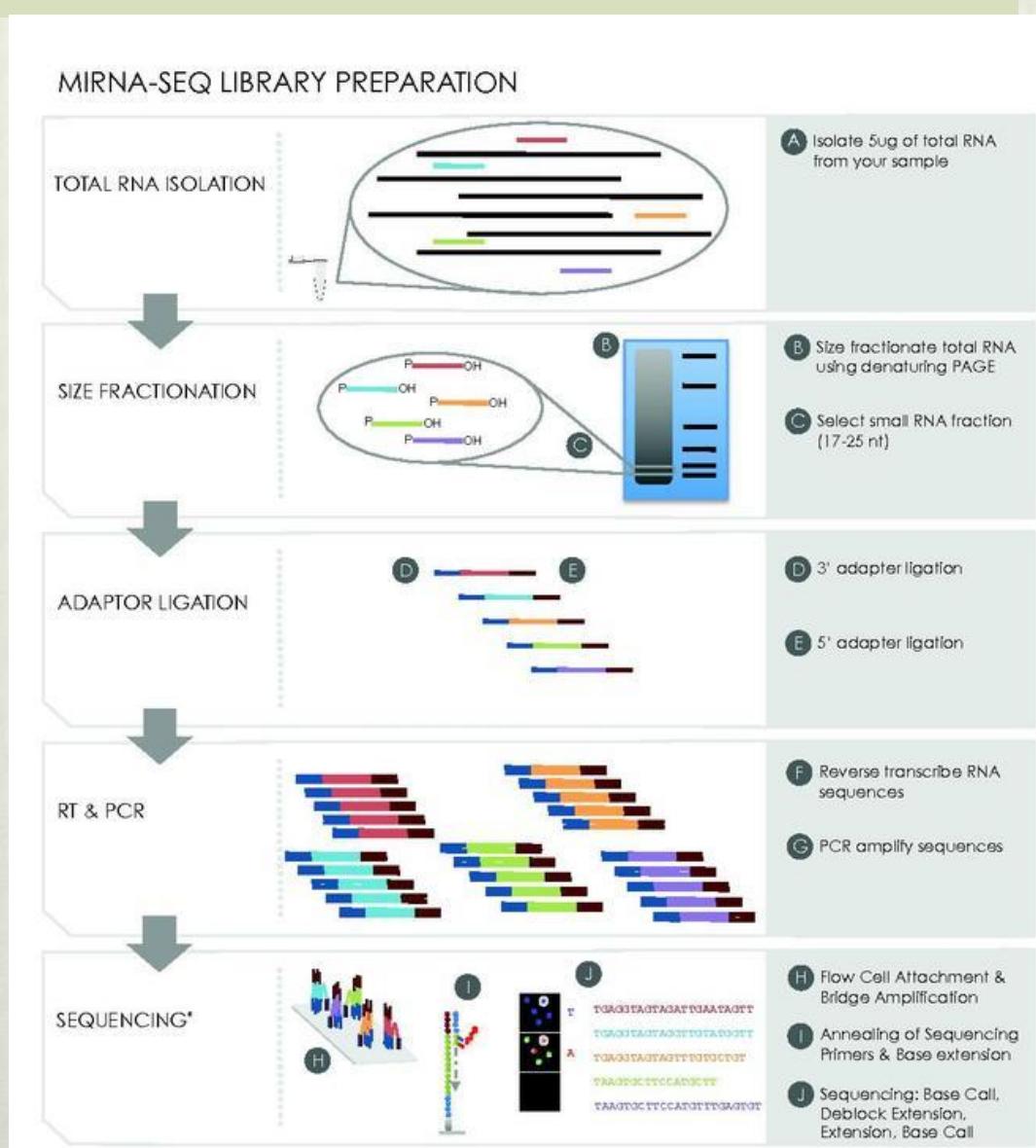


# microRNAs y secuenciación masiva (PII)

Genómica Funcional  
Máster en Genética y Evolución

# Secuenciación masiva & genes de microRNAs

- Extracción del RNA total
- Ligar adaptadores
- Seleccionar por longitud
- Generar una librería de cDNA
- Secuenciar
- Análisis bioinformático



Source:

[http://en.wikipedia.org/wiki/MicroRNA\\_Sequencing](http://en.wikipedia.org/wiki/MicroRNA_Sequencing)

# Análisis bioinformático

## El punto de partida

Las secuencias de las lecturas en formato fastq

Cada lectura está representada por 4 líneas

```
@SRR037876 GSM522374_1:1:148:931:861  
TAGTTCTACAGTCCGACGATCTCGTATGCCGTCTTC  
+  
BB@+?0 : 4@B@-@ /A<3A7@-=@<1=@87=?<==9#
```

Secuencia de la  
lectura

Calidad de la lectura

La longitud de las lecturas depende del número de ciclos en las secuenciación,  
frecuentemente entre 36 y 50 nucleótidos

# Flujo del trabajo

## 1) Control de calidad

- Eliminar lecturas con baja calidad
  - Muy importante para la detección de variación de secuencia
  - Potencialmente importante en la detección de isomiRs

## 2) Detectar y eliminar el adaptador

- Se secuencia parte del adaptador si la molécula es mas corta que la lecturas (número de ciclos)
- El adaptador no alinea frente al genoma
- Hay que eliminarlo para poder mapear la lectura y detectar isomiRs

## 3) Colapsar las lecturas

- Unir lecturas únicas en una entrada única que consiste en
  - Secuencia & conteo (read count) (las veces una secuencia fue observada en un experimento)

## 4) Alinear las lecturas únicas frente a una referencia

# Quality control

```
@SRR037876 GSM522374_1:1:148:931:861  
TAGTTCTACAGTCCGACGATCTGTATGCCGTCTTC  
+  
BB@+?0:4@B@-@/A<3A7@-=@<1=@87=?<==9#
```

The base call quality is ASCII encoded  
 $B=66$ ;  $@=64$ ,  $=63$ , etc



Convert to numbers

```
66|66|64|43|63 ...
```



Convert to Phred Score (Q)

```
33|33|31|10|30 ...
```



Subtract X from this number  
 $Q(B) = 66 - 33 = 33$   
X frequently is 33 but it might depend on the vendor's protocol

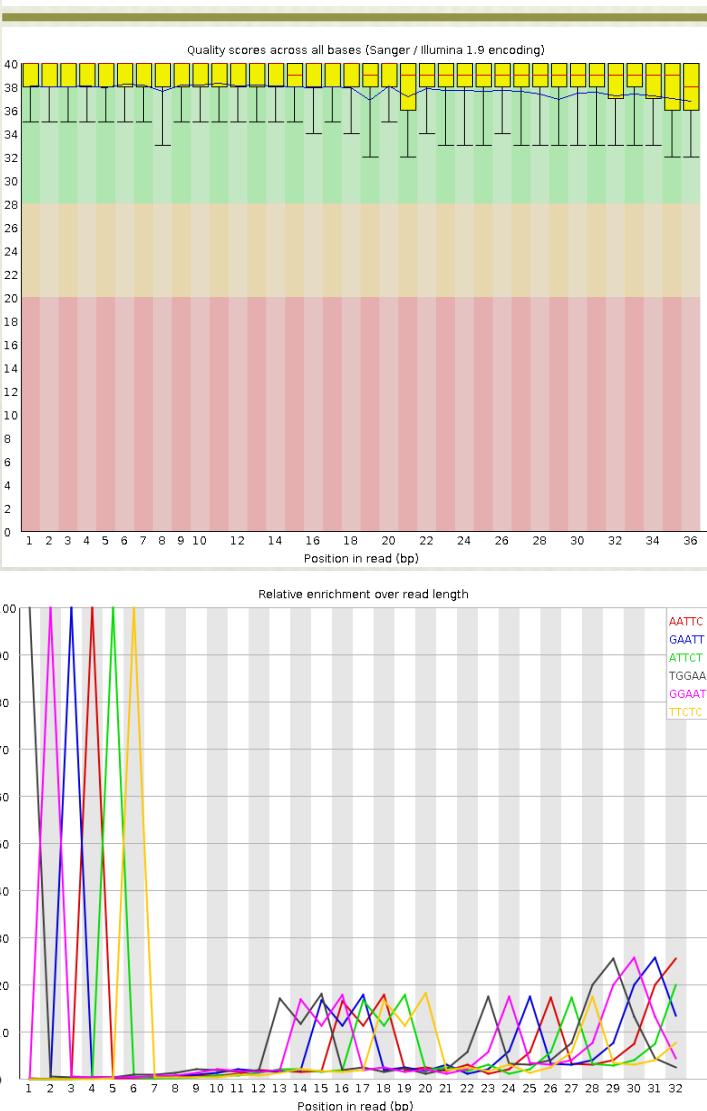


Several possibilities

- Trim the reads at the first base with  $Q < q$
- Remove reads with mean  $Q < q$
- Remove reads with min  $Q < q$
- Remove reads if the number of bases with  $Q < q$  is over given threshold

Q	P (incorrect BC)	BC accuracy
10	1 in 10	90%
20	1 in 100	99%
30	1 in 1000	99.9%
40	1 in 10000	99.99%

# Have a first glimpse on the data: fastqc



- Very good sequencing quality
- Suspicious overrepresentation of k-mers

- “Acceptable” sequencing quality
- Less k-mer bias at initial positions

# Detectar el adaptador

Mature microRNAs are around 21 nt long --- in the example below, the reads are 50 nt long

→(part of) the adapter is sequenced as well

```
@SRR518946.15 DA19881:1:30F8JAAXX:8:1:8:919 length=50  
TAGCTTATCAGACTGATGTTGACTCGTATGCCGTCTCTGCTTGTT  
+SRR518946.15 DA19881:1:30F8JAAXX:8:1:8:919 length=50  
BBBB<BBBABCABBABB@B>@?=B@7:@6A?=8>B>7?#####
```



Align the adapter sequence to the read

3' RNA Adapter  
5' P-UCGUAUGCCGUCUUCUGCUUGU

## Parameters:

- Minimum length of detected adapter sequence (10 nt)
- Number of allowed mismatches



```
@SRR518946.15 DA19881:1:30F8JAAXX:8:1:8:919 length=50  
TAGCTTATCAGACTGATGTTGACTCGTATGCCGTCTCTGCTTGTGT  
+SRR518946.15 DA19881:1:30F8JAAXX:8:1:8:919 length=50  
BBBB<BBBABCABBABB@B>@?=B@7:@6A?=8>B>7?#####
```

# Detectar el adaptador

```
@  
TAAGTGGGAGGCCCTCGTATGCCGTCTCTGCTTGAAAAAAAATA  
+  
BCA6<>>BBAB?AC@AABACBAB?'>A:A>?@A@#####  
@  
TGAGGTAGTAGATTGTATAGTTTCGTATGCCGTCTCTGCTTGATTATGT  
+  
BC@2ABCC?BBA?=BABB??ABB@B@=A@?@B?AB;#####  
@  
TCGTATGCCGTCTCTGCTTGAAAAAAAAAAATAATTTTTTTTTT  
+  
B@;?BBB?3?BBBB@9@A?0<AA#####  
@  
TTCAAGTAATCCAGGATAGGCTTCGTATGCCGTCTCTGCTTAATTTT  
+  
>C CBCBA?@@CBB@?BA@7:@A7=>8/:7<>=29#####  
@  
TAATACTGCCTGGTAATGATGACTCGTATGCCGTCTCTGCTTGTTGTGG  
+  
BCCCCCBCCCCC?>ACCCBCCBAB>>@@BBAB=;;?=B@#####  
@  
TGAGGTAGTAGATTGTATAGTTTCGTATGCCGTCTCTGCTTGATTTTT  
+  
BCAAA?BC:6<AABA>@:98=B:AA@A9>>@;??#####  
@  
TAGCTTATCAGACTGATGTTGACTCGTATGCCGTCTCTGCTTGTGTGTT  
+  
BBBB<BBBABCABBABB@B>@?=B@7:@6A?=8>B>7?#####
```

# Detectar el adaptador

```
@  
TAAGTGGGAGGCC  
+  
BCA6<>>BBAB?AC  
@  
TGAGGTAGTAGATTGTATAAGTT  
+  
BC@2ABCC?BBA?=BABBB??AB  
@  
+  
@  
TTCAAGTAATCCAGGATAGGCTTCGTATGCCGTCTCTGCTTTAATTTT  
+  
>C CBCBBA?@@CBB@?BA@7:@A7=>8/:7<>=29#####  
@  
TAATACTGCCTGGTAATGATGAC  
+  
BCCCCCBCCCCC?>ACCCBCCB  
@  
TGAGGTAGTAGATTGTATAAGTT  
+  
BCAAA?BC:6<AABA>@:98=B  
@  
TAGCTTATCAGACTGATGTTGAC  
+  
BBBB<BBBABCABBABB@B>@?
```

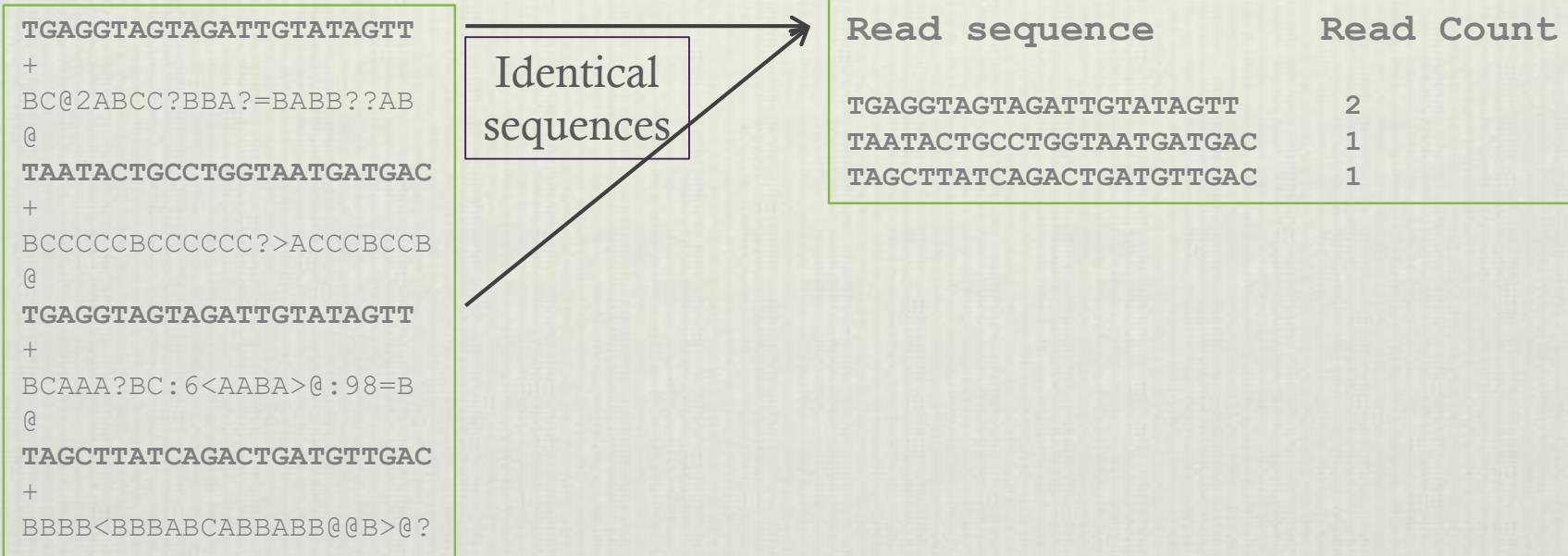
The diagram illustrates the lengths of various sequence segments from a sequencing run. The segments are grouped by a vertical bracket on the right side of the sequence list. The groups and their corresponding lengths are:

- 14 nt
- 22 nt
- 0 nt
- Not trimmed (50 nt)
- 22 nt
- 22 nt
- 23 nt

# Colapsar las lecturas

Convert adapter trimmed fastq file into read/count format

→ Collapse “redundant reads” into unique reads & read count



# Ficheros de entrada

## Fasta:

```
>1999420#1462
TGAGATGAAGCACTGTAGAAAA
>443945#1281
GGGAGCATCTCTCGGTCTATGCTGT
>633088#562
TAGATGAAGCACTGTAGCTCTT
>255762#230
GCATTGGTGGTAGAATTCTCGCC
>516042#97
TCAGATGAAGCACTGTAGCTCTT
>1582566#86
TAGATGAATCACTGTAGCTC
>1462753#79
TGGAAATTATGGAAAATGACAGATGGC
>625879#40
GTTAAGATATCCCGGACGAGCCC
>517214#8
TCCTTTGGTATAGTGGTGAGTATCCC
>626077#2
TGACTTGACCTGAGAGAAGAAGGC
```

## Read/count

TGAGATGAAGCACTGTAGAAAA	1462
GGGAGCATCTCTCGGTCTATGCTGT	1281
TAGATGAAGCACTGTAGCTCTT	562
GCATTGGTGGTAGAATTCTCGCC	230
TCAGATGAAGCACTGTAGCTCTT	97
TAGATGAATCACTGTAGCTC	86
TGGAAATTATGGAAAATGACAGATGGC	79
GTTAAGATATCCCGGACGAGCCC	40
TCCTTTGGTATAGTGGTGAGTATCCC	8
TGACTTGACCTGAGAGAAGAAGGC	2

# Asignar lecturas

```
>1999420#1462  
TGAGATGAAGCACTGTAGAAAA  
>443945#1281  
GGGAGCATCTCTCGGTCTATGCTGT  
>633088#562  
TAGATGAAGCACTGTAGCTCTT  
>255762#230  
GCATTGGTGGTAGAATTCTCGCC  
>516042#97  
TCAGATGAAGCACTGTAGCTCTT  
>1582566#86  
TAGATGAATCACTGTAGCTC
```

From which RNAs are these reads derived?

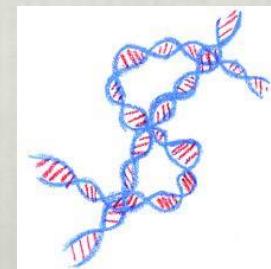
Assign reads to a reference library

1

Map reads to a set of known small RNA sequences

2

Map to the genome & genome annotations



# Asignar lecturas

1

Input: read/count

```
>1999420#12682  
TGAGGTAGTAGGTTGTGTGGTT  
>633088#5692  
TGAGATGAAGCACTGTAGCTC  
>255762#2630  
TGAGGTAGTAGGTTGTATAGTT  
>516042#1297  
TCAGATGAAGCACTGTAGCTCTT  
>443945#181  
TGAGGTAGTAGGTTGTGTGGT  
>1582566#86  
TGAGGTAGTAGGTTGTATAGT  
>1462753#79  
TGGAATTATGGAAAATGACAGATGGC  
>625879#40  
GTTAAGATATCCCGGACGAGCCC  
>517214#8  
TACCCTGTAGAACCGAATTGTG  
>626077#2  
TGACTTGACCTGAGAGAAGAAGGC
```

Alignment  
Bowtie, Blast, etc

Sequence library (miRBase)

```
>hsa-let-7b-5p  
TGAGGTAGTAGGTTGTGTGGTT  
> hsa-miR-143-3p  
TGAGATGAAGCACTGTAGCTC  
> hsa-let-7a-5p  
TGAGGTAGTAGGTTGTATAGTT  
> hsa-miR-509-3p  
TGATTGGTACGTCTGTGGGTAG  
> hsa-miR-10b-5p  
TACCCTGTAGAACCGAATTGTG
```

# Asignar lecturas

1

Input: read/count

```
>1999420#12682 → read count  
TGAGGTAGTAGGTTGTGTGGTT  
>633088#5692  
TGAGATGAAGCACTGTAGCTC  
>255762#2630  
TGAGGTAGTAGGTTGTATAGTT  
>516042#1297  
TCAGATGAAGCACTGTAGCTCTT  
>443945#181  
TGAGGTAGTAGGTTGTGTGGT  
>1582566#86  
TGAGGTAGTAGGTTGTATAGT  
>1462753#79  
TCCAATTATGGAAAATGACAGATGGC  
>625879#40  
GTTAAGATATCCCGGACGAGCCC  
>517214#8  
TACCCTGTAGAACCGAATTGTG  
>626077#2  
TGACTTGACCTGAGAGAAGAACGC
```

Alignment  
Bowtie, Blast, etc

Sequence library (miRBase)

```
>hsa-let-7b-5p  
TGAGGTAGTAGGTTGTGTGGTT  
> hsa-miR-143-3p  
TGAGATGAAGCACTGTAGCTC  
> hsa-let-7a-5p  
TGAGGTAGTAGGTTGTATAGTT  
> hsa-miR-509-3p  
TGATTGGTACGTCTGTGGGTAG  
> hsa-miR-10b-5p  
TACCCCTGTAGAACCGAATTGTG
```

Sum the read count of  
all mapped reads

Name	Read Count
hsa-let-7b-5p	12863
hsa-miR-143-3p	5692
hsa-let-7a-5p	2716
hsa-miR-10b-5p	8

# Differential Expression

Compare the expression profiles between two conditions

The total yield of reads can (will) differ between two different samples → read counts cannot be used for comparison

Two possibilities:

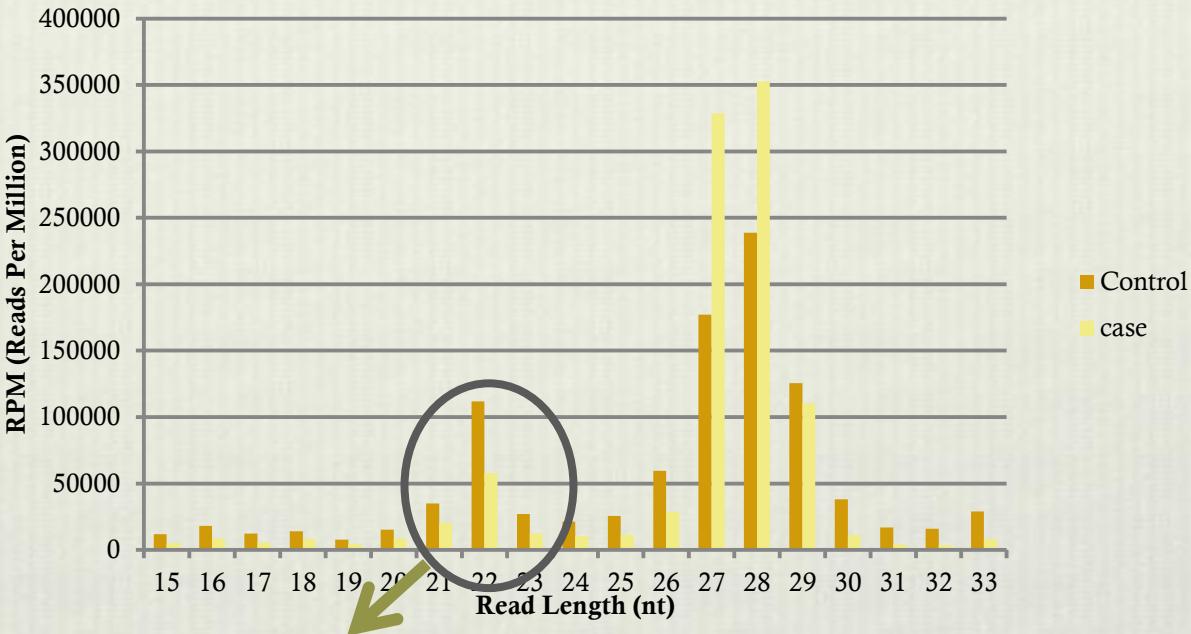
1. The expression measure needs to be independent of the total number of reads (Reads Per Million)
2. The expression values need to be scaled, i.e. make the total number of reads the same in all conditions/samples



Reproducibility of high-throughput mRNA and small RNA sequencing across laboratories

Peter A C 't Hoen<sup>1,2</sup>, Marc R Friedländer<sup>3–6,15</sup>, Jonas Almlöf<sup>7,15</sup>, Michael Sammeth<sup>3–5,8,14</sup>, Irina Pulyakina<sup>1</sup>, Seyed Yahya Anvar<sup>1,9</sup>, Jeroen F J Laros<sup>1,2,9</sup>, Henk P J Buermans<sup>1,9</sup>, Olof Karlberg<sup>7</sup>, Mathias Brännvall<sup>7</sup>, The GEUVADIS Consortium<sup>10</sup>, Johan T den Dunnen<sup>1,2,9</sup>, Gert-Jan B van Ommen<sup>1</sup>, Ivo G Gut<sup>8</sup>, Roderic Guigó<sup>3–5</sup>, Xavier Estivill<sup>3–6</sup>, Ann-Christine Syvänen<sup>7</sup>, Emmanouil T Dermitzakis<sup>11–13</sup> & Tuuli Lappalainen<sup>11–13</sup>

# Differential Expression



- Mature microRNAs are '**relatively**' less frequent in cases than in controls
  - Could be due to overexpression of 27-29 nt RNAs in cases, i.e. the absolute abundance needs not to be different between cases and controls!
- Normalize for "each used library" separately!

nature  
biotechnology

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$$\text{RPM of } i\text{'th microRNA: } RPM_i = 10^6 \frac{RC_i}{RC_{microRNAs}}$$

# isomiRs

## hsa-mir-99a

CCATTGGCATA	<b>AACCGTAGATCCGATCTTGT</b>	GTGAAGTGGACCGCA	<b>CAAGCTCGCTTCTATGGGTCTGTGTCAGTGTG</b>	7,156
.(((((((((.	(((((..((.((((.((.....)))))))))))..))))))))))))..			
AACCGTAGATCCGATCTTGT		← 3' length variant	3,815	
<b>AACCGTAGATCCGATCTTGT</b>		← hsa-miR-99a-5p	961	
AACCGTAGATCCGATCTTGT <b>A</b>		← Non-templated addition (A)	922	
AACCGTAGATCCGATCTTGT		← 3' length variant	266	
AACCGTAGATCCGATCTTGT <b>T</b>		← Non-templated addition (U/T)	227	
AAACCGTAGATCCGATCTTGT		← 5' length variant	74	
AACCTGTAGATCCGATCTTGT		← 3' length variant	65	
AACCGTAGATCCGATCTTGT		← 3' length variant	54	
AACTCGTAGATCCGATCTTGT		← 3' length variant	30	
AACCGTAGATCCGATCTTGT <b>A</b>		← Non-templated addition (A)	27	
AACCGTAGATCCGATCTTGT <b>A</b>		← Non-templated addition (A)	27	
AACCGTAGATCCGATCTTGC <b>C</b>		← Non-templated addition (C)	25	
AACCGTAGATCCGATCT		← 3' length variant	23	
AACCCTAGATCCGATCTTGT		← 3' length variant	23	
AACCCGTAGATCCTATCTTGT		← 3' length variant	21	
	CAAGCTCGCTTCTATGGGTCTGT		21	
	CAAGCTCGCTTCTATGGGTCTGA		21	
AACCGTAGATCCGATCTTGT <b>AA</b>		← Non-templated addition (2 A)	17	
CGTAGATCCGATCTTGT		← Multiple length variant	12	
AACCGTAGATCCGATCTTGT <b>AA</b>		← Non-templated addition (2 A)	11	
	<b>CAAGCTCGCTTCTATGGGTCTG</b>		11	

# Detectar nuevos microRNAs



- Drosha/Dicer (DCL in plants) processing patterns can be detected
- Both mature microRNAs (both arms) are represented in the sample?
- 5' end of the mature microRNA shows less fluctuation
- Virtually all reads are organized in one or two clusters