

# Transcriptome and isoform reconstruction with short reads

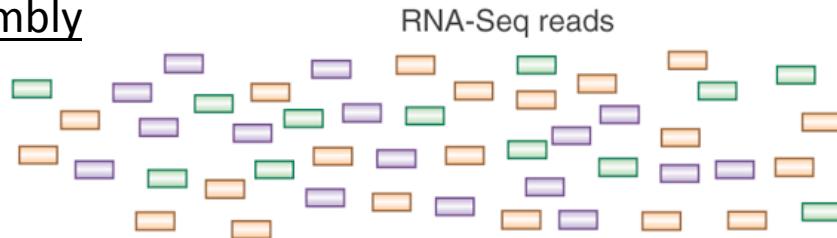
Tangled up in reads

Enabler for Life Sciences

# Topics of this lecture

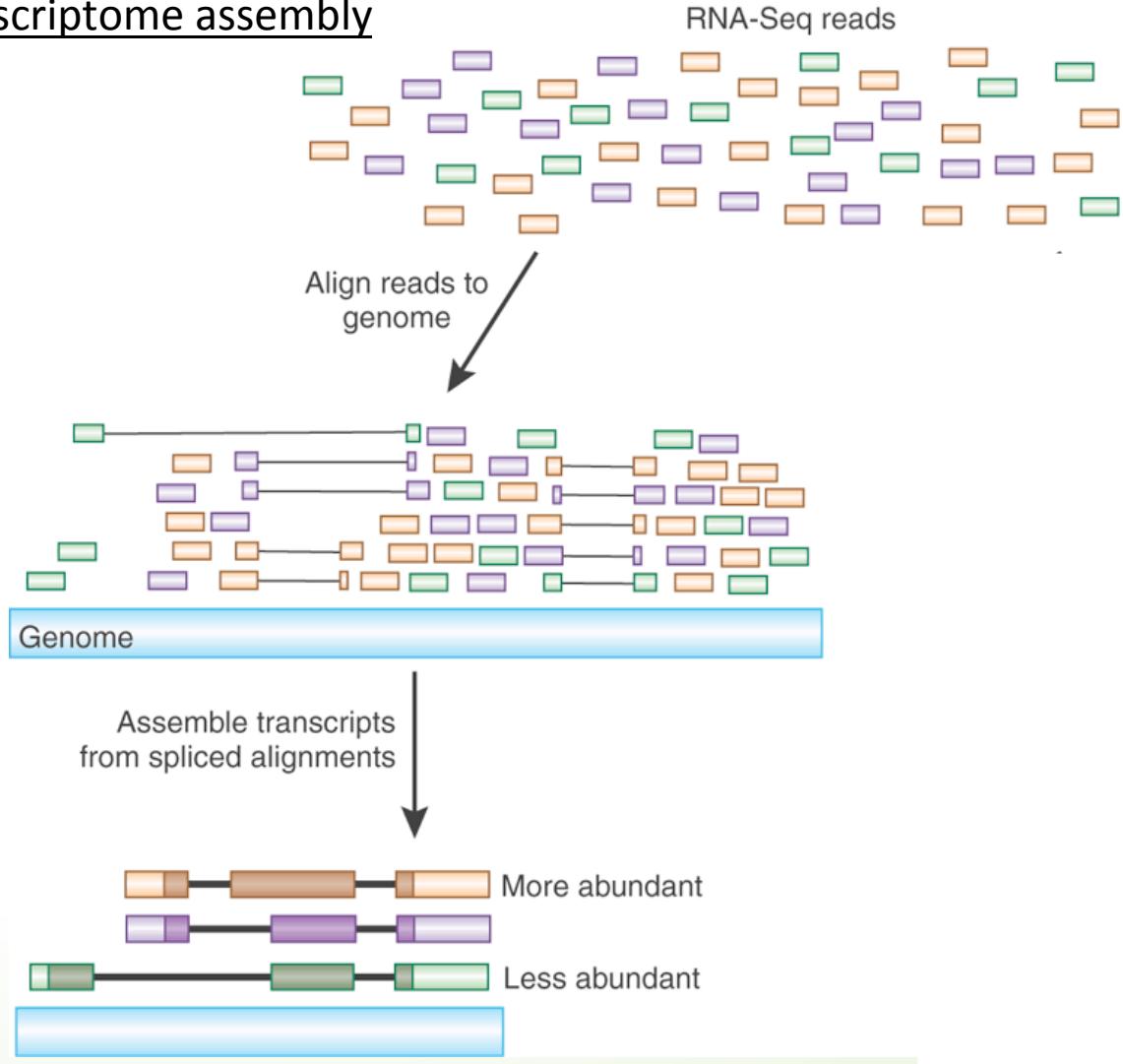
- Mapping-based reconstruction methods
  - Case study: The domestic dog
- De-novo reconstruction method
  - Trinity

## Transcriptome assembly



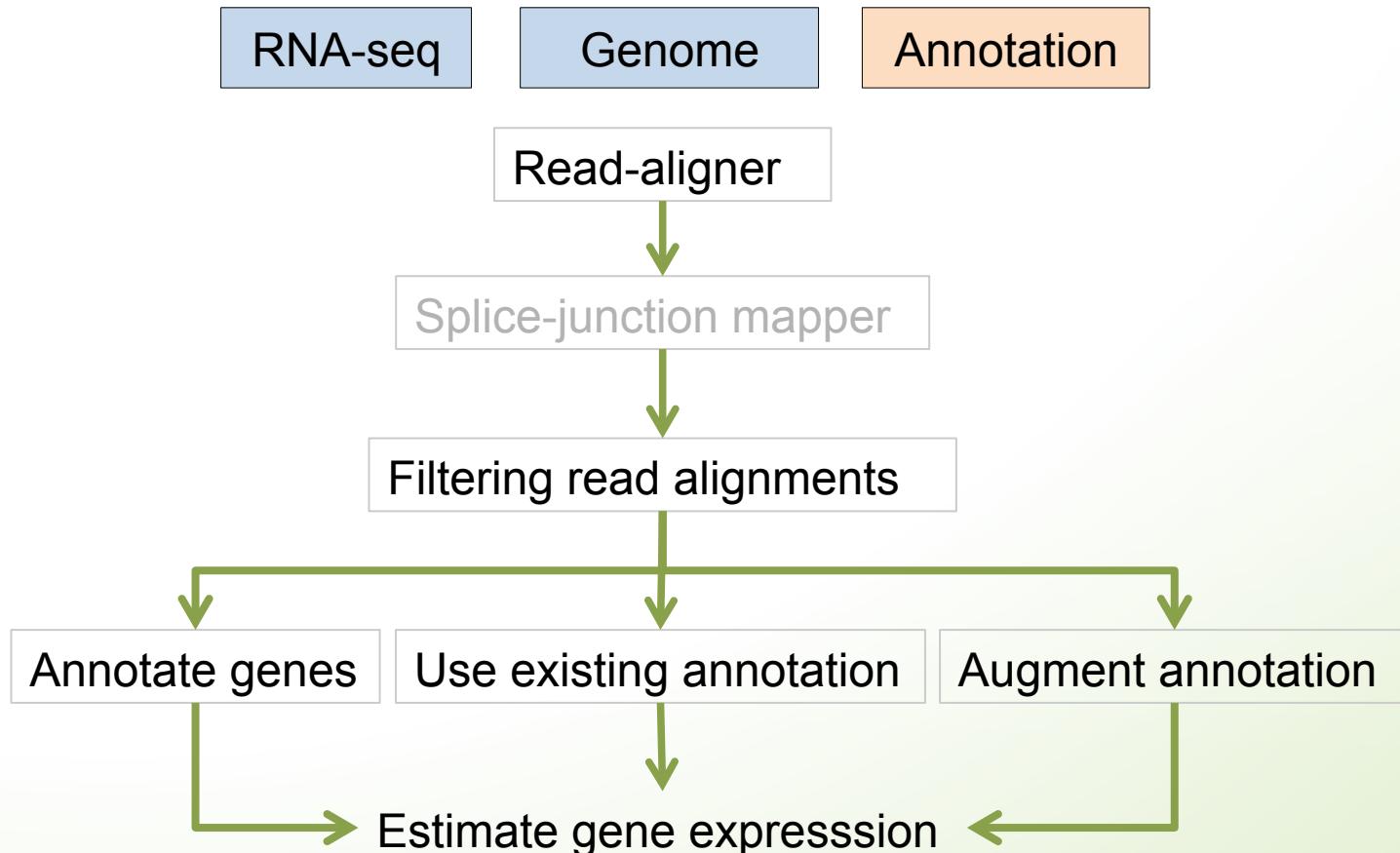
Haas and Zody, Nature Biotechnology 28, 421–423 (2010)

## Transcriptome assembly



Haas and Zody, Nature Biotechnology 28, 421–423 (2010)

## Mapping-based transcriptome reconstruction



## Case study: The transcriptome of the domestic dog



## Case study: The transcriptome of the domestic dog

Has shared an environment with humans for > 5000 years

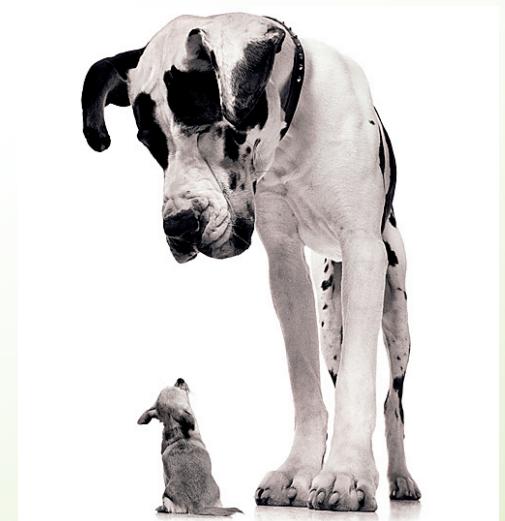
- > Exposed to many of the same environ. influences

Affected by many of the same diseases as man

- > Cancer
- > Heart disease

Extensive breeding and selection

- > Many dog breeds are prone to certain diseases
- > Long haplotypes ideal for association studies



Question: what genes are located in my region of interest?

Requires a high quality genome...and detailed annotation!

## Case study: The transcriptome of the domestic dog

Recently, the Broad institute released an updated build, canFam3.1

85 Mb of additional sequence integrated

99.8% of euchromatic portion of genome covered, high quality

Recovered 100s of GC-rich promoter regions

Now approaches level of quality/completion of mouse or human

> the annotation...not so much.

## Case study: The transcriptome of the domestic dog

strong discrepancy between well-annotated human genome and dog. Why?

- > largely homology-based
- > almost no isoform information
- > only few dog-specific gene annotations

Majority of loci likely incomplete, many dog-specific genes probably missing

## Case study: The transcriptome of the domestic dog

10 tissues at great depth (> 20 million reads)

blood, brain, heart, kidney, liver, lung, muscle, ovary, skin, testes

Stranded paired-end libraries

Poly-A selected: default approach, recovers mostly protein-coding genes

DSN prep: Targets all RNAs, but normalizes library to avoid strong biases

**An improved canine genome and a comprehensive catalogue of coding genes and non-coding transcripts.** Hoeppner MP et al. PLoS One 2014 Mar 13;9(3):e91172

## Mapping-based transcriptome reconstruction

Align reads with Tophat/Bowtie

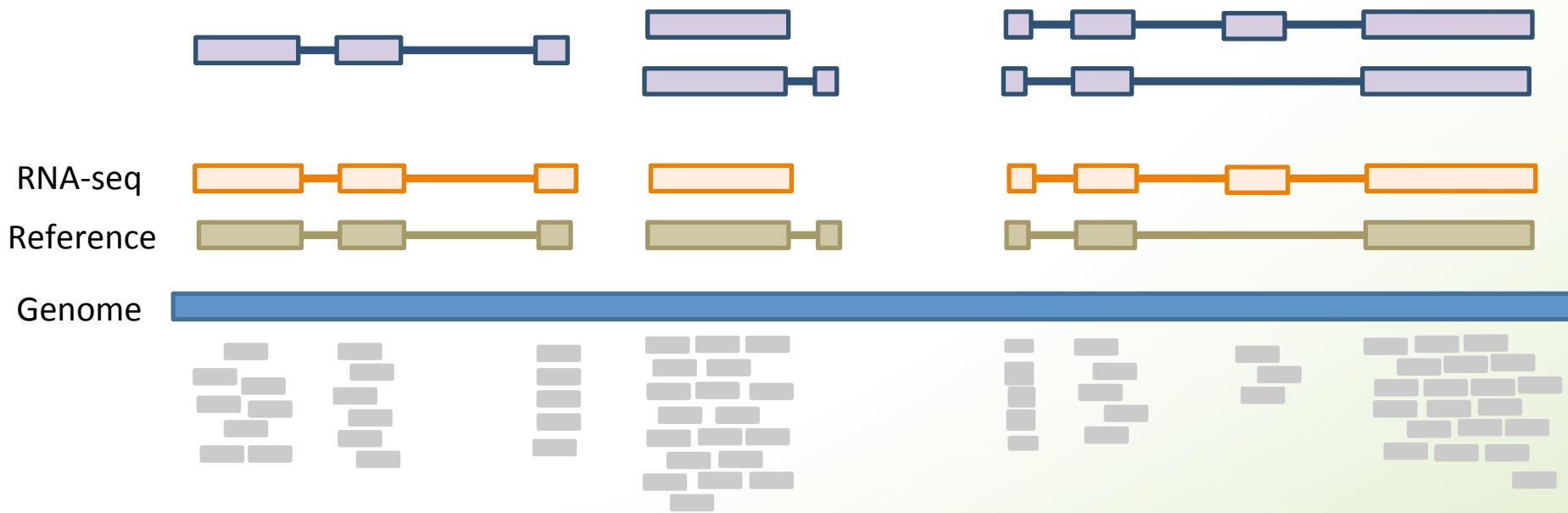
Reconstruct transcripts with  
Cufflinks

Reconcile de-novo annotation  
with reference

Annotate novel transcripts

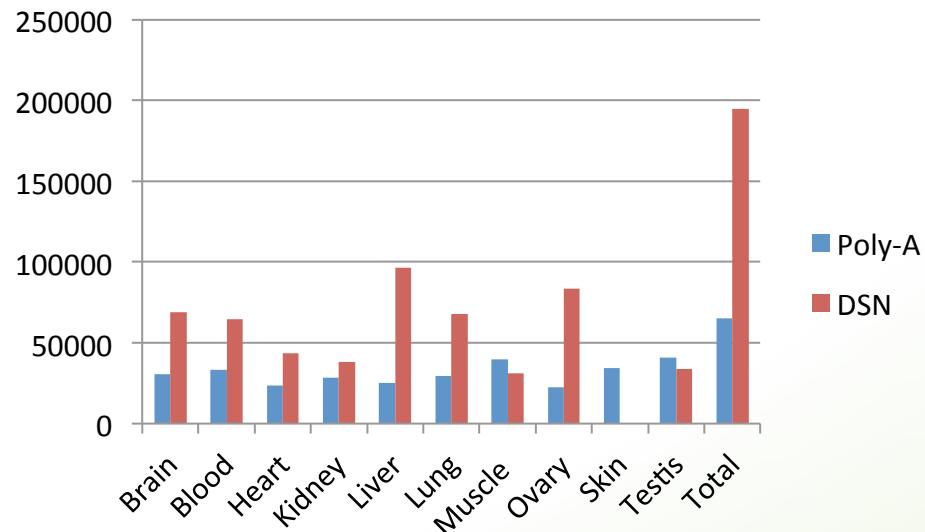
Quantify

## Mapping-based transcriptome reconstruction



## Case study: The transcriptome of the domestic dog

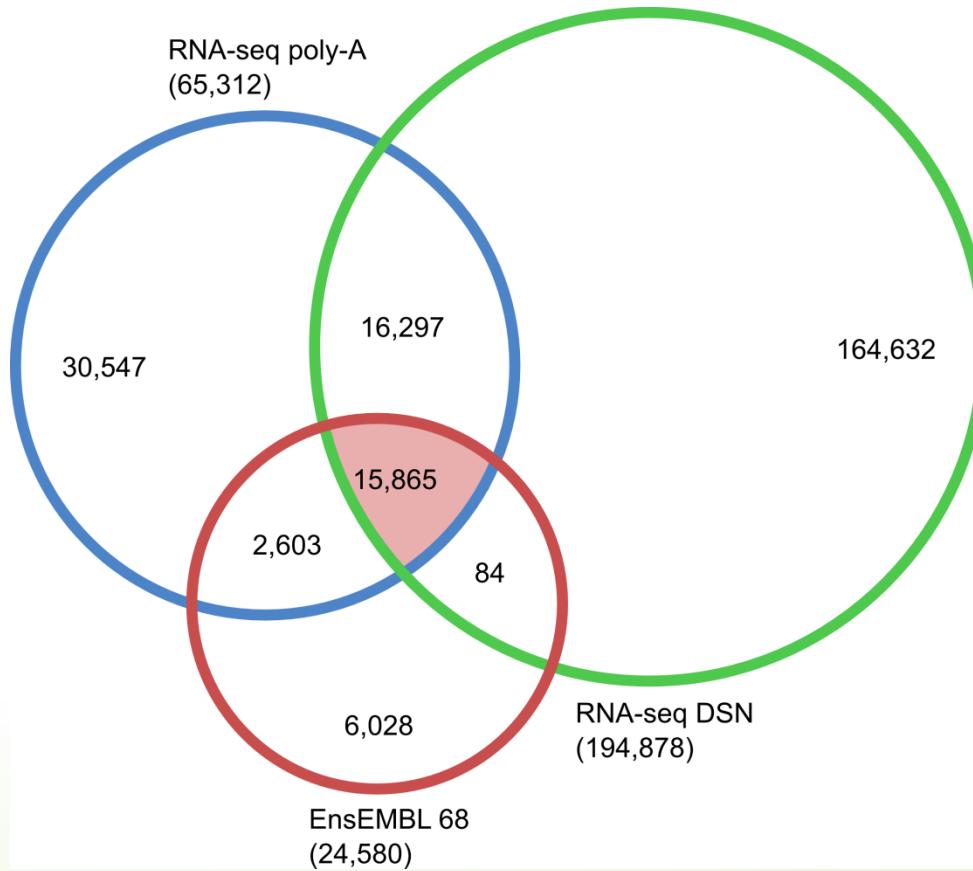
Transcript reconstruction using cufflinks for both libraries



DSN recovers more transcripts than polyA

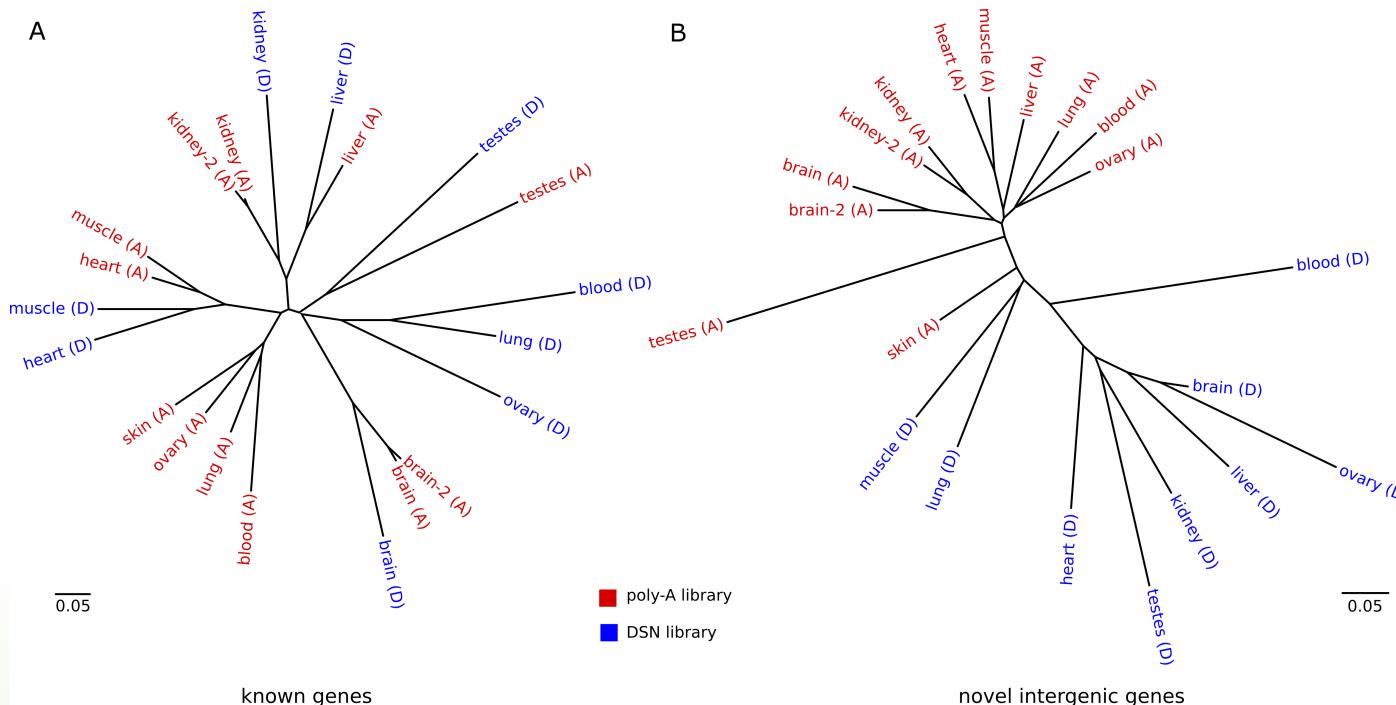
Transcriptional diversity is highest in testes

## Case study: The transcriptome of the domestic dog

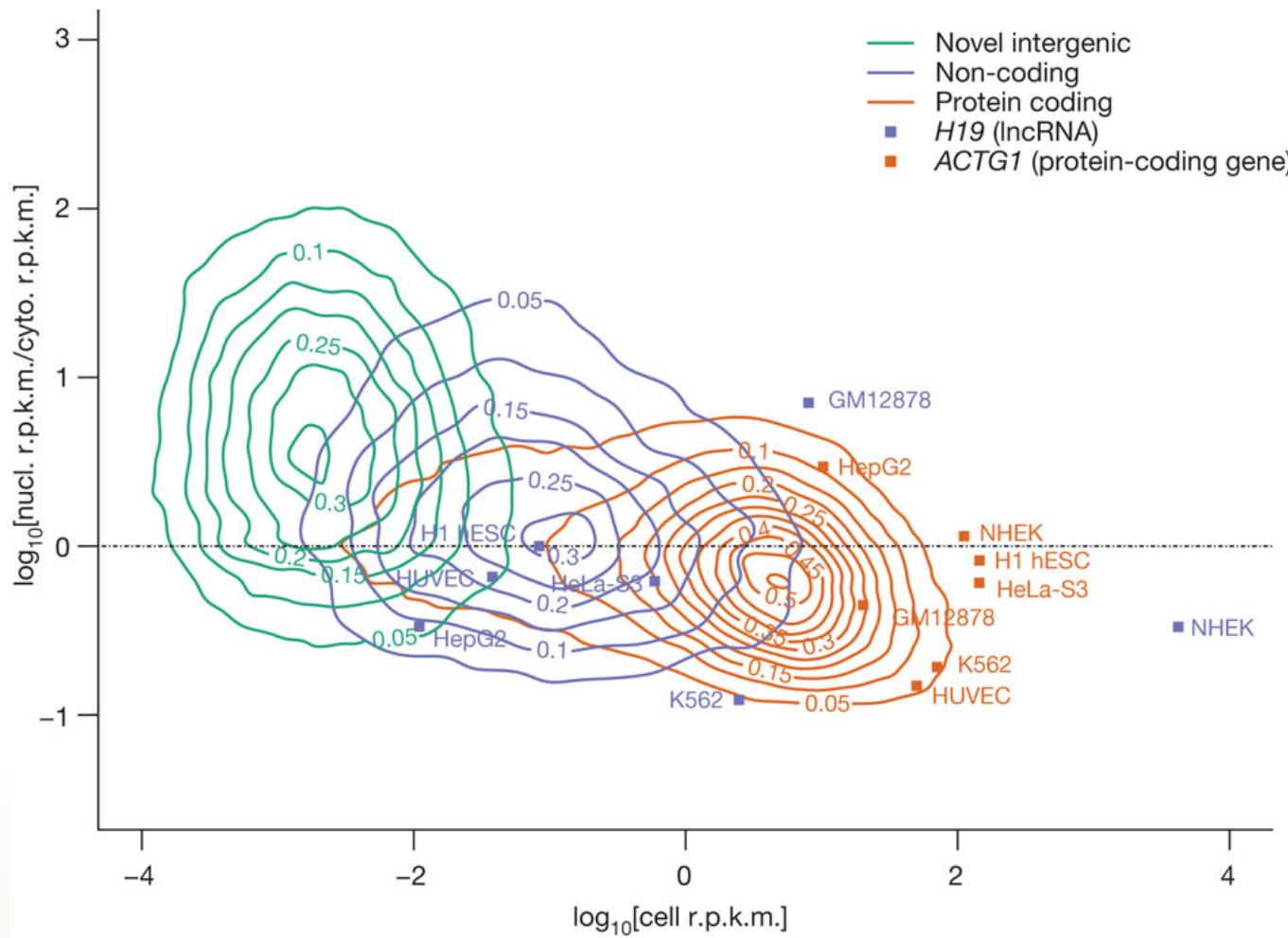


## Case study: The transcriptome of the domestic dog

Transcript reconstruction using cufflinks for both libraries

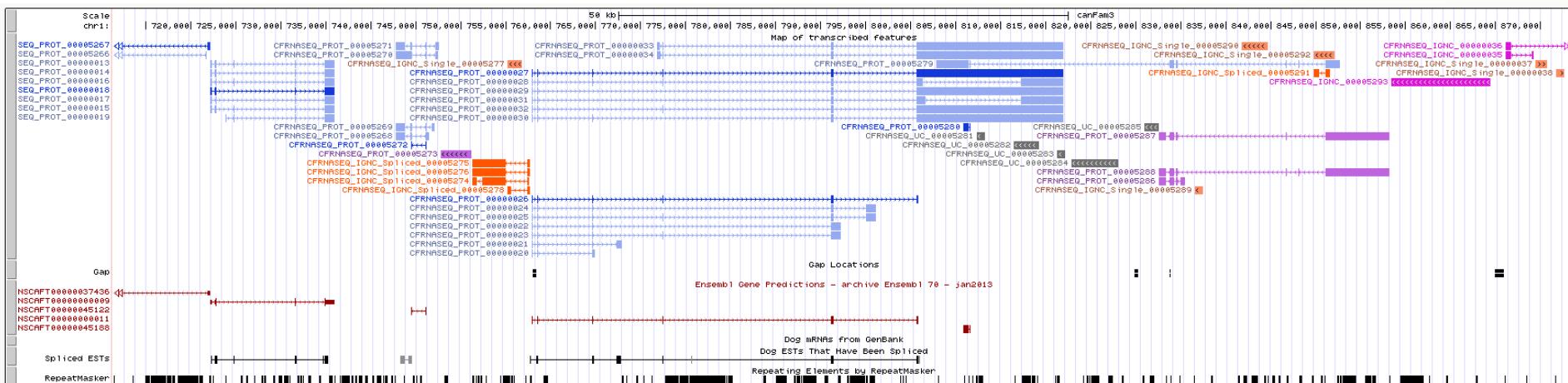


# RNA flavors



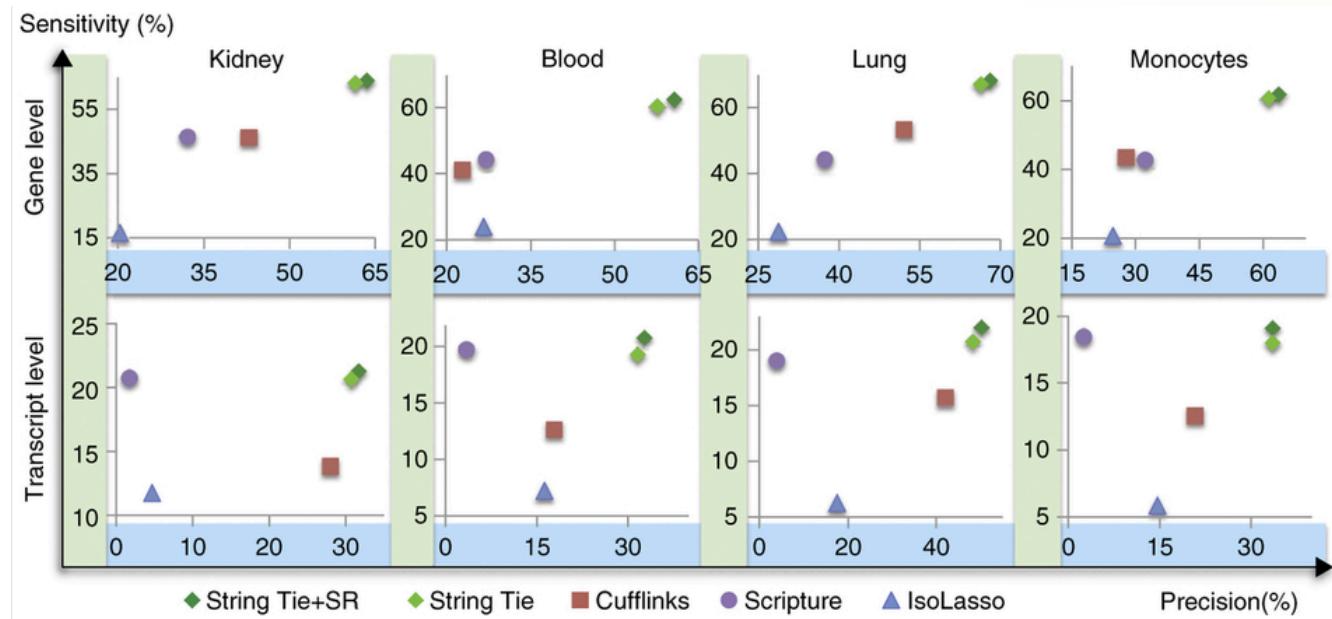
## Case study: The transcriptome of the domestic dog

## Augmented annotation and transcript classification

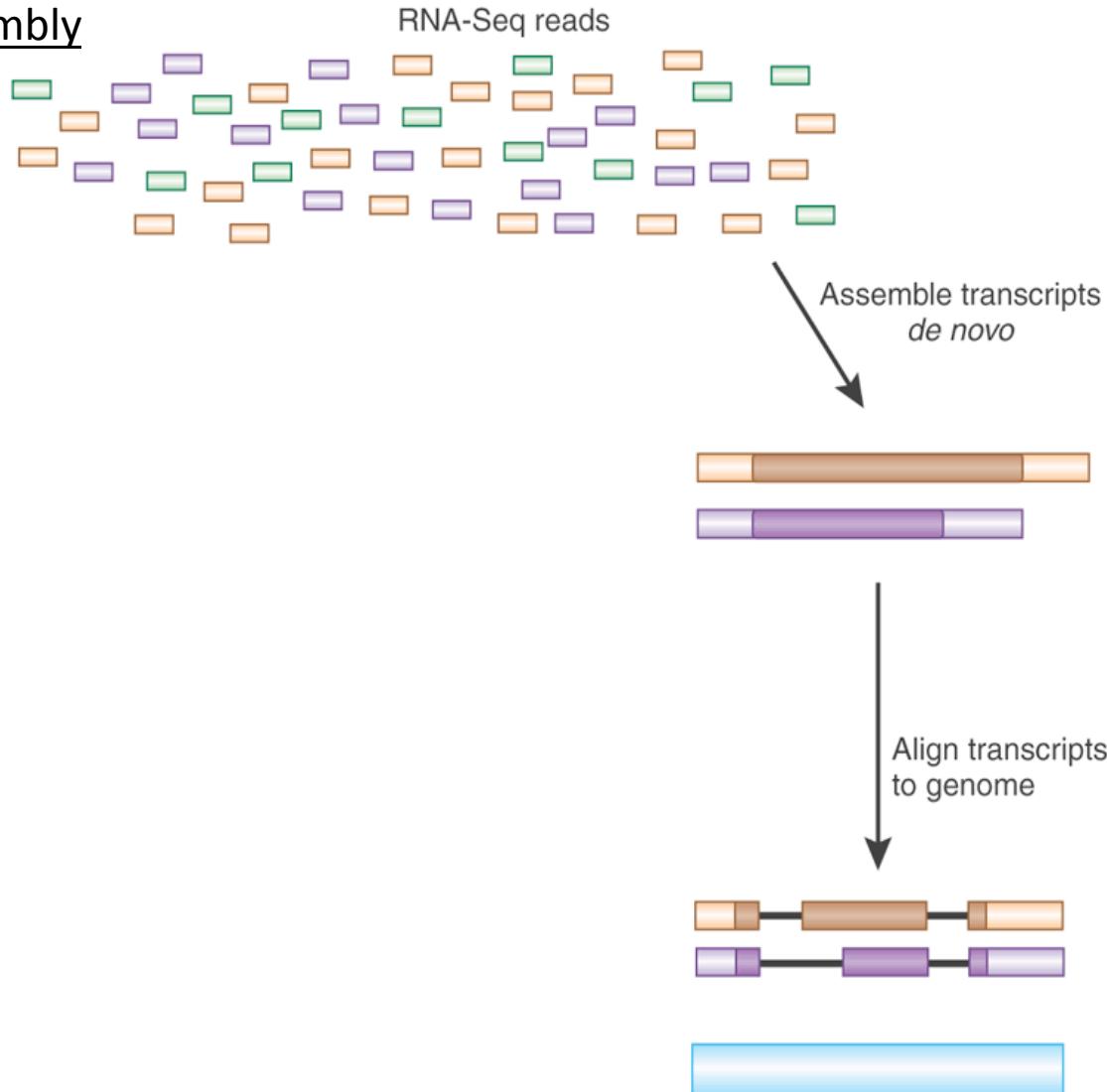


# Several softwares

- Cufflinks
- Scripture
- Ballgown
- StringTie



## Transcriptome assembly



Haas and Zody, Nature Biotechnology 28, 421–423 (2010)

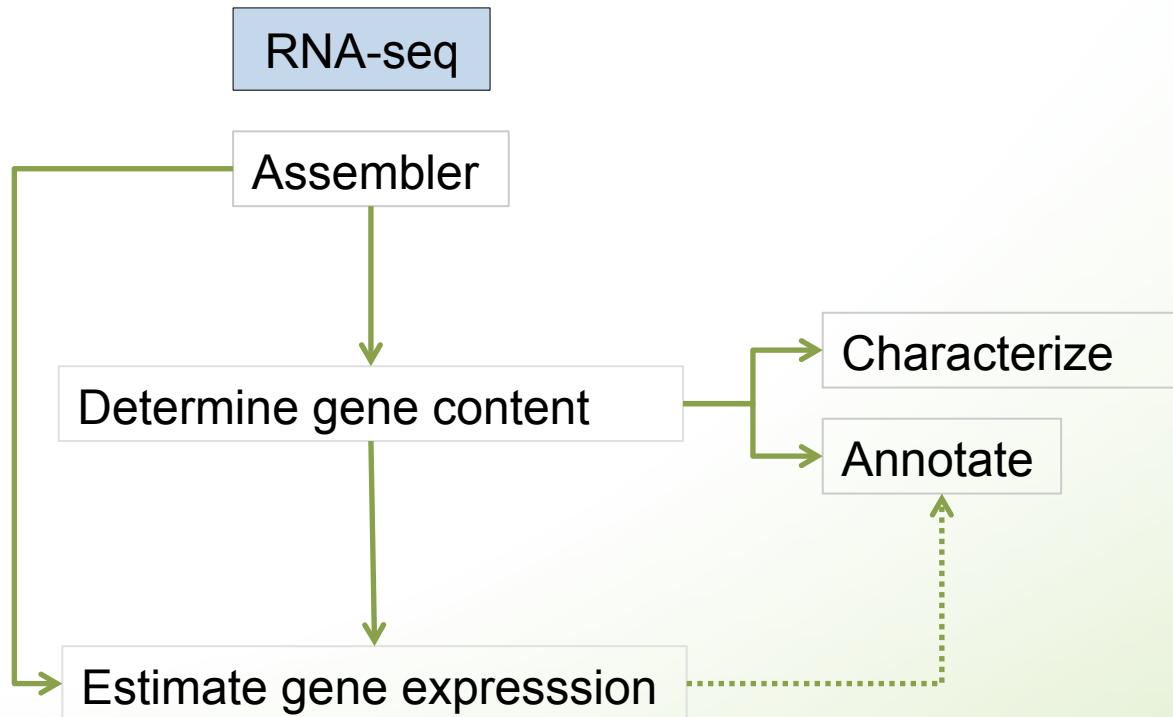
## De-novo transcriptome assembly

For the majority of species, there are no comprehensive genome sequences...

Transcriptomics can inform a broad range of questions without reference

→ De-novo transcriptome assembly from extracted RNA

## De-novo transcriptome reconstruction



# De-novo transcriptome assembly

Manfred Grabherr

Brian Haas

Moran Yassour

Kerstin Lindblad-Toh

Aviv Regev

Nir Friedman

David Eccles

Alexie Papanicolaou

Michael Ott

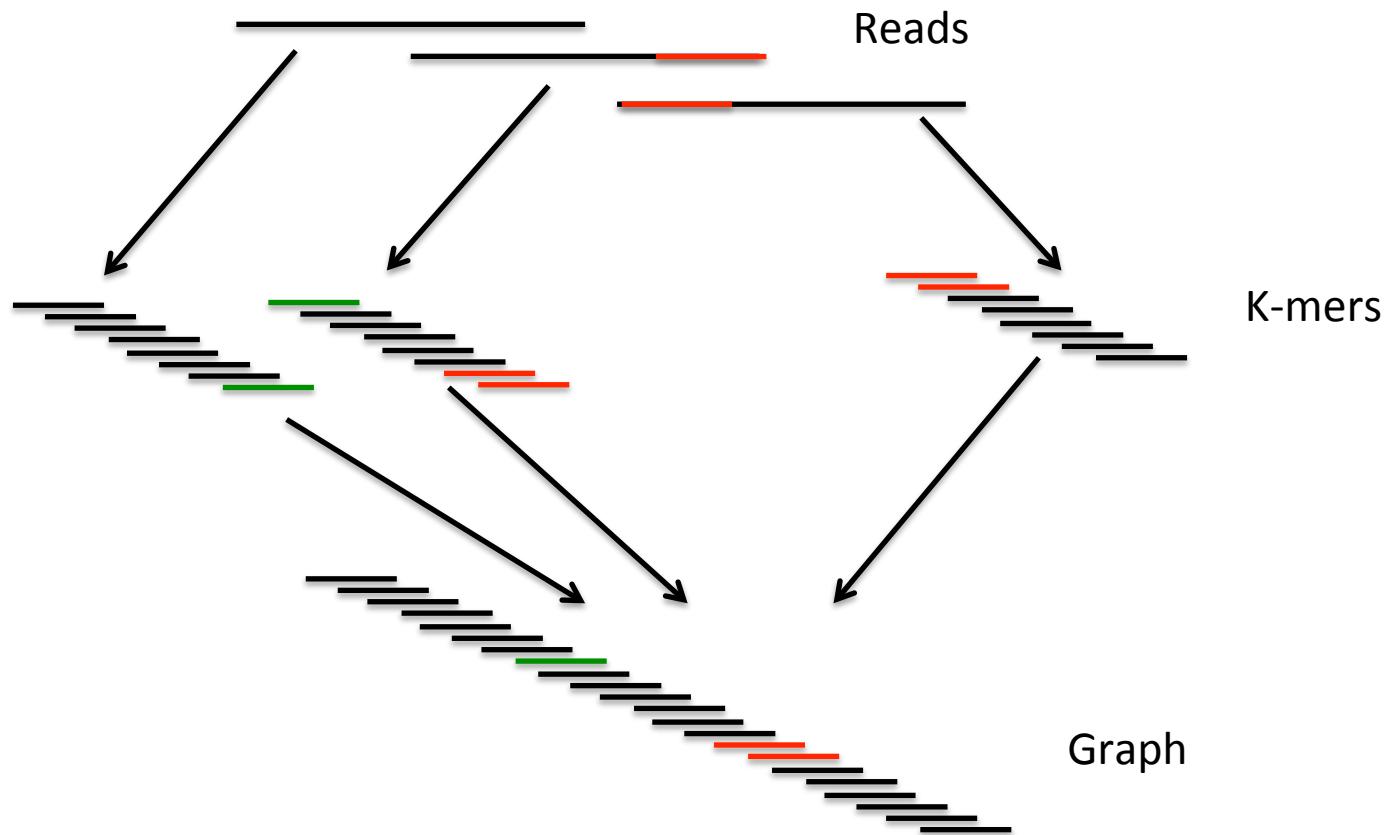
...



# The k-mer

---

- K consecutive nucleotides



# The de Bruijn Graph

---

- Graph of overlapping sequences
- Intended for cryptology
- Fixed length element:  $k$

CTTGGAA

TTGGAAC

TGGAACA

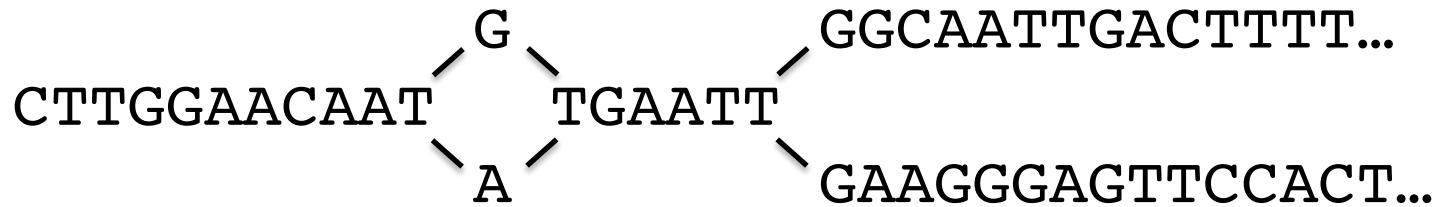
GGAACAA

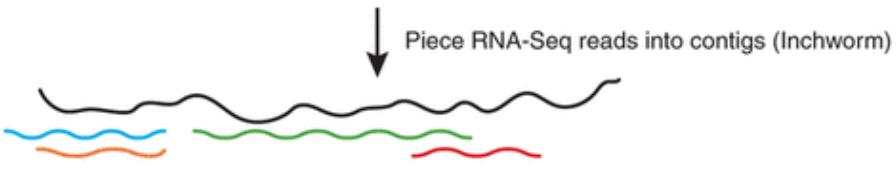
GAACAAT

# The de Bruijn Graph

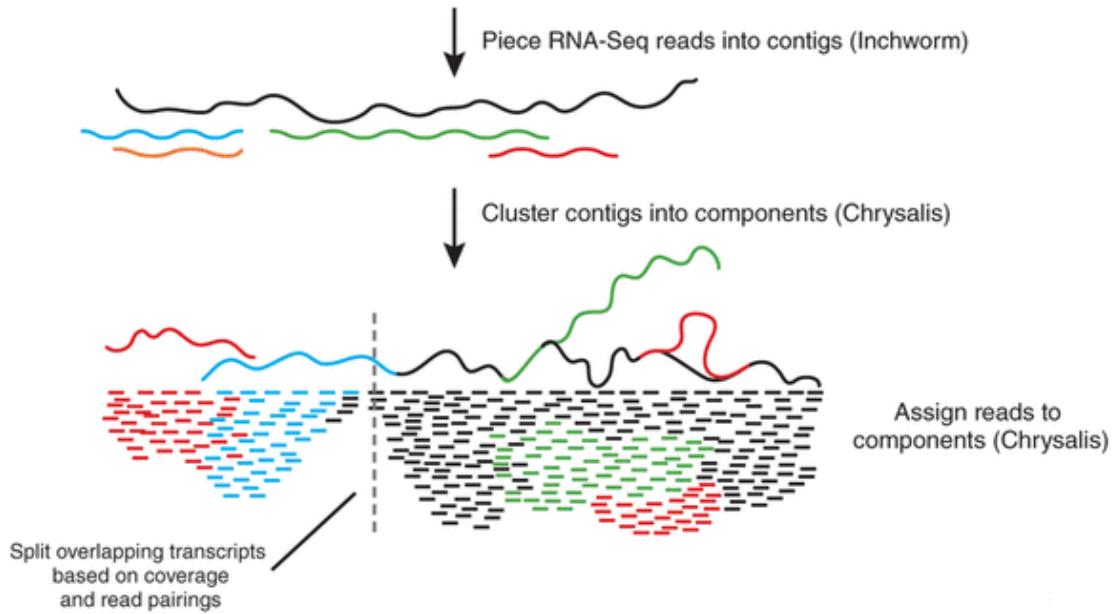
---

- Graph has “nodes” and “edges”

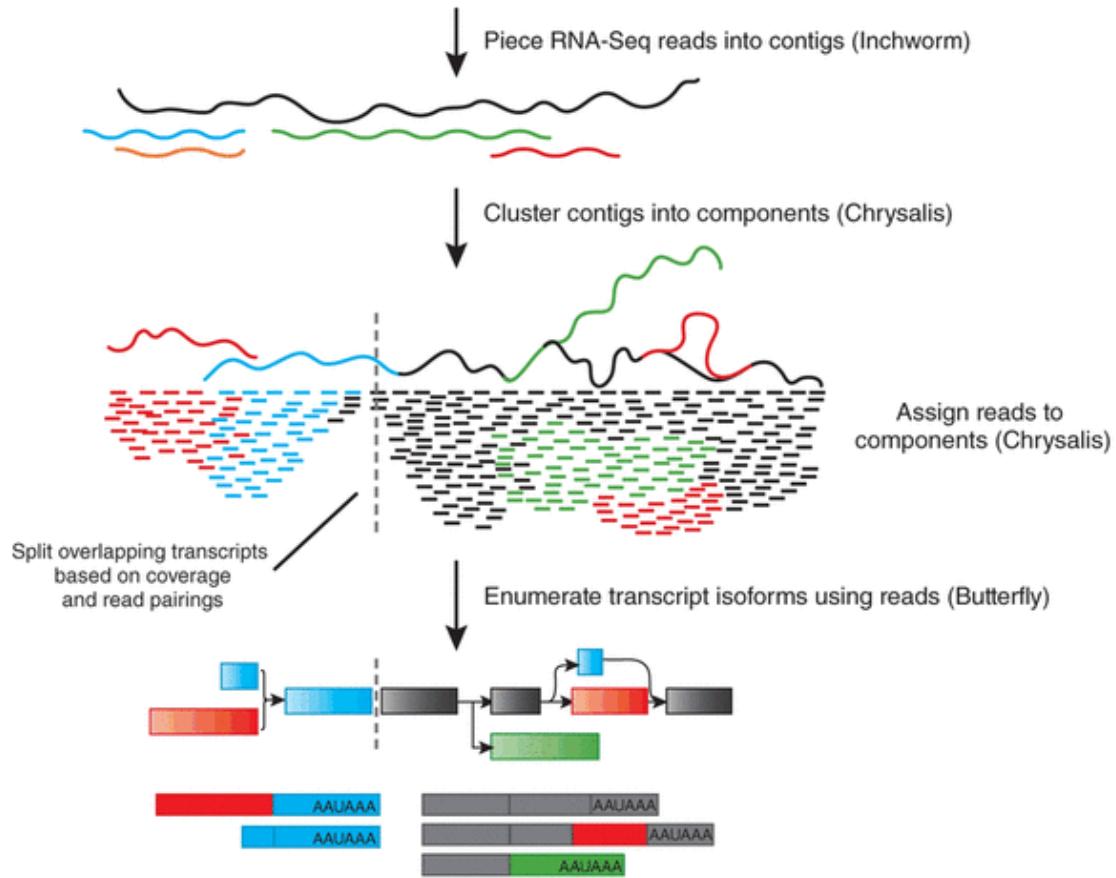




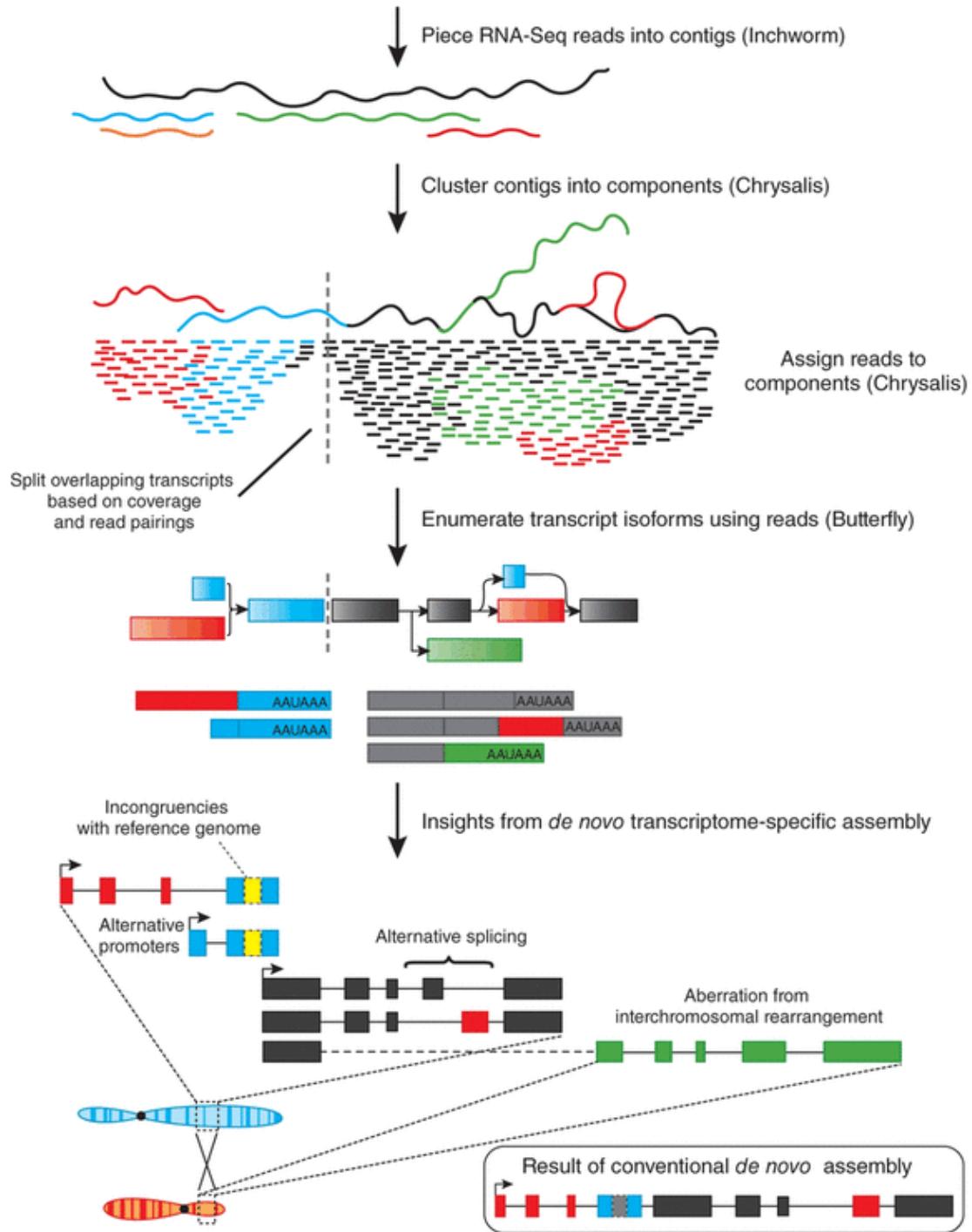
Iyer MK, Chinnaiyan AM (2011)  
*Nature Biotechnology* **29**, 599–600



Iyer MK, Chinnaiyan AM (2011)  
*Nature Biotechnology* **29**, 599–600



Iyer MK, Chinnaiyan AM (2011)  
*Nature Biotechnology* **29**, 599–600



Iyer MK, Chinnaiyan AM (2011)  
*Nature Biotechnology* **29**, 599–600

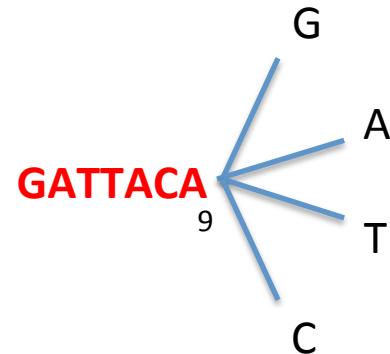


# Inchworm Algorithm

Decompose all reads into overlapping Kmers (25-mers)

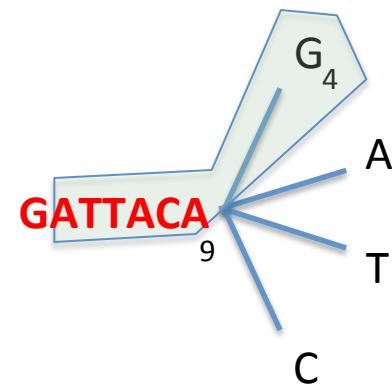
Identify seed kmer as most abundant Kmer, ignoring low-complexity kmers.

Extend kmer at 3' end, guided by coverage.



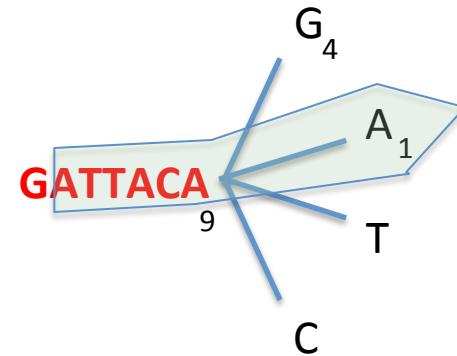


# Inchworm Algorithm



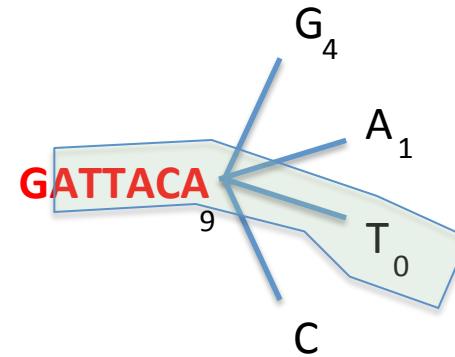


# Inchworm Algorithm



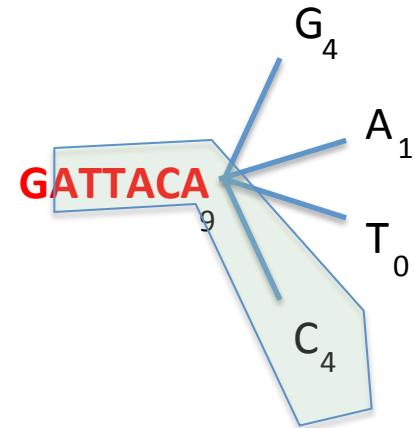


# Inchworm Algorithm



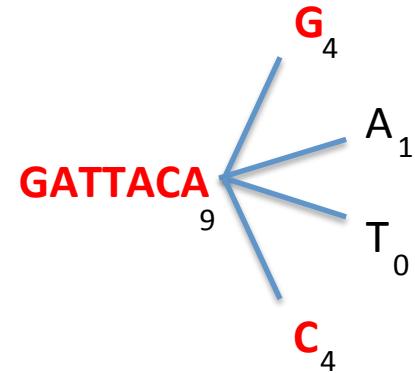


# Inchworm Algorithm



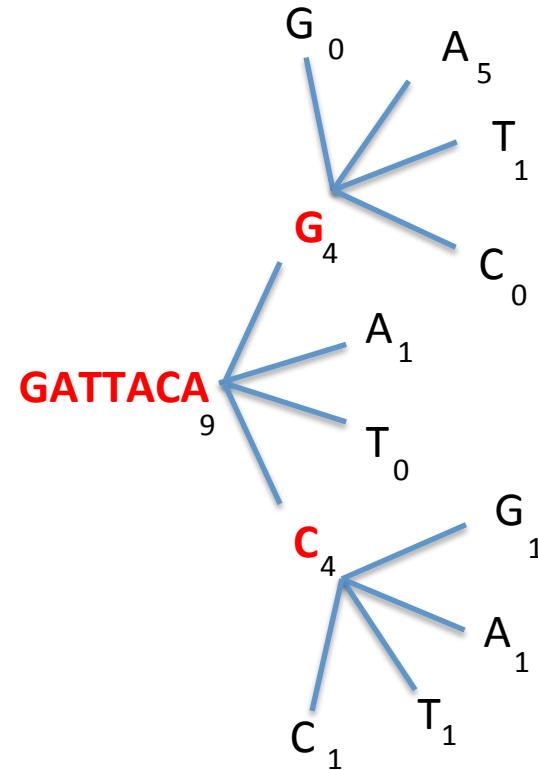


# Inchworm Algorithm



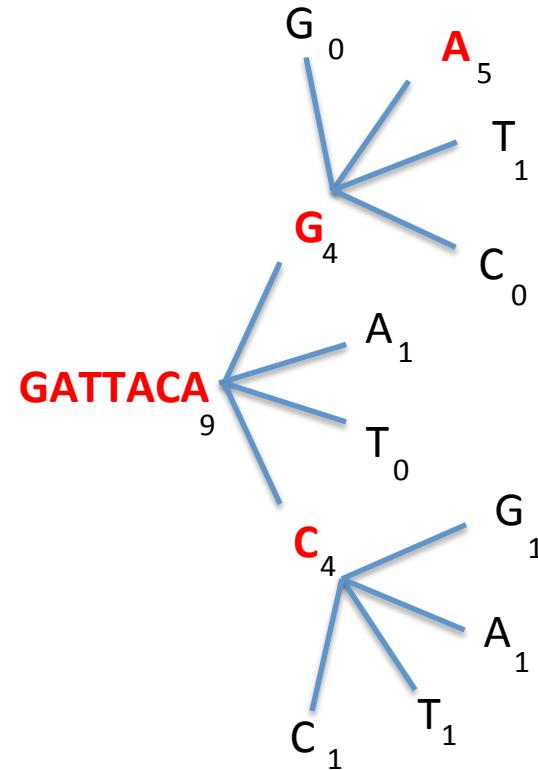


# Inchworm Algorithm



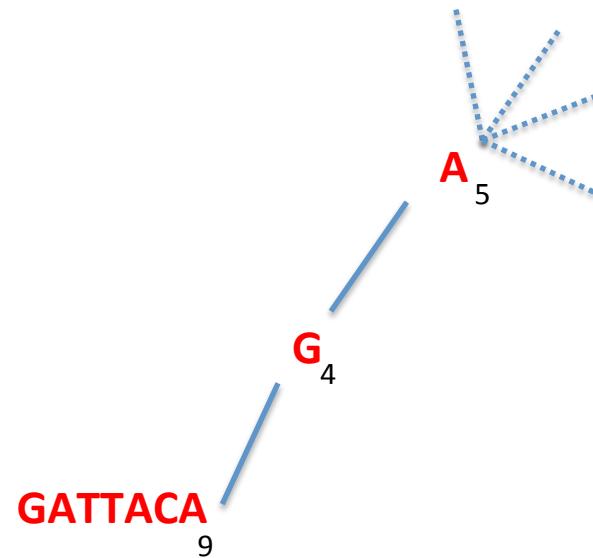


# Inchworm Algorithm



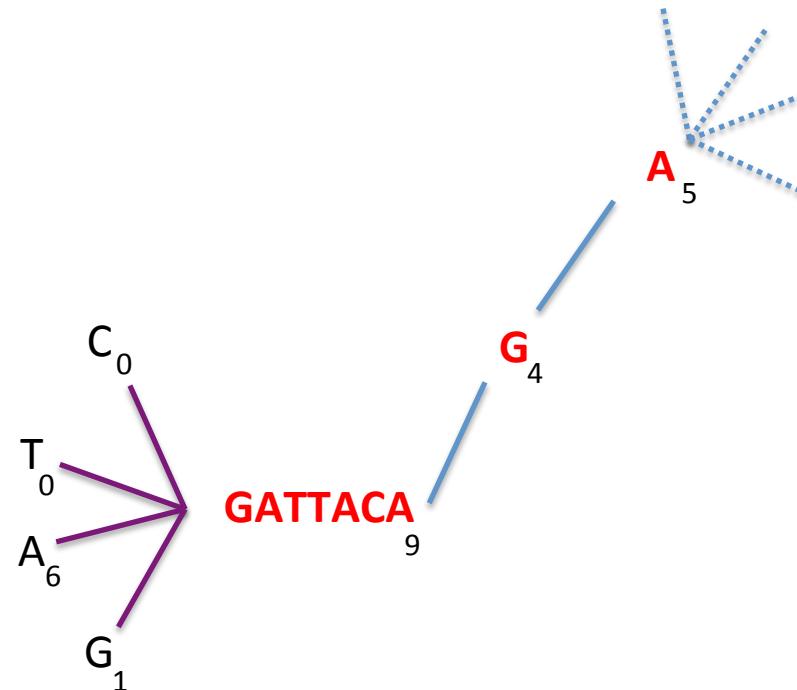


# Inchworm Algorithm



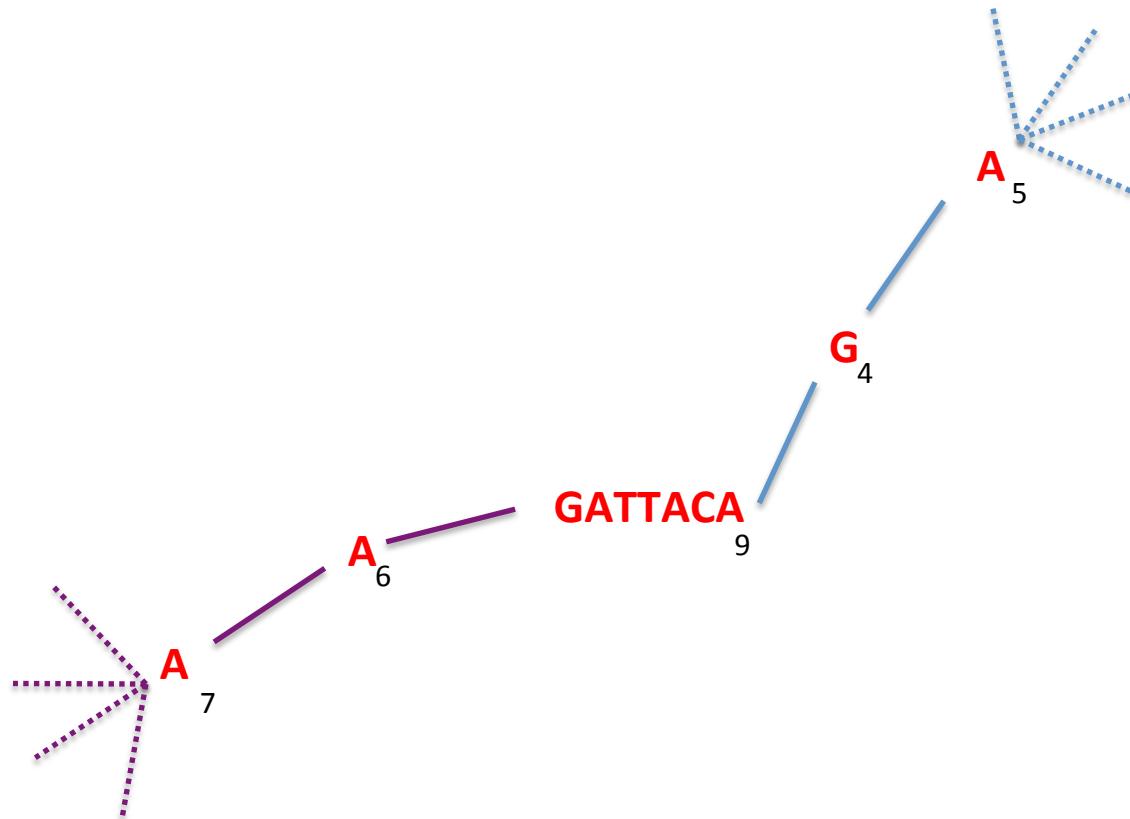


# Inchworm Algorithm





# Inchworm Algorithm

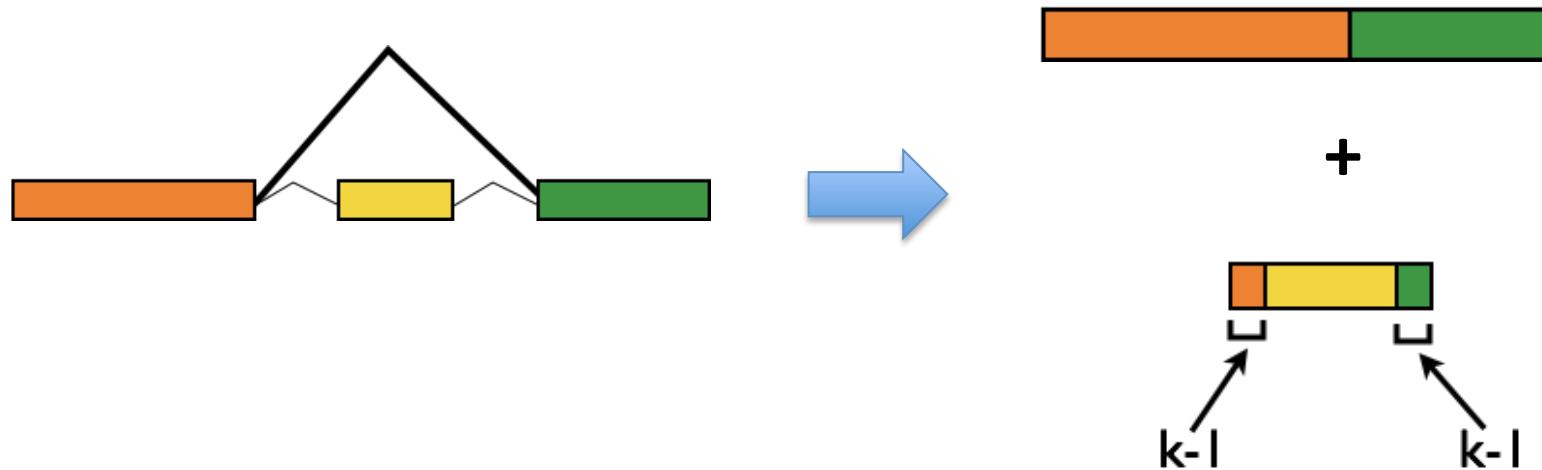


Report contig: ....**AAGATTACAGA**....

Remove assembled kmers from catalog, then repeat the entire process.



Inchworm Contigs from Alt-Spliced Transcripts  
=> Minimal lossless representation of data



# Chrysalis

```
>a121:len=5845  
_____  
>a122:len=2560  
_____  
>a123:len=4443  
_____  
>a124:len=48  
_____  
>a125:len=8876  
_____  
>a126:len=66  
_____
```

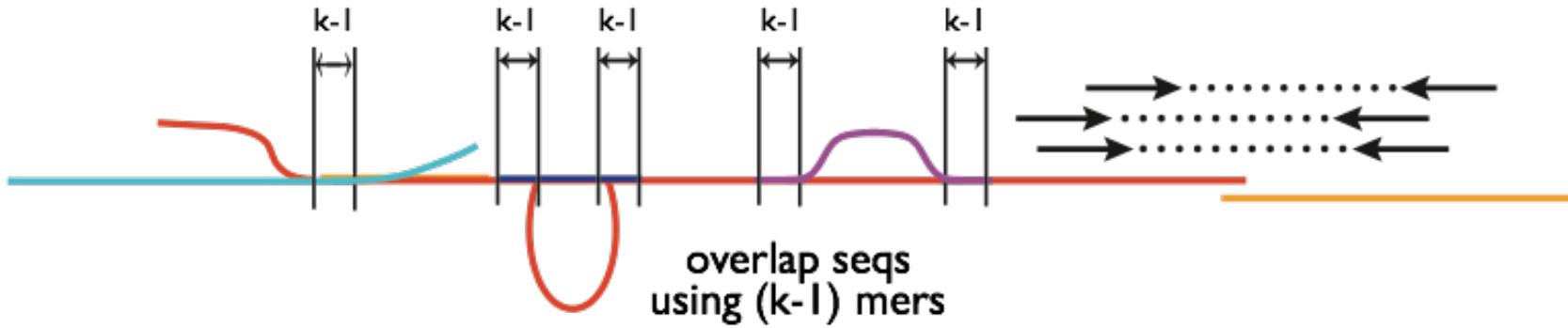


Integrate isoforms  
via k-1 overlaps

# Chrysalis

>a121:len=5845  
  red  
>a122:len=2560  
  green  
>a123:len=4443  
  cyan  
>a124:len=48  
  dark blue  
>a125:len=8876  
  orange  
>a126:len=66  
  purple

Integrate isoforms  
via k-1 overlaps

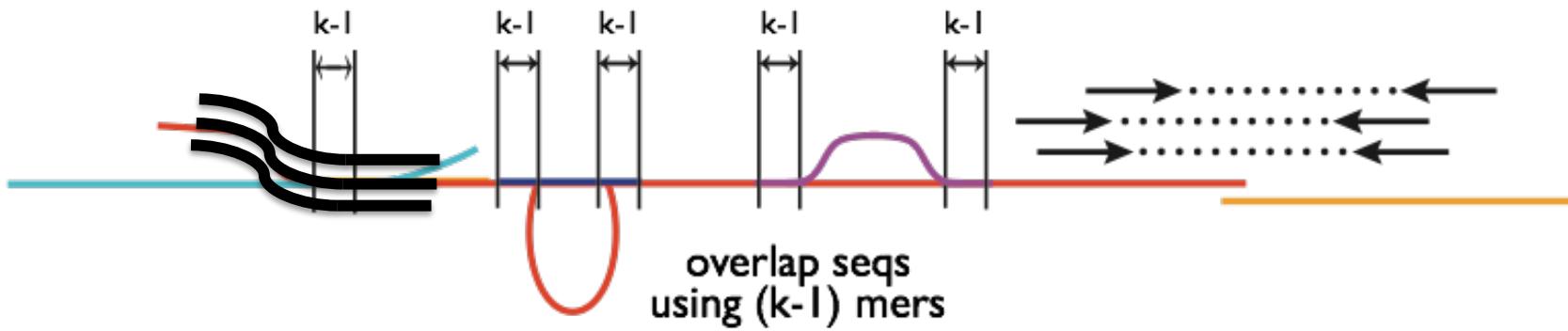


# Chrysalis

>a121:len=5845  
  red  
  
>a122:len=2560  
  green  
  
>a123:len=4443  
  cyan  
  
>a124:len=48  
  dark blue  
  
>a125:len=8876  
  orange  
  
>a126:len=66  
  purple



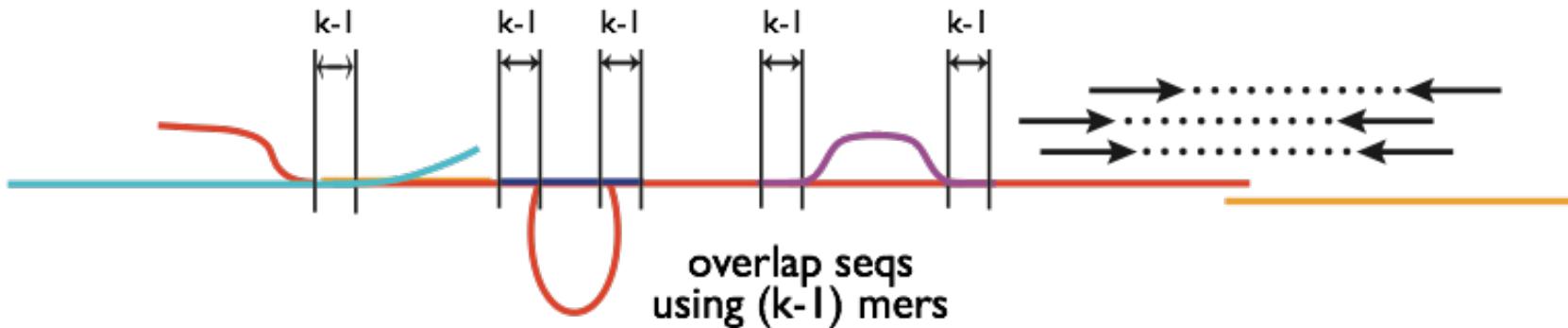
Integrate isoforms  
via k-1 overlaps  
Verify via “welds”



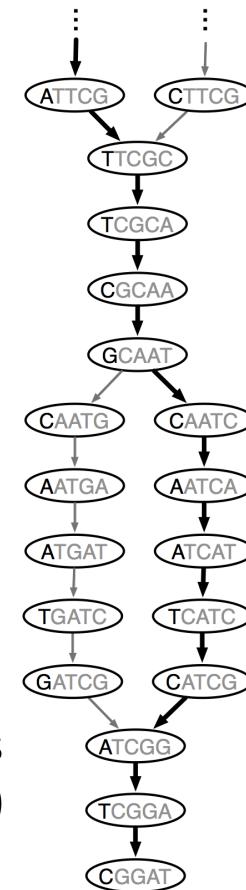
# Chrysalis

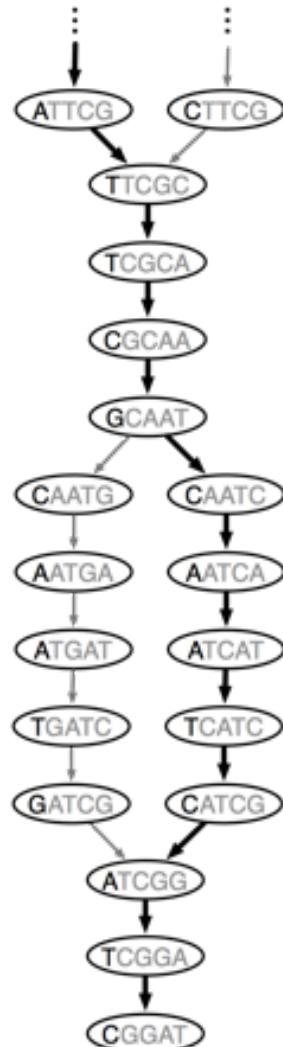
```
>a121:len=5845  
.....  
>a122:len=2560  
.....  
>a123:len=4443  
.....  
>a124:len=48  
.....  
>a125:len=8876  
.....  
>a126:len=66  
.....
```

Integrate isoforms  
via k-1 overlaps  
Verify via “welds”



Build de Bruijn Graphs  
(ideally, one per gene)

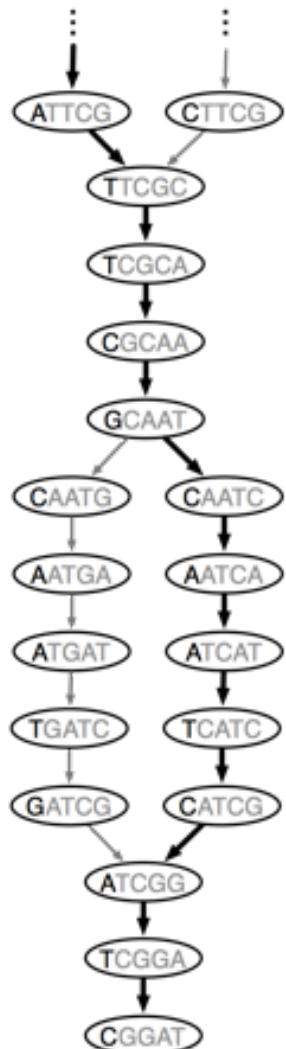




# Butterfly



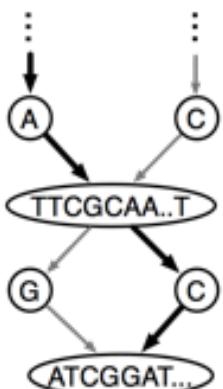
de Bruijn  
graph



de Bruijn  
graph

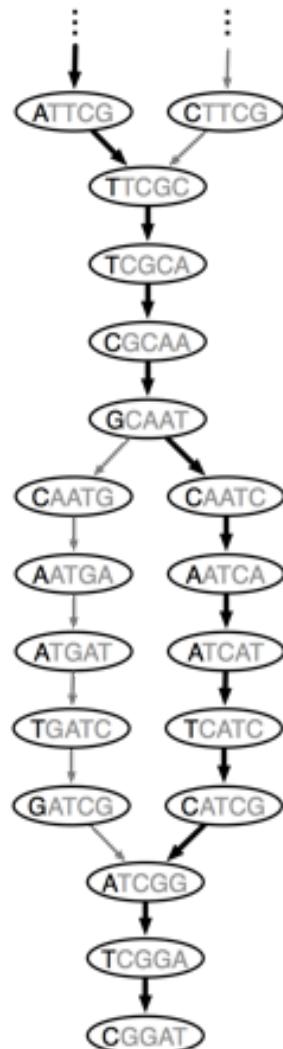
compacting

# Butterfly



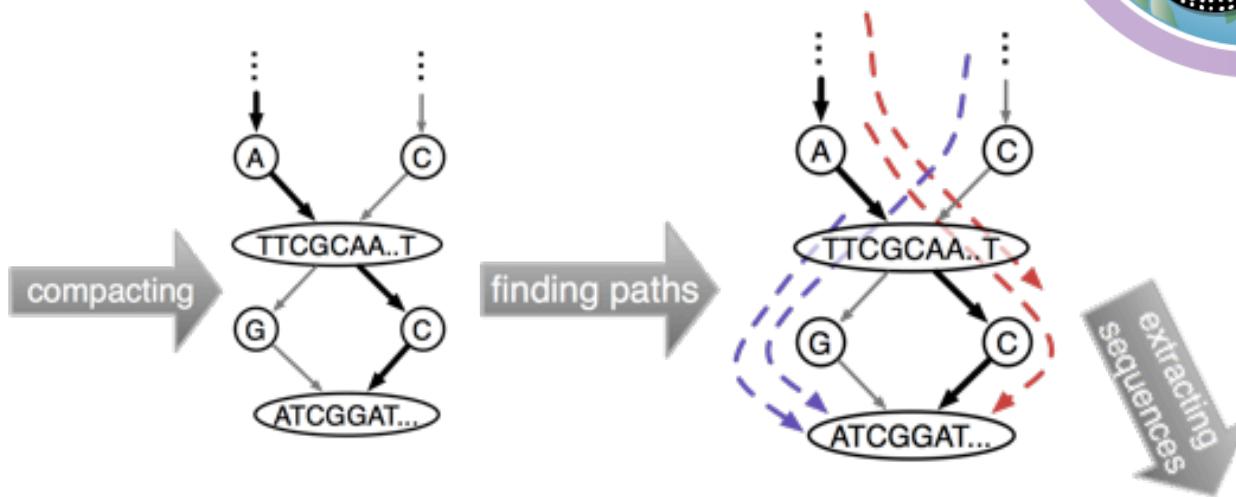
compact  
graph





de Bruijn  
graph

# Butterfly



compact  
graph

compact  
graph with  
reads



..CTTCGCAA..TGATCGGAT...  
..ATTCGCAA..TCATCGGAT...

sequences

# Completeness and coverage as function of read counts

