

# Comparative analysis of the transcriptome across distant species

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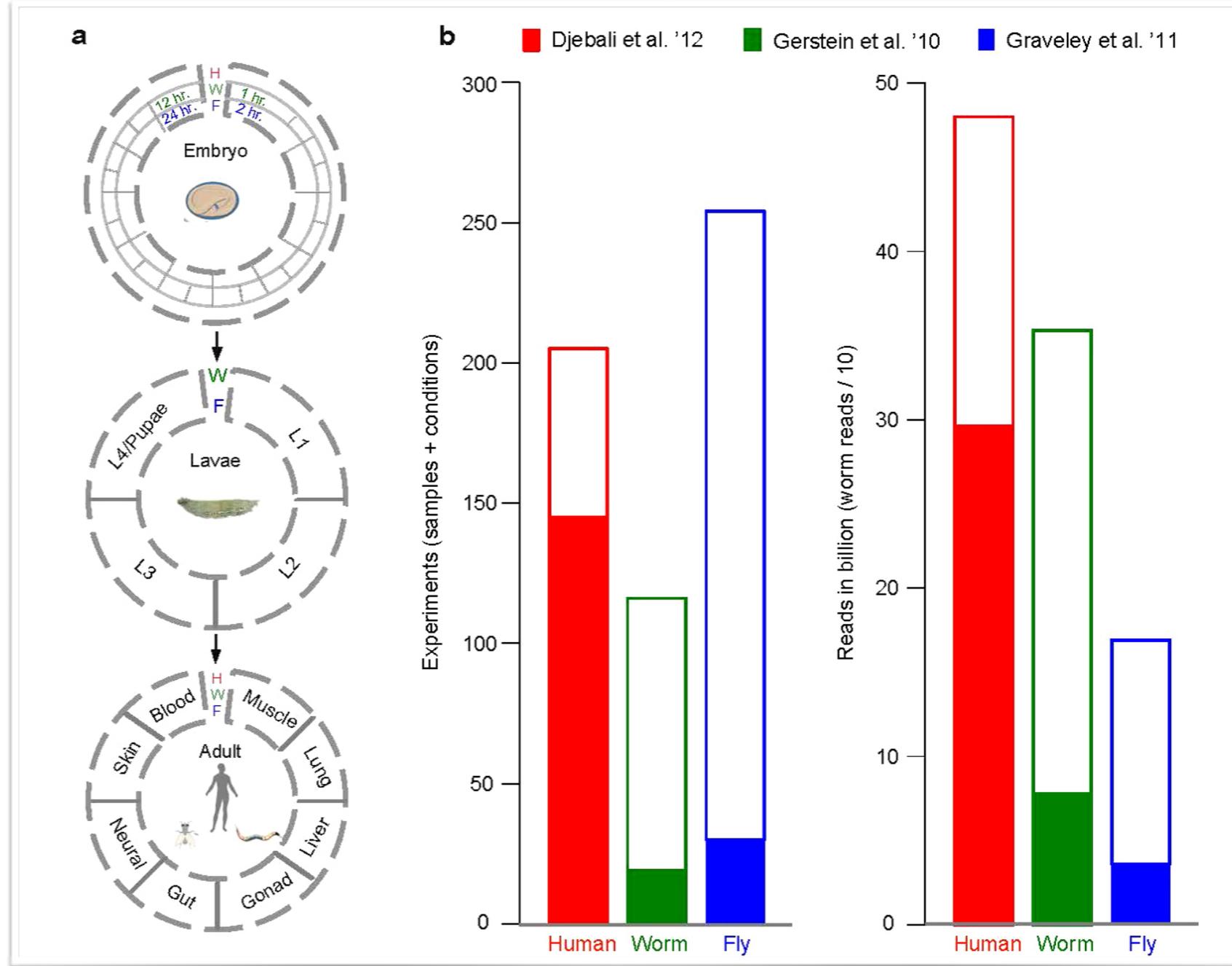
Cristina Sisu

Gerstein Lab

11<sup>th</sup> Jan 2016

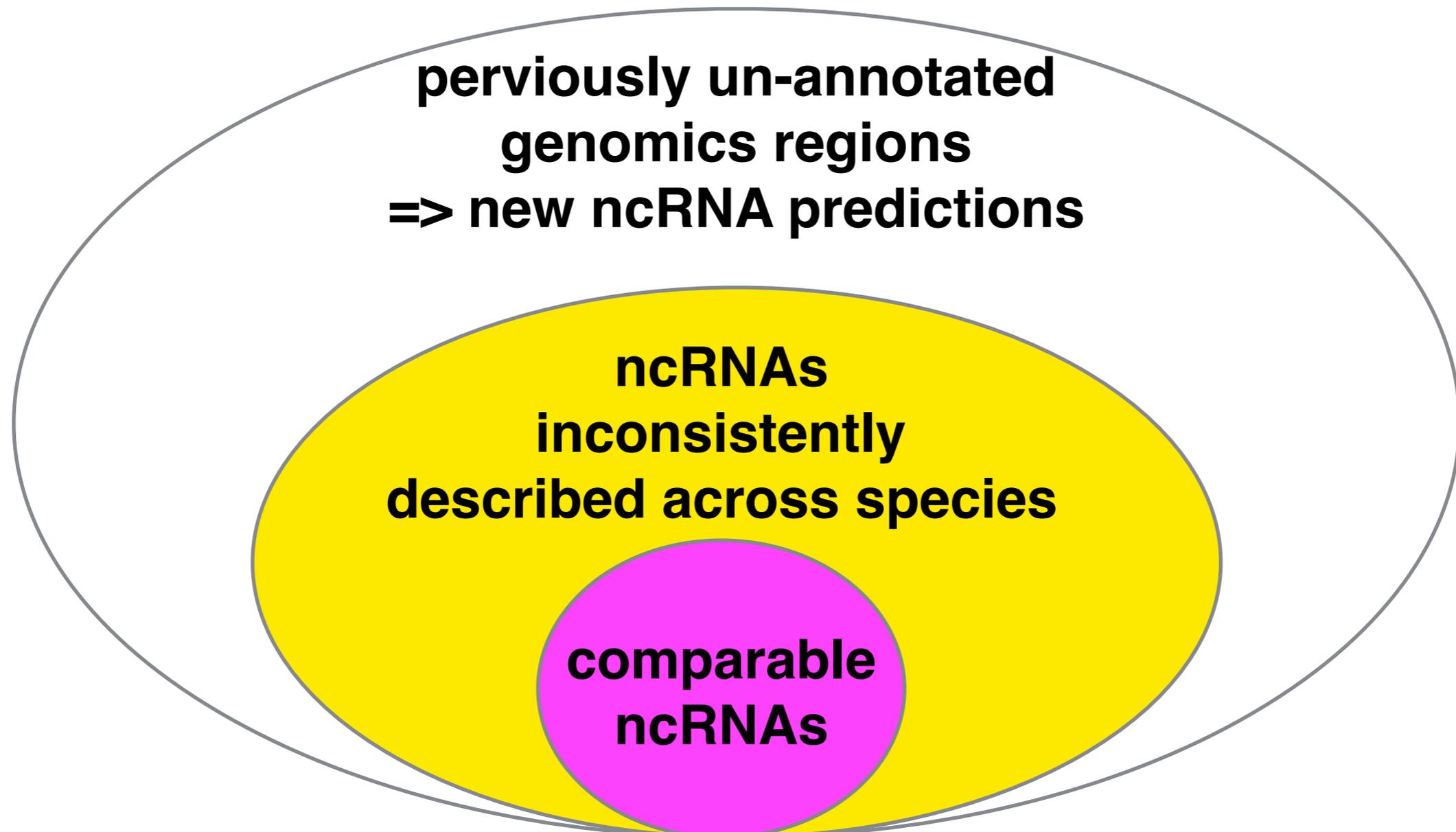
# ENCODE/modENCODE RNA Resource

- 575 experiments
  - 380 New
- >65 billion reads
  - >50% New
  - Illumina GAIIx
  - HiSeq2000
- Experimental conditions
  - 116 worm
  - 254 fly
  - 41 cell lines human



# ncRNA annotation

*“only a subset of ncRNAs, are annotated consistently across organisms”*



# comparable RNAs

5 biotypes for **gold-standard** annotations :

- **CDS, UTR, canonical ncRNAs** (include miRNA, tRNA, rRNA, snRNA, and snoRNA), **lncRNA**, and **ancestral repeats** for human & **unexpressed intergenic** regions for worm and fly

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	<b>Human</b>	<b>Fly</b>	<b>Worm</b>
Gold-standard (Coding sequence, UTR, etc)	Gencode V10 (level 1 and 2)	FlyBase R5.45 (confirmed)	WormBase WS220 (confirmed)
Gold-standard (ncRNA)	Gencode V10 (level 1 and 2)	FlyBase R5.45 (with support of EST, cDNA expression, etc)	WormBase WS220 (lncRNAs from [25])
Extended annotation	Gencode V10 (all levels)	modENCODE freeze	modENCODE freeze

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# Annotation & refinement

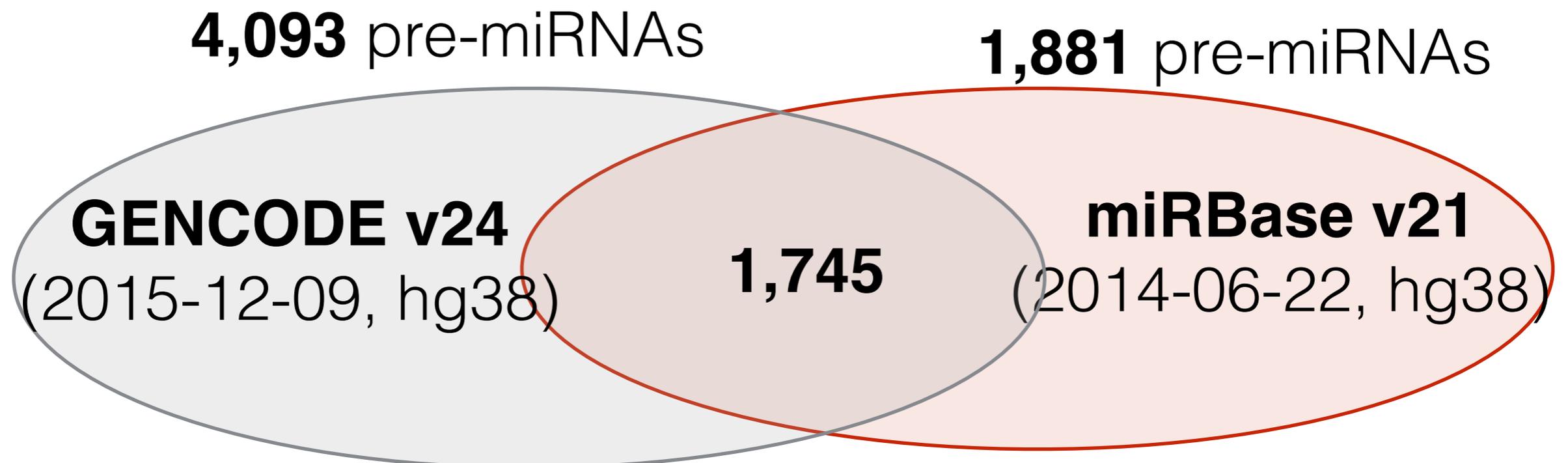
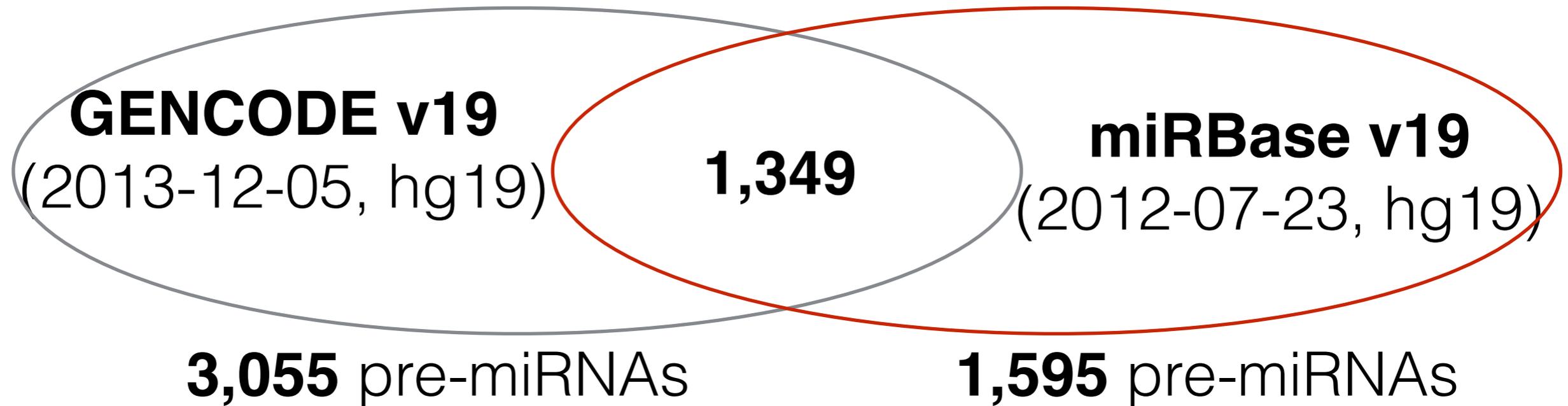
- **lncRNA** subdivision:
  - lncRNA overlapping with > 1bp, known gold standard biotypes were reclassified with the respective labels
  - antisense lncRNA — have >50% sequence overlapping known CDS on the opposite strand
  - intronic lncRNA — fully embedded in protein coding gene introns on the same strand
  - ambiguous ncRNA — overlap known biotypes but do not fulfil criteria for reclassification
- **miRNA**:
  - pre-miRNA known annotations : 1,756 in human, 221 in worm and 235 fly.
  - pre-miRNA hairpins from miRBase v18
  - mirtrons : *Genome Res* 22, 1634-45, (2012)
    - pri-miRNA collected from RefSeq & literature
- **short ncRNA**:
  - extracted from the known annotations from GENCODE, FlyBase and WormBase

# miRNA annotation in GENCODE

	<b>V10</b>	<b>V19</b>	<b>V24</b>
<b>V10</b>	1,756	1,558	1,474
<b>V19</b>		3,055	2,765
<b>V24</b>			4,093

- Common miRNA annotation in different GENCODE versions are determined by their transcript id's.
- V10 is the version used in comparative genomics paper, while v19 is the latest version for hg19, and v24 is the current version for hg38.

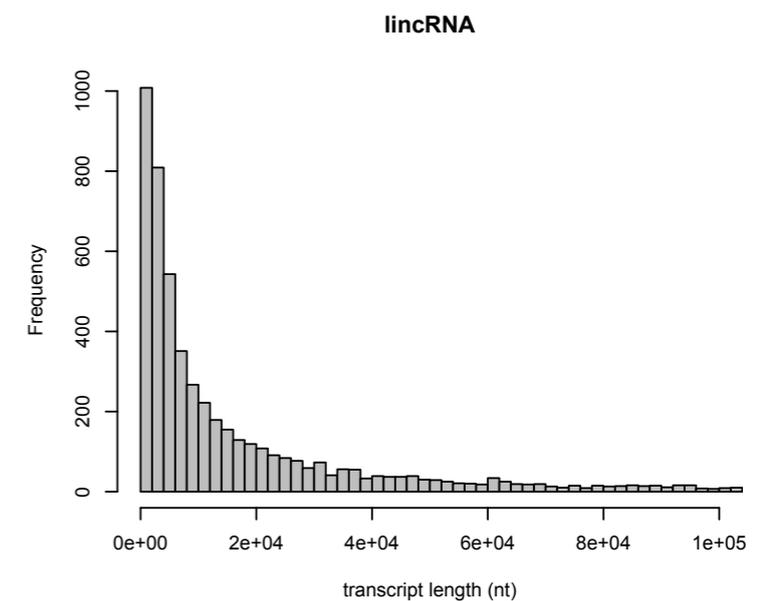
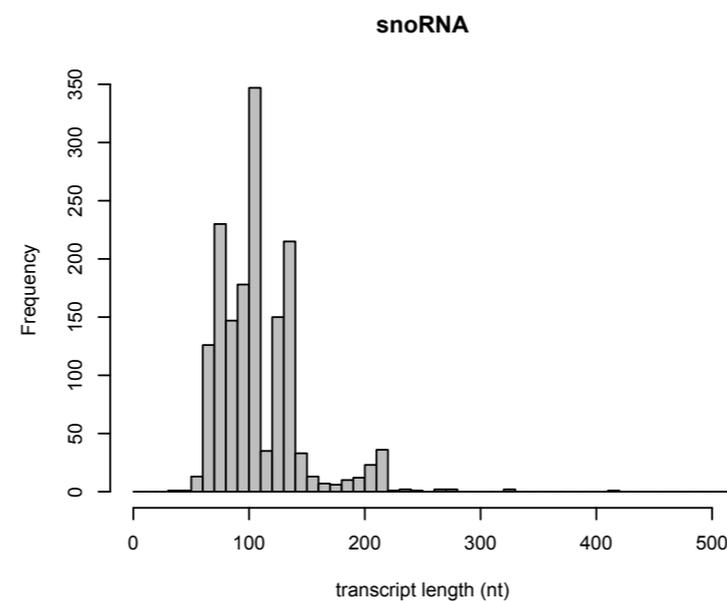
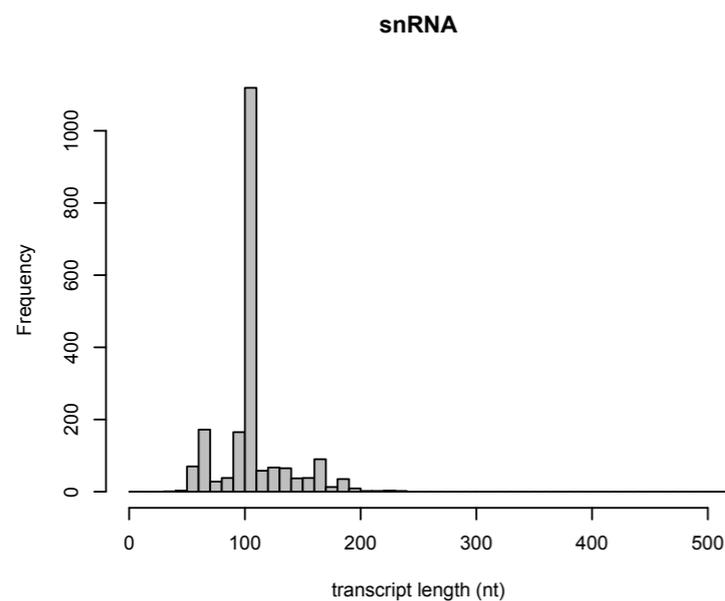
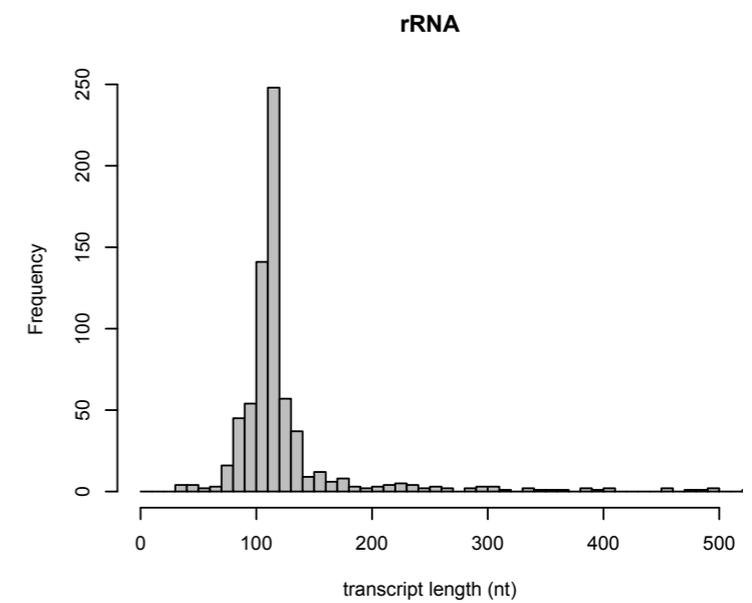
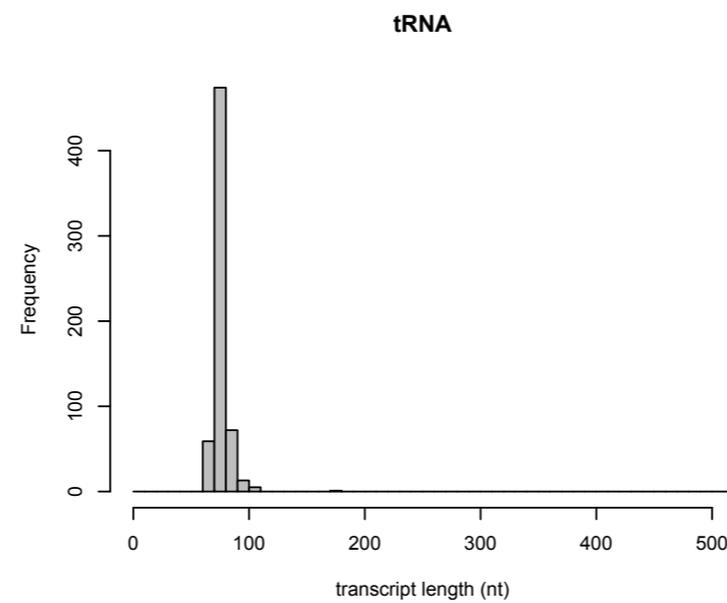
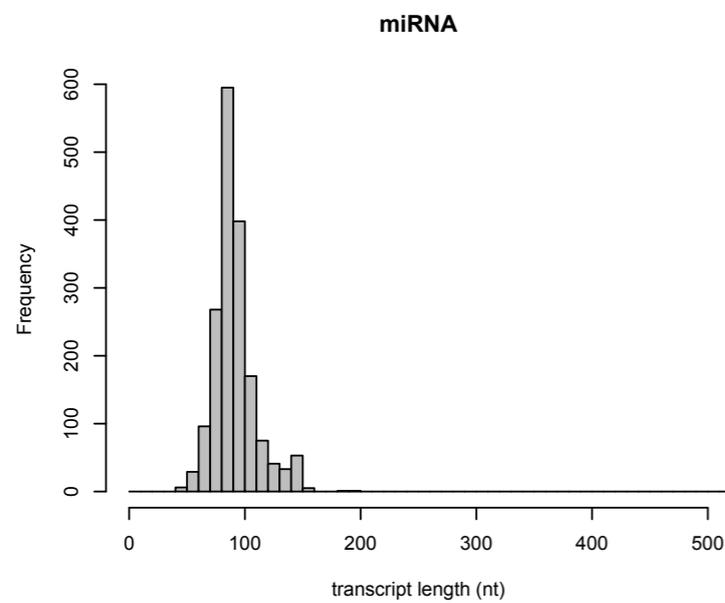
# GENCODE vs miRBase



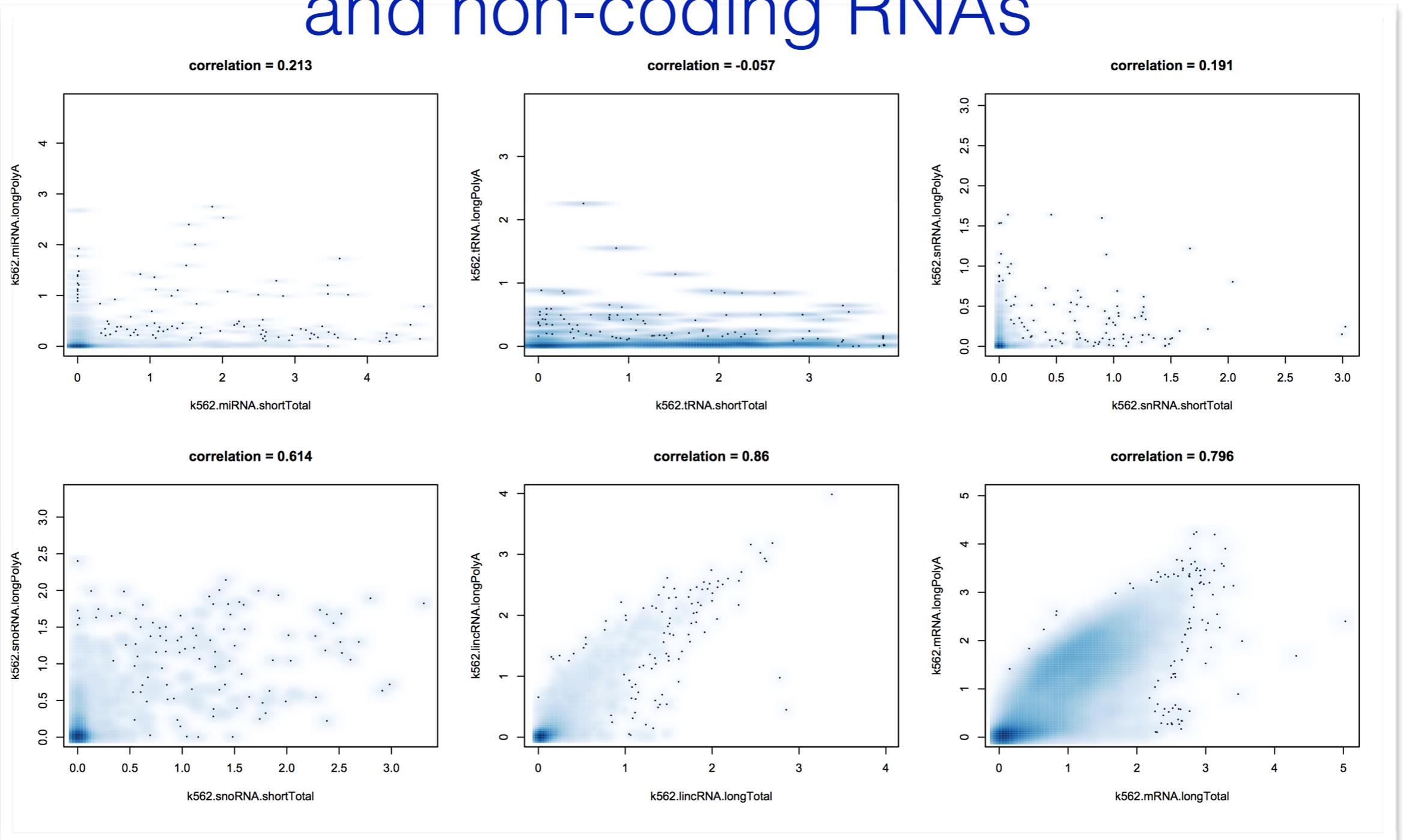
# non-comparable ncRNA

- ribosomal RNA
  - inconsistency of cross species annotations
- piwi-interacting RNA
  - cross species annotation using human piRNA clusters
  - refinement of previous annotation with respect to ~100M human testis small RNA reads
  - 88 human loci, 27 fly loci, and 35329 worm loci as piRNA clusters
- others: mitochondrial RNAs, piRNAs, rRNAs, Y RNAs, and misc\_RNA

# Length distribution in coding and non coding annotated human RNAs



# Effect of poly(A) RNA purification, during sample-prep, on ability to detect coding and non-coding RNAs



Poly(A) RNA-seq data perform poorly compared to short-total RNA-seq at detecting miRNAs, tRNAs, snRNAs and snoRNAs, but are much better able to detect lincRNAs and mRNAs.

# Summary of Annotated ncRNAs

		Human					Worm				Fly				
		Elements	Genome Coverage		RNA Read Coverage (%)		Elements	Genome Coverage		RNA Read Coverage Poly(A) [%]	Elements	Genome Coverage		RNA Read Coverage Poly(A) [%]	
			Kb	%	Poly(A)	Total		Kb	%			Kb	%		
Annotated ncRNAs	Comparable ncRNAs	pri-miRNA	58	1,158	0.04	0.036	0.025	44	16	0.02	0.00066	43	300	0.23	0.017
		pre-miRNAs	1,756	162	0.006	0.27	4.35	221	20	0.02	0.021	236	22	0.02	0.0071
		tRNAs	624	47	0.002	0.031	0.38	609	45	0.04	0.0012	314	22	0.02	0.00013
		snoRNAs	1,521	168	0.006	0.033	0.10	141	16	0.02	0.029	287	34	0.03	0.029
		snRNAs	1,944	210	0.007	0.0046	0.018	114	14	0.01	0.0049	47	7	0.006	0.0085
		lncRNAs	10,840	10,581	0.37	3.17	1.75	233	184	0.18	0.072	852	868	0.68	1.22
		Other ncRNAs	5,411	3,268	0.11	0.97	34.32	40,104	2,329	2.3	10.51	376	2,103	1.6	2.48
	piRNA loci	88	1,272	0.04	0.032	0.0073	35,329	449	0.45	0.67	27	1,473	1.1	0.16	
Total ncRNAs		22,154	17,770	0.62	4.45	40.52	41,466	2,611	2.6	10.61	2,155	3,279	2.6	3.74	

# Summary of Annotation + Novel Transcription

		Human			Worm			Fly			
		Elements	Kb	%	Elements	Kb	%	Elements	Kb	%	
<b>Sequenced Genome</b>	mRNAs (exons)		20,007	86,560	3.0	21,192	34,437	34.3	13,940	35,970	28.0
	Pseudogenes		11,216	27,089	0.95	881	1,343	1.3	145	155	0.12
	Annotated ncRNAs		22,154	17,77	0.62	41,466	2,611	2.6	2,155	3,279	2.6
	Comparable ncRNAs	miRNAs	1,756	162	0.006	221	20	0.02	236	22	0.02
		tRNAs	624	47	0.002	609	45	0.04	314	22	0.02
		snoRNAs	1,521	168	0.006	141	16	0.02	287	34	0.03
		snRNAs	1,944	210	0.007	114	14	0.01	47	7	0.006
		lncRNAs	10,840	10,581	0.37	233	184	0.18	852	868	0.68
	Regions Excluding mRNAs, Pseudogenes & Anno. ncRNAs		283,816	2,731,811	95.5	143,372	63,520	63.3	60,108	89,445	69.6
	Transcripton Detected (TARs)		708,253	916,401	<b>32.0</b>	232,150	37,029	<b>36.9</b>	83,618	44,256	<b>34.5</b>
Supervised Predictions		104,016	13,835	0.48	2,525	392	0.39	599	164	0.13	