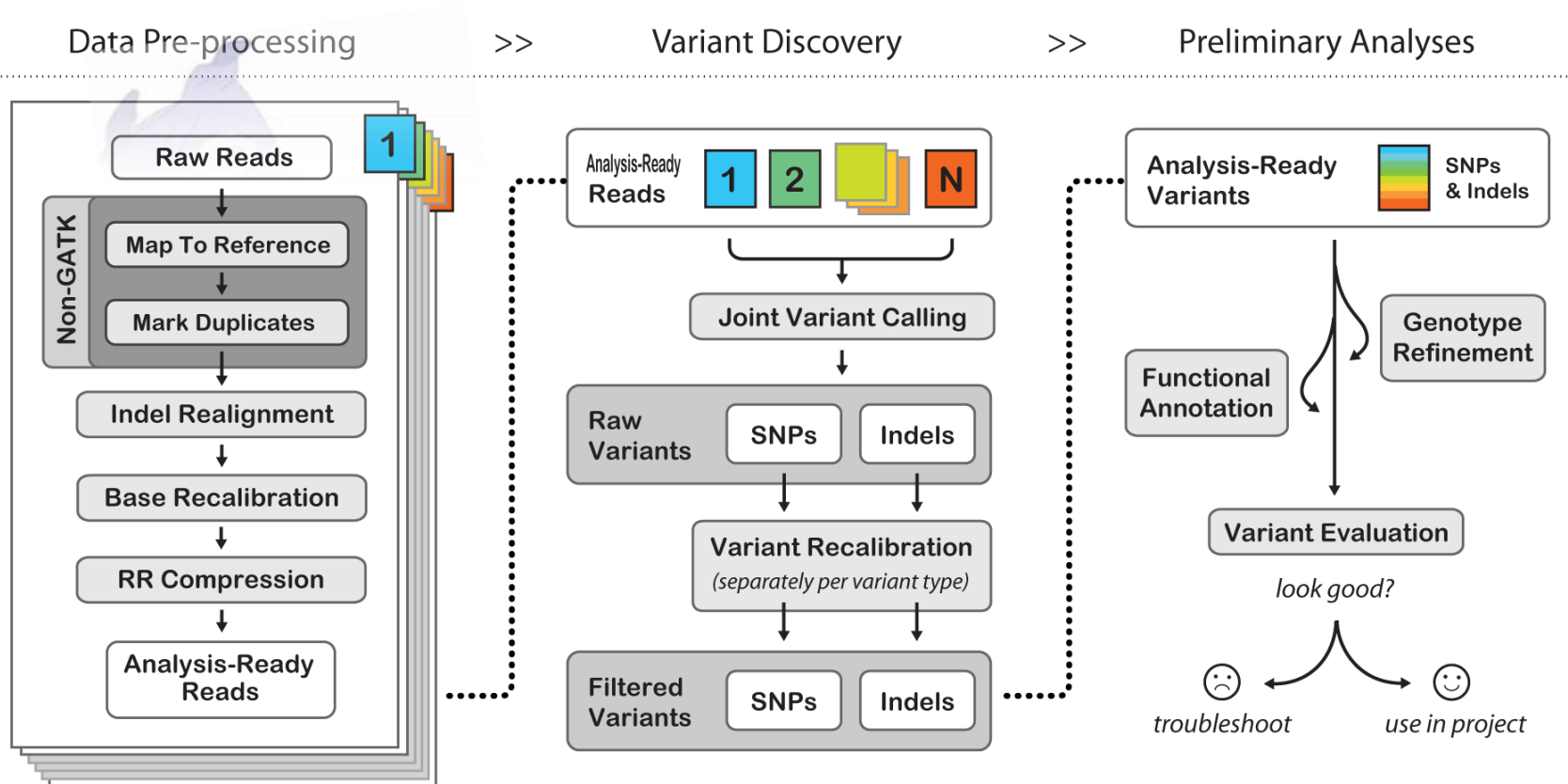
## Massively Parallel Sequencing



Reads



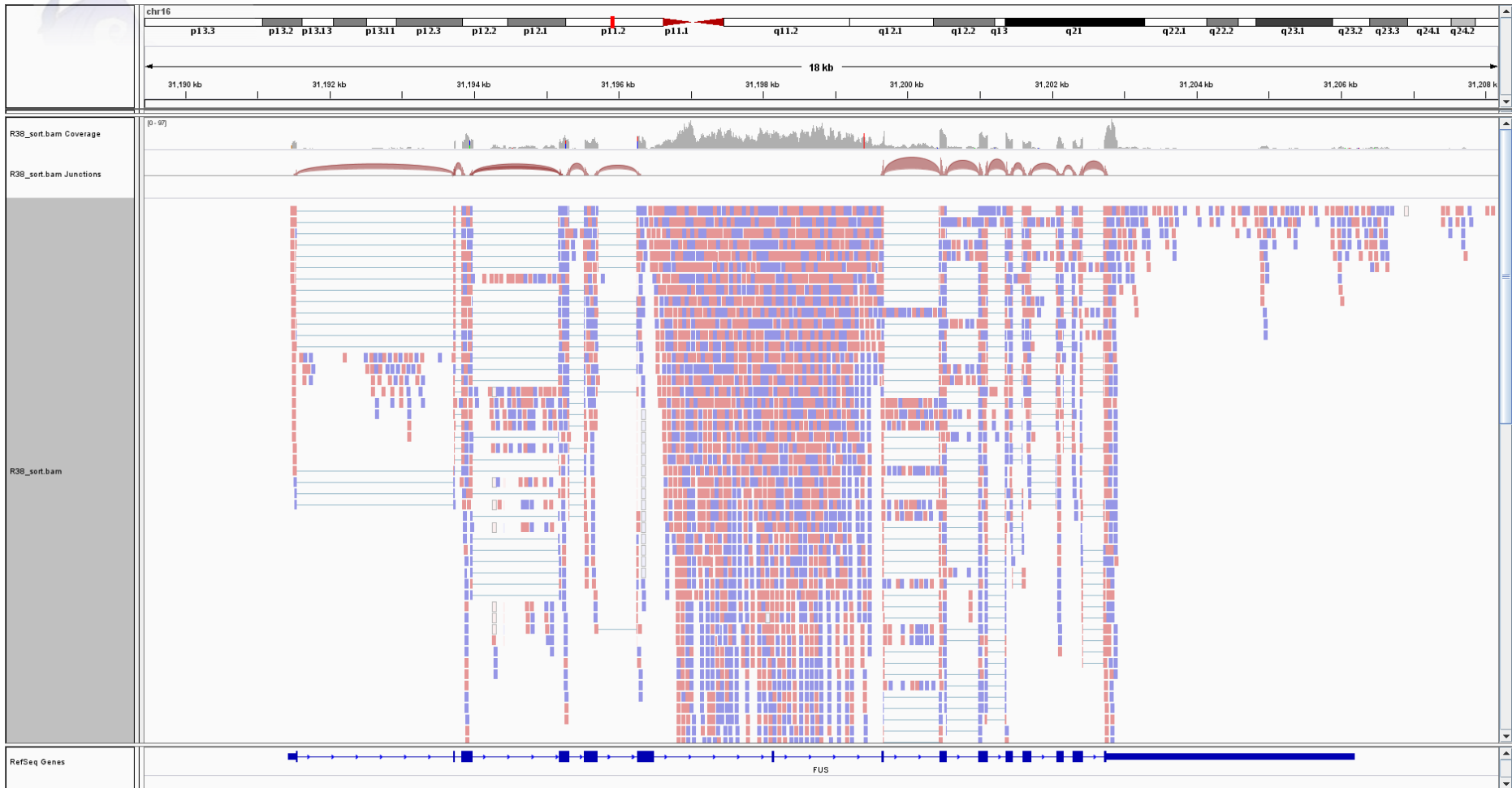
# Bioinformagician...



Example of NGS analysis pipeline for mutation detection, From GATK pipeline, Broad Inst



# ALIGNMENT TO THE REFERENCE GENOME



# ALIGNMENT TO THE REFERENCE GENOME

## Reference sequence

chromosome 12

GTAGTAGATGATGAT**A**GATGATAAAAGTAGAT**T**CCTGGTAGCATAGACTAGGA**G**TTGATAGTTATGATAGCCCATAGAAAAGATGTAGGGATGACGATGAAT

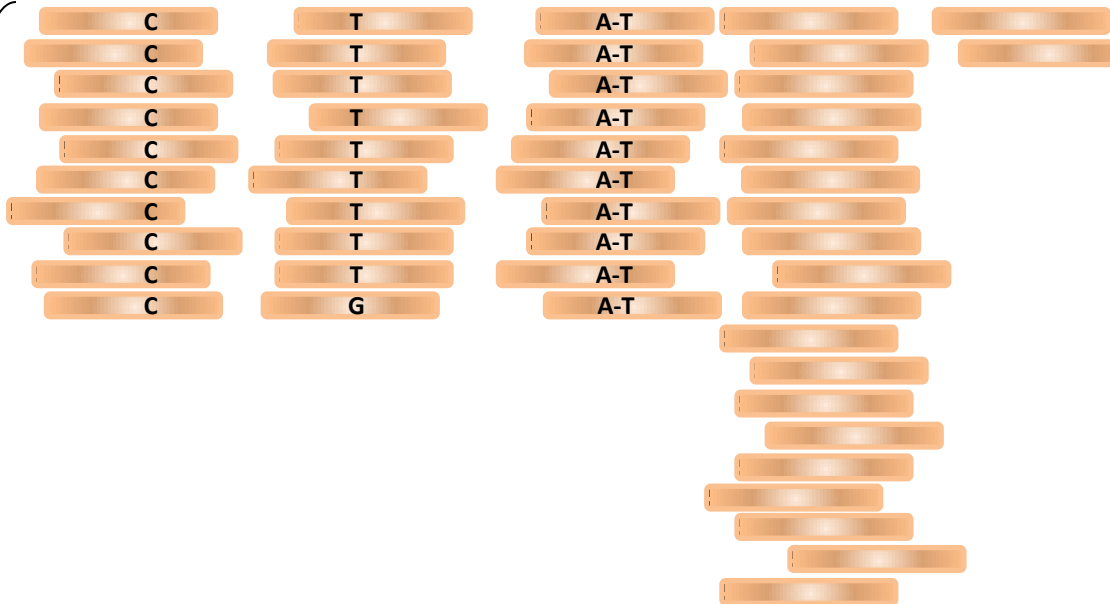
TAGATGATGAT**A**GA

AGTAGAT**T**CCTGGTA

GACTAG**A**GTTGATA

ATGATAGCCCATAG

GATGTAGGGATGA



Point mutations

InDel

Gains

Losses

**Depth of coverage** The average number of times that a particular nucleotide is represented in a collection of random raw sequences.

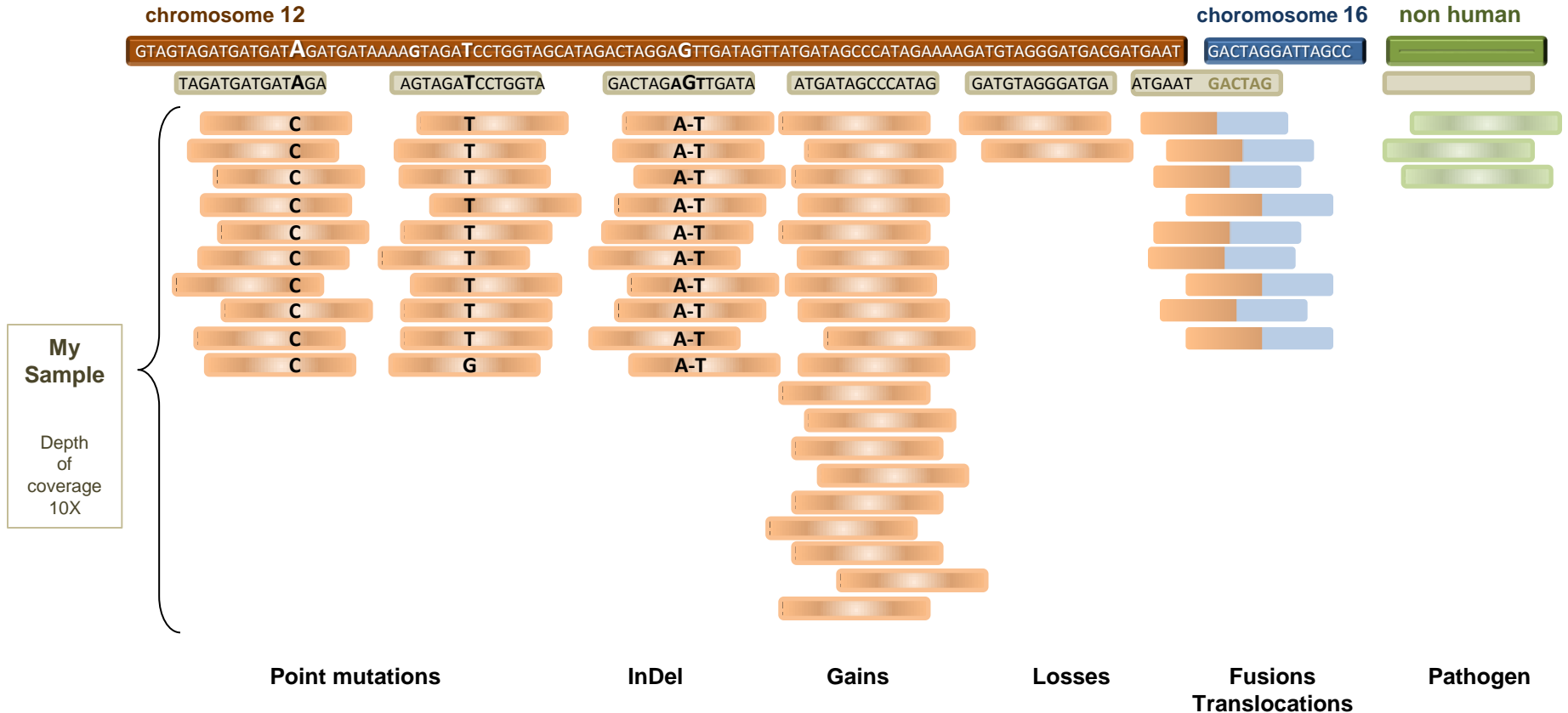
**Fold Coverage** (Nr of reads\* read length)/ target size

**Intrinsic instrument error** ~ 0.1%



# ALIGNMENT TO THE REFERENCE GENOME

## Reference sequence

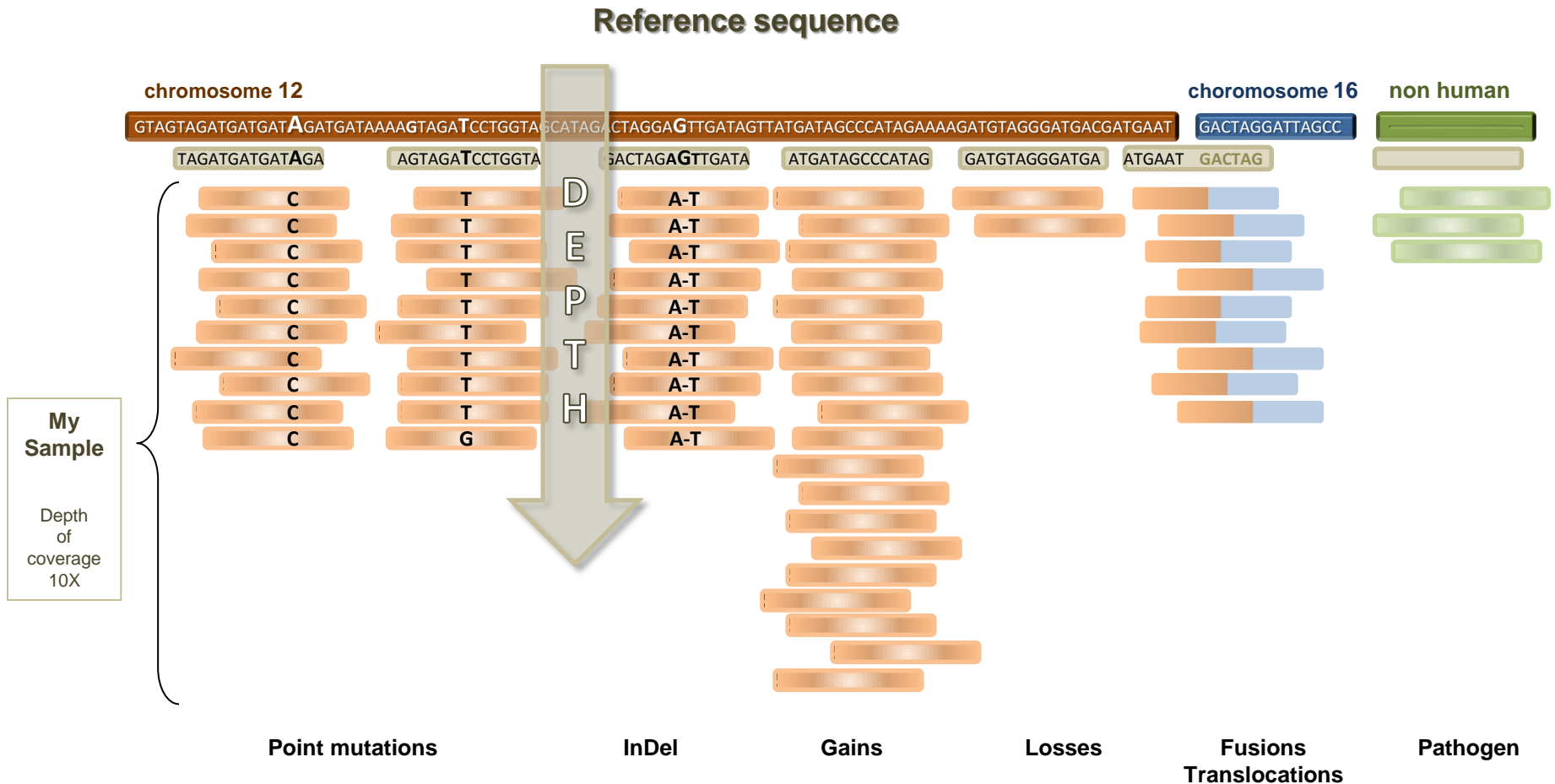


**Depth of coverage** The average number of times that a particular nucleotide is represented in a collection of random raw sequences.

**Fold Coverage** (Nr of reads\* read length)/ target size

**Intrinsic instrument error** ~ 0.1%

## ALIGNMENT TO THE REFERENCE GENOME



**Depth of coverage** The average number of times that a particular nucleotide is represented in a collection of random raw sequences.

**Fold Coverage** (Nr of reads\* read length)/ target size

**Intrinsic instrument error ~ 0.1%**

# SEQUENCING



## **First generation**

**Reaction occurs in solution**

**Each DNA template is sequenced individually**

**Long read length (~ 1kb)**

**Low throughput**

**Limited sensitivity**  
*(max 20%)*

**Qualitative**  
*Small-size abnormalities*

**High costs for large-scale projects**  
**Lower costs for small projects**

## **Second generation**

**Reaction occurs on solid-phase**

**Thousands of DNA templates are sequenced in parallel**

**Short read length (e.g. ~200 pb)**

**High throughput**

**High sensitivity**  
*(depends on coverage)*

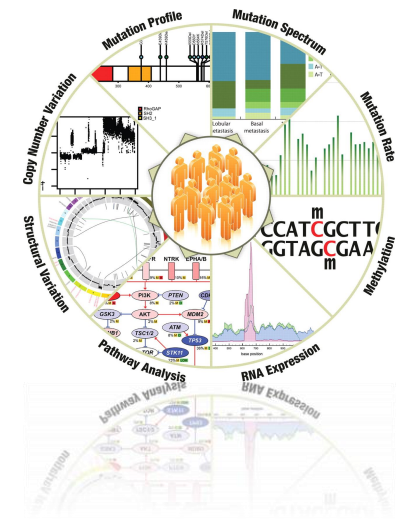
**Quali/Quantitative**  
*Multiple types of abnormalities*  
(SNV, InDels, CNV, Gene fusions, Translocations/Inversions, Transcriptome, Pathogen genomes)

**“Low” costs for large-scale projects**  
**Higher costs for small projects**

# MPS Applications

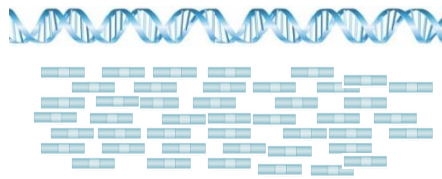
Method	Sequencing to determine:	Example reference	
DNA-Seq	A genome sequence	57	Comparison, 'anatomic' (isolation by anatomic site), flow cytometry, DNA extraction, mechanical shearing, adaptor ligation, PCR and sequencing
Targeted DNA-Seq	A subset of a genome (for example, an exome)	20	Comparison, cell culture, DNA extraction, mechanical shearing, adaptor ligation, PCR, hybridization capture, PCR and sequencing
Methyl-Seq	Sites of DNA methylation, genome-wide	34	Perturbation, genetic manipulation, cell culture, DNA extraction, mechanical shearing, adaptor ligation, bisulfite conversion, PCR and sequencing
Targeted methyl-Seq	DNA methylation in a subset of the genome	129	Comparison, cell culture, DNA extraction, bisulfite conversion, molecular inversion probe capture, circularization, PCR and sequencing
DNase-Seq, Sono-Seq and FAIRE-Seq	Active regulatory chromatin (that is, nucleosome-depleted)	113	Perturbation, cell culture, nucleus extraction, DNase I digestion, DNA extraction, adaptor ligation, PCR and sequencing
MAINE-Seq	Histone-bound DNA (nucleosome positioning)	130	Comparison, cell culture, MNase I digestion, DNA extraction, adaptor ligation, PCR and sequencing
ChIP-Seq	Protein-DNA interactions (using chromatin immunoprecipitation)	131	Comparison, 'anatomic', cell culture, cross-linking, mechanical shearing, immunoprecipitation, DNA extraction, adaptor ligation, PCR and sequencing
RIP-Seq, CLIP-Seq, HITS-CLIP	Protein-RNA interactions	46	Variation, cross-linking, 'anatomic', RNase digestion, immunoprecipitation, RNA extraction, adaptor ligation, reverse transcription, PCR and sequencing
RNA-Seq	RNA (that is, the transcriptome)	39	Comparison, 'anatomic', RNA extraction, poly(A) selection, chemical fragmentation, reverse transcription, second-strand synthesis, adaptor ligation, PCR and sequencing
FRT-Seq	Amplification-free, strand-specific transcriptome sequencing	119	Comparison, 'anatomic', RNA extraction, poly(A) selection, chemical fragmentation, adaptor ligation, reverse transcription and sequencing
NET-Seq	Nascent transcription	41	Perturbation, genetic manipulation, cell culture, immunoprecipitation, RNA extraction, adaptor ligation, reverse transcription, circularization, PCR and sequencing
Hi-C	Three-dimensional genome structure	71	Comparison, cell culture, cross-linking, proximity ligation, mechanical shearing, affinity purification, adaptor ligation, PCR and sequencing
Chia-PET	Long-range interactions mediated by a protein	73	Perturbation, cell culture, cross-linking, mechanical shearing, immunoprecipitation, proximity ligation, affinity purification, adaptor ligation, PCR and sequencing
Ribo-Seq	Ribosome-protected mRNA fragments (that is, active translation)	48	Comparison, cell culture, RNase digestion, ribosome purification, RNA extraction, adaptor ligation, reverse transcription, rRNA depletion, circularization, PCR and sequencing
TRAP	Genetically targeted purification of polysomal mRNAs	132	Comparison, genetic manipulation, 'anatomic', cross-linking, affinity purification, RNA extraction, poly(A) selection, reverse transcription, second-strand synthesis, adaptor ligation, PCR and sequencing
PARS	Parallel analysis of RNA structure	42	Comparison, cell culture, RNA extraction, poly(A) selection, RNase digestion, chemical fragmentation, adaptor ligation, reverse transcription, PCR and sequencing
Synthetic saturation mutagenesis	Functional consequences of genetic variation	93	Variation, genetic manipulation, barcoding, RNA extraction, reverse transcription, PCR and sequencing
Immuno-Seq	The B-cell and T-cell repertoires	86	Perturbation, 'anatomic', DNA extraction, PCR and sequencing
Deep protein mutagenesis	Protein binding activity of synthetic peptide libraries or variants	95	Variation, genetic manipulation, phage display, <i>in vitro</i> competitive binding, DNA extraction, PCR and sequencing
PhIT-Seq	Relative fitness of cells containing disruptive insertions in diverse genes	92	Variation, genetic manipulation, cell culture, competitive growth, linear amplification, adaptor ligation, PCR and sequencing

FAIRE-seq, formaldehyde-assisted isolation of regulatory elements-sequencing. MAINE-Seq, MNase-assisted isolation of nucleosomes-sequencing; RIP-Seq, RNA-binding protein immunoprecipitation-sequencing; CLIP-Seq, cross-linking immunoprecipitation-sequencing; HITS-CLIP, high-throughput sequencing of RNA isolated by cross-linking immunoprecipitation; FRT-Seq, on-flowcell reverse transcription-sequencing. NET-Seq, native elongating transcript sequencing. TRAP, translating ribosome affinity purification. PhIT-Seq, phenotypic interrogation via tag sequencing.



# Major MPS Applications

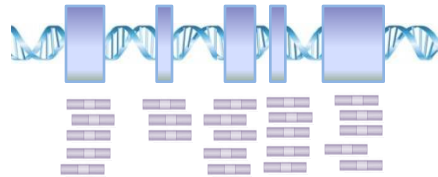
## Whole genome-seq



### Genome

Structural variants  
Point mutations/InDels  
CNV

## Whole exome-seq

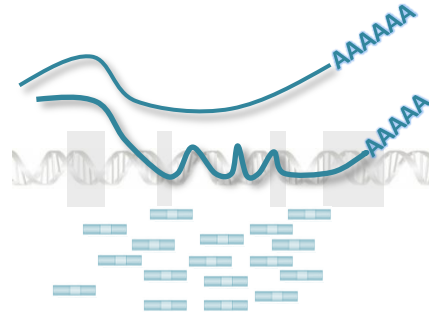


### Exome

(protein-coding regions)

Point mutations/InDels  
CNV

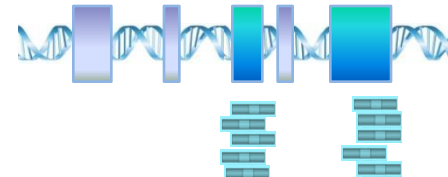
## RNA-seq



### Transcriptome

Gene expression  
Gene fusions  
Splice variants

## Target-seq



### Selected list of genes/hot-spots

Point mutations/InDels  
CNV

Breath

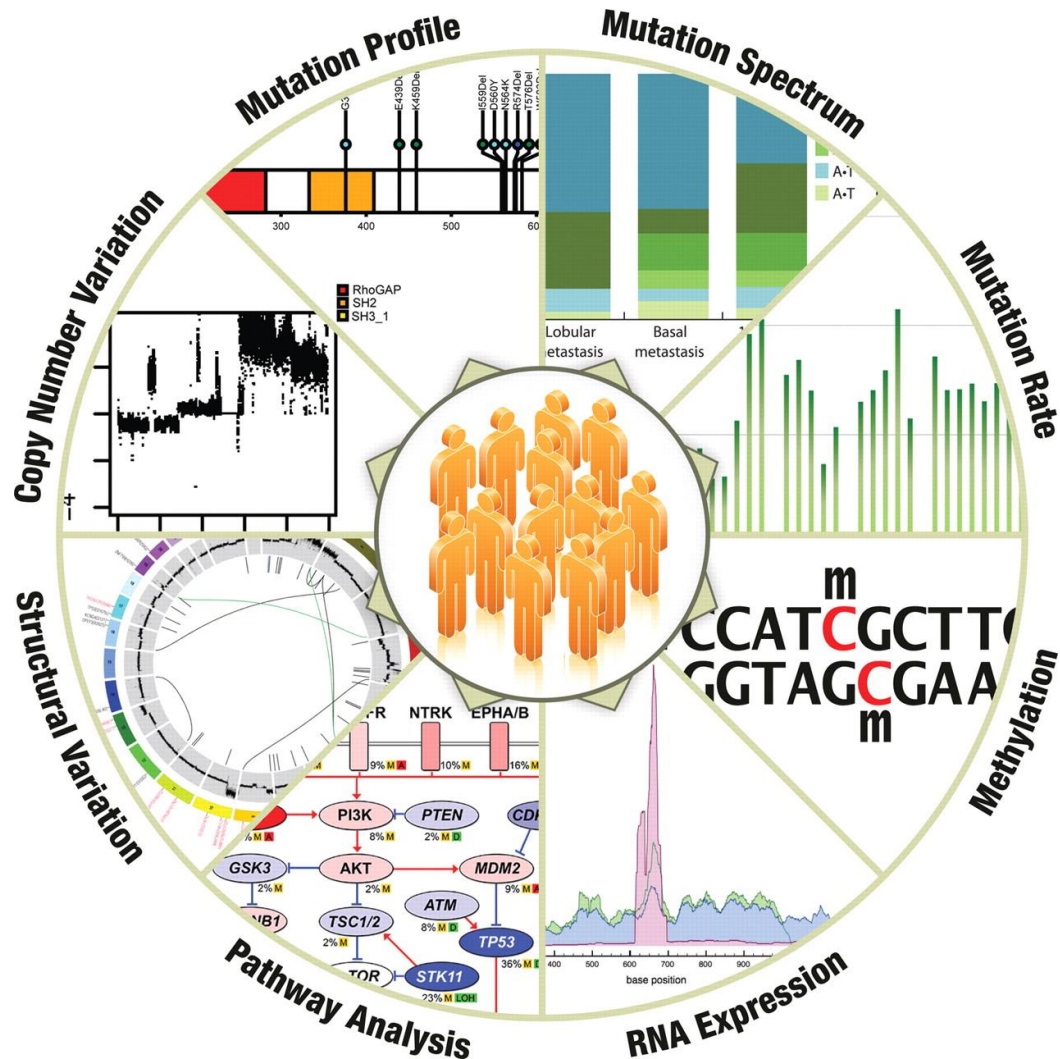
**NGS rule of thumb**

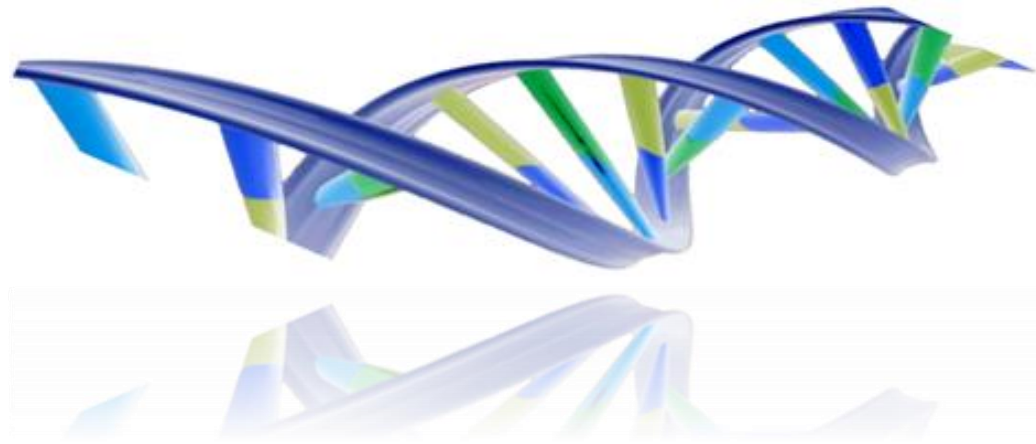
**Breath x Depth = Cost**

'Complexity' x 'Accuracy' = Cost

Approach	Advantages	Disadvantages
<p>Whole genome-Seq</p> <p>1x diploid genome 6x10<sup>9</sup> bp</p>	<p>Comprehensive landscape of whole genome alterations</p> <p>Any type of genomic alteration:</p> <ul style="list-style-type: none"> <li>- <b>Qualitative</b> (chromosome rearrangements, somatic mutations in coding and non-coding regions, active retrotransposons, pathogen genomes)</li> <li>- <b>Quantitative</b> (gain /loss)</li> </ul>	<p>Expensive..</p> <p>.. hence usually done at low/medium coverage to get a general picture (at the expense of accuracy)</p> <p>Huge amount of data to deal with, difficult to interpret</p> <p>Risk of incidental findings (ethical issues)</p>
<p>Whole exome-Seq</p> <p>1x exome 60x10<sup>6</sup> bp</p>	<p>Cost effective</p> <p>Good sensitivity (high coverage)</p> <p>Small datasets, easier to interpret</p> <p>Gene alterations (SNV, InsDel) within the coding regions</p>	<p>Covers only 1% of the genome</p> <p>Uneven capture efficiency across exons (may miss alterations)</p> <p>Off-target hybridizations</p> <p>Miss most fusion genes</p> <p>Risk of incidental findings (ethical issues)</p>
<p>RNA-Seq ncRNA-Seq</p> <p>Millions of reads</p>	<p>Cost effective</p> <ul style="list-style-type: none"> <li>- <b>Qualitative</b> (Fusion transcripts, Isoforms, RNA editing) and</li> <li>- <b>Quantitative</b> (mRNA and ncRNA expression levels)</li> </ul> <p><i>Compared to Microarray: wider dynamic range; no dependent on known gene sequence; free of hybridization artifacts</i></p> <p>Small datasets</p>	<p>Coverage depends on expression levels</p> <p>Miss alterations in low-copy transcripts (low coverage)</p> <p>The imbalance in the representation of different mRNAs makes it hard to call mutations</p>
<p>Targeted-seq</p> <p>A priori selected list of genes/mutations</p> <p>Variable length</p>	<p>Cost effective</p> <p>Mostly used to detect Point mutations/InDels/CNV</p> <p>Useful for diagnostics and NGS data validation</p> <p>Very small dataset, easy to interpret</p> <p>Very high sensitivity at high coverage</p> <p>Results are often actionable/Personalized medicine</p>	<p>Miss alterations outside the targeted regions</p> <p>A priori knowledge of the genes/mutations of interest</p>

# The power of NGS analyses





**So far so good...**

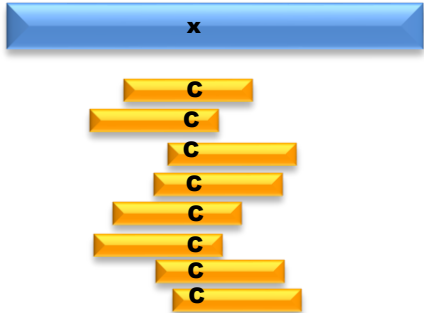
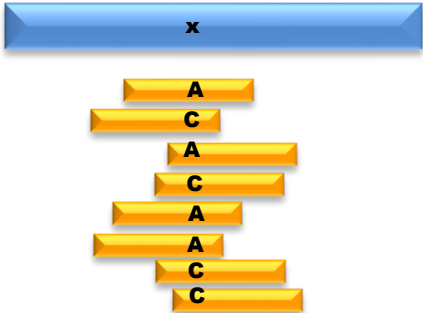
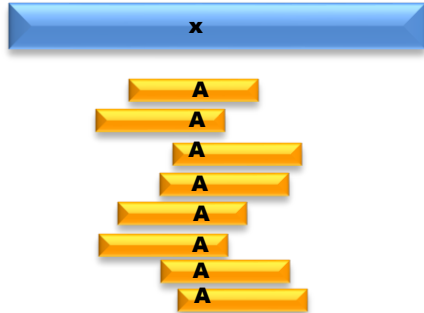
**...but cancer is not a “simple” genetic disorder...**



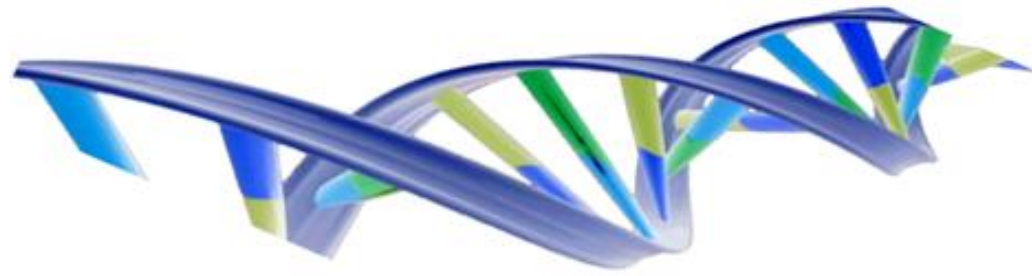


# Genetics

Reference sequence  
Chromosome 1

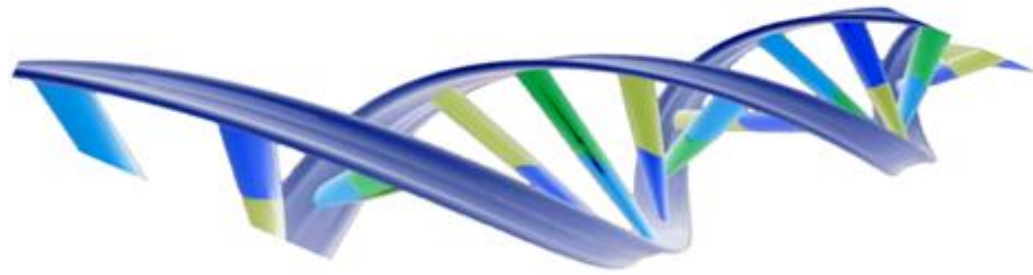
Homozygous C	Heterozygous A/C	Homozygous A
		
8/8 reads C (100% C)	4/8 reads C, 4/8 reads A (50% C, 50%A)	8/8 reads A (100% A)

8X coverage



# **ANALYSIS OF TUMOR SAMPLES: ISSUES**

- Purity**
- Clonality**
- Aneuploidy & Rearrangements**
- Sample quantity & quality**

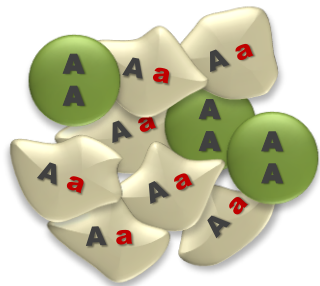


# ANALYSIS OF TUMOR SAMPLES: ISSUES

## Purity

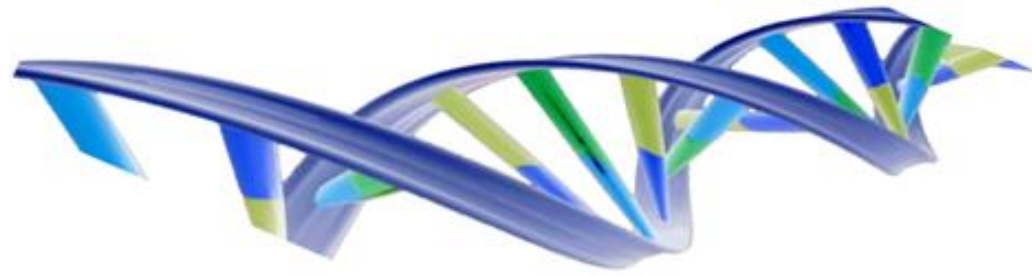
### Contaminantion by non-tumoral cells affects the ability to detect mutations

Example: an heterozygous mutation in a tumor sample 70% pure (30% non-tumoral cells) will be detectable in 35% of the reads



10 cells, 2 alleles per cells (20 alleles total)  
7 tumor cells (T) Aa  
3 normal cells (N) AA

A = 7 from T + (3+3) from N = 13/20 alleles are A  
a = 7 from T + 0 from N = 7/20 alleles are a  
The actual allelic frequency of a in the sample will be 7/20 = 35%

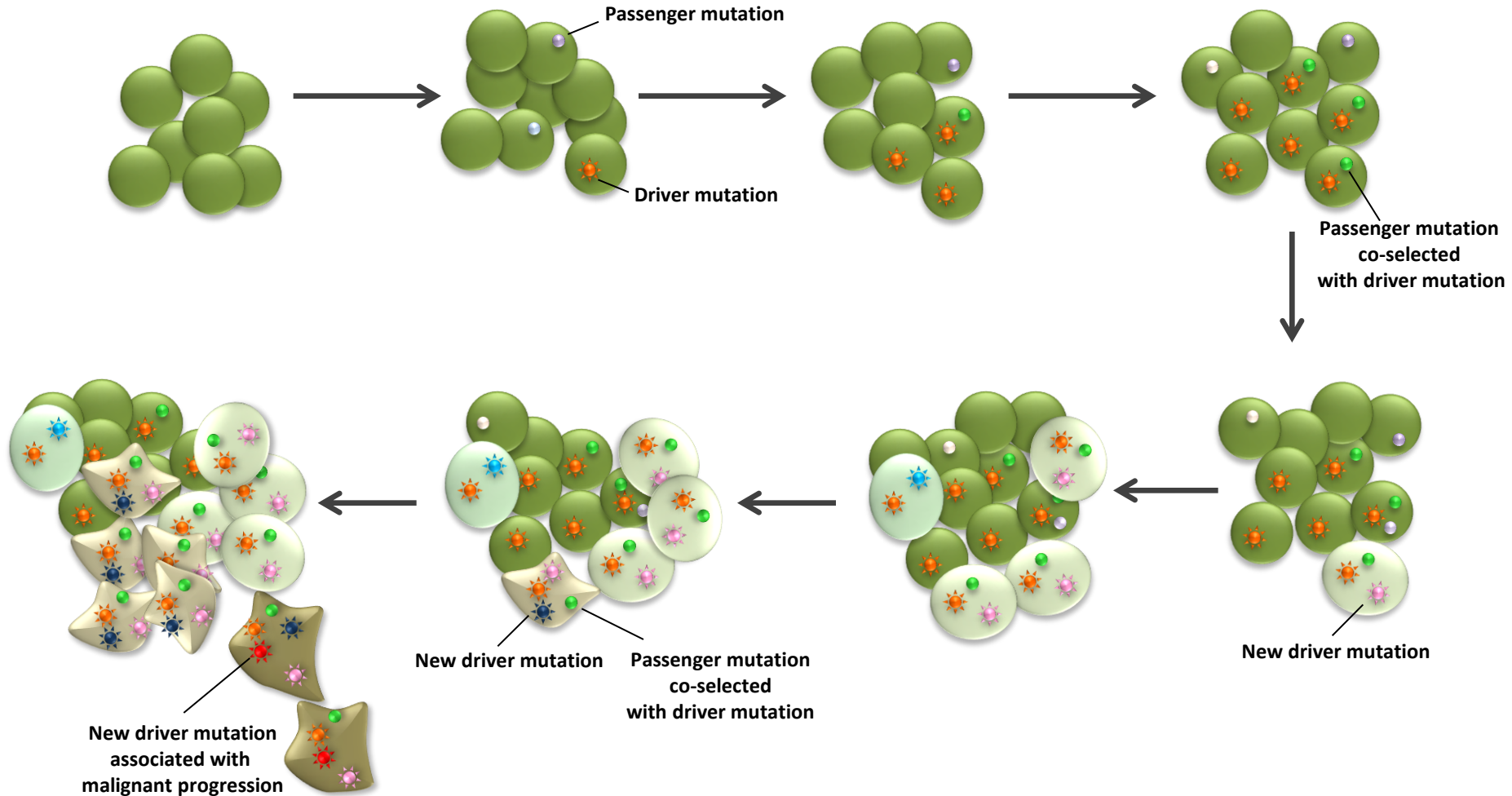



# **ANALYSIS OF TUMOR SAMPLES: ISSUES**


## **Clonality**

**Tumors may be highly heterogeneous**

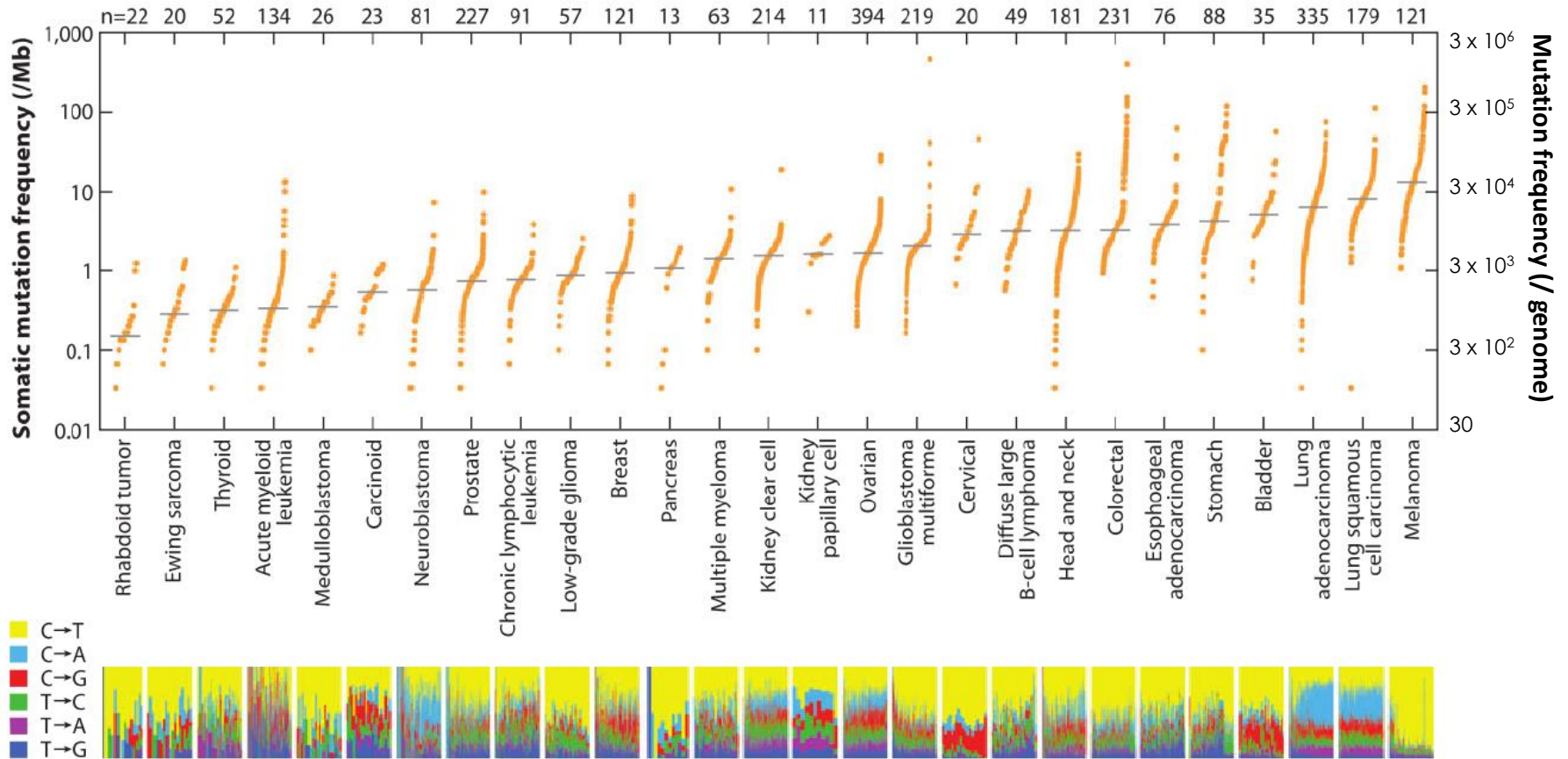
# The “polyclonal” evolution of cancer

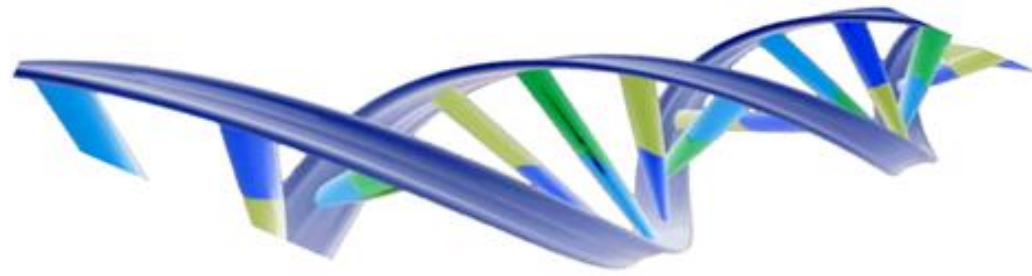


 **Driver mutation**  
Causally implicated in cancer.  
It confers growth advantage to tumor cells,  
therefore undergoes positive selection

 **Passenger mutation**  
No role in cancer  
No relevant impact on tumor cell growth or survival.  
May be selected as a result of a bystander effect

# Somatic mutation frequency in cancer





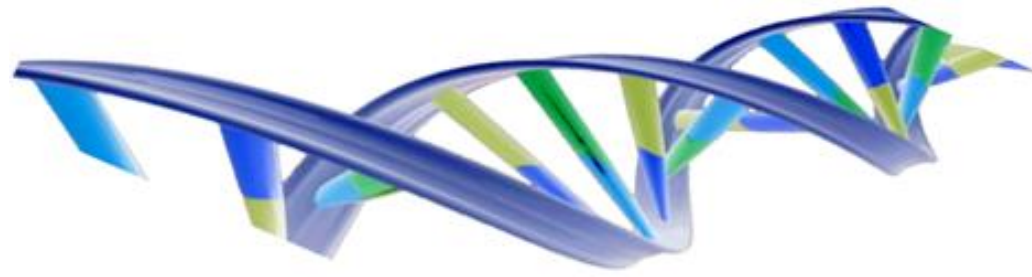
# **ANALYSIS OF TUMOR SAMPLES: ISSUES**

**Somatic vs Germline (comparison with normal matched samples)**

**Drivers vs Passengers**

**Functional validation of candidate driver mutations**



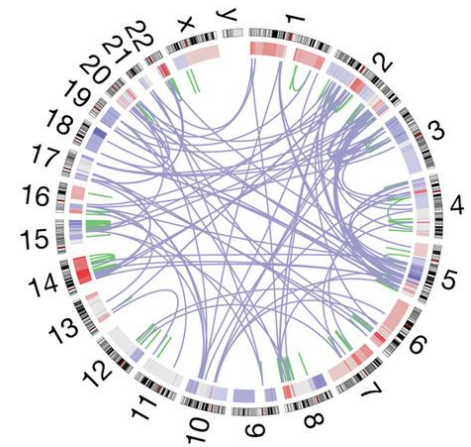


# **ANALYSIS OF TUMOR SAMPLES: ISSUES**

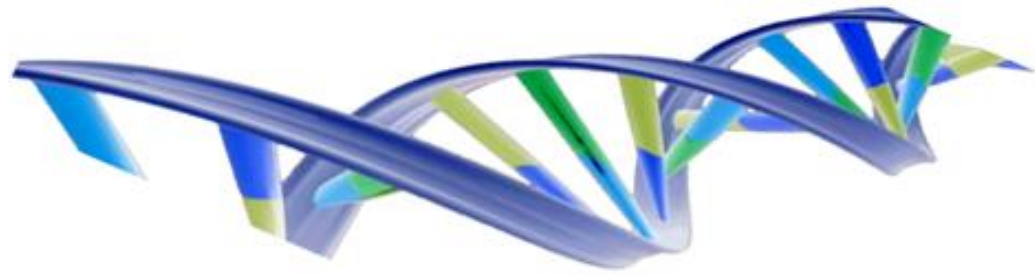
## **Aneuploidy & Rearrangements**

**Tumors are genetically unbalanced and rearranged**

**Alignment to the reference genome may be challenging**

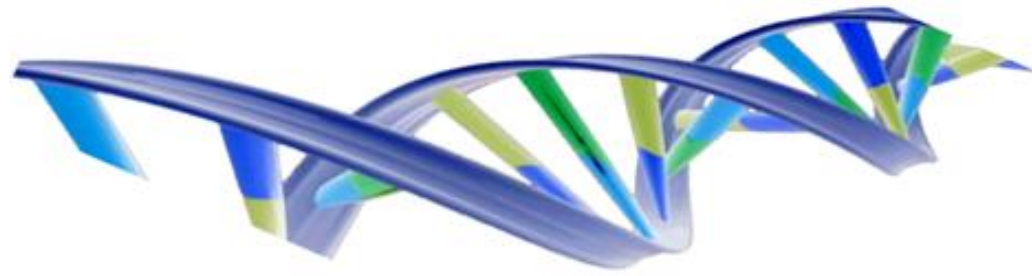






# **ANALYSIS OF TUMOR SAMPLES: ISSUES**

**Sample quantity & quality (FFPE)**



# **ANALYSIS OF TUMOR SAMPLES: ISSUES**

**Purity**

**Clonality**

**Aneuploidy & Rearrangements**

**Sample quantity & quality**

**Intrinsic error rate of the technology**

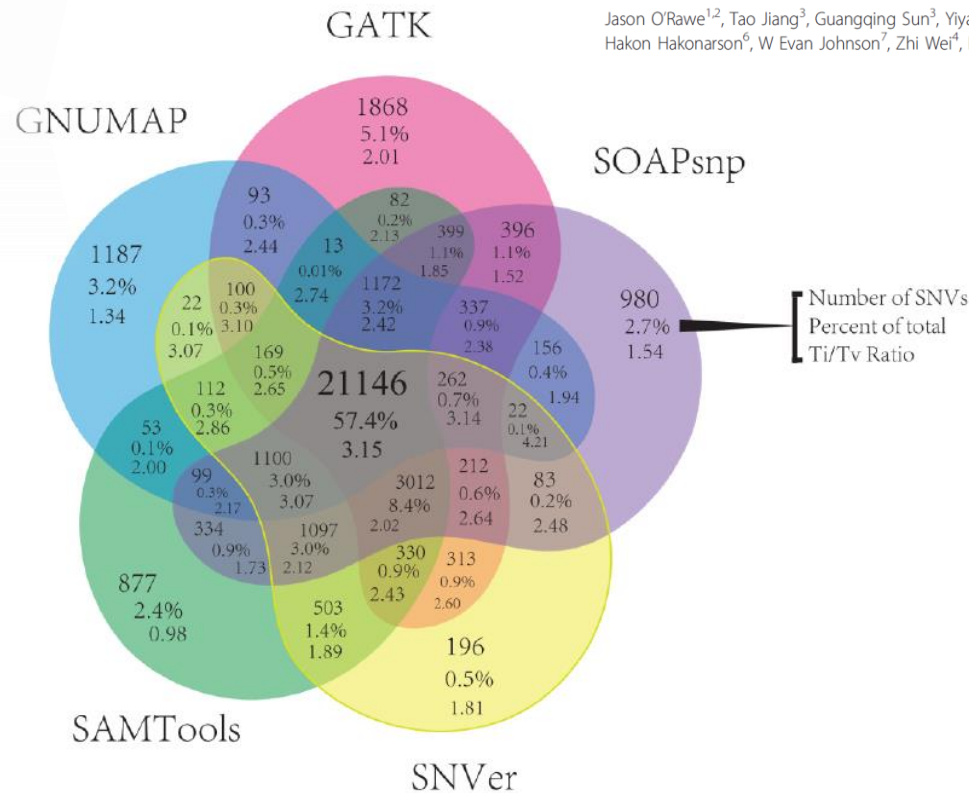
**Limits of bioinformatic tools**

RESEARCH

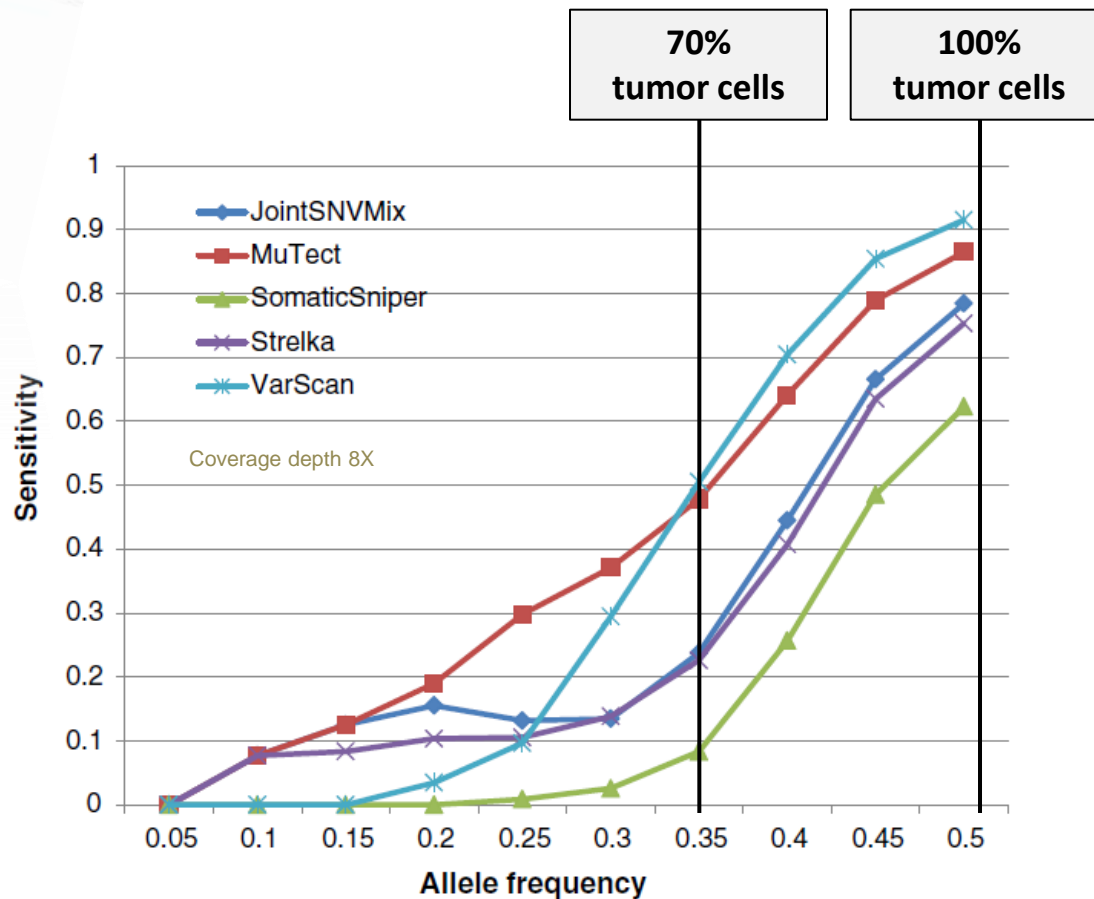
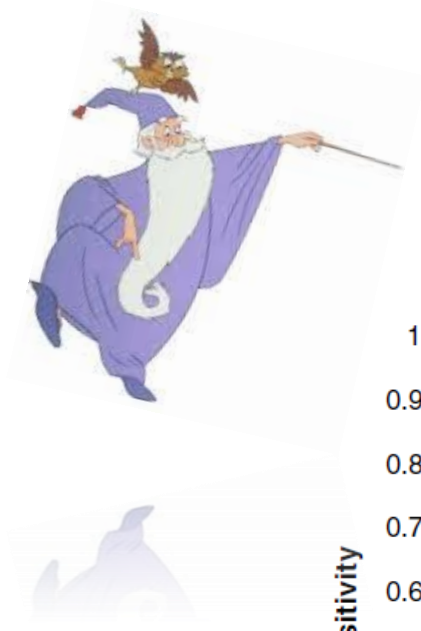
Open Access

# Low concordance of multiple variant-calling pipelines: practical implications for exome and genome sequencing

Jason O'Rawe<sup>1,2</sup>, Tao Jiang<sup>3</sup>, Guangqing Sun<sup>3</sup>, Yiyang Wu<sup>1,2</sup>, Wei Wang<sup>4</sup>, Jingchu Hu<sup>3</sup>, Paul Bodily<sup>5</sup>, Lifeng Tian<sup>6</sup>, Hakon Hakonarson<sup>6</sup>, W Evan Johnson<sup>7</sup>, Zhi Wei<sup>4</sup>, Kai Wang<sup>8,9\*</sup> and Gholson J Lyon<sup>1,2,9\*</sup>



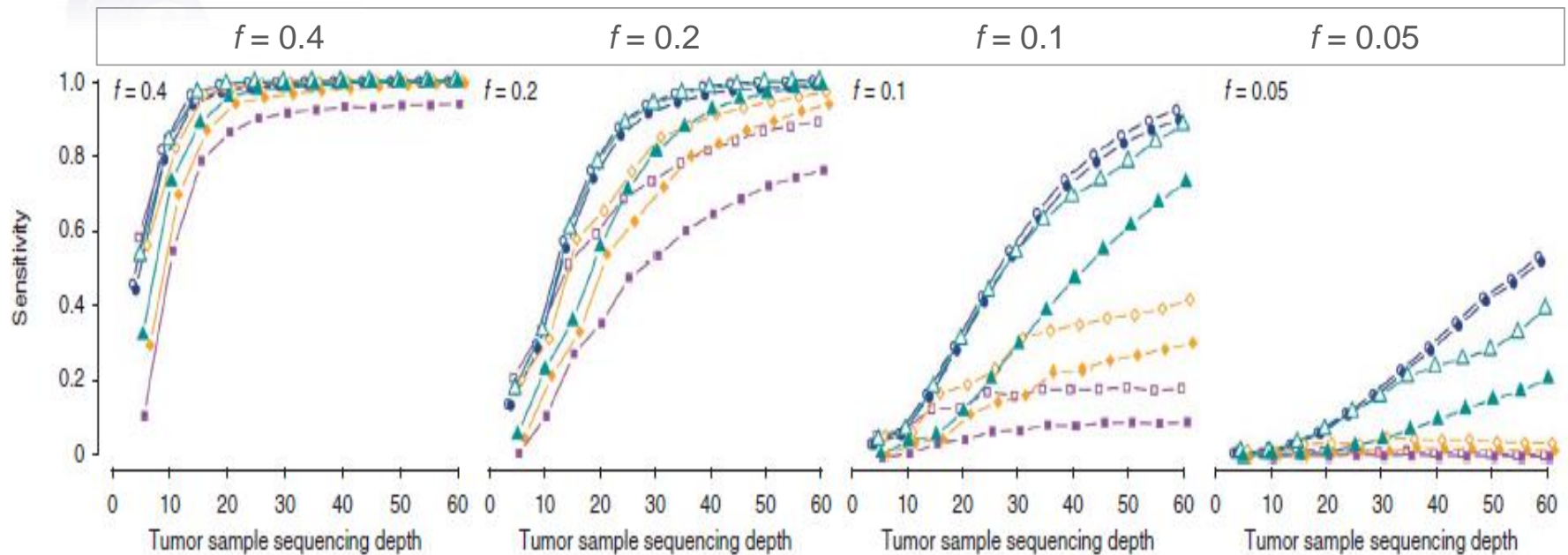
**Conclusions:** Our results suggest that more caution should be exercised in genomic medicine settings when analyzing individual genomes, including interpreting positive and negative findings with scrutiny,



**Figure 1 Sensitivity as a function of mutation allele frequency for five sSNV-detecting tools.** Given an allele frequency value  $f$ , the sensitivity of a tool  $T$  (either JointSNVMix, MuTect, SomaticSniper, Strelka, or VarScan 2) is calculated as:  $S_T = N_T/N_f$  where  $N_f$  is the total number of sSNVs with sequencing depth  $\geq 8$ , the number of alternate allele-supporting reads  $\geq 2$  in the disease sample, and an allele frequency less than  $f$ , and  $N_T$  is the number of sSNVs that the tool  $T$  identified out of these  $N_f$  point mutations.

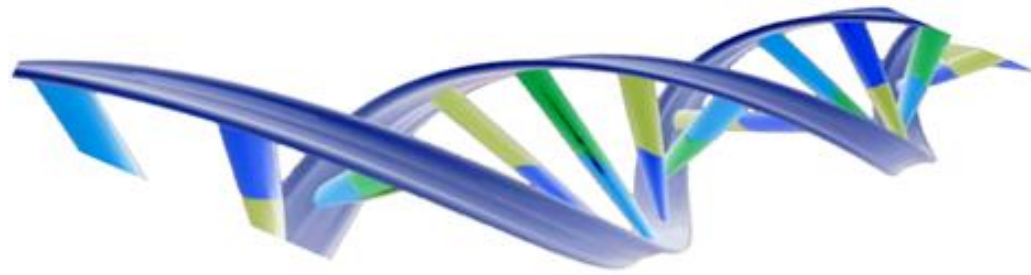


# Sensitivity of mutation detection as a function of sequencing depth and mutated allele frequency ( $f$ )



Cibulskis, K et al., Sensitive detection of somatic point mutations in impure and heterogeneous cancer samples  
*Nature Biotechnology* (2013) 31, 213–219

**Coverage of ~500X is required to detect mutations carried by a subclone representing ~ 1% of the tumor**



# **ANALYSIS OF TUMOR SAMPLES: ISSUES**

**Higher coverage and  
Dedicated Bioinformatic tools**

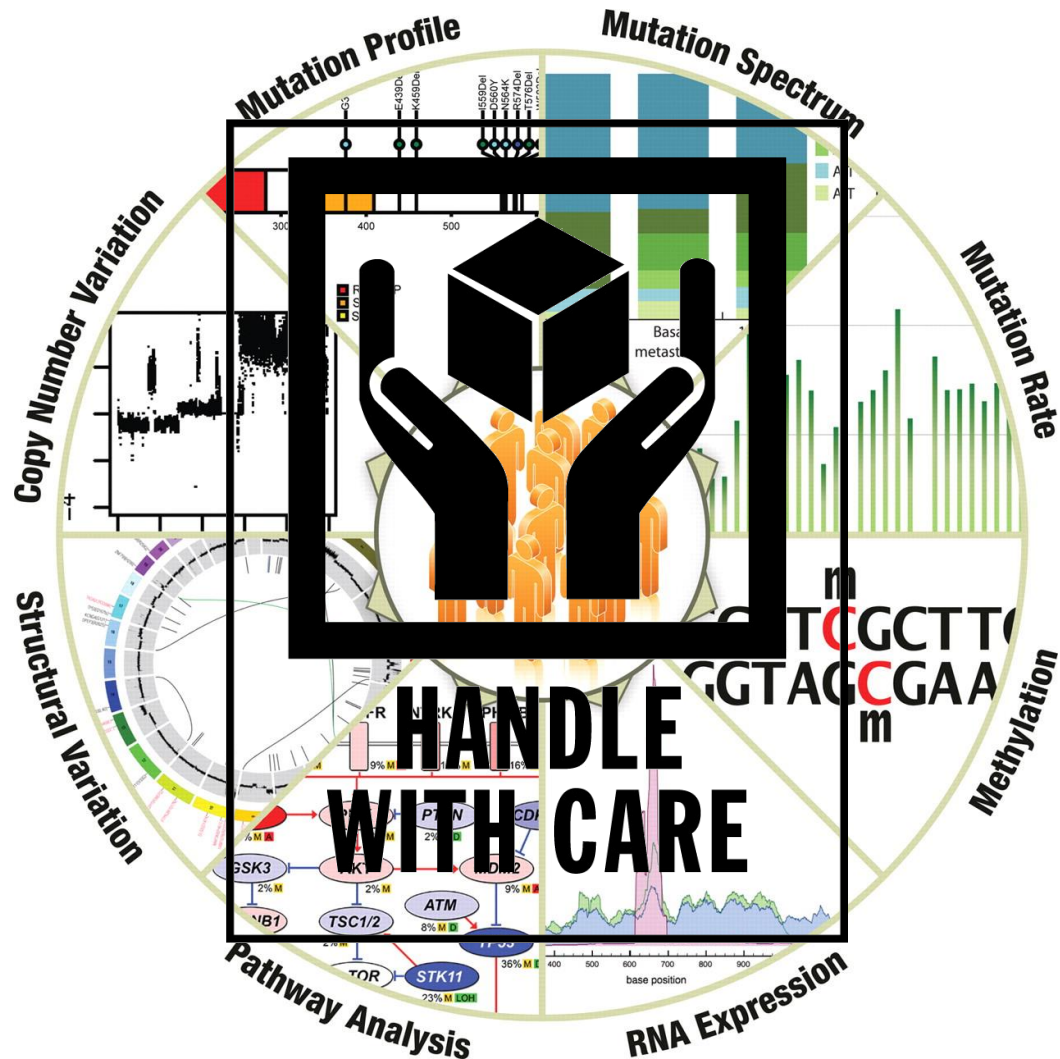
**Need of validation of mutation**

Orthogonal approaches (Sanger, Pyroseq, ASO, others)

Interrogation of large cohorts



# The power of NGS analyses







## Novel Clinically Relevant Genes in Gastrointestinal Stromal Tumors Identified by Exome Sequencing

Sebastian F. Schoppmann<sup>1</sup>, Ursula Vratzner<sup>1</sup>, Niko Popitsch<sup>2</sup>, Martina Mittlböck<sup>2</sup>, Sas Gerd Jomrich<sup>3</sup>, Berthold Straube<sup>4</sup>, and Peter Birner<sup>1</sup>

### Abstract

**Purpose:** Chromosomal gains and losses resulting in altered gene dosage of gastrointestinal stromal tumors (GIST). The aim of our study was the identification of these candidate regions.

**Material and Methods:** A cohort of 17 GISTs was investigated using DNA array analysis (n = 13), and immunohistochemistry (n = 145).

**Results:** Array analysis revealed recurrent copy number variations (CNVs) in 17 GISTs. In 12 GISTs, CNVs were associated with shorter disease-free survival (DFS) and overall survival (OS) in patients showing recurrent CNVs in chromosomes 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14, 15, 16, 17, 18, 19, 20, 21, 22, 23, 24, 25, 26, 27, 28, 29, 30, 31, 32, 33, 34, 35, 36, 37, 38, 39, 40, 41, 42, 43, 44, 45, 46, 47, 48, 49, 50, 51, 52, 53, 54, 55, 56, 57, 58, 59, 60, 61, 62, 63, 64, 65, 66, 67, 68, 69, 70, 71, 72, 73, 74, 75, 76, 77, 78, 79, 80, 81, 82, 83, 84, 85, 86, 87, 88, 89, 90, 91, 92, 93, 94, 95, 96, 97, 98, 99, 100, 101, 102, 103, 104, 105, 106, 107, 108, 109, 110, 111, 112, 113, 114, 115, 116, 117, 118, 119, 120, 121, 122, 123, 124, 125, 126, 127, 128, 129, 130, 131, 132, 133, 134, 135, 136, 137, 138, 139, 140, 141, 142, 143, 144, 145, 146, 147, 148, 149, 150, 151, 152, 153, 154, 155, 156, 157, 158, 159, 160, 161, 162, 163, 164, 165, 166, 167, 168, 169, 170, 171, 172, 173, 174, 175, 176, 177, 178, 179, 180, 181, 182, 183, 184, 185, 186, 187, 188, 189, 190, 191, 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2156, 2



**Screening**

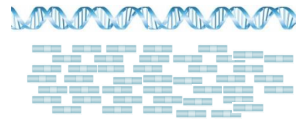
**Diagnosis**

**Prognosis**

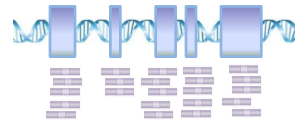
**Personalized therapy**

**Disease monitoring**

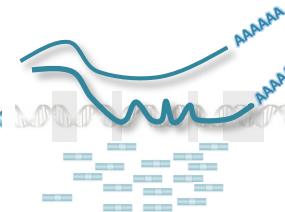
**Whole genome-seq**



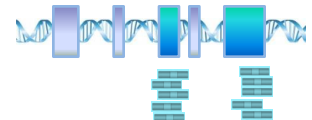
**Whole exome-seq**



**RNA-seq**



**Target-seq**



**Genome**

Structural variants  
Point mutations/InDels  
CNV

**Exome**

(protein-coding regions)

Point mutations/InDels  
CNV

**Transcriptome**

Gene expression  
Gene fusions  
Splice variants

**Selected list  
of genes/hot-spots**

Point mutations/InDels  
CNV

**Breath**

## NGS rule of thumb

**Breath x Depth = Cost**

*'complexity' x 'accuracy' = cost*

# TARGETED SEQUENCING

**Screening**

**Diagnosis**

**Prognosis**

**Personalized therapy**

**Disease monitoring**



**Accurate, fast and cost-effective analysis  
of a selected set  
of clinically actionable mutations**



# TARGETED SEQUENCING



The NEW ENGLAND JOURNAL of MEDICINE

Perspective  
DECEMBER 19, 2013

FDA Approval of Illumina Miseq  
for genetic/genomic testing

First FDA Authorization for Next-Generation Sequencer

Francis S. Collins, M.D., Ph.D., and Margaret A. Hamburg, M.D.



**Screening**

**Diagnosis**

**Prognosis**

**Personalized therapy**

**Disease monitoring**

Accurate, fast and cost-effective analysis  
of a selected set  
of clinically actionable mutations



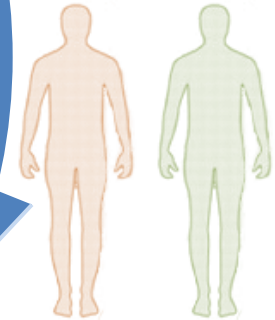




**Genetic/genomic/epigenetic  
investigations**

**Increased knowledge**

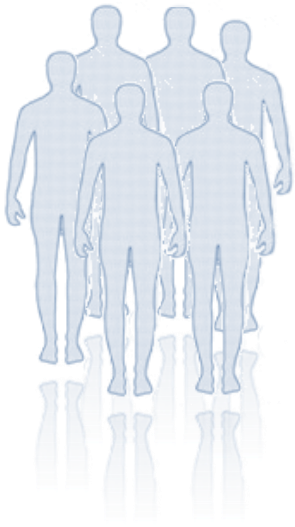
**Hypotheses for  
Patient risk stratification**



**Validation/Exploitation**



**Personalized medicine**



# **Cycle of personalized cancer medicine**



**Thank you**

**Roberta Maestro  
CRO Aviano**



# Sarcoma and GIST Conference

Milano, 18-19 February, 2014



GOOD SCIENCE  
BETTER MEDICINE  
BEST PRACTICE



New technologies may be upsetting....





Invited Review

## Does massively parallel DNA resequencing signify the end of histopathology as we know it?

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These technologies **will become part of histopathology practice** and will augment microscopy, either directly or indirectly, through the **incorporation of novel sequencing-based diagnostics into routine pathology practice**

