The UCSC Repeat Browser allows discovery and visualization of evolutionary conflict

across repeat families

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ABSTRACT

Background

Nearly half the human genome consists of repeat elements, and many of these

sequences play important roles in biological functions. However repeat elements pose

several unique challenges to current bioinformatic analyses and visualization tools, as

short repeat sequences can map to multiple genomic loci resulting in their

misclassification and misinterpretation. Therefore, there is a continued need for

standardized tools and techniques to interpret genomic data of repeats.

Results

We present the UCSC Repeat Browser, which consists of a complete set of repeat

reference sequences derived from the gold standard repeat database RepeatMasker.

The UCSC Repeat Browser contains mapped annotations from the human genome

(hg19, due to the large existing annotation sets for this assembly) to these references,

and presents all of them as a comprehensive interface to facilitate work with repetitive

elements. Furthermore, it provides processed tracks of multiple publicly available

datasets of biological interest to the repeat community, including ChIP-SEQ datasets for

KRAB Zinc Finger Proteins (KZNFs) – a family of proteins known to bind and repress

certain classes of repeats. Here we show how the UCSC Repeat Browser in

combination with these datasets, as well as RepeatMasker annotations in several non-

human primates, can be used to trace the independent trajectories of species-specific

evolutionary conflicts.

Conclusions

The UCSC Repeat Browser allows easy and intuitive visualization of genomic data on

consensus repeat elements, circumventing the problem of multi-mapping, in which

sequencing reads of repeat elements map to multiple locations on the human genome.

By developing a reference consensus, multiple datasets and annotation tracks can

easily be overlaid to reveal complex evolutionary histories of repeats in a single

interactive window. Specifically, we use this approach to retrace the history of several

primate specific LINE-1 families across apes, and discover several species-specific

routes of evolution that correlate with the binding and emergence of KZNFs.

Keywords

repeats; retroelements; genomics; krab zinc finger proteins; evolution;

60
61 **INTRODUCTION**
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Transposable elements are significant drivers of eukaryotic genome evolution, and

nearly half the human genome consists of these repetitive elements. Despite the high

repeat content of the human genome, many genomic analyses struggle to deal with

these regions as sequencing reads can often be assigned nearly equally well to multiple

regions in the genome. Masking or filtering these reads is often considered a

"conservative" approach in that it avoids mis-assigning the genomic location of a read,

but it prevents the discovery of important biology occurring at repeat elements[1]. Indeed,

many repeats already have established roles in important biological processes and

complex behavioral phenotypes[2–4].

One of the major challenges in proper repeat-analysis is establishing a set of

standardized sequences, nomenclature and annotation sets that can be universally

understood by the scientific community. The most rigorous and commonly used

database of repeats are Repbase[5] and RepeatMasker[6]. Repbase began as a hand-

curated list in 1992 of 53 prototypic repeat sequences identified in the human genome[7].

By 2015, it contained more than 38,000 sequences in 134 species[5], making curation

and comprehension of each repeat family a daunting challenge. RepeatMasker is a

program that screens DNA (e.g. a newly sequenced genome) for repeat elements.

RepeatMasker classifies repeats by transforming the curated prototypic sequences in

Repbase database into consensuses that allow identification of a repeat family within a

genome. RepeatMasker also uses additional optimizations (e.g. building full length

repeat elements from smaller subparts, generalization (grouping together) of similar

elements, and specialization (using information about repeat structure)) designed to

improve the speed and quality of repeat detection (Figure 1A).

While the practice of repeat detection and classification is intimidating on its own, a

variety of tools exist to study repeats[8], the tools to dynamically visualize genomic data

and interact with existing annotation sets on repeats (e.g. protein coding regions,

conservation with other sequences and the list of matches in the genome) are currently

underdeveloped. Generating and mapping to a consensus version of individual repeats

has proven successful in illustrating novel biological features of retroelements, but has

largely been limited to static visualizations on targeted elements of interest[9,10].

Here we present the UCSC Repeat Browser. The Repeat Browser simplifies analysis of

genomic data on repeats by providing automatically generated consensus sequences

for all human repeat element classifications within RepeatMasker, and overlaying a

precomputed set of comprehensive annotations in an interactive genomic browser

environment (Figure 1A). Further, we demonstrate the utility of the Repeat Browser in

uncovering and illustrating evolutionary conflict between a primate specific class of

retrotransposons and their repressors.

IMPLEMENTATION

Generating Reference Sequences for Human Repeats

We first generated consensus reference sequences for each repeat family listed in the

RepeatMasker annotation of the human genome (hg19). To do so, we downloaded all

nucleotide sequences and their annotations in the RepeatMasker annotation track on

the UCSC Human Genome Browser (hg19). We observed that extremely long repeats

tended to represent recombination or misannotation events and therefore removed the

longest 2% of sequences in all classes. We then aligned the 50 longest sequences of

each class, as this produced a tractable number of sequences that allowed manual

inspection of each alignment. Additionally, we decided to bias towards longer

sequences for visualization purposes as this decreases the effect of insertions relative

to the consensus which are otherwise invisible when plotted on shorter sequences. For

each repeat family, these fifty sequences were realigned with MUSCLE[11] to create a

consensus sequence. Each of these consensus sequences was then stored as a

118 "reference" in the Repeat Browser in a manner analogous to a single chromosome on

119 the Human Genome Browser. Each alignment is provided as a link in a "consensus

120 alignment" track for additional visual inspection by the user.

FIGURE 1: Building the UCSC Repeat Browser. A) Workflow for building the UCSC Repeat Browser. Repeat annotations and sequences are taken directly from RepeatMasker tracks across the human genome and used to build reference consensus sequences for every repeat family. Existing genomic annotations are then mapped to these consensuses. B) Every instance of a repeat family is mapped against the consensus; for certain families like L1PA5 individual instances will only contain a small portion of the consensus.

122 Annotation of each repeat class

For each repeat family, the consensus was mapped back to all of its repeats with

BLAT[12]. From this process, we generated a coverage plot illustrating the relative

representation of the consensus from each genomic instance (Figure 1B). For example,

the primate-specific L1PA5 element shows the expected distribution: most of the

individual instances of the primate specific LINE-1 element, L1PA5, are short 3'

truncations, meaning that most genomic loci annotated as L1PA5 do not contain the 5'

portion; therefore the 3' end of the consensus is found relatively more often across the

human genome (Figure 1B).We also ran Tandem Repeats Finder[13] and the EMBOSS

ORF finder[14] on these consensus sequences in order to automatically annotate each

consensus. We similarly aligned the RepeatMasker Peptide Library[15] with BLAST[16] and

each of the original genomic sequences with BLAT[12] to each consensus.

FIGURE 2: Mapping of existing annotations to the UCSC Repeat Browser. A) Existing hg19 annotation sets (e.g. UCSC Genes) that intersect RepeatMasker are lifted to the consensuses. Shown here are all genes that contain L1PA5 sequence as well as ORF structure.

Our alignment of individual repeat elements in the genome to their respective

consensus sequence allows us to map any genome annotation to the genome

consensus sequence, a process more generally known as "lifting". In this way, human

genes that contain repeat sequence (as annotated by GENCODE[17] and UCSC genes[18])

were "lifted" to each consensus sequences. The result of these procedures produces a

fully annotated and interactive consensus sequence that requires minimal prior

knowledge of the genomic organization of the repeat being analyzed and at the same

time allows lifting of any genome annotation (Fig 2).

Mapping of Existing Genomic Datasets

We also mapped genomic peaks bound by histone-modifying enzymes from ENCODE

datasets[19] as well as large-scale ChIP-SEQ collections KRAB Zinc Finger Proteins

(KZNFs) [20,21]. KZNFs are particularly compelling factors as they engage in evolutionary

"arms races" in which KZNFs evolve unique DNA binding properties to bind and repress

retrotransposons[9,22]. These retrotransposons then accumulate mutations that allow

evasion of KZNF-mediated repression[9]. In order to map this ChIP-SEQ data to the

Repeat Browser, we first downloaded raw fastqs from the Sequence Read Archive

(SRA)[23], mapped them to the reference genome (hg19) using bowtie2[24] and called

peaks using macs2[25] (Figure 3A). After this standard genomic mapping and peak

calling, we then took all peak summits that overlapped a repeat element as annotated in

the RepeatMasker track, extended them by 5 nt in both directions, and used BLAT to

map them to the appropriate (as determined by RepeatMasker annotation) RB

consensus sequence. In essence, this approach leverages each repeat instance as a

technical replicate with the mapping to the consensus representing an average of many

genomic "replicates' (Figure 3A), as individual instances of a repeat family summits

produce a wide spread of mappings, but hundreds of them yield a clear average signal.

In order to determine the likely binding site within the consensus sequence we once

again ran our peak caller (macs2) on the repeats to generate a list of "meta-summits"

which represent the average location of each factor. We then generated a track which

summarizes these meta-peaks for each consensus sequence allowing easy and quick

determination of factors with correlated binding patterns (Figure 3B; visualized on

Human Endogenous Retrovirus H (HERV-H)).

FIGURE 3: Mapping of KZNF ChIP-SEQ data to the UCSC Repeat Browser. A) Workflow for analyzing KZNF ChIP-SEQ. Data from existing collections was downloaded from SRA, analyzed via standard ChIP-SEQ workflows and the resulting summits mapped back to the RB for analysis. Mapping of individual summits produces a "meta-summit" (red arrow) that can be used for downstream analysis and which is stored separately in another annotation track. B) Example of an repeat family, HERVH-int (a primate endogenous retrovirus) with lifted annotations and datasets. Shown are tandem repeats, annotated ORFs gene tracks and ChIP-SEQ summits and meta-summits of a variety of transcription factors and histone marks.

169 **RESULTS**

Comparative Analysis of L1PA elements

In order to demonstrate the power of the UCSC Repeat Browser, we focused on recent

L1PA families. The L1PA lineage is a group of LINE-1 families specific to primates.

These elements are fully autonomous, encoding proteins (ORF1 and ORF2)

responsible for reverse transcription and re-integration of the retroelement (Fig 4A).

L1PA families evolve in bursts; higher numbers (e.g. L1PA17) indicate ancient

evolutionary origins, as evidenced by syntenic copies in distantly related species. Lower

numbers indicate more recent activity (e.g. L1PA1 is found only in humans (human-

specific) and is therefore also known as L1HS)[26]. We recently used the Repeat Browser

to demonstrate that multiple KZNFs will coordinate to battle L1PA elements and that

L1PA elements acquire multiple mutations to escape this concerted action (*Fernandes*

et al, in preparation).   However, it is unclear if these mechanisms of escape are specific

to the human lineage, or occur independently in other primate lineages.

Comparison of Primate Repeat Elements Reveals a Large Number of Gibbon

Specific L1PA4 Elements

In order to trace the mechanisms of escape in other species, we downloaded the

complete sequences for every L1PA6 and younger repeat (as annotated in their UCSC

Genome Browser RepeatMasker tracks) in gibbon (nomLeu3), orangutan (ponAbe2),

chimp (panTro4), bonobo (panPan2) and human (hg19). We further restricted our

analysis to only full length elements by filtering out elements outside the expected size

range of an intact element. We then confirmed that RepeatMasker annotations matched

192   our expectations by comparing the expected evolutionary history of these families with

193   the established species tree (Fig 4B).

FIGURE 4: Comparative analysis of L1PA elements. A) L1PA5 elements consist of 3 ORFs (ORF1, ORF2 and ORF0 (antisense)) and 5' and 3' UTRs. B) Relative fraction of the number of instances of each L1PA family (6 to HS) detected by RepeatMasker in primate genomes compared to the human genome. Light blue coloring indicates similar frequencies to human, dark-blue indicates fewer than human, and gold (only in Gibbon L1PA4) indicates more than human. A cartoon (right) representing the evolutionary divergence of each species from the human lineage demonstrates that these fractions match the expected evolutionary history. C) Deletions in the Gibbon L1PA4 elements (red) are near the predicted ZNF93 binding site (green). D) Pie charts showing the fraction of all gibbon L1PA4 instances containing the gibbon-specific indels (top) or the instances shared between gibbon and human using liftOver to find syntenic L1PA4 instances.

As expected, the number of elements in older families were largely similar amongst all

species that shared a common ancestor when the retrotransposon was active, while

human specific elements were found only (barring a few clear misannotations) in the

human genome (Fig 4B; white coloring on the left becomes bluer as species diverge).

The one exception is the L1PA4 family which has a marked increase in number of

instances in gibbon compared to human (Fig 4B; gold color). This is likely due to the

L1PA4 family expanding in a gibbon-specific fashion in a manner that still matches the

human L1PA4 classification. By using BLAT to lift each Gibbon L1PA4 instance to the

human Repeat Browser consensus (Fig 4C) we identify a subgroup of gibbon L1PA4

sequences that contain insertions and deletions near the ZNF93 binding site observed

in the great ape lineages. However, whereas young L1PA families (L1PA3, L1PA2,

L1HS) in great apes (orangutans, chimps, bonobos and humans) acquired a 129-bp

deletion to evade ZNF93, these gibbon-specific elements contain a much smaller

alterations to 20-bp region immediately 5' of the ZNF93 meta-summit, and near the

previous bioinformatically-predicted ZNF93 motif (Figure 4C), where the most C-

terminal fingers are predicted to contact. This suggests that ZNF93 in the human-

gibbon ancestor also repressed L1PA4 elements, and that gibbons acquired a separate

set of escape mutations than great apes (although it is possible that these changes are

driven by an unknown possibly gibbon-specific KZNF). Syntenic analysis of a subset of

Gibbon L1PA4 elements via liftOver supports the idea that these events are lineage-

specific (Figure 4D), as L1PA4 elements shared between gibbons and humans do not

contain these changes. Taken together, it appears that the large amount of gibbon

"L1PA4" actually consists of continued L1PA4 activity after divergence from the great

apes creating gibbon specific elements (e.g. L1 Gibbon-Specific or "L1GS" elements).

Thus, the gibbon and great ape lineages independently generated mutations that alter

the ZNF93 binding site, demonstrating the strength of the selective pressure KZNFs

exert on retroelements (Figure 4E).

Novel Orangutan-Specific Deletions are Visible on the UCSC Repeat Browser

We reasoned that L1PA4 elements provided strong signals of lineage-specific evolution

in gibbons since that particular L1PA family was active near the time which gibbons

diverged from humans.

FIGURE 5: Lineage specific escape in the L1PA 5' UTR A) Orangutan L1PA3 elements acquire a 11 bp deletion (blue). This deletion occurs after the 129-bp ZNF93 binding site deletion (red). B) Bonobo L1PA2 elements mostly maintain the 11 bp region deleted in orangutans, but acquire deletions immediately adjacent to this region (orange).

Therefore, we decided to explore L1PA3 evolution in orangutans and L1PA2 evolution

in chimpanzees and bonobos. Lifting of orangutan L1PA3 elements on the Repeat

Browser L1PA3 consensus displayed a clear 11 nt deletion ~230 nt into the 5' UTR that

is not widespread in human, chimp or bonobo elements (Fig 5A). However, analysis of

existing KZNF ChIP-SEQ data, shows no specific factor that clearly correlates with this

deletion. It may be that we simply lack ChIP-SEQ of the appropriate factor (including the

possibility that the KZNF driving these changes evolved within the orangutan lineage) to

explain the evolutionary pattern seen in these orangutan-specific ("L1OS") elements.

Moreover, all instances containing this 11 nt deletion also harbor the 129 bp ZNF93

deletion, consistent with the model that this deletion occurred after orangutan L1PA3

elements escaped ZNF93. Interestingly, lifting of L1PA2 elements in bonobo, chimp

and human to the Repeat Browser show specific changes accumulating around ~250 nt

(human L1PA2 consensus numbering) with little evidence for indels near the orangutan-

specific deletion at 230 nt (Figure 5B). These observations are consistent with KZNF

targeting this overall region, but distinct species-specific escape mechanisms just as

observed in the ZNF93 case (Figure 6B).

FIGURE 6: Model for L1PA evolution in different primate species. A) Representative sequences of L1PA families from human and other ape species lifted to the L1PA4 consensus show clear lineage-specific changes indicated by color. B) ZNF93 deletions (red) occur in 2 lineage-specific fashions: alterations to a 20 bp region in gibbon L1PA4 elements or a 129 bp deletion in L1PA3 elements of the great ape ancestor. Orangutans acquire a lineage-specific second deletion (11 bp, blue) in L1PA3 elements while the L1PA2 elements of bonobos, chimps and humans display a variety of changes immediately 3' of this deletion (orange).

DISCUSSION

The UCSC Repeat Browser provides an interactive and accessible environment to

study repeat biology and side-steps the problem of mistakenly mapping reads to an

incorrect locus by generating consensus representations of every repeat and focusing

on how genome-wide datasets interact with repeat sequences independent of their

genomic locus.

However, several caveats should be noted about Repeat Browser-based

analyses. First, they rely entirely on RepeatMasker classifications (and in turn

RepBase) and therefore depend on the quality of the annotations established in these

collections. Second, the Repeat Browser uses its own consensus sequences to display

genomic data, with these choices biased by length due to a preference for easy

visualization over established biological relevance. However, custom installations of the

browser allow the substitution of the pre-calculated sequence with a custom sequence.

Indeed, we previously used this approach to create consensuses of L1PA3 subclasses

(L1PA3long and L1PA3short (the great-ape specific 129bp deletion)) when tracing an

evolutionary arms race between ZNF93 and L1PA3 elements.[9] Finally, the Repeat

Browser and other consensus-based approaches risk diluting important, biologically

relevant signal driven by a few instances of a repeat type that may affect the cell by

virtue of their genomic location instead of their sequence. In these cases, the majority

of instances in these families may generate no signal and produce an underwhelming

"composite" Repeat Browser signal whereas an individual genomic locus may produce

a strong, reproducible, and functionally relevant signal. Therefore, we believe the

Repeat Browser analysis should be used in combination with existing genomic

approaches.

Finally, the existence of the UCSC Repeat Browser as a complete "genome" available

for download and manipulation should allow mapping and utilization of these set of

sequences with a variety of pre-existing tools. We expect that the repeat community will

make creative use of this tool beyond the workflows suggested here.

CONCLUSIONS

The UCSC Repeat Browser provides a fully interactive environment, analogous to the

Human Genome Browser, to study repeats. We show here that this environment

provides an intuitive visualization tool for analysis and hypothesis-generation, and, by

using the Repeat Browser, we demonstrate that sequence-specific changes in repeats

driven by KZNF binding can occur independently in different species. A test version of

the Repeat Browser is currently available at: http://bit.ly/repbrowser .

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Project name: The UCSC Repeat Browser

Project home page: http://bit.ly/repbrowser

Operating system(s): Standard Web Browser

Programming language: Python, bash

License: Freely available for academic, nonprofit, and personal use.

Any restrictions to use by non-academics: No

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AUTHORS' CONTRIBUTIONS

MH developed the Repeat Browser with input from all other authors. JDF and AZ

analyzed KZNF and repeat data. MH, JDF, SRS, WJK and DH conceived of the idea

and contributed to the Repeat Browser's design.

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