# New approaches for computer analysis of nucleic acid sequences 

(dyad symmetries/homology/self-dyad/algorithm)

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#### Abstract

A new high-speed computer algorithm is outlined that ascertains within and between nucleic acid and protein sequences all direct repeats, dyad symmetries, and other structural relationships. Large repeats, repeats of high frequency, dyad symmetries of specified stem length and loop distance, and their distributions are determined. Significance of homologies is assessed by a hierarchy of permutation procedures. Applications are made to papovaviruses, the human papillomavirus HPV, $\lambda$ phage, the human and mouse mitochondrial genomes, and the human and mouse immunoglobulin $\boldsymbol{\kappa}$-chain genes.


Technical advances for determining the sequence of nucleic acids have been used to generate large data bases of more than 1.5 $\times 10^{6}$ nucleotides. Analyses of this data require accurate and efficient computer programs that can rapidly search a single large sequence or many smaller sequences and identify relevant features (1-8). Currently available programs for finding all homologies execute in time essentially proportional to the square of the sequence length $\left(n^{2}\right)$ and usually follow a single pair of homologues at a time. The programs of refs. 1 and 2 compare various sequences for homologies by successively sliding along each sequence, assuming all possible alignments. The matrix method ( 3,5 ), which displays regions of homology in two dimensions, is primarily limited to pairwise sequence comparisons. In this method, large sequences or multiple sequences are usually partitioned into sections $\leq 1$ kilobase (kb) in length, and the matrices are examined by eye.
Another problem underlying nucleic acid sequence analysis is the distinction between meaningful structures and chance configurations. Confidence estimates for accepting significant homology are based on criteria related to the number of bases matched, percentage of mismatches tolerated, and constraints on numbers of insertions or deletions, etc. The algorithms of refs. 9 and 10 provide ways of measuring homology between pairs of nucleic acid or protein sequences based on minimization principles involving various penalty assignments for errors. The results are limited by the specification of the penalties.

## FORMAT OF SEQUENCE COMPARISONS

We have devised an algorithm of an intrinsic global character whose running time is a linear function of the input sequence size. The algorithm can find a variety of relationships between any number of nucleic acid sequences totalling up to 500 kb . The program executes in about 2 sec for sequences of length $n \approx 10,000$ (see Table 1). The following four categories of output data representations are used to help in the identification of pertinent patterns in nucleic acid sequences: (i) frequency distribution of nucleic acid sequence homologies-e.g., direct

[^0]repeats (DR) and dyad symmetries (DS); (ii) distribution of distances among repeats of high occurrence, clusters of repeats, and dyad symmetries of stem length $\geq$ a specified size $s$, allowing a central loop distance $\leq \ell$ bases; (iii) special attributes of the sequence-e.g., the several largest DR and DS; and (iv) distributions of the above for multiple sequences.

Assessment of statistical significance for these homologies is determined by various permutation and randomization procedures described in the next section. New theoretical results germane to significance evaluations are also presented. The last section contains specific results to illustrate the scope and flexibility of the program when applied to DNA sequences including $\lambda$ phage (11), papovaviruses [simian virus 40 ( SV 40 ; ref. 12), polyoma (13), BK virus-Dun (14)], human papillomavirus (HPV; ref. 15), human and mouse mitochondrial genomes (HuMt and Ms-Mt; refs. 16 and 17, respectively), and human and mouse $\kappa$-chain genes ( Hu -Ig and Ms-Ig; ref. 18). Detailed sequence analysis of the examples will be presented elsewhere.

We elaborate now on the capabilities of the program.
Distribution of DR and DS. For a DNA or RNA sequence of $n$ bases, the program ascertains and locates all DR and DS of any word size (a word of size $k$ is an oligonucleotide of $k$ consecutive bases). The program allows for a prescribed number of mismatches and/or deletions and insertions. For each given word size $k$, the program determines the complete frequency distribution $f_{k}(\cdot)$ of repeat occurrences-i.e., the number $n_{r}$ of words of size $k$ repeated $r$ times, $r=0,1,2$, . . (see Table 7).
The frequency distribution for DS is two-dimensional $f_{k}(\cdot$,$) ,$ which indicates, for each pair of integers $(\ell, m)$, the number of DS pairs each of size $k$, one repeated $\ell$ times and its DS word repeated $m$ times (see Table 10). The program also ascertains a hierarchy of functionals identifying all DS pairs above a prescribed word size, all DS pairs of numerous occurrences, the distribution of self-dyads (self-D; a word is a self-D if it is identical to its DS word-e.g., C-A-C-T-A-G-T-G), and all close DS of given minimum stem length and maximal loop length.

Special Attributes of the Sequence. The program records the locations of the largest distinct DR and DS and of oligonucleotides that occur with exceptionally high frequency (hf).

Comparisons Among Multiple Sequences. Multiple sequences are concatenated, and the DR patterns (sizes and locations) for the extended sequence are determined. The distribution of homologies for the extended sequence is readily converted back into comparisons between the original sequences. The algorithm takes into consideration whether the original sequences are circular or linear.

[^1]The program records for each word $\geq$ size $s$ the vector number ( $m_{1}, m_{2}, \ldots, m_{\mathrm{L}}$ ) signifying the occurrence $m_{\alpha}$ of its representatives (with their locations) in the $\alpha$ th sequence ( $\alpha=$ $1,2, \ldots$. ., L). Similarly, in analyzing hf DR, the program highlights those words of any given size whose cumulative occurrences $\Sigma_{i=1}^{L} m_{i}$ exceed a specified level.

Our algorithm is not restricted to the four-letter DNA alphabet. Repeat patterns or other word relationships can be determined for amino acid sequences by the same procedures. Furthermore, categorizing amino acids by functional or charge criteria allows additional comparisons. Searches for DNA homologies can focus on two-letter alphabets, distinguishing purine versus pyrimidine or strong versus weak base pairs (bp).

## OUTLINE OF ALGORITHM AND THEORETICAL RESULTS ON HOMOLOGY

In a sequence of length $n$, comprised of letters from an alphabet of size $\alpha$ ( $\alpha=4$ in the case of DNA or RNA sequences and $\alpha=20$ for amino acid sequences; when nucleic acids or amino acids are grouped by functional characteristics, the alphabet size is appropriately reduced), if the letters are assigned the numerical representation $\{0,1,2, \ldots ., \alpha-1\}$, then a word of size $k>0$ (i.e., a succession of $k$ letters from the sequence $\left.\left\{a_{1}, a_{2}, \ldots, a_{k}\right\}\right)$ will have the unique word value $\sum_{i=1}^{k} a_{i} \alpha^{k-i}$. Such word values will range between 0 and $\alpha^{k}-1$. The conversion to word values is done recursively ( $\leq 4 n$ operations).

Utilizing the information on positions and frequencies of words of size $\ell$, we move in one pass and in order down the sequence of positions of words with frequencies exceeding 1 , determining for each if there exists another DR of size $\ell+D$. The value of $D$ is chosen to be $1 \leq D \leq \ell$. This procedure is iterated to determine all DR of size $\ell_{1}+D_{1}, \ell_{2}+D_{2}$, etc. $\left(\ell_{1}=k\right)$.

The process of extending DR from size $\ell$ to size $\ell+D$ requires operations of the order $R(\ell)$, where $R(\ell)$ is the total number of DR of size $\ell$. If the relative frequencies of words are not excessively skewed, $R(\ell)$ shrinks rapidly, and the total number of operations to extract all DR from a sequence of size $n$ will tend to be linear in $n$.

The above procedure is extended, with modifications, to determine all strings or groups of strings that exhibit relationships such as DS or more elaborate word relationships or patterns. The actual execution time of our program (on an IBM 3081) from sequence data for identifying all possible DR and DS and a hierarchy of distributions is given in Table 1.

The details of the algorithm will be presented elsewhere.
Consider a randomly generated sequence of length $n$ based on an $r$ letter alphabet with probabilities $p_{i}$ of getting the letter $A_{i}, i=1,2, \ldots ., r$. Let $L_{n}$ be the length of the largest exact DR contained in the sequence.

Theorem. The length of the expected largest DR, $\mathrm{L}_{\mathrm{n}}^{*}$, is of precise asymptotic growth: $\mathrm{L}_{\mathrm{n}}^{*}=2 \log \mathrm{n} / \log (1 / \lambda)-[1+\log (1$ $-\lambda) / \log \lambda+0.5772 / \log \lambda]+\log 2 / \log \lambda$ where $\lambda=$ $\sum_{\mathrm{i}=1}^{\mathrm{r}} \mathrm{p}_{\mathrm{i}}^{2}$. The variance Var $\mathrm{L}_{\mathrm{n}} \approx 1.645(-1 / \log \lambda)^{2}$ independent of $n$.

It follows that the expected largest DR in a sequence of length 5,000 , for a four-letter alphabet with all letters equally likely and independently generated, is of length 12.

The largest theoretically expected $\mathrm{DR}, L_{n}^{*}$, and the largest observed DR $\left[\mathrm{obs}\left(L_{n}\right)\right]$ are recorded in Table 2. Note a DR of length 15 is expected by chance and found in $\lambda$ phage.

## EVALUATING THE SIGNIFICANCE OF SEQUENCE HOMOLOGIES

Homologies can occur by chance when a single large sequence or a number of smaller sequences are examined. To evaluate

Table 1. Execution time of the program

| DNA sequence | Size, bp | Identification time, sec |  |
| :---: | :---: | :---: | :---: |
|  |  | DR | DS |
| SV40 | 5,243 | 1.38 | 1.67 |
| Polyoma | 5,293 | 1.02 | 1.29 |
| BKV | 5,153 | 1.34 | 1.52 |
| $\mathrm{Hu}-\mathrm{Ig}$ | 5,019 | 1.00 | 1.10 |
| Ms-Ig | 5,473 | 1.01 | 1.12 |
| HPV | 7,811 | 1.12 | 1.50 |
| Ms-Mt | 16,295 | 3.09 | 3.81 |
| Hu-Mt | 16,569 | 2.49 | 2.76 |
| $\lambda$ phage | 48,502 | 6.48 | 6.57 |

the significance of homologies within a sequence or between two or more sequences, we compare the pattern of DR and DS in the original sequence(s) with that found in 20-100 random permutations of the sequence. Significance is determined by comparing the range of outputs from the separate permutation sequences with the corresponding evaluations on the original DNA sequence. Consider a specific property of the se-quence-for example, the largest DR. We order the value of this attribute for the original DNA sequence with the collection of values of the same attribute computed for the permuted sequences. Significance clearly occurs when the original value falls outside the range of the values based on the permuted sequences.

Permutations are obtained by randomly shuffling the nucleotides of the original DNA sequences. The base frequencies are unchanged for each such permutation. Other permutation constructions randomly exchange ( $i$ ) codons in gene regions, (ii) bases of introns, or even (iii) permutations of nucleotides between analogous chromosomal segments of different species.

In addition to the permutation analysis, we generate random (independent or Markov dependent) DNA sequences of the required length. Our theoretical results for the independence or Markov-dependent cases serve as a further control.

## DR

This section is divided into three parts: (i) large DR and their locations are identified and distinctive attributes noted; (ii) hf repeats of oligonucleotides are indicated; and (iii) the distribution of DR in different sequences is compared.

The role of large or hf DR is unknown. Duplications and genomic rearrangements are persistent through evolutionary time. These events may modulate gene expression and amplification or may provide opportunities for partial, differentiated gene function to cope with new environmental contingencies while maintaining the original gene expression. The latter scenario conforms with the prevailing view of evolutionary develop-ment-i.e., as starting with a few primordial genes with se-

Table 2. Largest observed and expected DR lengths

| DNA <br> sequence | $L_{n}^{*}$ | $\operatorname{Var}\left(L_{n}\right)^{+}$ | $\operatorname{obs}\left(L_{n}\right)$ |
| :--- | :---: | :---: | :---: |
| SV40 | 11.85 | 0.91 | 72 |
| Polyoma | 11.61 | 0.86 | 16 |
| BKV | 11.88 | 0.91 | 67 |
| Hu-Ig | 11.78 | 0.91 | 18 |
| Ms-Ig | 11.94 | 0.91 | 20 |
| HPV | 12.50 | 0.91 | 16 |
| Ms-Mt | 14.27 | 0.99 | 16 |
| Hu-Mt | 14.10 | 0.99 | 15 |
| $\lambda$ phage | 14.80 | 0.86 | 15 |

Table 3. Large DR within and between Hu-Ig and Ms-Ig

| Size, bp | Oligonucleotide | $\mathrm{Hu}-\mathrm{Ig}$ |  | Ms-Ig |  | $D\left(D^{*}\right)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | Position | $\underset{\text { location }}{J / C}$ | Position | $\begin{gathered} J / C \\ \text { location } \end{gathered}$ |  |
| 20 | T-G-G-A-A-A-T-A-A-A-A-C-G-T-A-A-G-T-A-G |  |  | 1121, 1751 | $J_{2}, J_{4}$ | 610 |
| 19 | C-A-C-T-G-T-G-G-T-G-G-A-C-G-T-T-C-G-G | 638 | $J_{1}$ | 733 | $J_{1}$ | 95* |
| 18 | T-G-G-A-G-A-T-C-A-A-A-C-G-T-A-A-G-T | 1033, 1680 | $J_{2}, J_{4}$ |  |  | 629 |
| 17 | G-A-A-T-C-A-C-T-G-T-G-A-T-T-C-A-C | 1301 | $J_{3}$ | 1714 | $J_{4}$ | 413* |
| 16 | A-G-G-T-T-T-T-T-G-T-A-A-A-G-G-G | 1273 | $J_{3}$ | 1684 | $J_{4}$ | 411* |
| 16 | C-C-T-C-A-C-T-G-T-G-G-C-T-C-A-C | 1644 | $J_{4}$ | 2053 | $J_{5}$ | 409* |
| 16 | A-G-A-T-T-A-C-A-G-T-T-G-A-C-C-T | 3510 | after $J_{5}$ | 3999 | after $J_{5}$ | 489* |
| 16 | C-A-G-G-C-A-G-G-T-T-T-T-T-G-T-A |  |  | 1679, 2018 | $J_{4}, J_{5}$ | 323 |
| 15 | A-G-G-G-A-C-C-A-A-G-G-T-G-G-A | 660, 1669 | $J_{1}, J_{4}$ |  |  | 994 |
| 15 | G-G-G-G-A-C-C-A-A-G-C-T-G-G-A | 1022 | $J_{2}$ | 1110 | $J_{2}$ | 88* |
| 15 | G-G-G-A-C-C-A-A-G-C-T-G-G-A-G | 1023 | $J_{2}$ | 2079 | $J_{5}$ | 1056* |
| 15 | A-T-C-A-A-A-C-G-T-A-A-G-T-A-C | 1038, 1343 | $J_{2}, J_{3}$ |  |  | 290 |
| 15 | G-A-C-A-G-C-A-C-C-T-A-C-A-G-C | 4329 | C | 4782 | C | 453* |
| 15 | A-A-G-A-G-C-T-T-C-A-A-C-A-G-G | 4440 | C | 4893 | C | 538* |
| 14 | T-G-G-A-A-A-T-C-A-A-A-C-G-T | 671 | $J_{1}$ | 766 | $J_{1}$ | 95* |
| 14 | G-A-G-A-T-T-T-C-A-G-A-A-A-T | 2885 | after $J_{5}$ | 3279 | after $J_{5}$ | 394* |
| 14 | A-C-C-A-C-C-A-C-C-A-C-C-A-C |  |  | 215, 218 | before $J_{1}$ | -11 |
| 14 | A-C-C-A-A-G-C-T-G-G-A-A-A-T |  |  | 759, 1114 | $J_{1}, J_{2}$ | 34 |

$D$, distance between repeats within a species; $D^{*}$, difference of the distances from the start position of the sequences when the homology occurs between species. Positions in the $J$ or $C$ regions are noted.

## quential duplication and divergence.

Enhanced tandem and interspersed DR can be induced through unequal crossing-over and through intra- and interchromosomal conversions and transpositions. Transposon termini and sites of genomic insertions are associated with DR. Moreover, DNA stuttering coupled to specific DNA repair enzyme actions may bring about short frequent DR.

DR may aid in transcription. For example, several DR identified by Alu restriction sites are located in spacer regions of rRNA genes of Drosophila melanogaster coincident with a 45bp DR overlapping the $5^{\prime}$ end of the 285 gene (19). It is conjectured that these Alu spacer DR can simulate potential binding sites for transcription, drawing RNA polymerase I to this vicinity and thereby ameliorating transcription of the actual 28 S gene. Similar DR patterns (but species specific) occur in spacer regions of other Drosophila species and Xenopus laevis.

Large DR. Hu-Ig and Ms-Ig. Both sequences ( $\kappa$-chain gene) start about $600 \mathrm{bp} 5^{\prime}$ to the joining $(J)$ regions and extend from the last $J$ downstream ( $\approx 2.5 \mathrm{~kb}$ ) through the constant $(C)$ region. The DNA sequence is continuous for the $\mathrm{Ms}-\mathrm{Ig}$, but a segment of about 600 bp between $J_{5}$ and $C$ is missing in Hu-Ig. The number of large DR is far more than expected from corresponding randomly permuted sequences (Table 3). We would expect for $n=10,000$ bases, on average, one DR of size 13; a $\mathrm{DR} \geq 15 \mathrm{bp}$ would be extremely unlikely.

The distances $D$ between large DR within each species are consistently about $325 m \pm 25 \mathrm{bp}$, where $m$ is a nonnegative integer. The distances $D^{*}$ from the initial position to the large DR between the human and mouse Ig regions are about $100 \pm$ $325 m$ (that is, apart from a phase shift of 100 bases, the correspondence of multiples of 325 bp apart is persistent). The $J$ regions are spaced about 300 bp apart (18), and most of the DR patterns reflect this inherent homology. There is also substantial homology between the $C$ regions-e.g., the two $15-\mathrm{bp}$ DR in the proximity of the $C$ regions of $\mathrm{Hu}-\mathrm{Ig}$ and $\mathrm{Ms}-\mathrm{Ig}$ (positions 4329 and 4782 and positions 4440 and 4893).
In Ms -Ig none of the larger DR are in region $J_{3}$. The degeneration of $J_{3}$ in $\mathrm{Ms}-\mathrm{Ig}$ (18) appears emphatic. Also, in $\mathrm{Hu}-$ $\mathrm{Ig} J_{5}$ does not have any large oligonucleotides in common with $J_{1}-J_{4}$ of Ms -Ig, although two significant regions 1 - and $1.5-\mathrm{kb}$
$3^{\prime}$ to $J_{5}$ in $\mathrm{Ms}-\mathrm{Ig}$ and $\mathrm{Hu}-\mathrm{Ig}$ are homologous. A phase shift (insertion or deletion in the vicinity of $J_{5}$ ) also is suggested.

Mitochondria. The largest DR in Hu-Mt-C-A-A-A-C-T-C-A-A-A-C-T-A-C-G-is 15 bp located at positions 3,674 and 11,748. The largest DR in Ms-Mt-T-A-T-C-C-T-T-A-T-T-T-A-T-T-A-T-is 16 bp , located at positions 2,933 and 9,986 . The large distances between these DR and their sizes relative to those expected by chance alone suggests no special significance. However, the occurrences of the highest DR in Ms-Mt and Hu-Mt both fall into separate undefined reading frames (URF 1 and URF 4). The lack of large DR in both mitochondrial genomes stands in sharp contrast to the papovaviruses.

Papovaviruses (SV40, Polyoma, and BKV). In SV40 there is the well-known 72-bp abutting (gap 0) enhancer segment and the $21-\mathrm{bp}$ abutting "promoter" region. The next largest distinct DR are the $13-\mathrm{bp}$ oligonucleotides $\mathrm{A}-\mathrm{A}-\mathrm{A}-\mathrm{A}-\mathrm{A}-\mathrm{C}-\mathrm{C}-\mathrm{A}-\mathrm{G}-\mathrm{A}-\mathrm{A}-$ A-G at positions 486 and 507 separated by a gap of 8 bp and G-A-G-G-C-A-C-A-C-G-A-G-G at positions 2,440 and 2,510 with a gap of 57 bp . SV40 contains two distinct DR of size 12-T-G-C-T-T-T-A-T-T-T-G-T at 2,600 and 2,629 (gap 17) and T-C-A-T-C-A-T-C-A-T-C-A at 2,908 and 2,911 (gap -9 ; a negative

Table 4. hf DR in Hu-Ig and Ms-Ig

|  | hf DR, no. |  |
| :--- | :---: | :---: |
| Oligonucleotide | $\mathrm{Hu}-\mathrm{Ig}$ | $\mathrm{Ms-Ig}$ |
| Length 5 |  |  |
| A-A-A-A-A | $46^{*}$ | 10 |
| A-A-A-A-G | $21^{\dagger}$ | 9 |
| T-T-A-A-A | $21^{\dagger}$ | 10 |
| T-T-T-A-A | $22^{\dagger}$ | $12^{\dagger}$ |
| T-T-T-T-T | $26^{\dagger}$ | $23^{+}$ |
| G-T-G-A-A | 7 | $18^{+}$ |
| Length 9 |  |  |
| A-A-A-A-A-A-A-A-A | $7^{\dagger}$ | 0 |
| G-A-A-A-G-A-A-A-A | 1 | $4^{+}$ |
| A-C-C-A-C-C-A-C-C | $3^{\dagger}$ | 0 |

[^2]Table 5. hf DR in Hu-Mt and Ms-Mt

|  |  | hf DR, no. |  |
| :---: | :---: | :---: | :---: |
| Word size | Repeat level | Hu-Mt | Ms-Mt |
| 6 | $\geq 20$ | 42 | 63 |
|  | $\geq 30$ | 3 | 8 |
|  | $\geq 40$ | 0 | 1 |
| 8 | $\geq 5$ | 65 | 88 |
|  | $\geq 7$ | 2 | 11 |
| 10 | $\geq 3$ | 10 | 12 |
| 12 | $\geq 2$ | 29 | 52 |
| 14 | $\geq 2$ | 2 | 9 |
| 16 | $\geq 2$ | 0 | 1 |

gap indicates overlapping oligonucleotides) so that TCA is tandemly repeated five times in the large T-antigen gene. We note that all DR of size $\geq 12$ have distances between them of $\leq 60$ bp. The 72-, 21- and one of the two $13-\mathrm{bp}$ DR are G.C-rich. There is a significant number of moderate-to-large DR of size $\geq 11$ located in the large T-antigen gene.

In polyoma virus the largest DR is of size 16 , consisting of six successive GGA codons. We further note that all DR of size $\geq 11$ tend to be close (four out of five with a distance of $\leq 0.5$ kb and the fifth with a distance of $<1 \mathrm{~kb}$ ); four of the five DR are part of the large T -antigen gene.

In BKV there is a large DR of size 67 at positions 143 and 261 (gap 51) and a DR of size 51 at positions 167 and 217 (gap -1 ). The next largest distinct DR is of size 14 with gap 34 . Again, all large DR are close, and they tend to favor $\mathrm{G} \cdot \mathrm{C}$ nucleotides.

HPV. The only significant large DR (size 16) occurs at positions 4,056 and 4,071 (gap -1) and shows a G.C bias.
$\lambda$ phage. None of the large DR (involving $\geq 12 \mathrm{bp}$ ) have more than two representatives. The largest size, 15 , is not significantly different from chance expectation.
hf DR. Hu-Ig and Ms-Ig. All hf DR were ascertained over the aggregate $\mathrm{Hu}-\mathrm{Ig}$ and Ms -Ig sequences. For a sequence length $n=5,000$, the criterion for a word of size $k$ to qualify as a hf $\mathrm{DR}, k=5$ and 9 , is to have at least 25 and 3 representatives, respectively. These threshold levels are determined from theoretical studies. The base composition for the $\mathrm{Hu}-\mathrm{Ig}$ and Ms Ig $\kappa$-chain gene sequences is similar.

Table 4 shows that hf DR occur more in Hu-Ig compared to Ms-Ig. Moreover, clustering of DR also favor the Hu-Ig sequence. This is in contrast to the preponderance of close DS of stem length $\geq 7$ [excluding self-dyads (self-D)] in the Ms-Ig versus Hu -Ig sequences (see Table 8).

We also note the 9-bp oligonucleotide A-A-A-C-G-T-A-A-G occurring at positions 1041, 1346, 1688, 2033 (spaced 296, 333, 306 bp apart, respectively) in Hu -Ig. The same oligonucleotide is in Ms-Ig at positions $774,1129,1759,2097$ with gaps 346, 621,329 , respectively. Notice that the jump of 621 equals 2 (300) for the Ms-Ig, reflecting the inactivation of $J_{3}$.
$H u-M t$ and $M s-M t$. The Ms-Mt has many more hf DR than does the Hu-Mt (Table 5). By contrast, Hu-Ig shows many more hf DR than does Ms-Ig.

Papovaviruses. Table 6 shows that the original sequence contains significantly more oligonucleotides for sizes 4 and 6 , repeated in high numbers, compared to the corresponding cases

Table 6. hf DR in papovaviruses

| Virus | Size 4 |  |  | Size 6 |  | Size 8 |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | $\geq 30$ | $\geq 40$ | $\geq 60$ | $\geq 6$ | $\geq 9$ | $\geq 3$ | $\geq 4$ |
| SV40 | 48 | 25 | 3 | 42 | 6 | 11 | 0 |
| P-range | $(31,43)$ | $(5,14)$ | $(0,0)$ | $(24,41)$ | $(0,4)$ | $(7,14)$ | $(0,2)$ |
| Polyoma | 46 | 4 |  | 13 | 1 | 5 | 3 |
| P-range | $(10,15)$ | $(0,0)$ |  | $(6,15)$ | $(0,1)$ | $(1,9)$ | $(0,1)$ |

Number of oligonucleotides of a given size that occur in repeats $\geq t$ times in the original sequence. The permutation range (P-range) is the corresponding range (minimum, maximum) determined from 20 randomly permuted sequences.
when the sequence is randomly permuted. This significance fails for word size $\geq 8$. Short DR might be easier to generate (e.g., mediated by unequal crossing-over and gene conversion processes, by enzyme repair actions, and DNA stuttering mechanisms). However, a constant rate of mutation might tend to more readily disrupt the identity of longer repeats.
$\lambda$ phage. The most frequent repeats of size 5 are A-A-A-AA (147 occurrences), T-G-C-T-G (138), T-G-A-T-G (133), and T-T-T-T-T (133). The sequence T-G-A-T-G is singled out in ref. 20 in relation to the concept of translational coupling (see also ref. 11). The most frequent repeats of word size 10 are A-C-C-T-G-A-C-C-G-C, A-C-G-C-C-C-G-G-C-A, and C-T-G-A-T-G-C-A-G-G, each occurring four times. They all show a $G \cdot C$ bias.

It is interesting that the largest DR among the viruses tend to be in noncoding regions or in URFs and usually are G•C-rich relative to expectations.

Distribution of DR. We use examples from the papovaviruses. The sums in each row of Table 7 are the number of distinct oligonucleotides of sizes 6 and 10 that occurred in the given sequences. The total number of possible words of size 6 with a four-letter alphabet is $4^{6}=4,096$ and of size 10 is $4^{10}=$ $1,048,580$. If $r_{\ell}$ words are repeated $\ell$ times, then $\Sigma \ell r_{\ell}=n=$ sequence length. Note that hf DR words of all sizes are considerably rarer in polyoma compared to both BKV and SV40. However, the number of unique oligonucleotides in polyoma is significantly more than in SV40 and BKV, even adjusting for the large 72 and 21 DR of SV40 and the two large DR in BKV.

## DS

The importance of identifying DS pairs for their potential function in secondary structure and as signals for transcriptional control is well recognized. This section presents examples, interpretations, and speculation on the bivariate distribution of DS with particular attention to self-D, close DS, and large DS.

Close DS. Table 8 indicates the numbers of close DS. The following facts are worth emphasis: (i) Ms-Mt compared to Hu Mt has $50 \%$ more close DS; (ii) polyoma has significantly less close DS than does SV40; (iii) the Ms-Ig compared to Hu-Ig has $\approx 50 \%$ more close DS. After adjustment for genome size, $\lambda$ phage exhibits significantly fewer self-D in comparison to all other examples of Table 8.

As to the significance of self-D, we discuss the output only for polyoma; the results are consistent with respect to all the virus data sets examined. The number of unique DS pairs is

Table 7. Number of DR of oligonucleotides of sizes 6 and 10

|  | Size 6, frequency |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  | Size 10 , frequency |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 | 16 | 17 | 18 | Sum | 1 | 2 | 3 | 4 | Sum |
| SV40 | 898 | 628 | 361 | 175 | 87 | 57 | 30 | 14 | 7 | 1 | 0 | 0 | 2 | 0 | 0 | 0 | 0 | 1 | 2,261 | 4,892 | 78 | 31 | 3 | 5,004 |
| Polyoma | 1,174 | 740 | 421 | 198 | 78 | 22 | 5 | 2 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 2,641 | 5,250 | 16 | 2 | 1 | 5,269 |
| BKV | 943 | 627 | 363 | 183 | 90 | 47 | 29 | 11 | 7 | 5 | 1 | 3 | 1 | 2 | 0 | 0 | 0 | 0 | 2,314 | 4,991 | 123 | 2 | 0 | 5,116 |

Table 8. Number of DS with stem length $\geq 5$ and loop length $\leq 50^{*}$

| Stem <br> size | SV40 | Plyma | HPV | Ms-Mt | Hu-Mt | Hu-Ig | Ms-Ig | $\lambda$ |
| ---: | ---: | ---: | ---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 5 | 176 | 158 | 247 | 501 | 337 | 208 | 192 | 1797 |
| 6 | 121 | 84 | 152 | 327 | 247 | 111 | 115 | 832 |
| SD | $(65)$ | $(49)$ | $(87)$ | $(218)$ | $(155)$ | $(64)$ | $(60)$ | $(332)$ |
| 7 | 14 | 11 | 19 | 49 | 19 | 15 | 19 | 113 |
| 8 | 23 | 17 | 23 | 71 | 46 | 20 | 17 | 142 |
| SD | $(17)$ | $(11)$ | $(20)$ | $(61)$ | $(40)$ | $(19)$ | $(9)$ | $(102)$ |
| 9 | 1 | 0 | 0 | 4 | 1 | 1 | 1 | 11 |
| 10 | 5 | 4 | 7 | 16 | 13 | 4 | 1 | 24 |
| SD | $(5)$ | $(4)$ | $(6)$ | $(13)$ | $(11)$ | $(4)$ | $(1)$ | $(20)$ |
| 11 | 0 | 0 | 1 | 0 | 1 | 0 | 0 | 4 |
| 12 | 1 | 1 | 1 | 3 | 5 | 1 | 0 | 4 |
| SD | $(1)$ | $(1)$ | $(1)$ | $(2)$ | $(5)$ | $(1)$ | $(0)$ | $(4)$ |

SD, self-D; Plyma, polyoma.
*The integer without parentheses is the number of DS corresponding to the given stem length including self-D. The integer in parentheses is the number of self-D of the given stem length. For close DS of stem length exceeding 12 , see text.
significantly diminished for the original genome compared to that for all the permuted sequences for words of size 6. The opposite is true for unique DS pairs of sizes 8 and 10 (Table 9). Significant orderings are not realized with respect to multiple DS pairs, where at least one of the component words occurs more than once. Self-D occurring twice may be considered a bona fide unique dyad pair because a more stable stem-loop can be formed for the different words but with neither self-D.

The percentage of self-D compared with single DS pairs was significantly less for the original genome for words of size 8 . No significant difference in self-D percentage was observed for word size 6. Self-D may be selected against. Possible reasons are that self-D and associated potential secondary structures may slow transcription (pause sites) and encumber efficiency. It is reasonably documented in laboratory experiments that when short self-dyads are coerced into a stem-loop form, they generally snap back quickly to a linear configuration.

Three large self-D of size 16,14 , and 12 occur in HPV. These cannot be considered statistically significant because the samesize self-D appeared in a number of permuted sequences.

Bivariate Distribution of DS. We illustrate this concept for the cases of SV40 and polyoma (Table 10). The entries in row $\ell$ and column $m$ refer to the number of occurrences of DS pairs of size 8 , one word repeated $\ell$ times, and its dyad word repeated $m$ times. Thus, the entry for $(1,1)$ is the number of unique DS pairs where each word occurs once. Unique self-D are included. Observe that the original bivariate distributions exhibit more DS pairs than occur by randomly permuting the data. In

Table 9. DS and self-D in polyoma

|  |  | Original |  |  | Permutation ranges |  |
| :---: | :---: | ---: | :---: | :---: | :---: | :---: |
| Size | DS type | DS, no. | Self-D, $\%$ |  | DS, no. | Self-D, \% |
| 6 | $(1,1)$ | 170 | 0.09 |  | $(243,285)$ | $(0.06,0.13)$ |
|  | $(2,2)$ | 94 | 0.08 |  | $(109,145)$ | $(0.09,0.15)$ |
|  | $(3,3)$ | 34 | 0.12 |  | $(20,36)$ | $(0.17,0.32)$ |
| 8 | $(1,1)$ | 248 | 0.06 |  | $(192,229)$ | $(0.06,0.10)$ |
|  | $(2,2)$ | 2 | 0.00 |  | $(0,8)$ | $(0.00,1.0)$ |
| 10 | $(1,1)$ | 30 | 0.17 |  | $(5,26)$ | $(0.12,0.31)$ |

[^3]Table 10. Bivariate distributions of DS of size 8 for SV40 and Polyoma

| $\frac{\text { Virus }}{\text { SV40 }}$ | Original | Permutation ranges |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | 123 |  | - 1 | 2 | 3 |
|  | $1\left[\begin{array}{cccc}276 & 22 & 3\end{array}\right]$ | 1 | $(195,260)$ | $(0,14)$ | $(0,1)$ |
|  | $2{ }_{2} \mathbf{4 6} 151511$ | 2 | $(15,25)$ | $(0,4)$ | $(0,0)$ |
|  | $3{ }^{3} \quad 6 \quad 200$ |  | $(0,3)$ | $(0,1)$ | $(0,0)$ |
|  | $4{ }^{4}$ | 4 | $(0,0)$ | $(0,0)$ | $(0,0)$ |
|  | 500000 |  |  |  |  |
|  | $6\left[\begin{array}{lll}1 & 0 & 0\end{array}\right]$ |  |  |  |  |
|  | 12 |  | 1 | 2 |  |
| Polyoma | $1\left[\begin{array}{lll}248 & 14\end{array}\right]$ | 1 | $(192,229)$ | $(0,10)$ | $(0,1)$ |
|  | $2\left[\begin{array}{ll}22 & 2\end{array}\right]$ | 2 | $(7,16)$ | $(0,2)$ | $(0,0)$ |
|  |  | 3 | (0,3) | $(0,0)$ | $(0,0)$ |

particular, the number of unique DS pairs in SV40 is 276, in excess of the maximum number in the 20 permutations.

Large DS. Papovaviruses. Apart from the size 13 exact DS (gap one) at the replication point in SV40, there are two 12-nucleotide DS pairs, both involving $1-\mathrm{kb}$ loop length and a mul-tiple-size 11 DS having A-A-T-T-A-G-T-C-A-G-C at position 27 with its two dyad words at positions 112 and 146 .

Polyoma had no DS pair of size $\geq 10$.
$\lambda$ phage large DS. The largest exact DS consists of A-G-A-A-A-G-G-A-A-A-C-G-A-C-A-G (size 16), and its dyad word occurs at positions 109 and 151 (loop 26). The large size and short loop probably portend a biological function. This potential stem loop structure is 24 nucleotides $5^{\prime}$ of $N u$-1 gene (11).

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[^1]:    Abbreviations: DR, direct repeats; hf, high frequency; URF, undefined reading frame; DS, dyad symmetries; HPV, human papillomavirus; kb, kilobase(s); BKV-Dun, BK virus, Dunlop strain; bp, base pair(s); self-D, self-dyads; $\mathrm{Hu}-\mathrm{Mt}$ and $\mathrm{Ms}-\mathrm{Mt}$, human and mouse mitochondrial genomes; Hu-Ig and Ms-Ig, human and mouse Ig $\kappa$-chain genes; J, joining; C, constant.

[^2]:    *Very abundant clustering involving $>4$ clusters.
    ${ }^{\dagger}$ hf DR occurring asymmetrically in the Ms-Ig versus $\mathrm{Hu}-\mathrm{Ig}$ sequences by a factor $\geq 2.5$ or appearing in clusters, with each cluster defined to have at least four consecutive DR of gap length $\leq 50$.

[^3]:    The number of DS pairs and the proportion of self-D for polyoma and 20 permuted sequences are shown with the minimum and maximum, respectively, in parentheses.

