

# Copy Number and Structural Variation

Chris Miller

Some slides adapted from:

Malachi Griffith, Obi Griffith, Fouad Yousif

**High-Throughput Biology: From Sequence to Networks**

[https://github.com/griffithlab/rnaseq\\_tutorial\\_wiki/blob/master/LectureFiles/cbw-cshl/2017/IGV\\_Tutorial\\_Brief.pptx](https://github.com/griffithlab/rnaseq_tutorial_wiki/blob/master/LectureFiles/cbw-cshl/2017/IGV_Tutorial_Brief.pptx)

Tobias Rausch

**Structural and copy-number variation analysis**

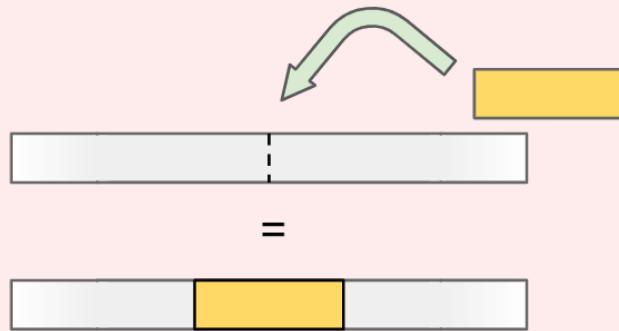
<https://www.ebi.ac.uk/training/materials/cancer-genomics-materials/structural-and-copy-number-variation-mutational-signatures/structural-and-copy-number-variation-analysis/>



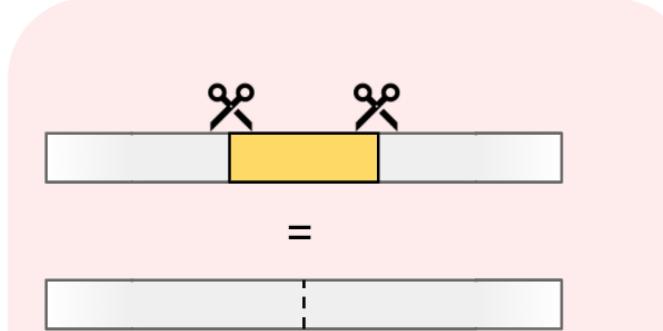
# SV Types

Destructive (non-balanced)

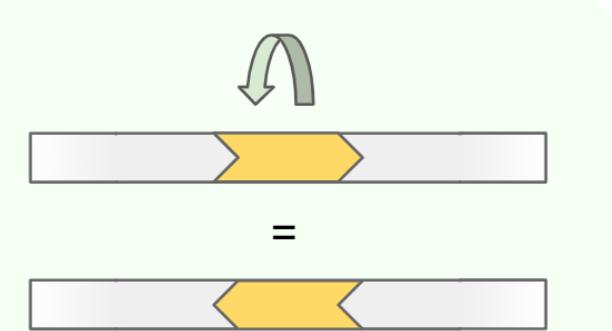
Non-destructive (balanced)



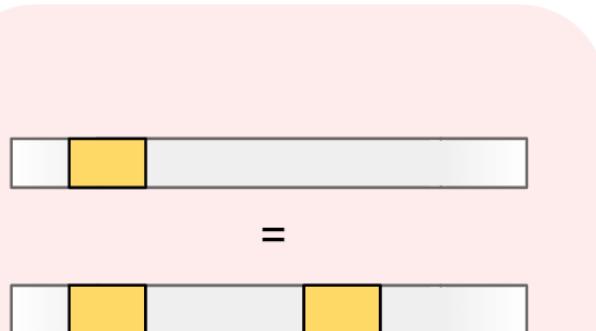
Insertion



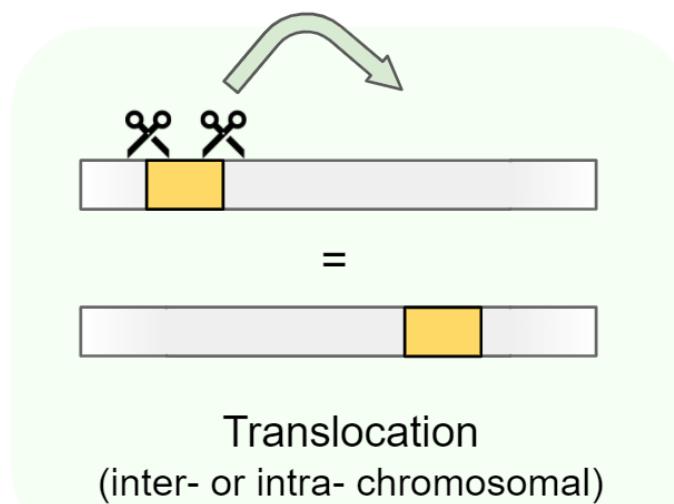
Deletion



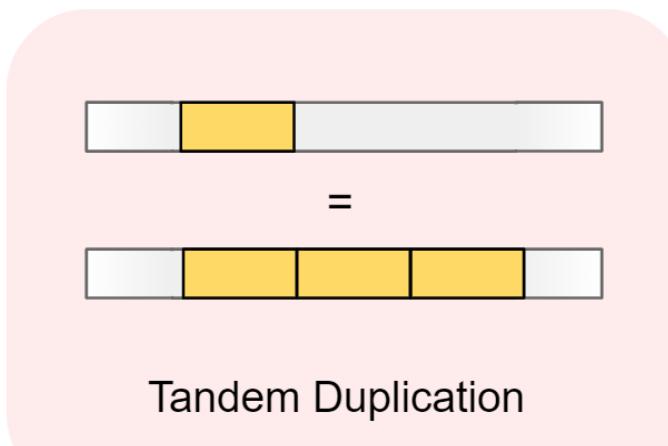
Inversion



Interspersed  
Duplication



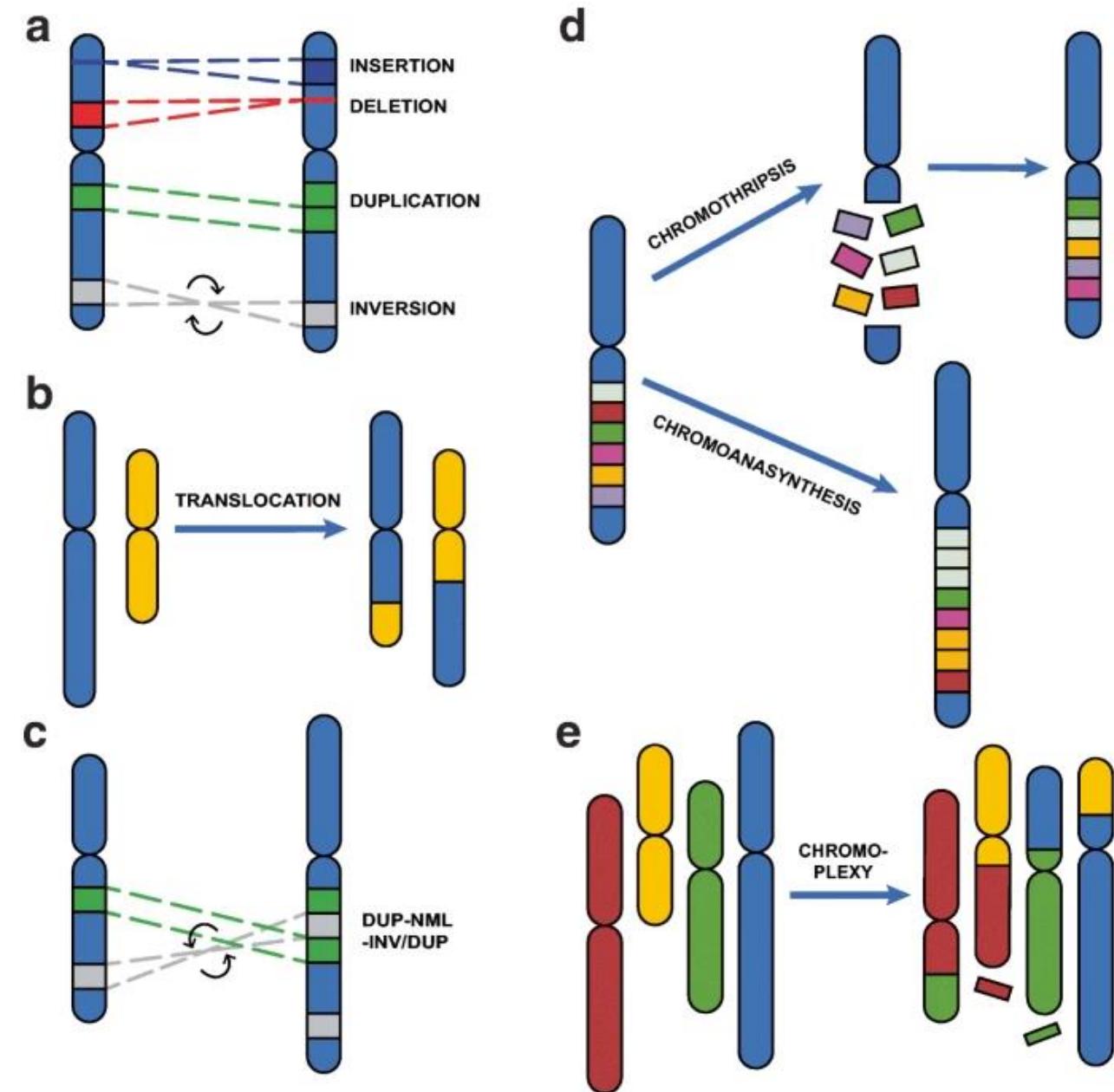
Translocation  
(inter- or intra- chromosomal)



Tandem Duplication

# Types of Structural Variation

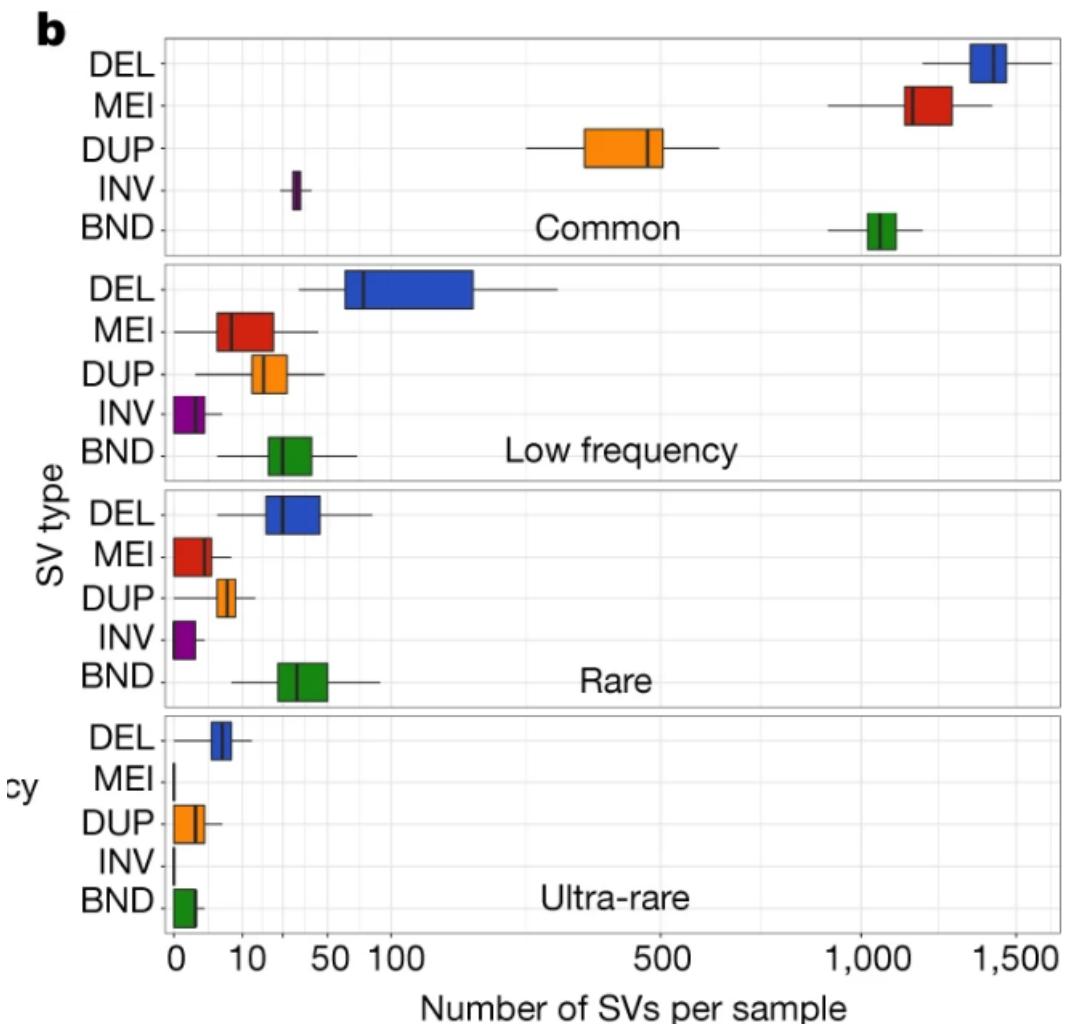
SVs can get complicated!



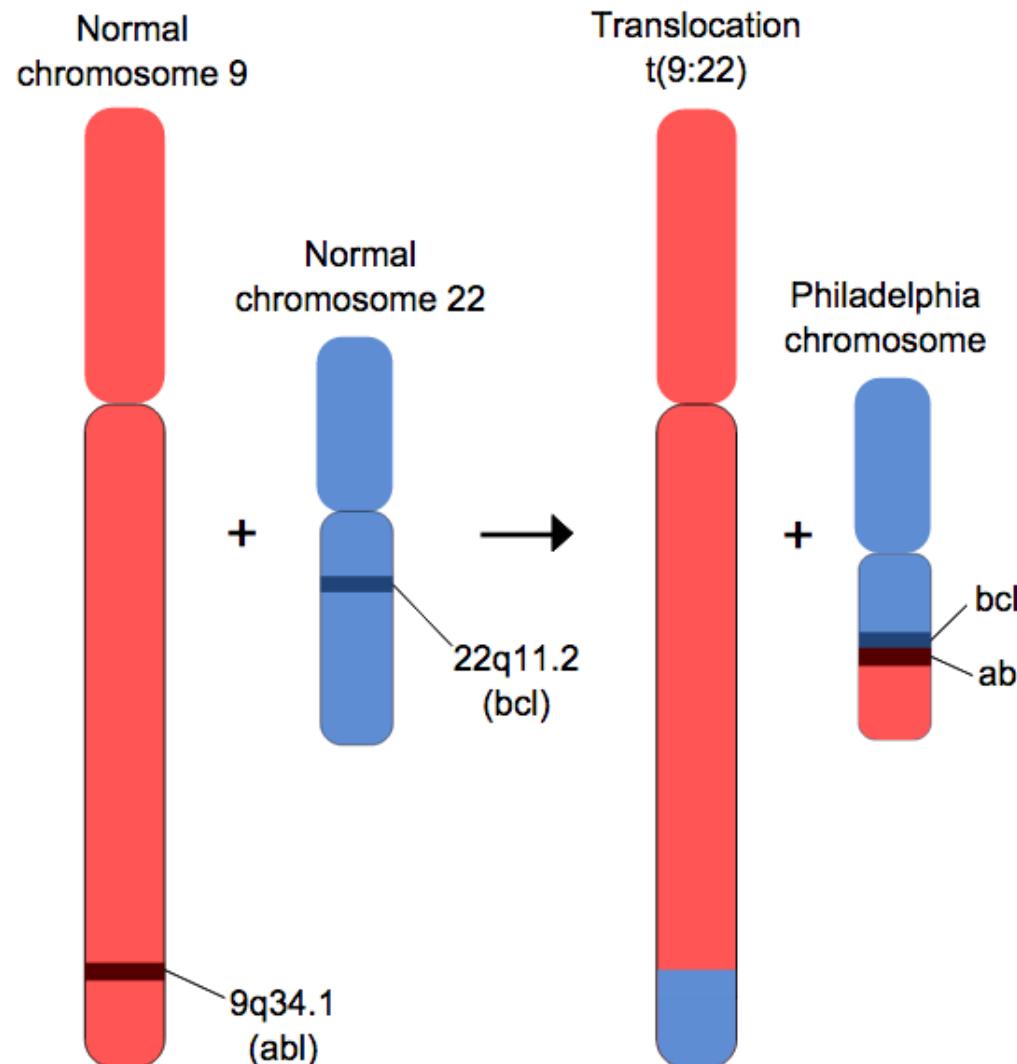
# Genomic diversity from SVs

- Underappreciated due to past limitations of technology
- probably about 1% of each genome (by bp) differs from the reference
  - only 0.1% different by SNPs

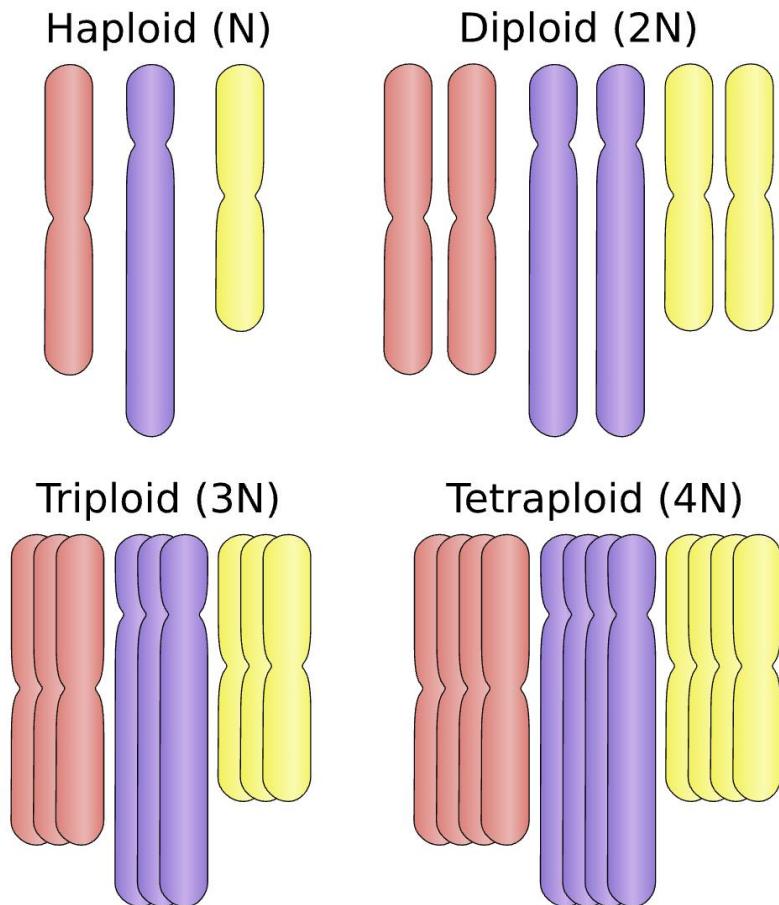
SV calls from WGS of 14,623 samples



# Somatic SVs are a frequent cause of cancer



# Polyplody

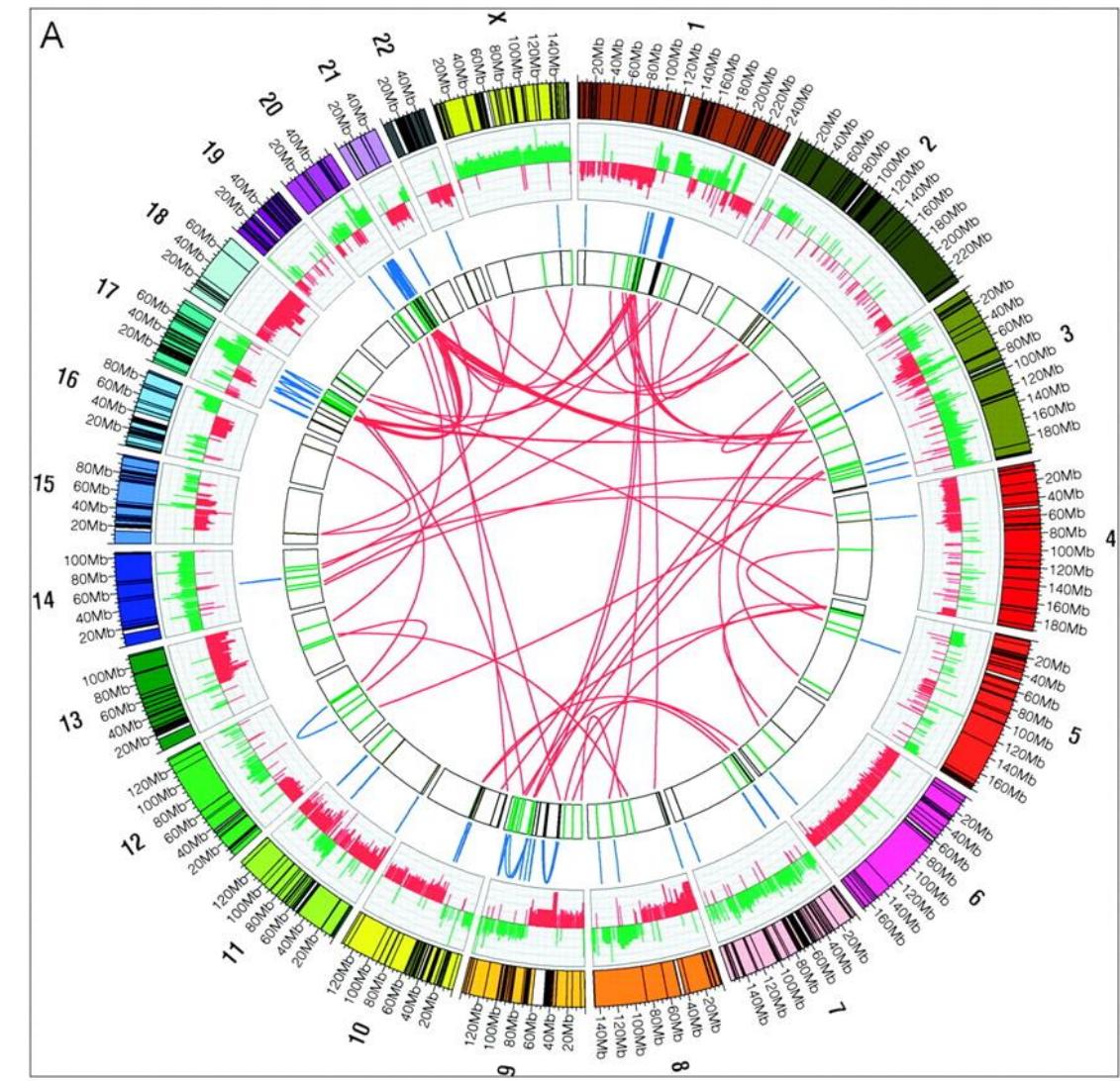
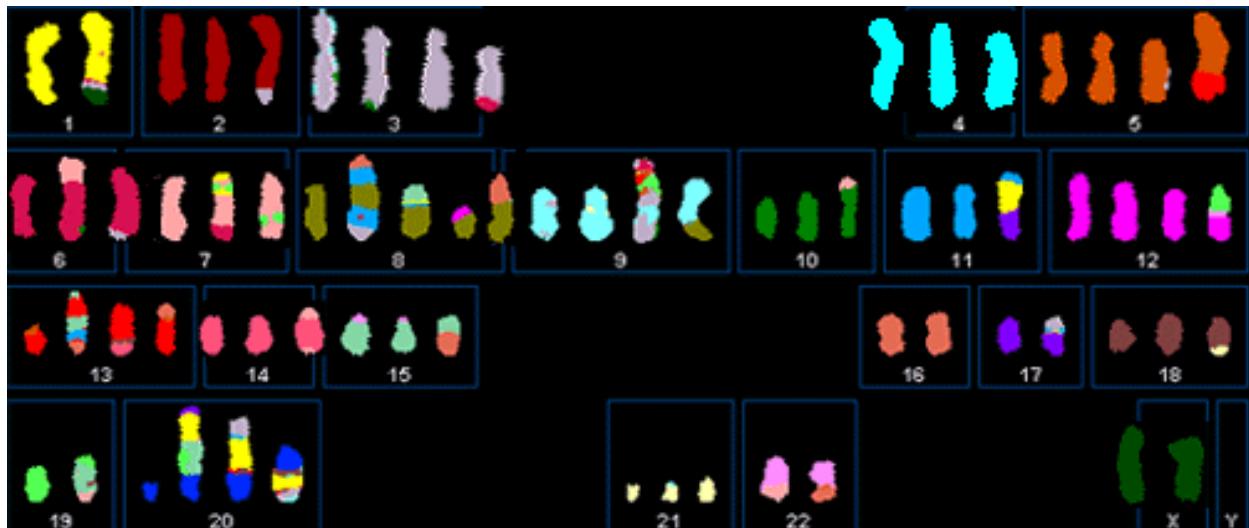


# Whole Genome Doubling



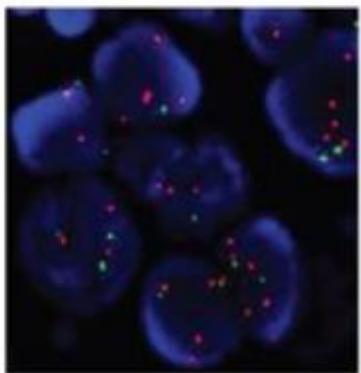
# Somatic SVs are a frequent cause of cancer

MCF7 Breast Cancer cell line

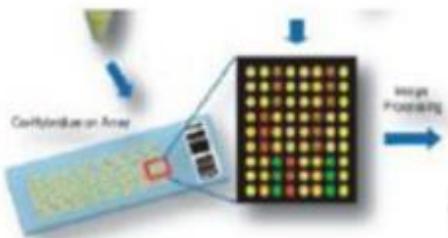


# Copy Number detection

Tech: FISH  
#: <10



Array CGH  
30-100K



Genotype arrays  
100K-2M



WGS  
3G!



Resolution

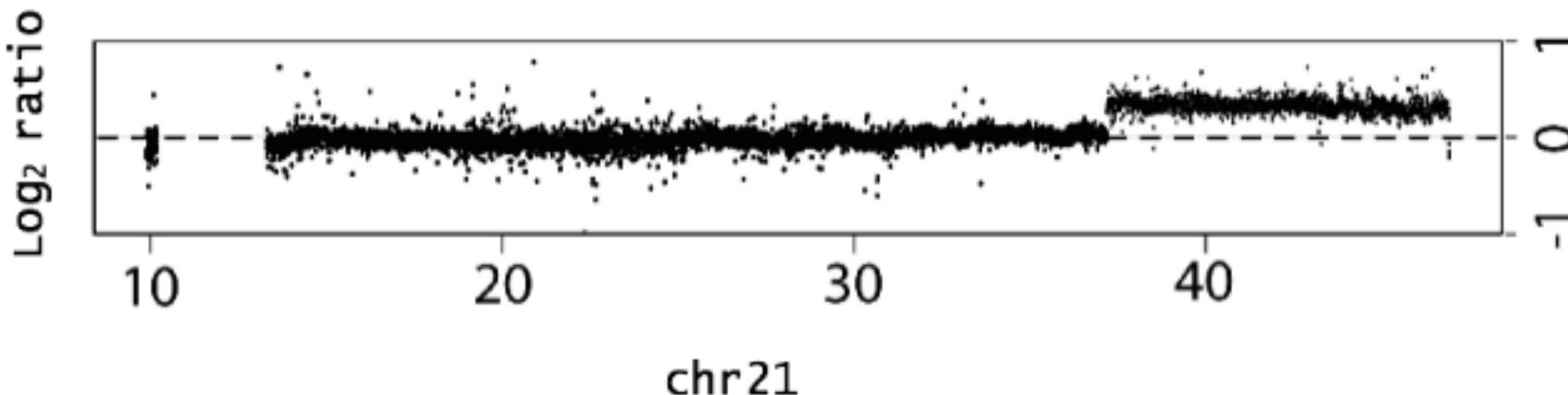
# Copy Number detection

- Read counting in windows for tumor and normal data



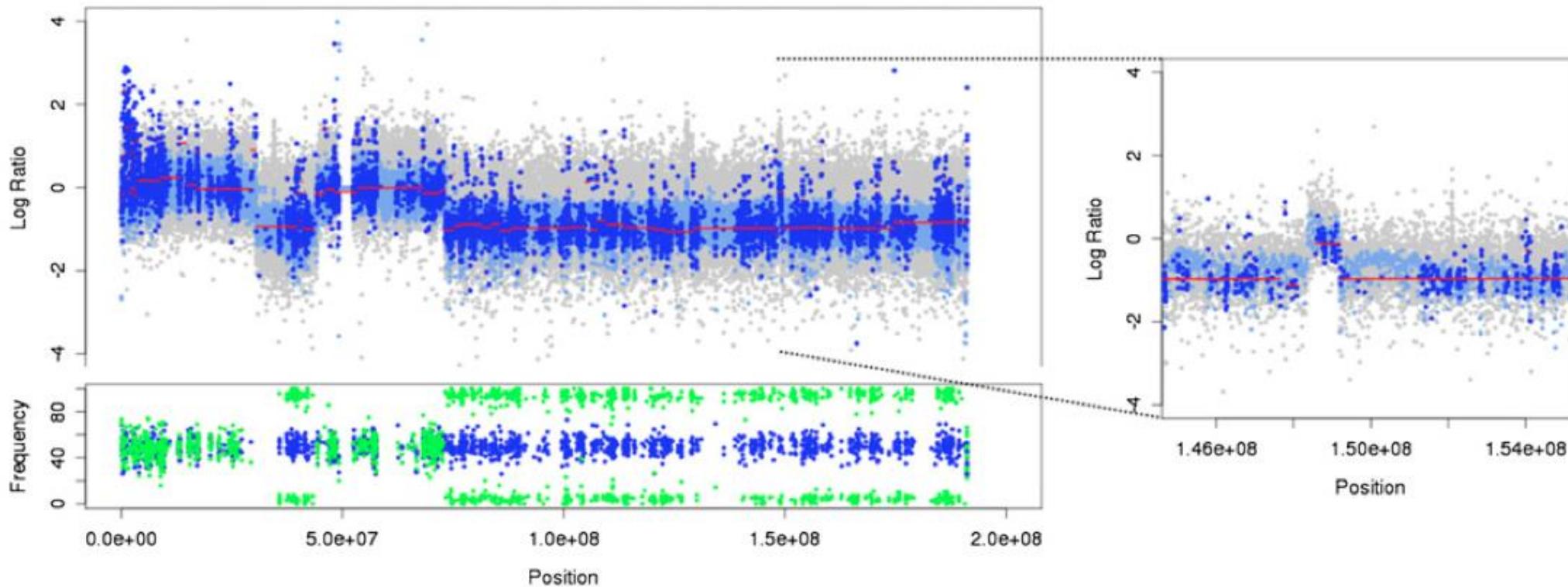
- Log2 ratio for each window
- Chromosome-wide plot

$$\log_2 \frac{\text{\# Reads}_{Disease}}{\text{\# Reads}_{Normal}}$$



# Copy Number detection

- Gets more noisy with targeted sequencing, but still works!



- B-allele frequency for CN-neutral Loss of Heterozygosity

# Copy Number detection

- Other factors:
  - Sample prep
  - GC-bias
  - Probe affinities
  - Sample Purity
  - Subclonal populations
- Cleaner data, deeper data = higher resolution
  - even a 0.5x low-pass WGS experiment can pick up large events!

# Copy Number detection

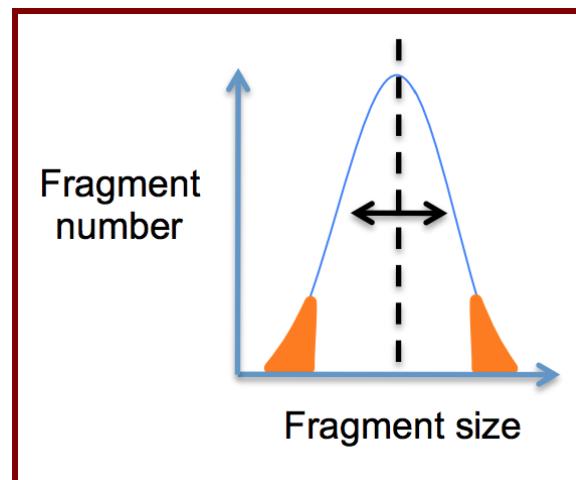
- There are few decent packages for doing this
- CNVkit is my go-to algorithm these days

# Paired-end sequencing

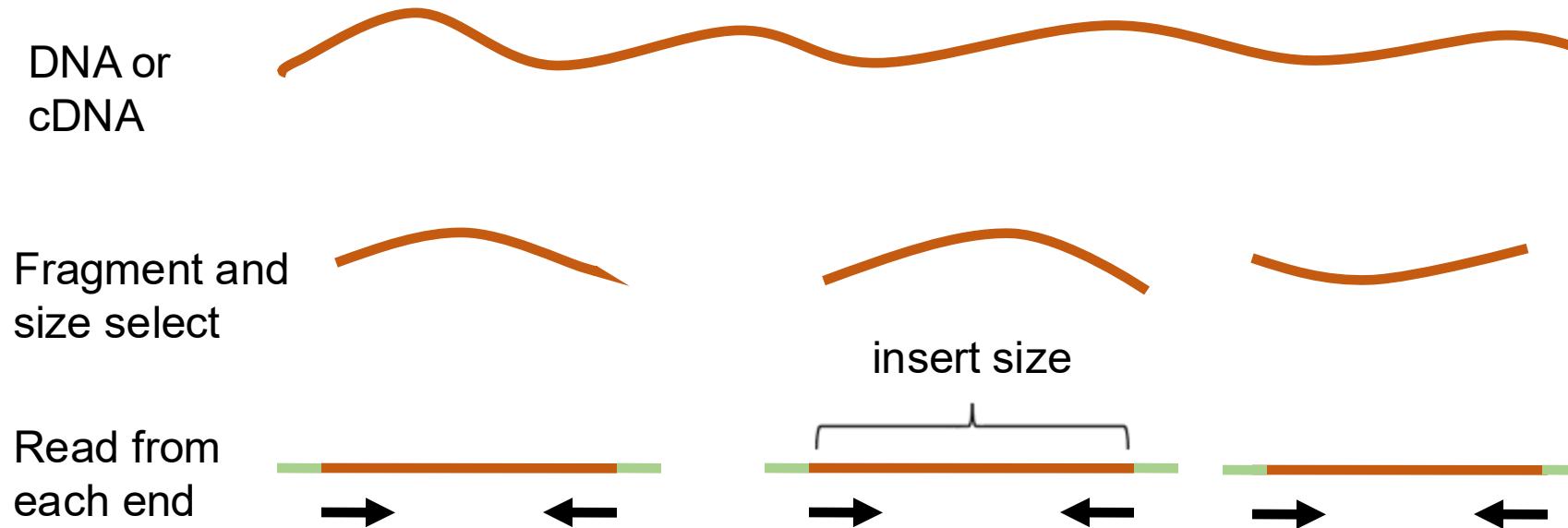
DNA or  
cDNA



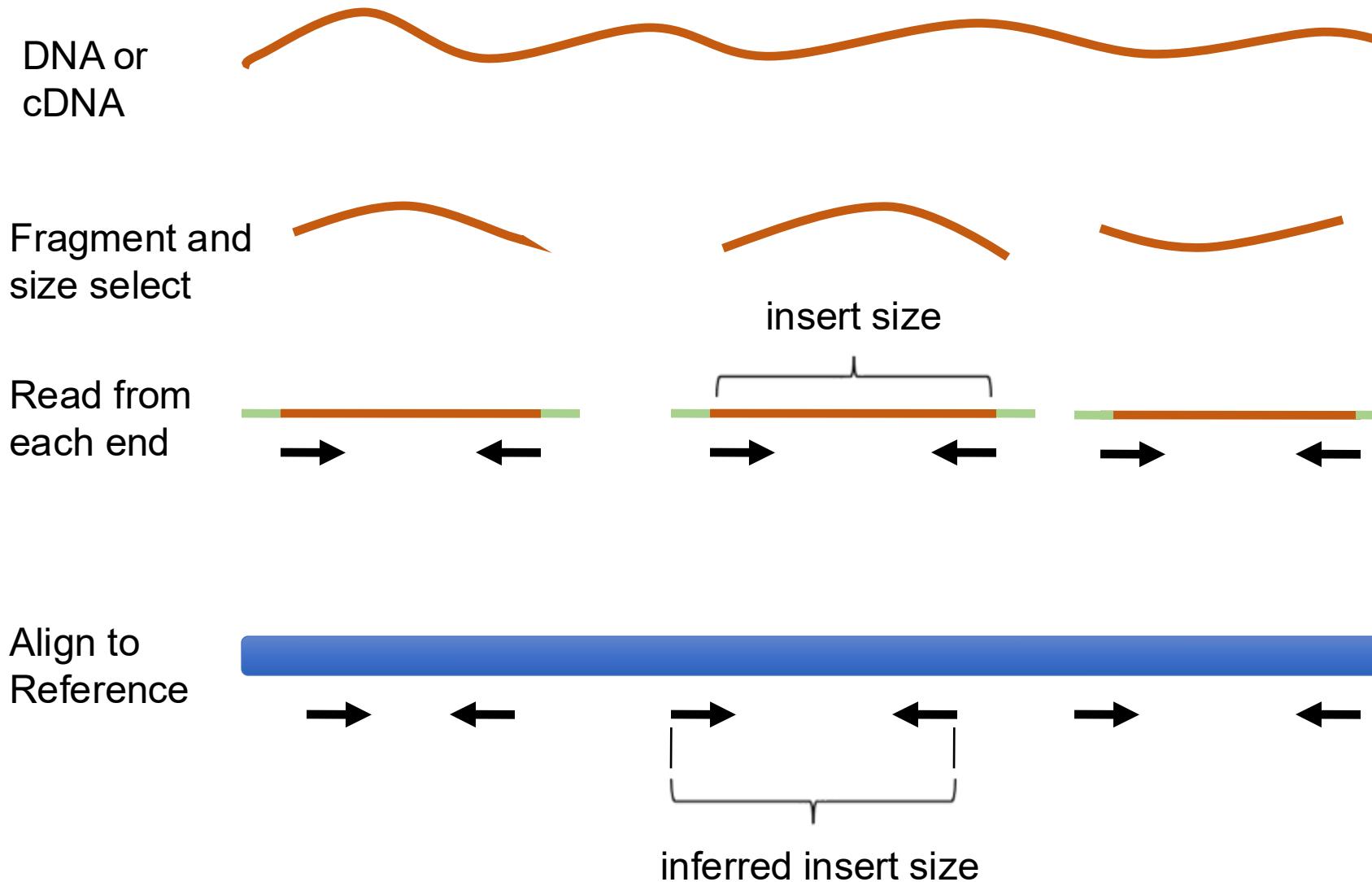
Fragment and  
size select



# Paired-end sequencing



# Paired-end sequencing



# Interpreting inferred insert size

The “inferred insert size” can be used to detect structural variants including

- Deletions
- Insertions
- Inter-chromosomal rearrangements:  
(Undefined insert size)

# Deletion

What is the effect of a deletion on inferred insert size?

# Deletion

Reference  
Genome



Subject



# Deletion

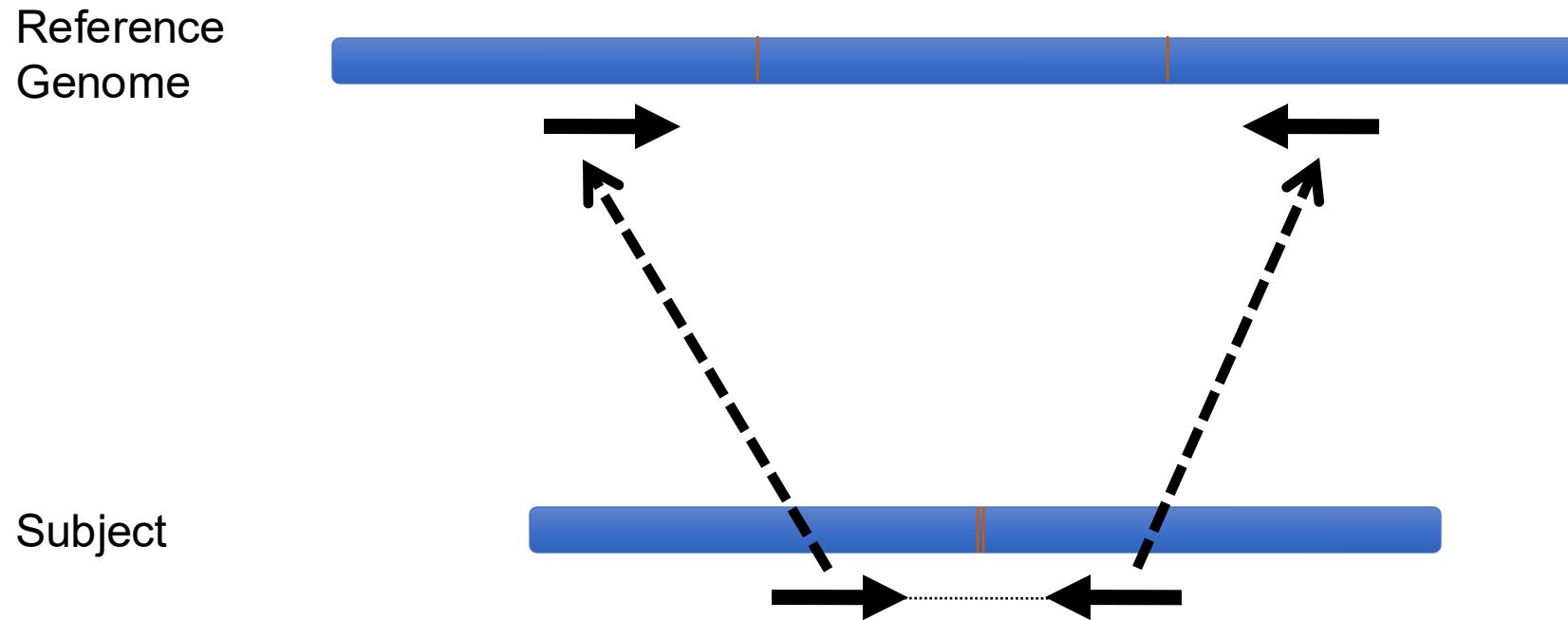
Reference  
Genome



Subject



# Deletion



# Deletion

Inferred insert size is > expected value

Reference  
Genome



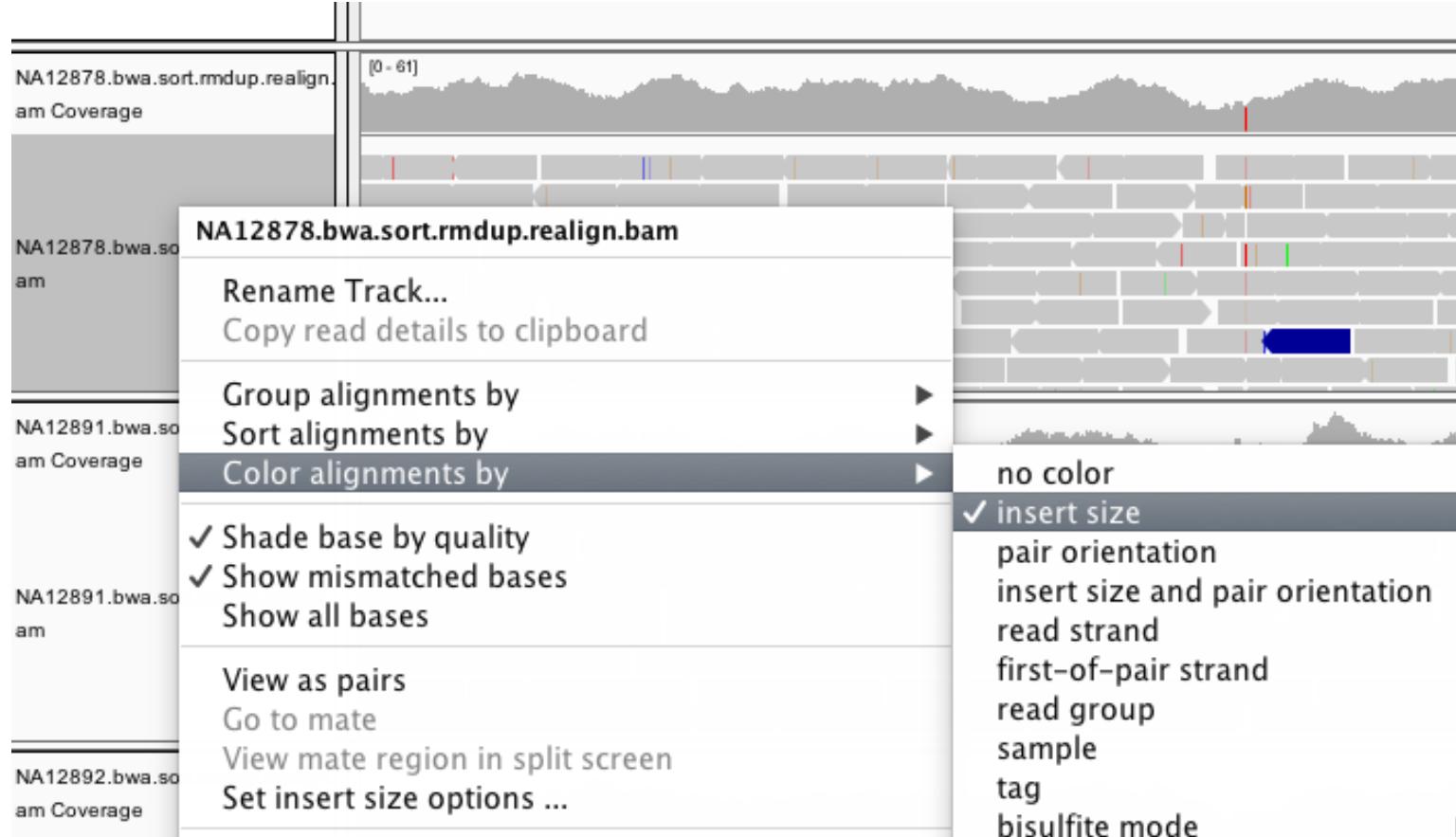
inferred insert size

Subject

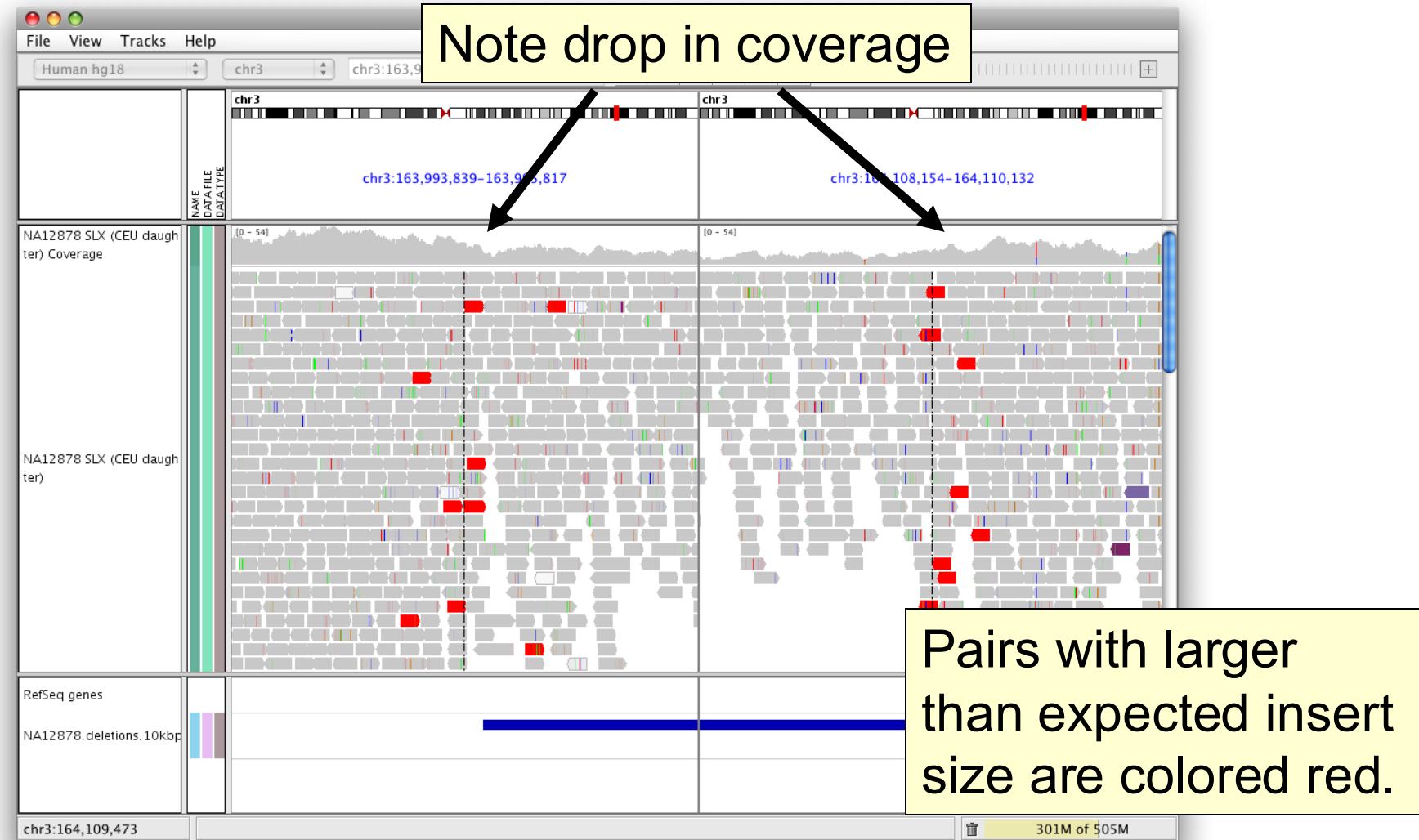


expected insert size

# Color by insert size



# Deletion



# Insert size color scheme

- Smaller than expected insert size:

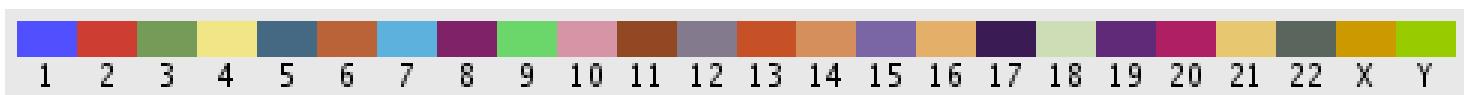


- Larger than expected insert size:

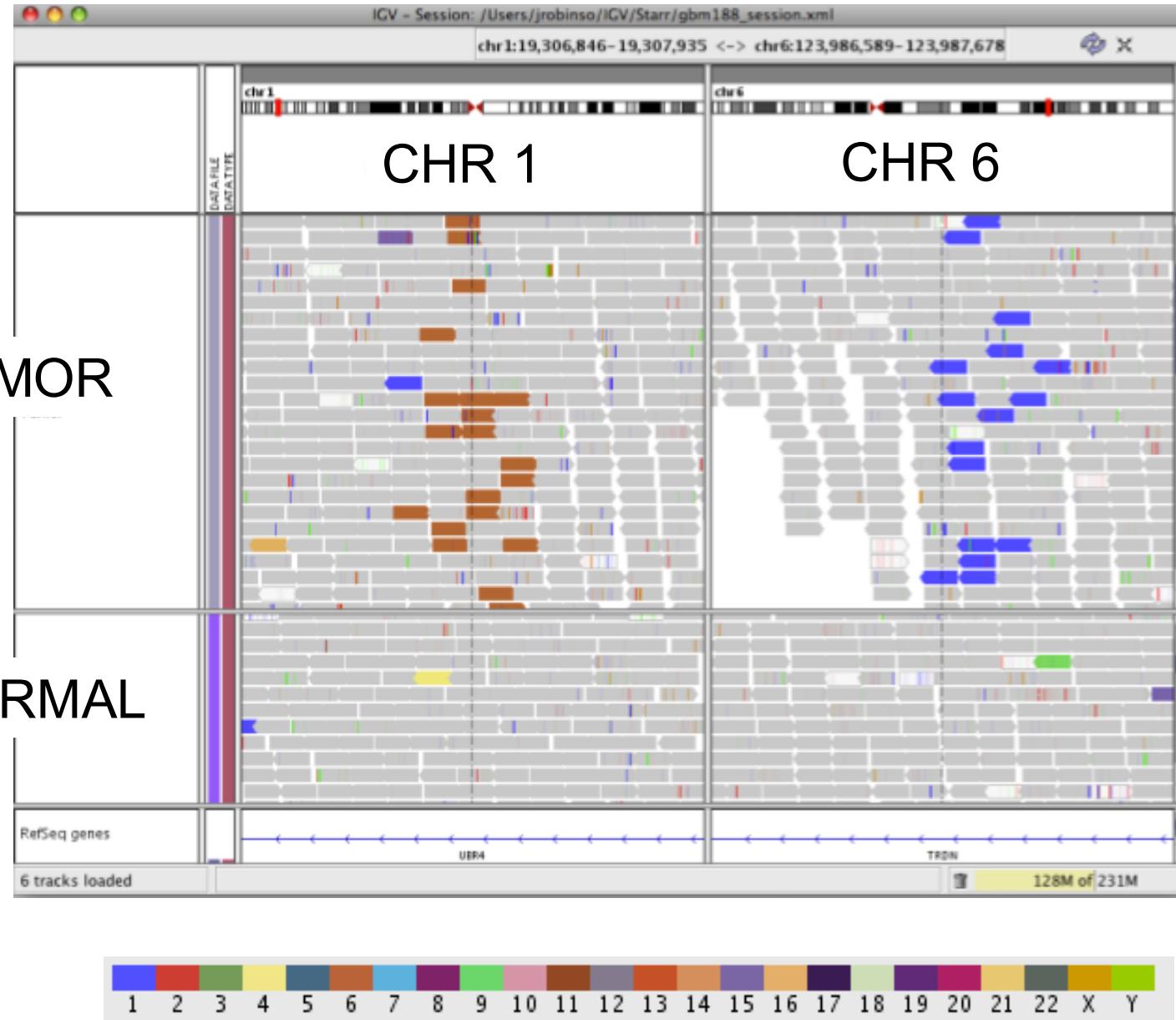


- Pairs on different chromosomes

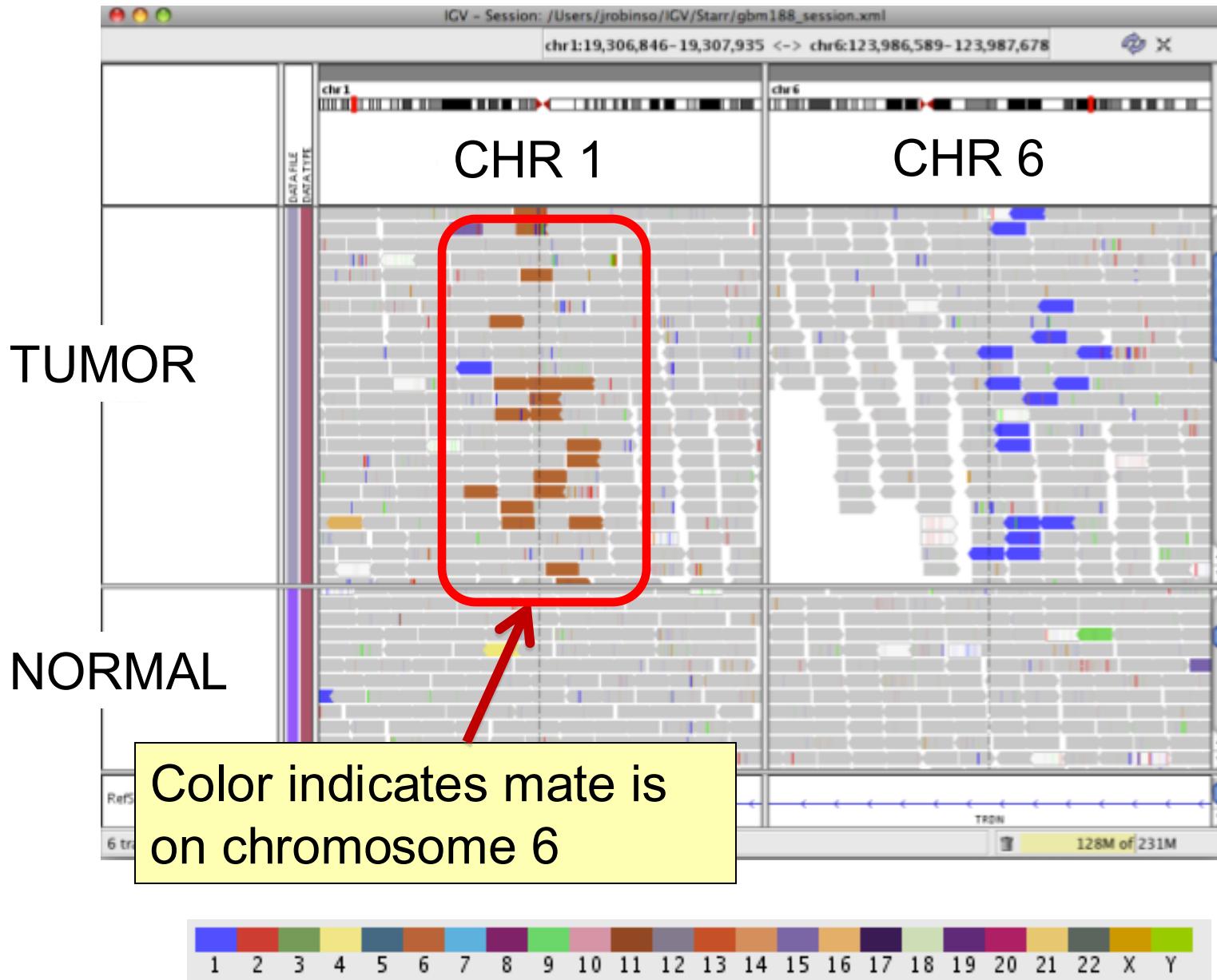
*Each end colored by chromosome of its mate*



# Rearrangement



# Rearrangement



# Interpreting Read-Pair Orientations

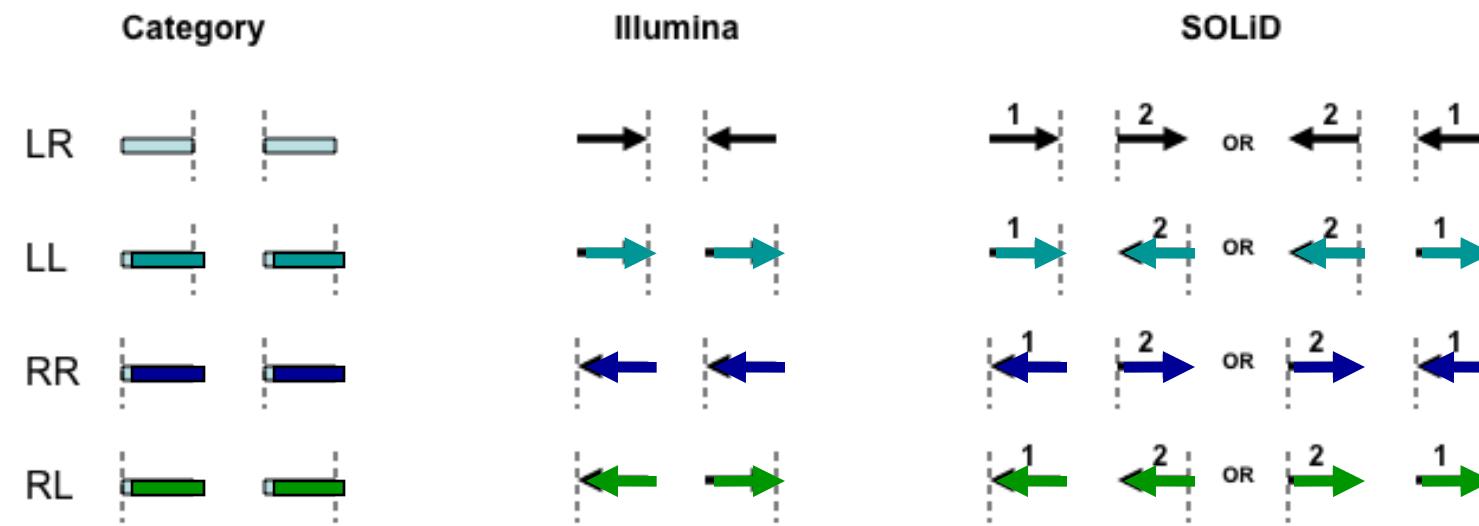
Orientation of paired reads can reveal structural events:

- Inversions
- Duplications
- Translocations
- Complex rearrangements

Orientation is defined in terms of

- read strand, left *vs* right, *and*
- read order, first *vs* second

## Interpretation of read pair orientations



LR      Normal reads.  
The reads are left and right (respectively) of the unsequenced part of the sequenced DNA fragment when aligned back to the reference genome.

LL,RR    Implies inversion in sequenced DNA with respect to reference.

RL       Implies duplication or translocation with respect to reference.

These categories only apply to reads where both mates map to the same chromosome.

*Figure courtesy of Bob Handsaker*

# Inversion

Reference  
genome

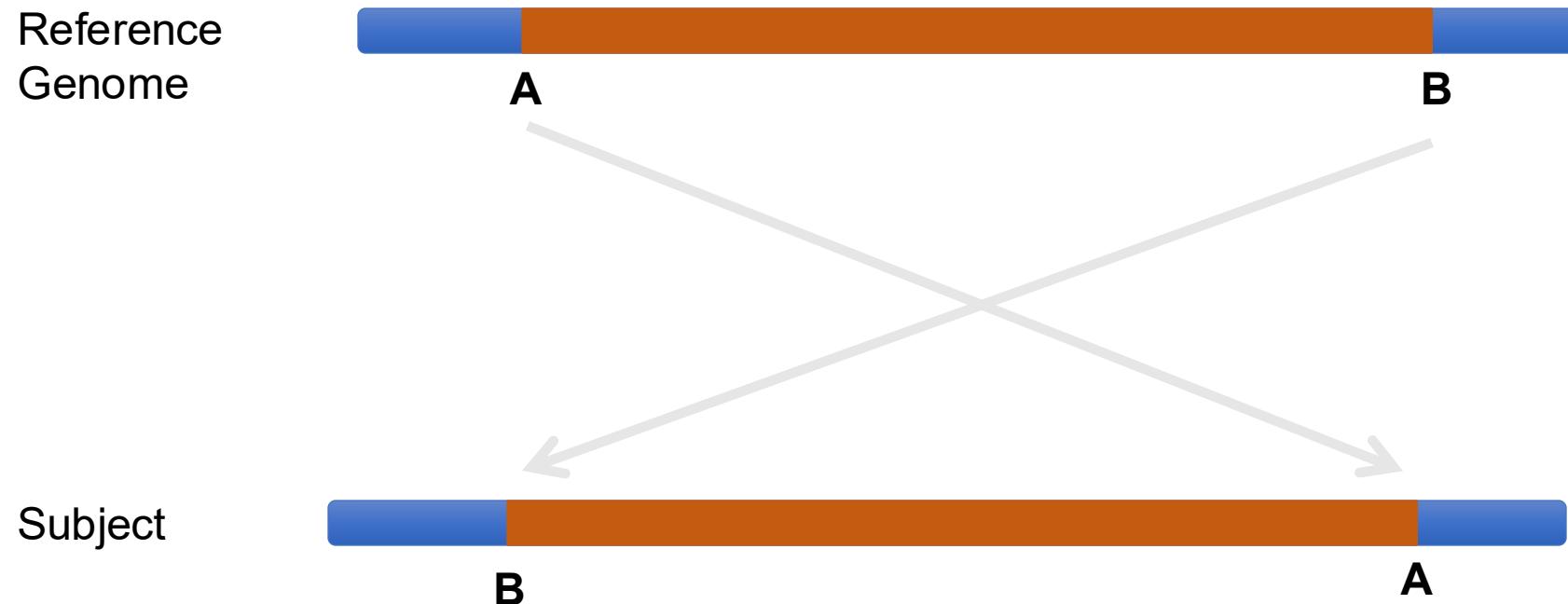


# Inversion

Reference  
genome



# Inversion



# Inversion

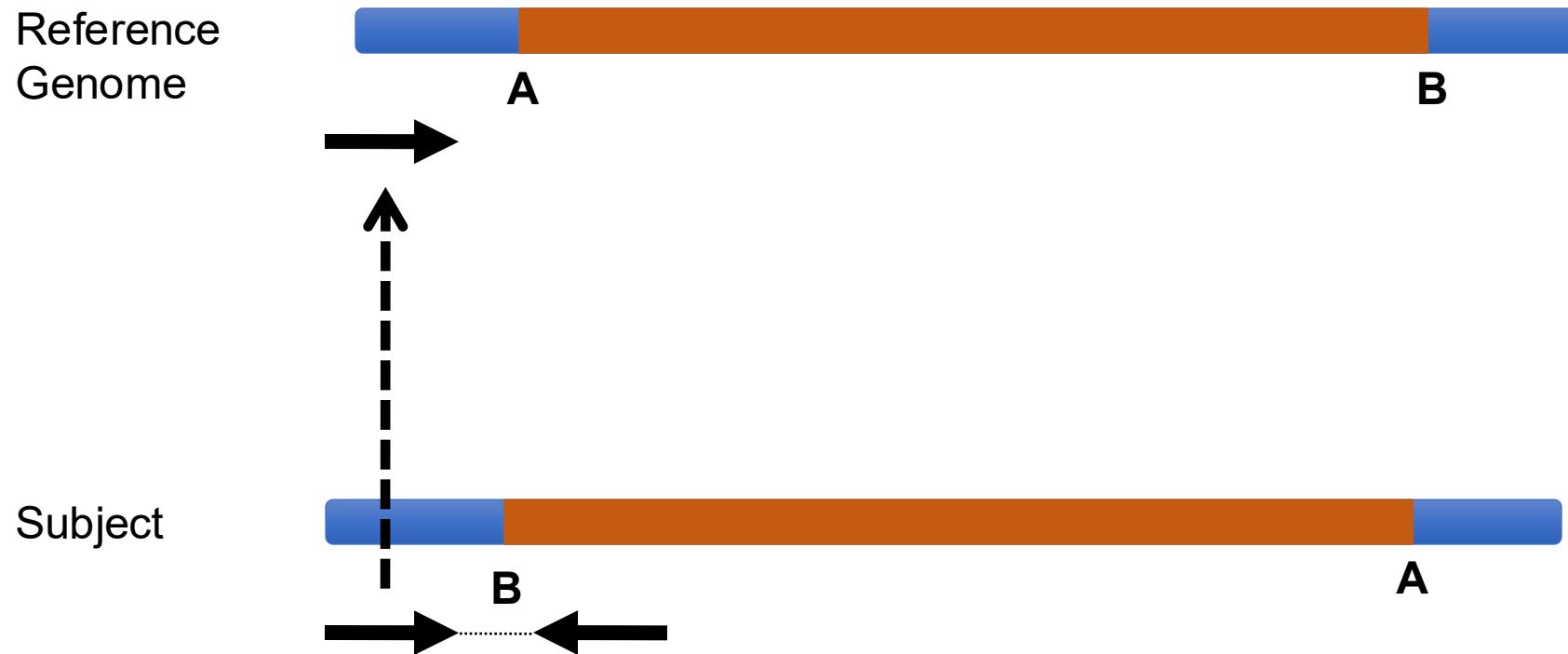
Reference  
Genome



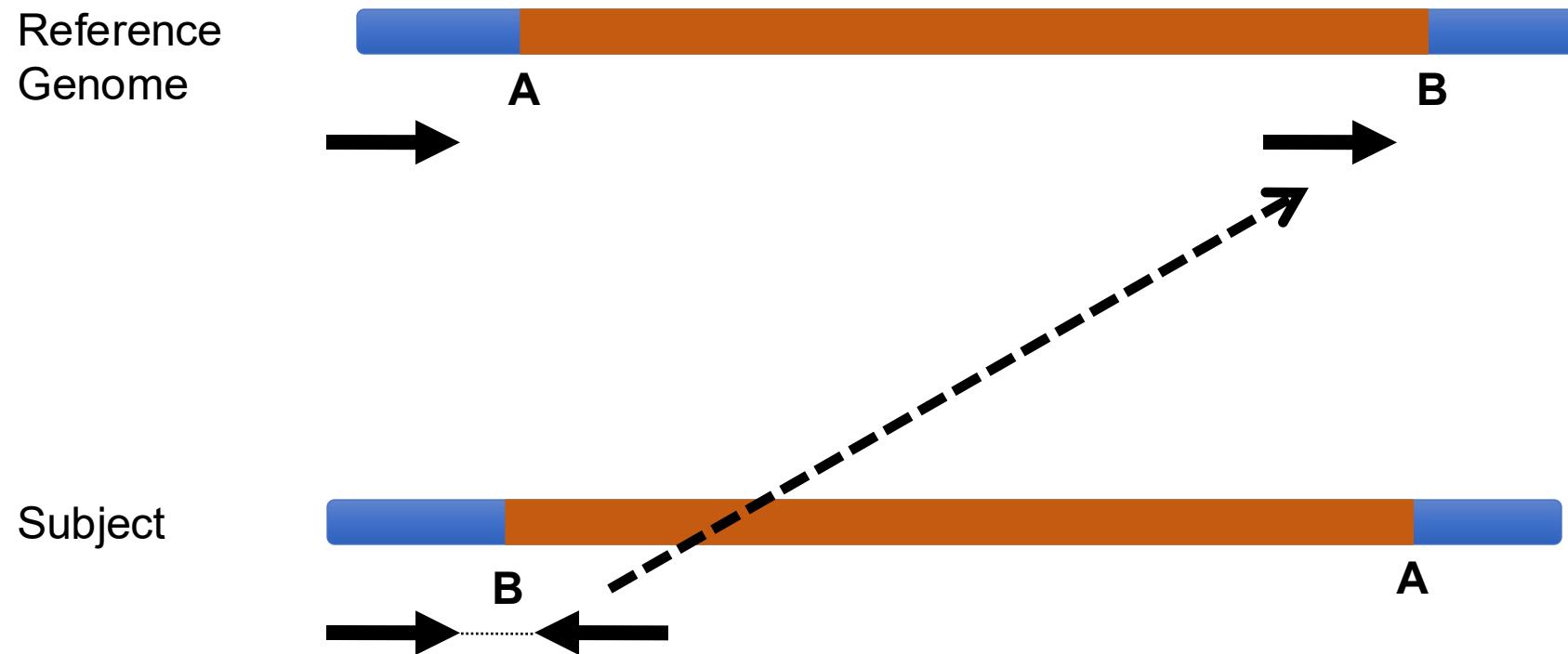
Subject



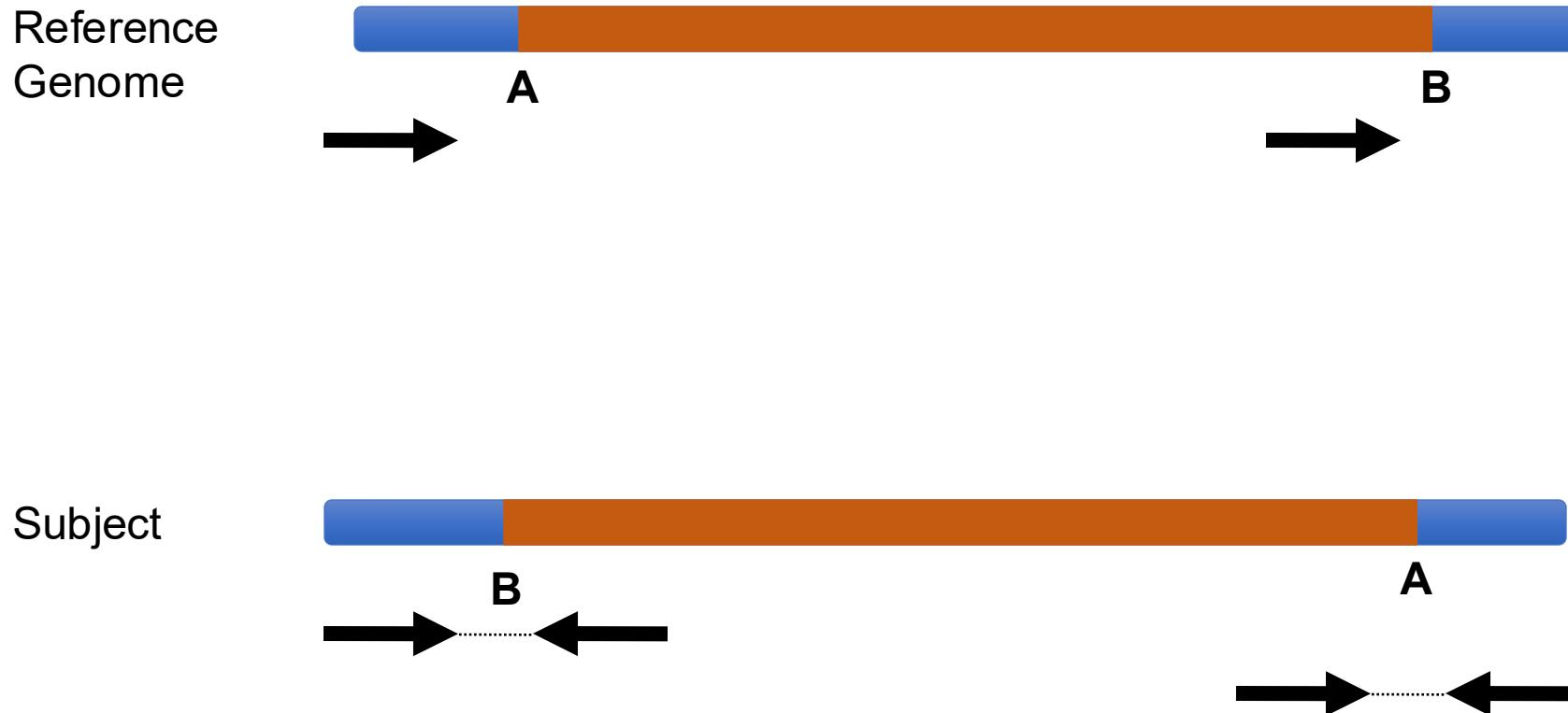
# Inversion



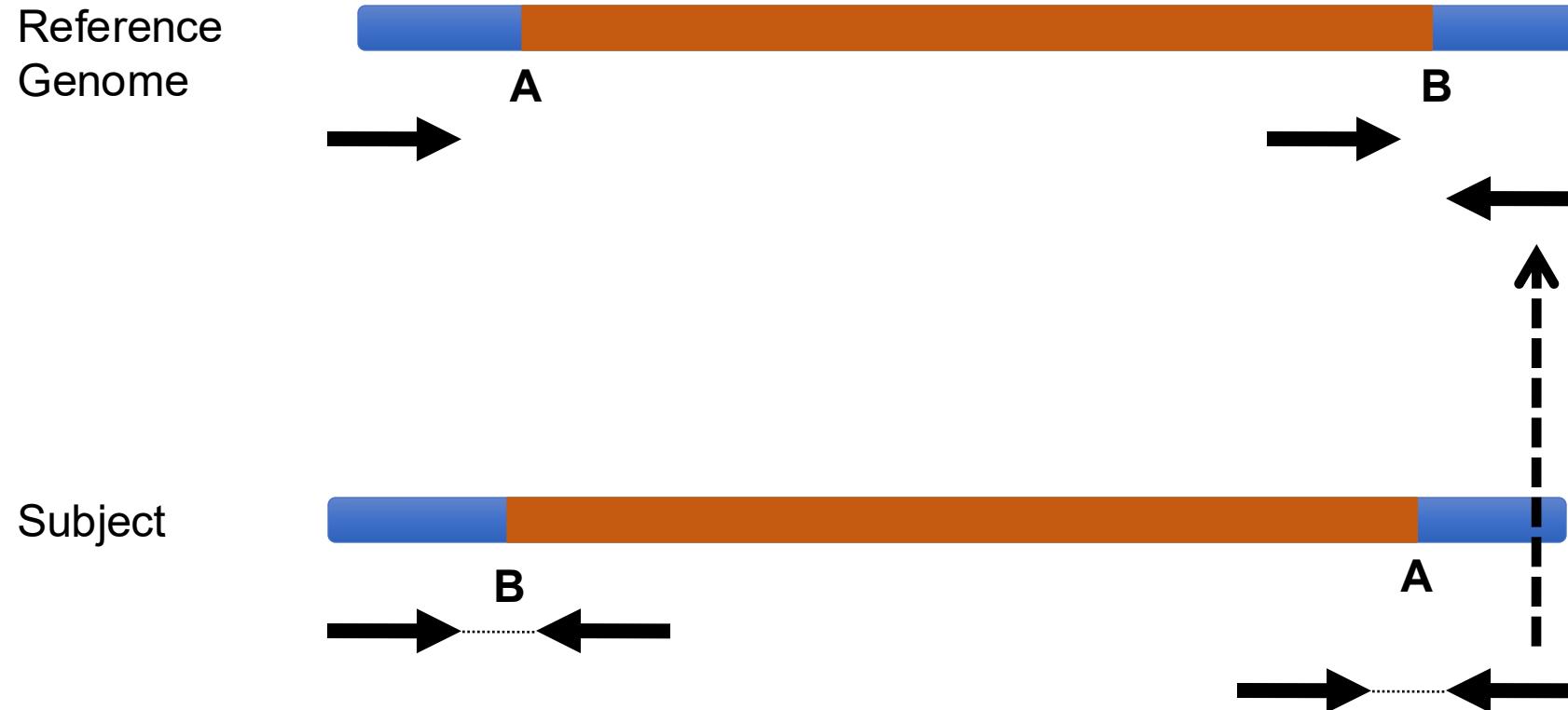
# Inversion



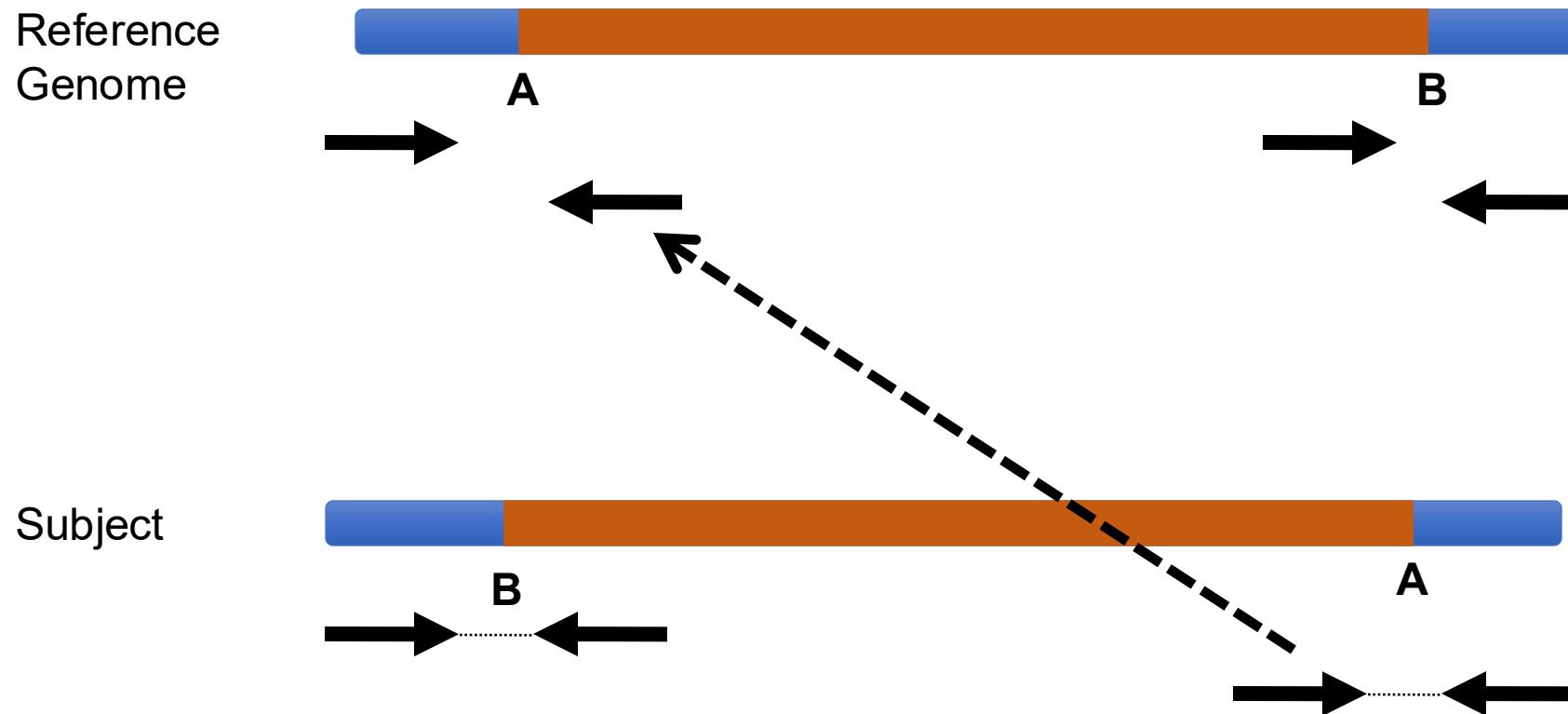
# Inversion



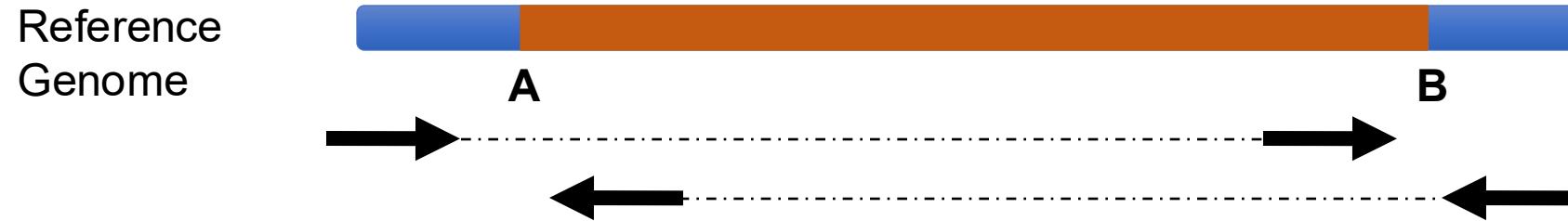
# Inversion



# Inversion



# Inversion

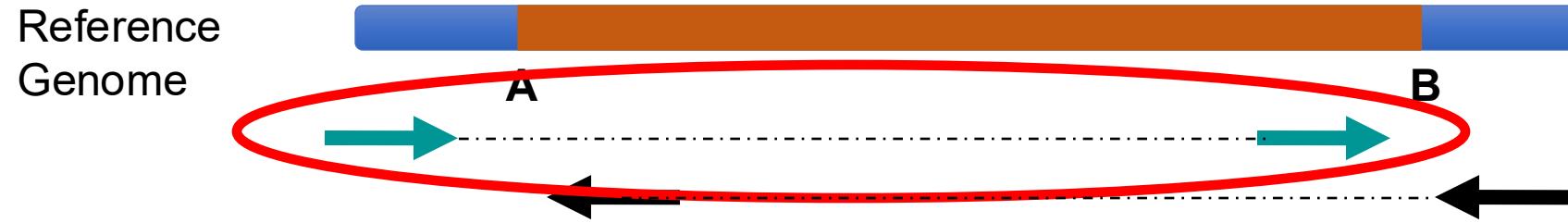


# Inversion



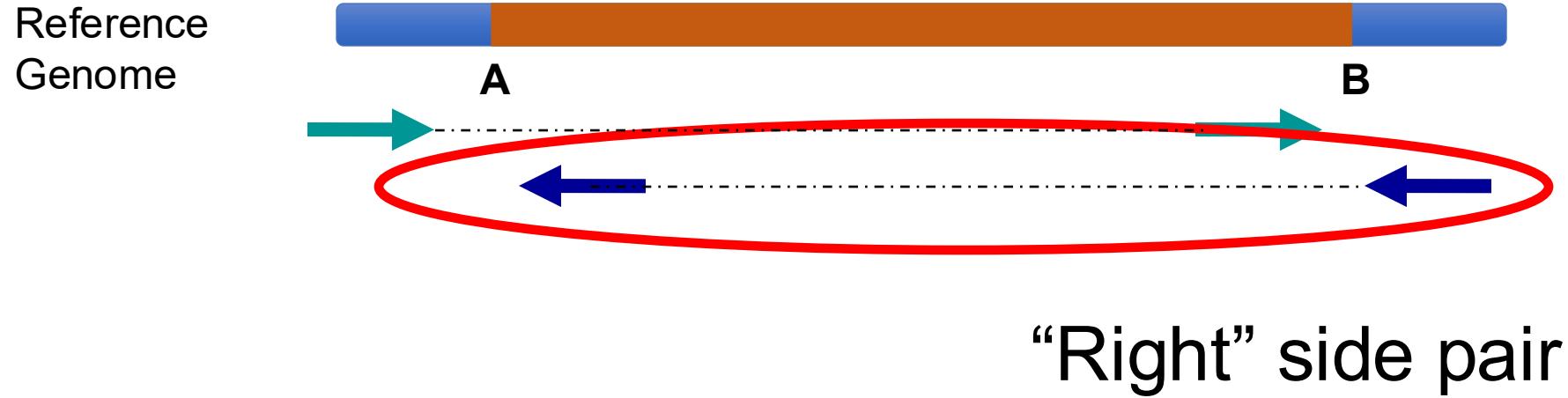
Anomaly: expected orientation of pair is  
inward facing ( → ← )

# Inversion

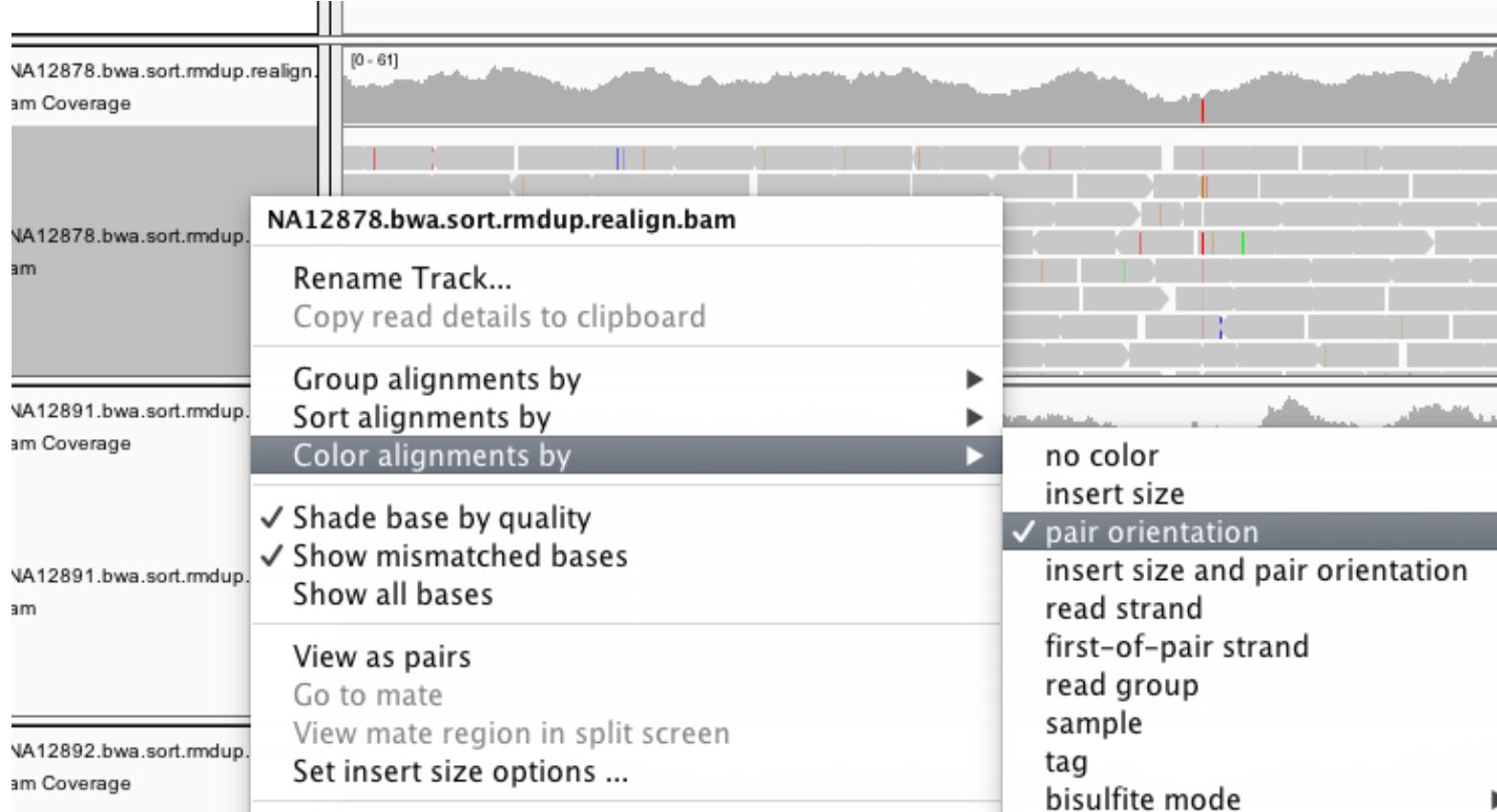


“Left” side pair

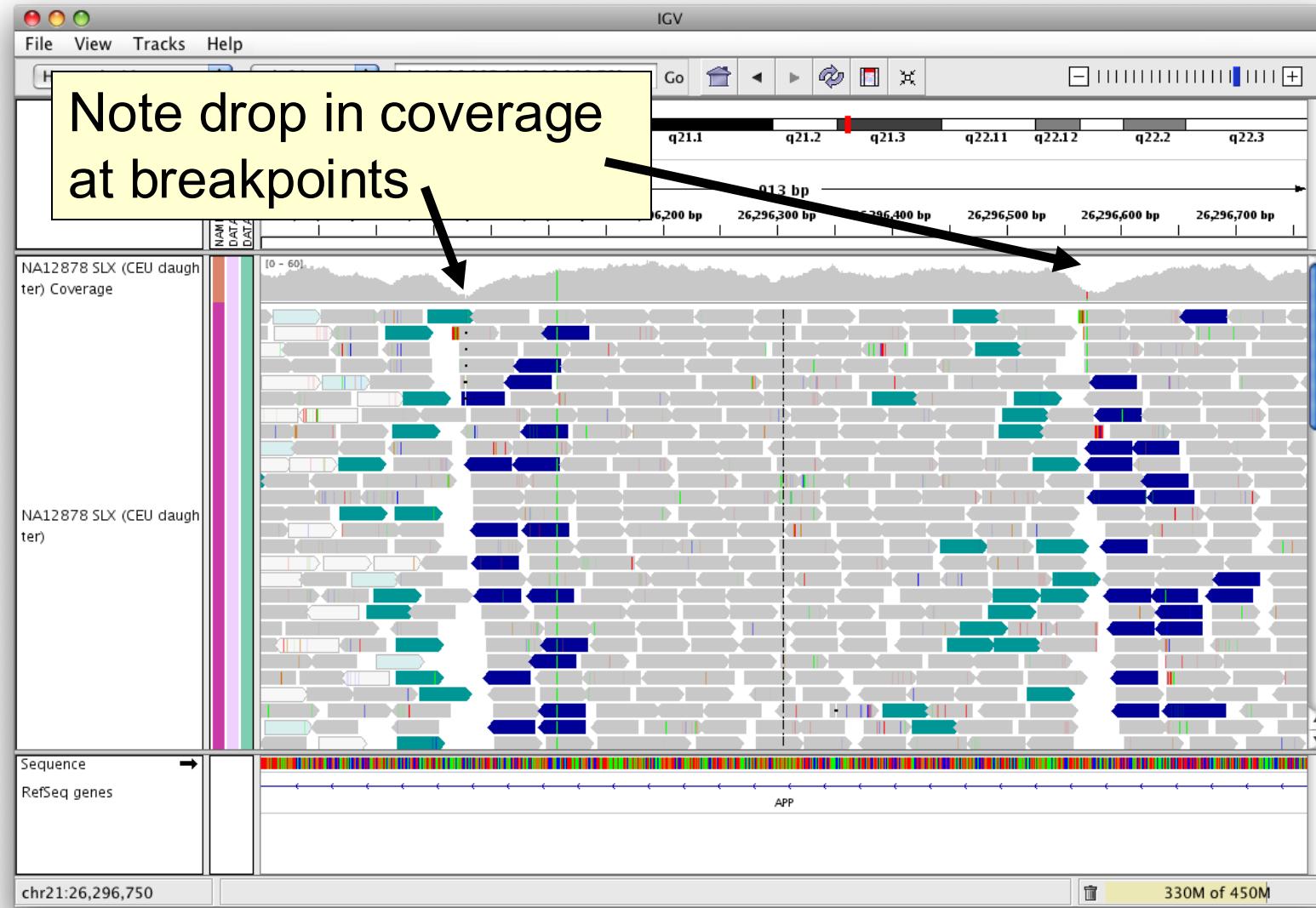
# Inversion



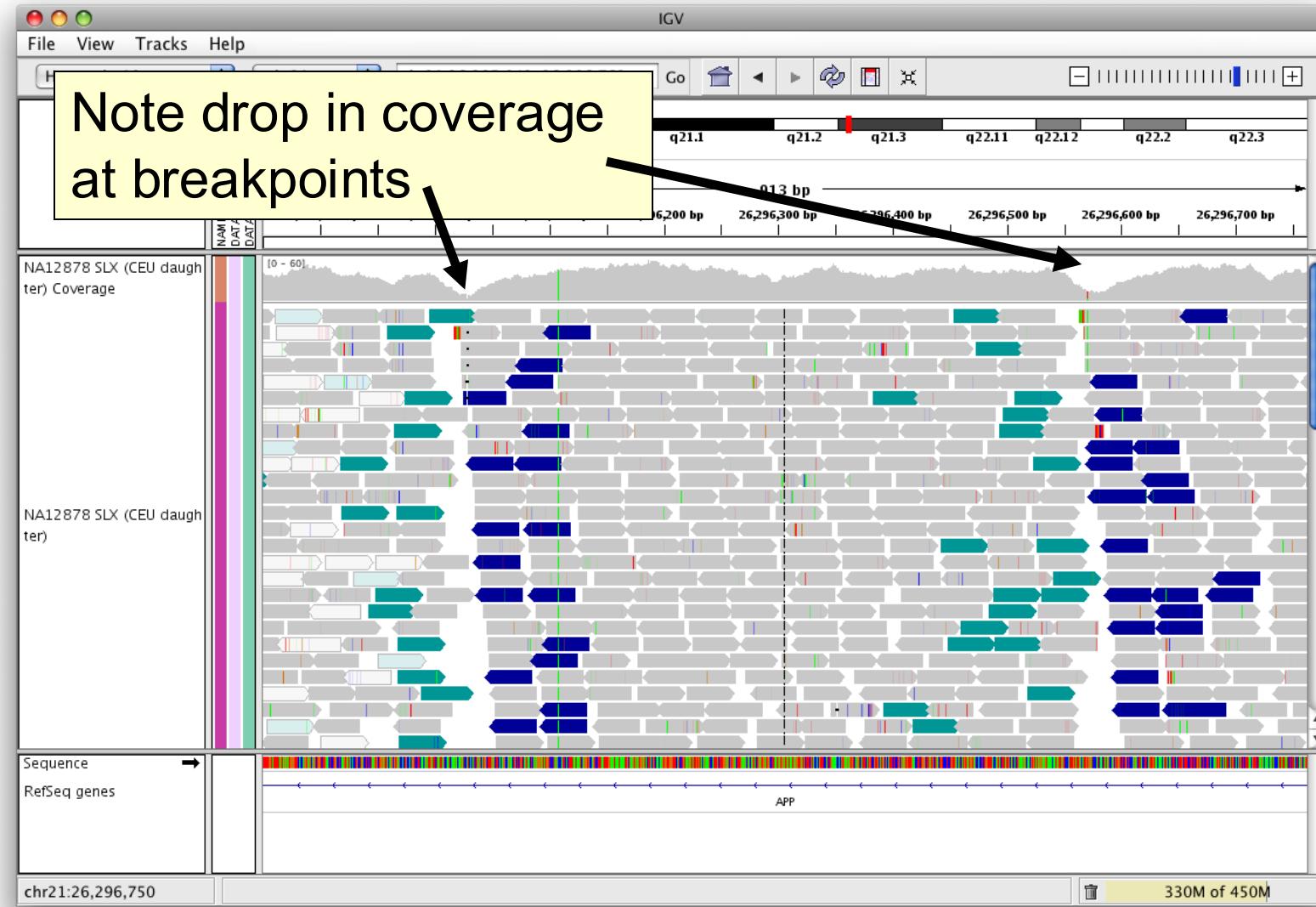
# Color by pair orientation



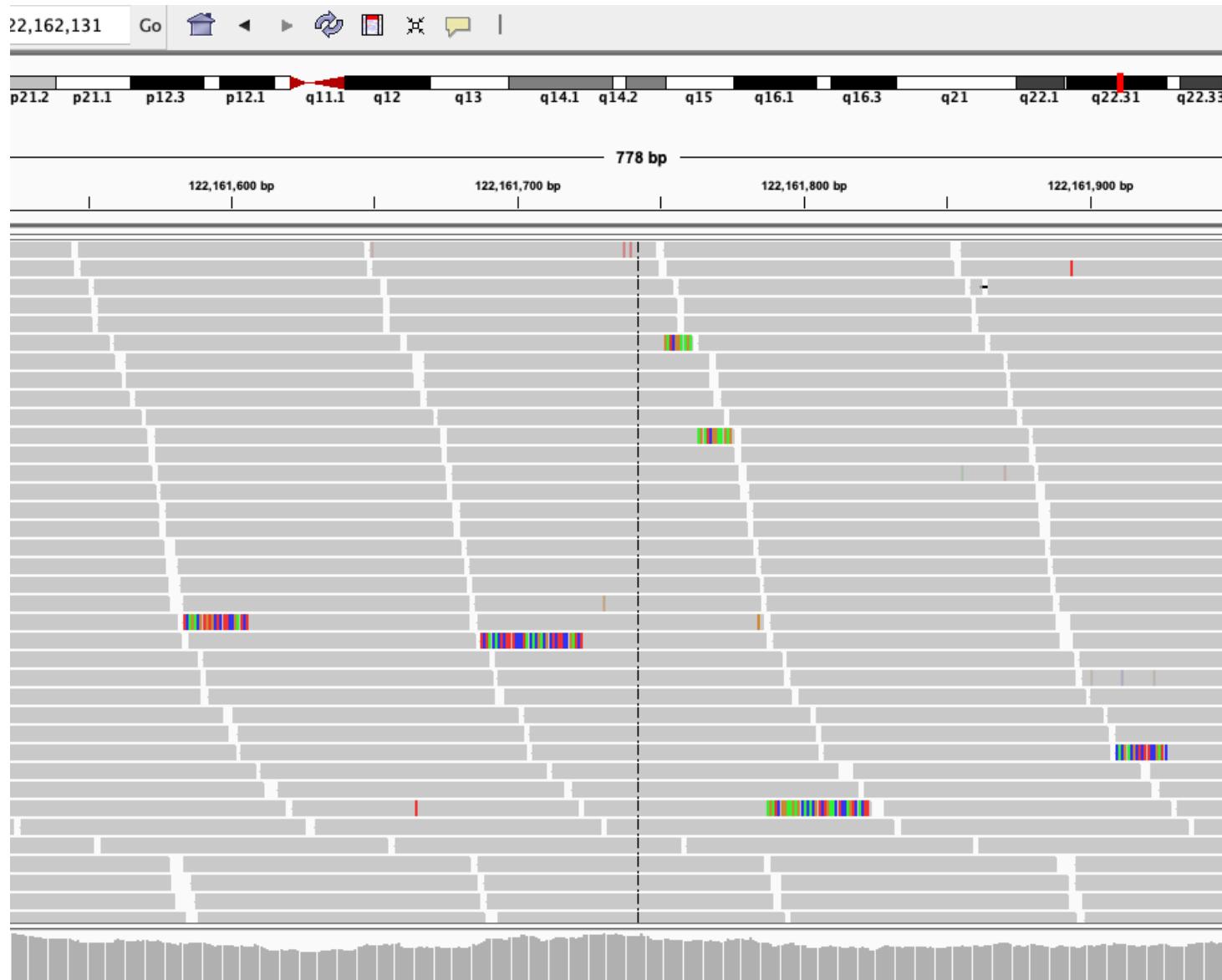
# Inversion



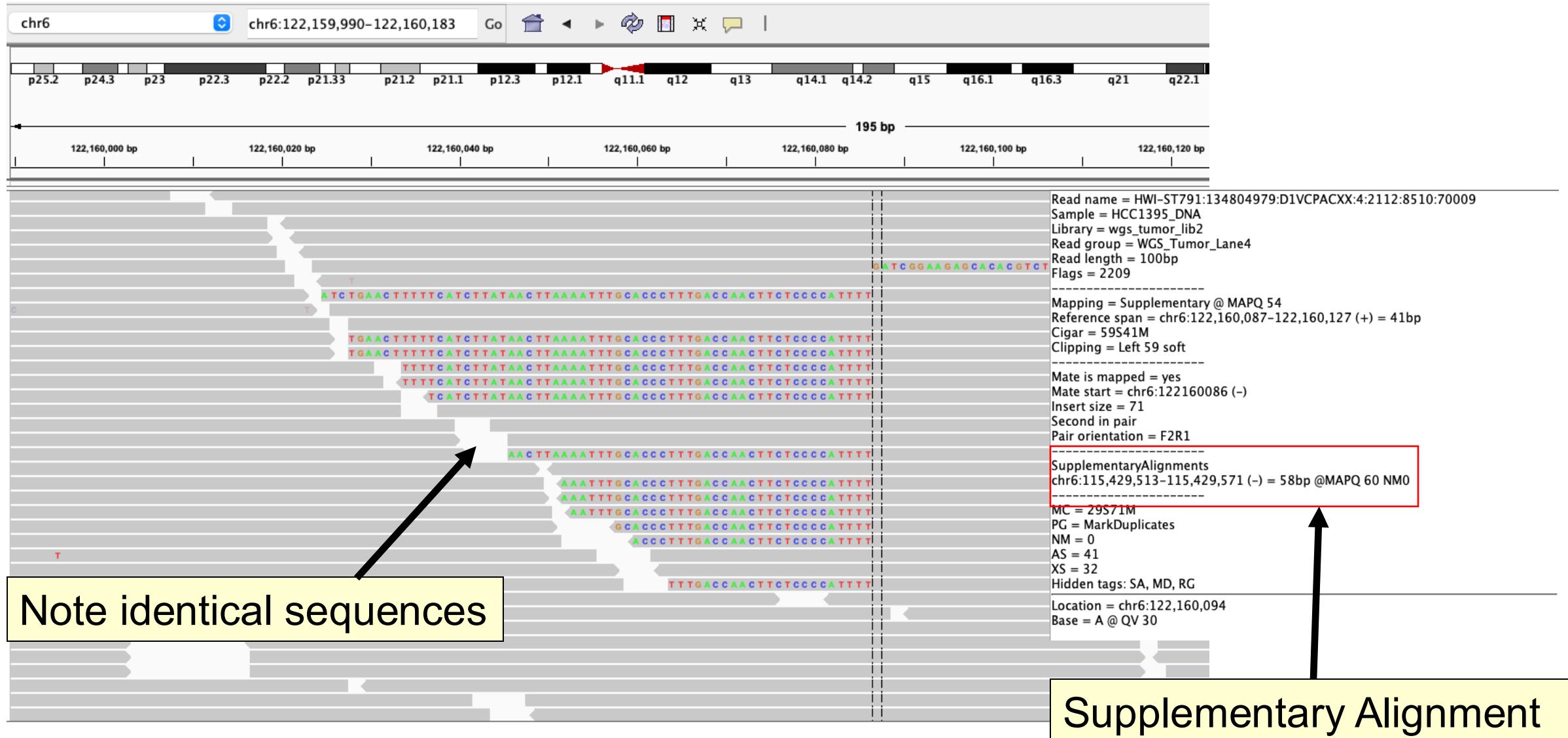
# Inversion



# Soft-clipping



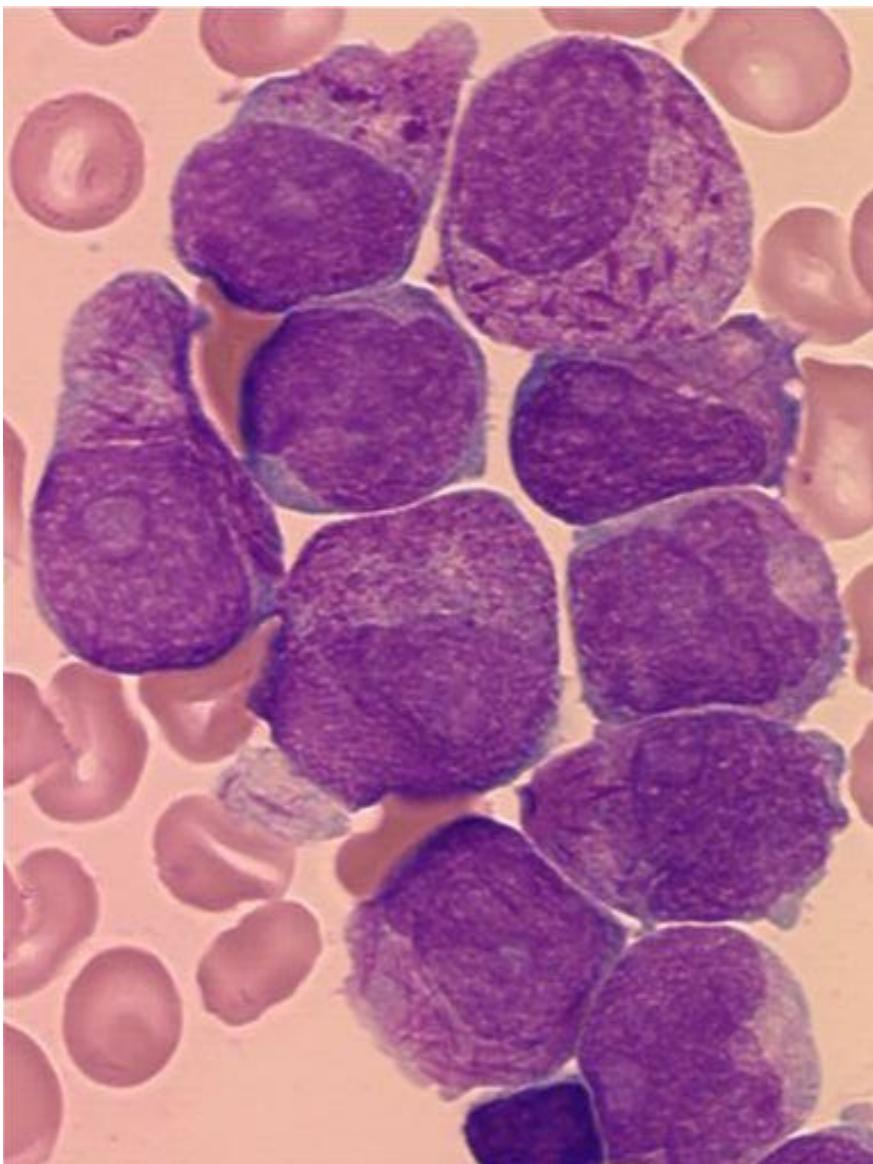
# Soft-clipping



# Assignment

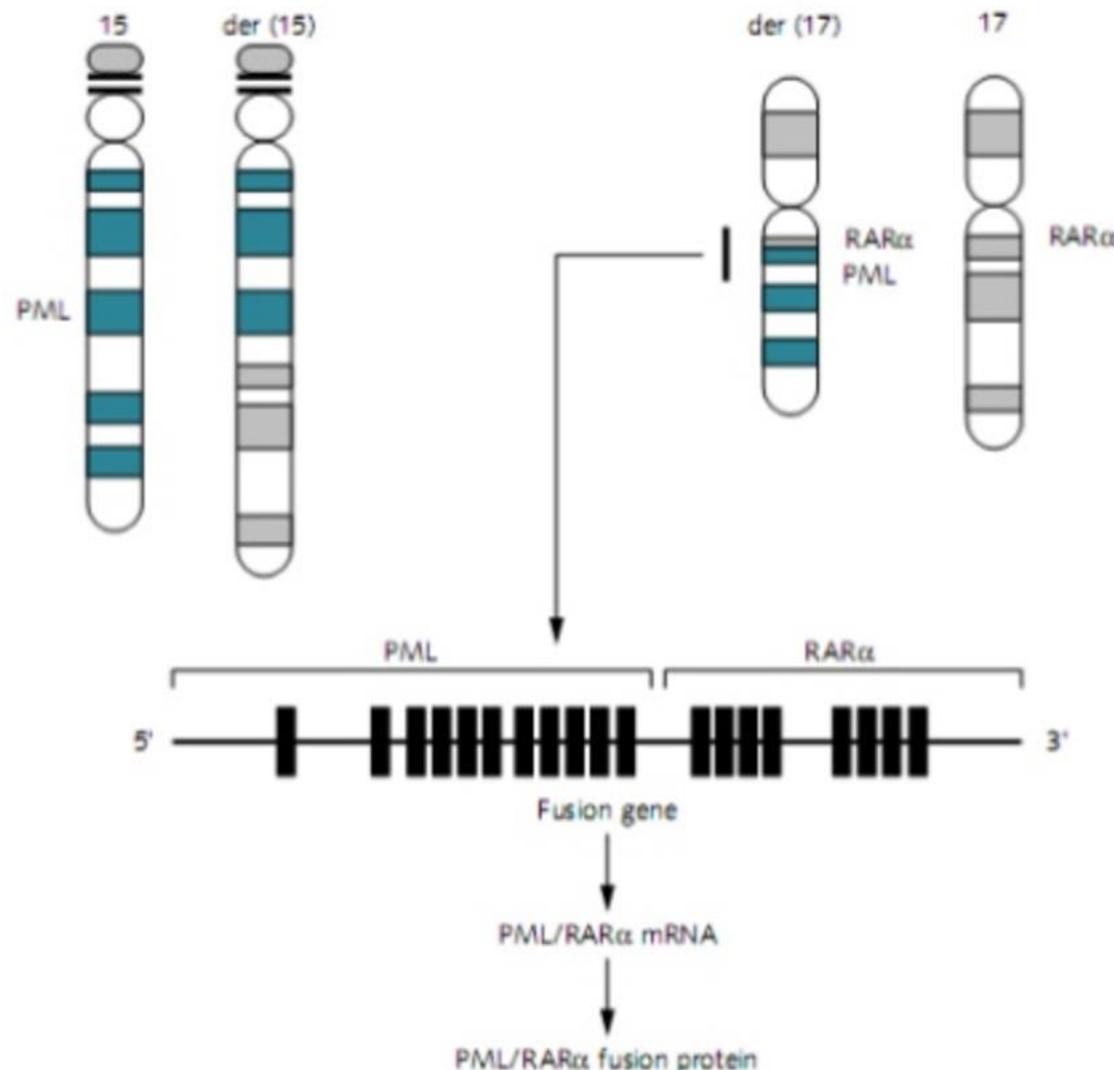
<https://gist.github.com/chrisamiller/1150bcd1a269b6c32d1f2a77dccb9aa>

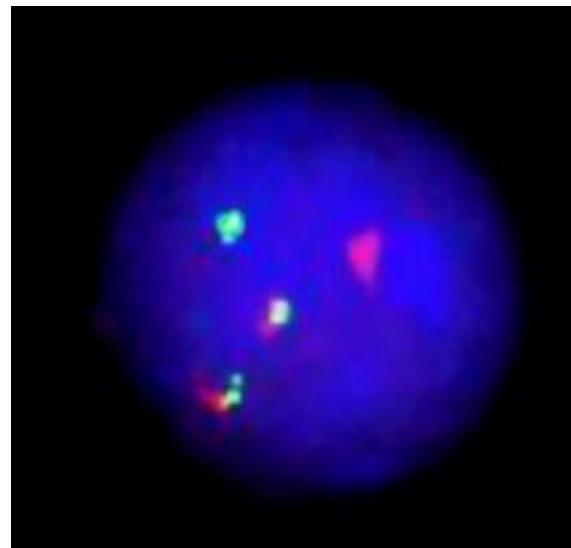
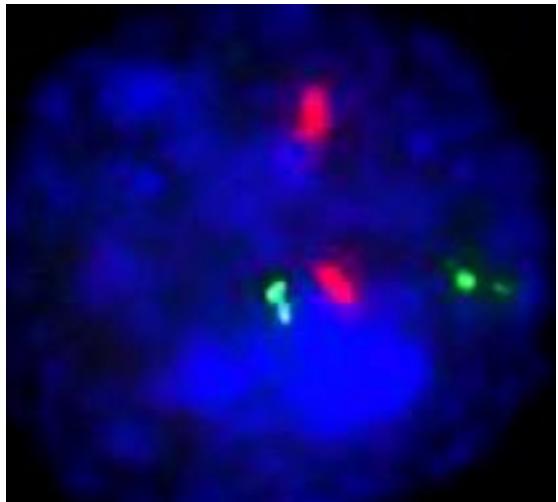
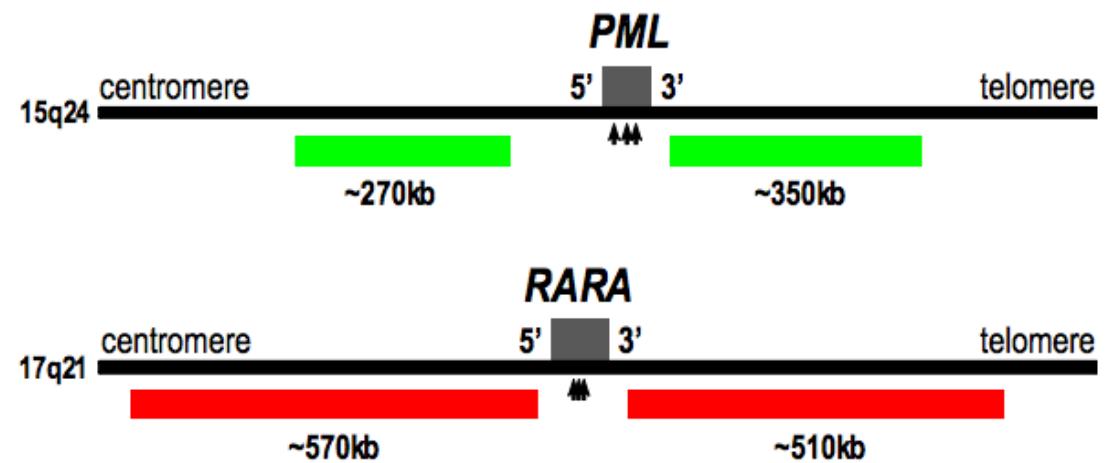
# AML52: An atypical M3 AML



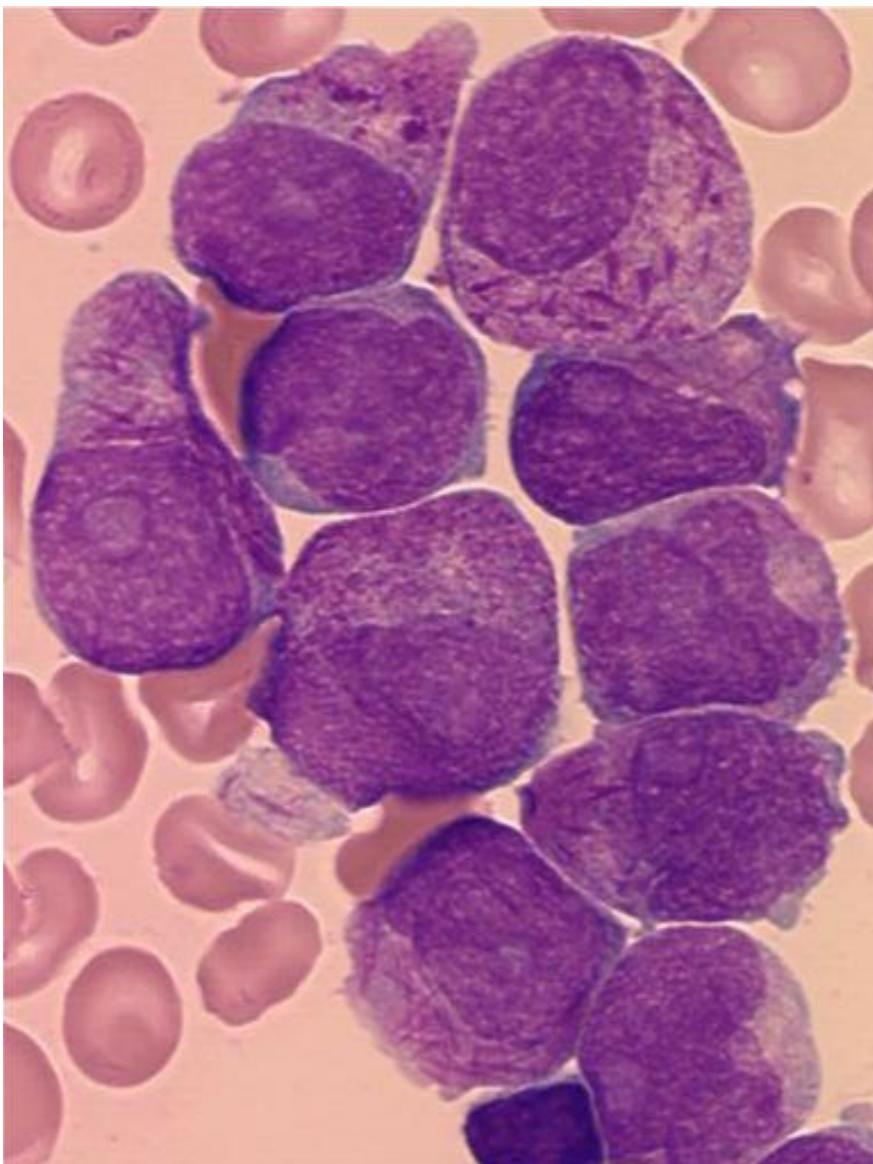
37 y.o. female with AML;  
M3 morphology

# PML-RARA fusion





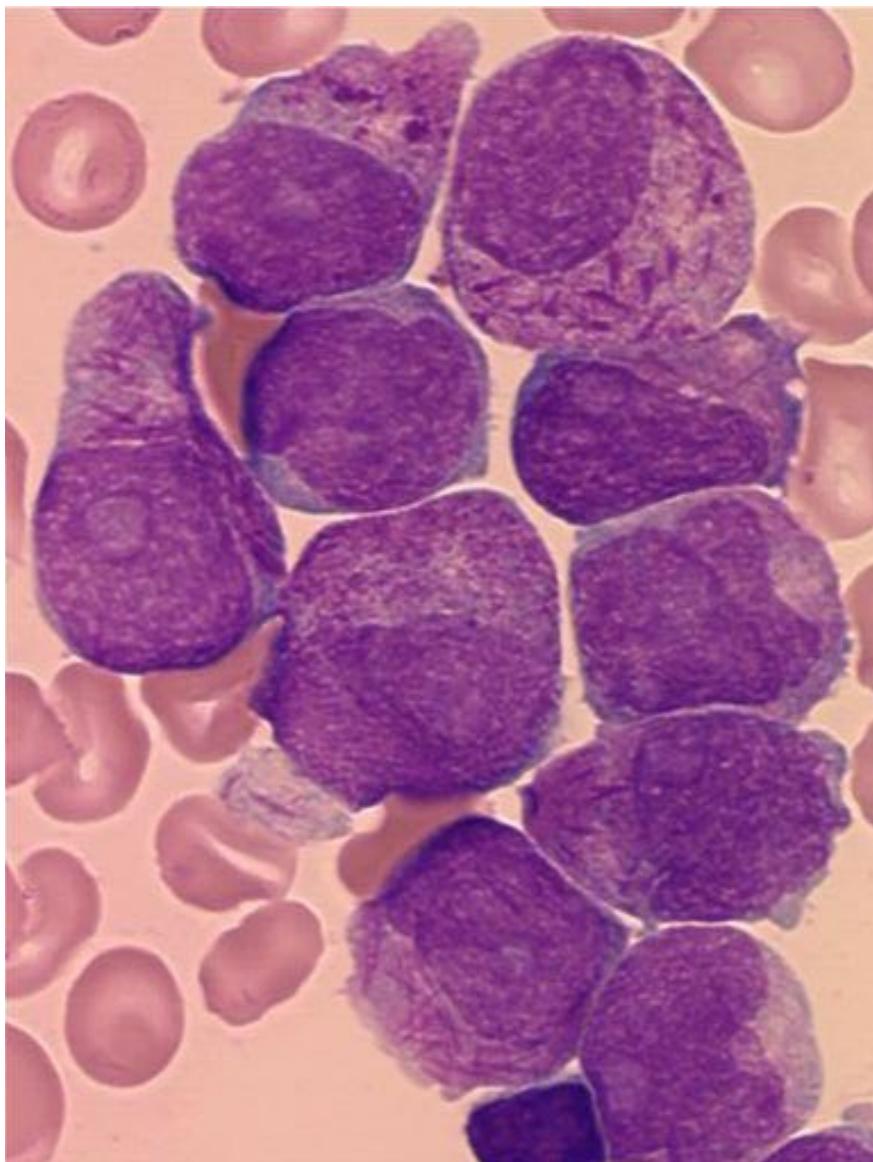
# AML52: An atypical M3 AML



37 y.o. female with AML;  
M3 morphology

Chemo + ATRA

# AML52: An atypical M3 AML



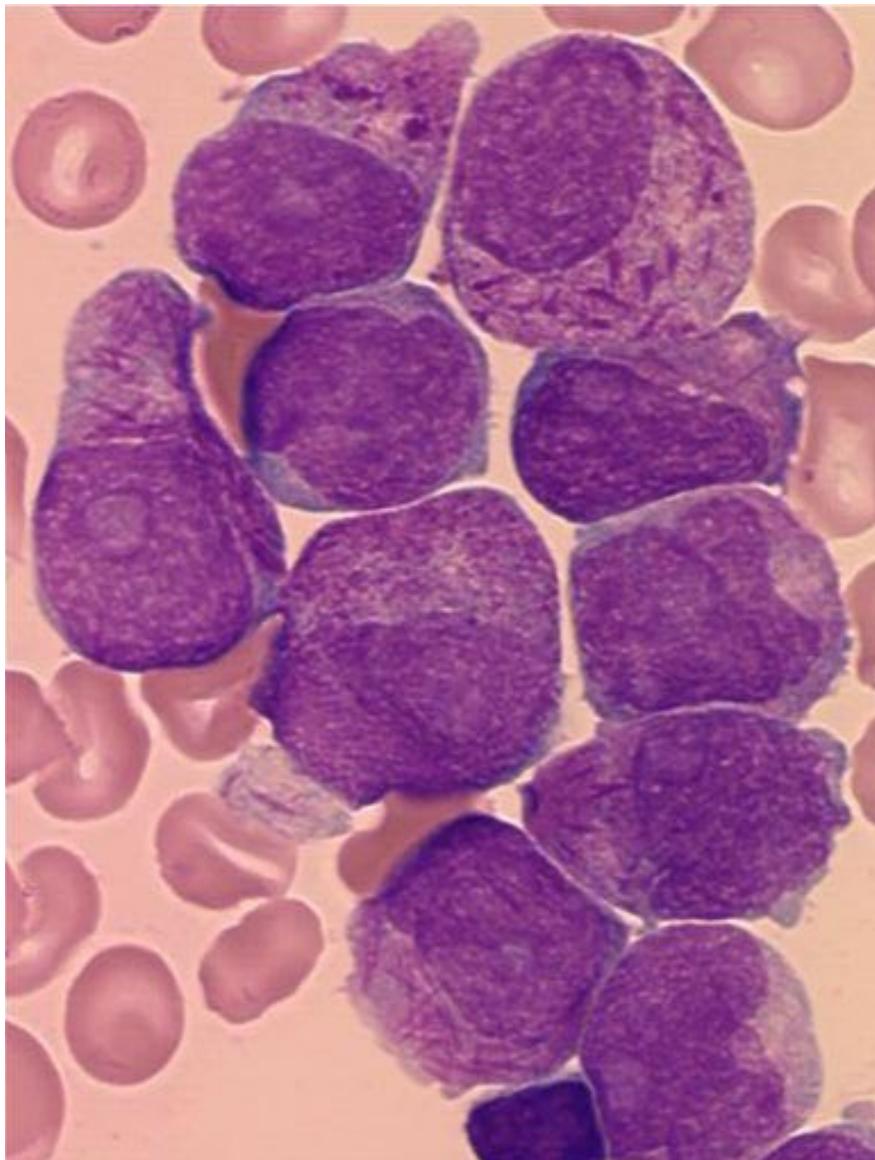
37 y.o. female with AML;  
M3 morphology

Chemo + ATRA

Complex cytogenetics,  
negative for PML-RARA

Chemo only

# AML52: An atypical M3 AML



37 y.o. female with AML;  
M3 morphology

Chemo + ATRA

Complex cytogenetics,  
negative for PML-RARA

Chemo only

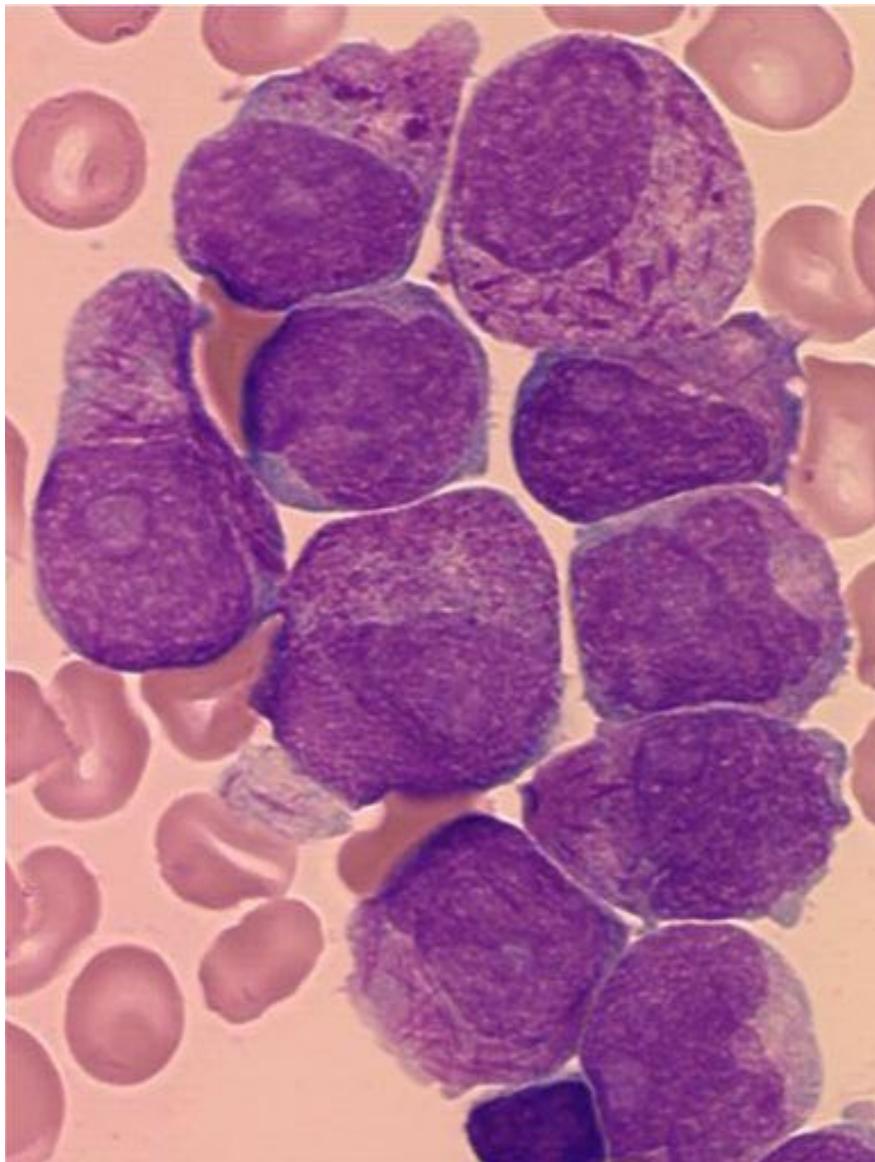
Achieved remission, but faced decision  
Referred to WUSTL

???

Allogeneic  
SCT

Consolidation  
+ ATRA

# AML52: An atypical M3 AML



37 y.o. female with AML;  
M3 morphology

Chemo + ATRA

Complex cytogenetics,  
negative for PML-RARA

Chemo only

Achieved remission, but faced decision  
Referred to WUSTL

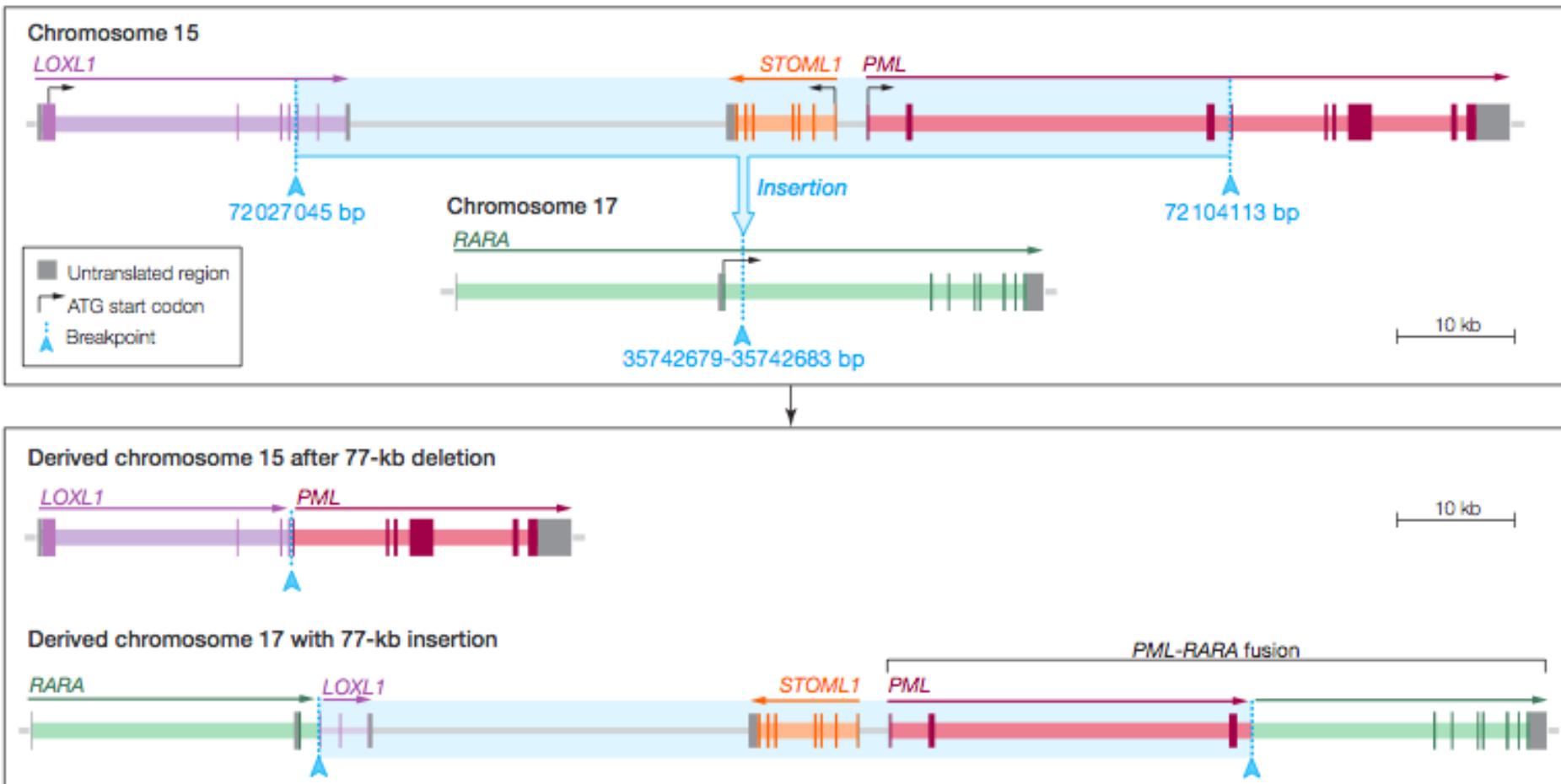
???

Allogeneic  
SCT

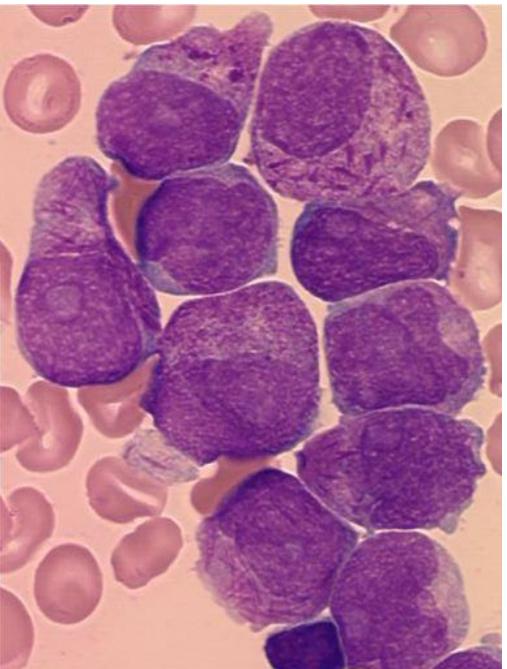
Consolidation  
+ ATRA

## Use of Whole-Genome Sequencing to Diagnose a Cryptic Fusion Oncogene

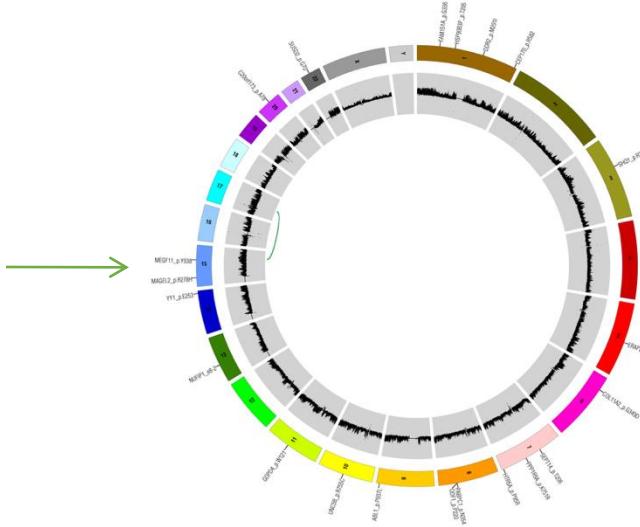
**A** Breakpoints in chromosomes 15 and 17 resulting in *PML-RARA* fusion



# AML52: An atypical M3 AML



37 y.o. female with  
*de novo* AML,  
M3 morphology,  
CTG, no PML-RARA.  
Referred to WUSM  
for SCT.



# Detection of PML-RARA fusion by WGS. Confirmed by FISH, RT-PCR

## Consolidation: Chemo + ATRA

## Sustained remission

# Additional cryptic M3 AMLs

