

Research Article

Production of random DNA oligomers for scalable DNA computing

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While remarkably complex networks of connected DNA molecules can form from a relatively small number of distinct oligomer strands, a large computational space created by DNA reactions would ultimately require the use of many distinct DNA strands. The automatic synthesis of this many distinct strands is economically prohibitive. We present here a new approach to producing distinct DNA oligomers based on the polymerase chain reaction (PCR) amplification of a few random template sequences. As an example, we designed a DNA template sequence consisting of a 50-mer random DNA segment flanked by two 20-mer invariant primer sequences. Amplification of a dilute sample containing about 30 different template molecules allows us to obtain around 10^{11} copies of these molecules and their complements. We demonstrate the use of these amplicons to implement some of the vector operations that will be required in a DNA implementation of an analog neural network.

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1 Introduction

In 1994, Adleman [1] proposed and demonstrated a new way to solve in principle very complex problems using DNA molecular computation. This technique has been improved by introducing the selection of desired components in electrophoresis gels containing bound target DNA oligomers [2]. Since the first DNA computer was reported, various alternate schemes for DNA computing and self assembly have been proposed, all based on the property that complementary single-stranded DNA (ss-DNA) oligomers can find each other in solution to form Watson-Crick double strands. If the single-stranded oligomers are present in connected pairs of distinct molecules [1, 2] or in higher multiples of distinct molecules [3, 4], certain networks of molecules will form in space or time, depending on how

the reactions are carried out. The structure of the resulting networks will reflect the correlations encoded in the set of oligomer pairs or triads, *etc.* While complex networks can form from a relatively small number of distinct oligomer strands, a large computing power might ultimately require the use of many more distinct DNA strands than could be economically produced by automatic synthesis. Our new approach to producing the requisite distinct DNA oligomers is based on PCR amplification of a few molecules chosen from a collection of oligomers produced with random sequences. Our method could in principle be scaled to produce millions of different DNA oligomers.

In Adleman's classic DNA computing paper [1], a small-scale directed Hamiltonian path problem was solved by encoding the cities and paths of the problem in complementary DNA molecules that would find each other in solution and, by the process of self assembly, produce a small number of connected DNA oligomers representing the correct result. Liu *et al.* [5, 6] proposed another technique that involves the immobilization and manipulation of combinatorial mixtures of DNA on a gold-coated

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coverslip. A set of DNA molecules encoding all candidate solutions is synthesized and attached to the surface. Successive cycles of hybridization operations and exonuclease digestion are used to identify and eliminate those members that are not solutions. After completing all of the multiple-step cycles, the solution to the computational problem is identified using PCR to amplify the remaining molecules, which are then hybridized to an addressed array. The advantages of this approach are its scalability and potential to be automated. However, the shortcomings are the low efficiency of DNA attaching to the gold-coated surface and the requirements of large quantities of different synthesized DNA strands. DNA computation approaches using the ability of pairs of distinct oligomers to join in chains have been used to suggest a way to solve the SAT problem [7], to perform binary addition [8, 9], and to solve the maximal clique problem [10]. Inspired by Adleman's work using DNA renaturation to effect a computation, the energy of hybridization of DNA fuel strands has also been used to run nanomachines [11, 12] (for a review see [13]).

The operations of joining various strands of DNA may be thought of as a series of matrix multiplications with the matrix elements being represented by couplets of joined single-stranded oligomers and vectors by singlets [14]. An analog neural network may be represented by saturable matrix operations [15] and hence may be represented by chemical operations performed on strands of DNA [16, 17]. The latter references have described a particular set of DNA operations to effect the interconversion of electrical and DNA data, to represent the Hopfield associative memory [15], and to implement the feed-forward neural network of Rumelhart et al. [18]. This type of DNA computing has the advantage that it should be fault tolerant and thus more immune to DNA hybridization errors than a Boolean DNA computer [19]. To extend this method to problems of n dimensions, one will need n different basis DNA oligomers and their complements. Thus really interesting applications using thousands of dimensions will be impractical if the different basis vectors must be synthesized individually.

The idea of representing a vector space by concentrations of various chemicals may be traced to Weyl's suggestion [20] of a vector space composed of a mixture of four gases, with unit concentrations of the pure gases standing for unit vectors in the various dimensions. We note that Adleman in his original DNA computing experiment [1] used random 20-mers to represent his basis vectors, but these were specified as definite sequences that

were produced by a DNA synthesizer. Non-random designs for oligomers with advantageous properties for DNA computing have been proposed [21], but such basis vectors would be impractical for calculations in a large number of dimensions. Here, we describe a new method in which we make the material representing each basis vector in a DNA vector space by PCR-amplifying a few random DNA oligomers into a macroscopic sample of oligomers and their complements. The problem of negative amplitudes needed for a true vector space representation is solved by assigning concentrations of the complementary DNA oligomers to stand for negative concentrations. Such a convention has the desired property that equal concentrations of positive and negative basis vectors will cancel out by becoming inactive double-stranded DNA (dsDNA) after a period of time. The template material for generating our basis vectors is a commercially synthesized 90-mer ssDNA oligomer, specified as a 50-mer random sequence flanked by two distinct 20-mer fixed DNA strands serving as the primer set for PCR. A sample containing about 30 template molecules with different DNA sequences is obtained by repeated dilutions of template in nuclease-free water. After 38 cycles of PCR we obtain approximately 10^{11} copies of these 30 molecules. Asymmetric PCR (using initially only one primer and then the other one) yields usable amounts of two samples containing single-stranded template copies and their complements for our use in various matrix operations for implementing an analog neural network DNA computing algorithm. We infer that it will be possible to scale up to obtain large numbers (at least hundreds) of distinct DNA template molecule sets.

2 Materials and methods

2.1 Primer and random DNA sequence designing

In this experiment, we chose two primers from the website <http://www.realtimeprimers.org/> with sequences: primer L20-002-MWG: 5'-AAGAGCCATGCTACTGTTGG-3' and primer R20-002-MWG: 5'-GGAAGTTCACAGATAGCCTC-3', both from MWG Biotech. Tag-primer L20-002-MWG and Tag-primer R20-002-MWG (MWG Biotech) were obtained by adding TET and AA to 5' end of primer L20-002-MWG and primer R20-002-MWG, respectively. The template labeled as: template 90-002: 5'-AAGAGCCATGCTACTGTTGGNN...NNGAGGC-TATCTGTGAAGTTCC-3' was from Integrated DNA Technologies, Inc, with the middle 50-mer random sequences made by machine mixing: 30% T,

20% A, 26% G and 24% C. Both the primers and the template were checked using software AnnHyb 4.920 to reduce the chance of primer dimer or hairpin formation. It is essential to purchase the primers and templates from different vendors, as there may be a chance that minute traces of template from the solid matrix of the synthesizer contaminates the primers.

Our primary interest in the design of strands is that they are orthogonal (*i.e.*, they do not hybridize to one another). Concerns about the differential activity of polymerase on differing nucleosides are allayed by two points. First, even if certain strands were amplified more than others, there would be a negligible effect in output intensity of the polyacrylamide gel. This benefit of “fault tolerance” is one which we believe makes analog neural network architectures most attractive. Second, any fragmentation that occurs is minimal, as evidenced by a lack of fragmentation in our output gels.

2.2 PCR and asymmetric PCR

To reduce the formation of primer dimers before PCR starts, we selected Finnzymes' DyNAzyme™ II hot start DNA polymerase (New England Biolabs), a modified form of the DyNAzyme™ II DNA Polymerase originating from *Thermus brockianus*. It is inactive at room temperature, and the activity is recovered by a 10-min incubation step at 94°C. The enzyme improves the specificity of PCR by preventing the extension of non-specifically bound primers during reaction setup and the first heating cycle. Besides PCR primers and templates, each 100- μ L solution contains 0.2 mM dNTP (New England Biolabs), 1 \times DyNAzyme™ II hot start DNA polymerase reaction buffer [15 mM Tris-HCl, 30 mM KCl, 5 mM (NH₄)₂SO₄, 2.5 mM MgCl₂, 0.02 % BSA, pH 8.2 at 25°C], 1.2 μ L 2 U/ μ L hot start polymerase and nuclease-free water (Integrated DNA Technologies). In our experiment, we combined the annealing and extension steps. A 38 cycle symmetric PCR and a 30 cycle asymmetric PCR (initial 10-min incubation at 94°C; denaturation at 94°C for 30 s, annealing and extension at 50°C for 90 s; after 38 or 30 cycles, incubation at 72°C for 10 min to maximize the extension, and then maintenance at 4°C) were used to get ssDNA amplicons. We sealed each PCR test tube with a hot glue gun before putting them into the thermal incubator to prevent cross contamination.

2.3 DNA PAGE

To check the results, 15% TBE gels and 10–20% gradient Tris-HCl gels were used. A controlled-tem-

perature, vertical gel tank with cycling water and one sapphire plate covering the gel was used to maintain the desired temperature uniformly across the gel. Tris-Borate-EDTA buffer (1 \times , Sigma) was used as the running buffer and 1 \times bromophenol blue buffer as the loading buffer; 6 μ L solution was added to each gel well. Gel electrophoresis was run at 107 V and 40°C for 70 min.

2.4 SYBR Gold gel stain

SYBR Gold (Molecular Probes) nucleic acid gel stain was used to stain DNA after gel electrophoresis. This is the most sensitive fluorescent stain available for detecting ds- or ss- DNA or RNA in electrophoresis gels. It is a proprietary unsymmetrical cyanine dye with excitation maxima for dye-nucleic acid complexes at ~495 nm in the visible and ~300 nm in the ultraviolet and with emission maximum at ~537 nm. For detecting DNA and RNA, SYBR Gold stain is more than 10-fold more sensitive than ethidium bromide and does not require a destaining step due to the low intrinsic fluorescence of the unbound dye. In our experiment, the polyacrylamide gel with DNA was immersed into a stain buffer (formed by mixing 5 μ L 10 000 \times SYBR Gold gel stain with 10 mL 10 \times TBE buffer and 90 mL double-distilled water) at room temperature for 40 min.

2.5 Data analysis using Kodak 1D system

Laser light [312 nm UV light (Fisher Scientific), or 488 nm or 514 nm] was used to excite the SYBR Gold-nucleic acid complexes. The exposure time was 8 s. The concentration and mobility of the DNA strands were measured using a Kodak 1D image analysis system (Fisher Scientific).

2.6 DNA extraction from polyacrylamide gel using QIAEX® II gel extraction kits

To obtain pure DNA strands, a small piece of gel containing the required DNA band was cut using a razor blade and crushed in a test tube with a pipette tip. A QIAEX® II gel extraction kit was used to purify DNA strands.

3 Results and discussion

3.1 Amplifying 30 molecules using PCR

One microliter of the 50 μ M Template 90-002 was diluted with 1000 μ L nuclease-free water (IDT) and labeled as D-1 with a concentration of 30×10^9 mol-

ecules/ μL . Serial 10^3 dilutions (1 μL in 1000 μL nuclease-free water) were made yielding D-2 (30×10^6 molecules/ μL), D-3 (30×10^3 molecules/ μL), and D-4 (30 molecules/ μL). Also 1 μL D-3 was diluted into 100 μL of nuclease-free water and labeled as D-3.5 (300 molecules/ μL). After 38 cycles of PCR, the template can be amplified approximately $2^{38} \approx 10^{11}$ -fold. Experimental evidence for an efficiency approaching unity for Taq polymerase can be found in Wolffs *et al.* [22]. In this reference, the authors use the efficiency equation “ $E = (10^{-1/\text{slope}}) - 1$ ”, which was derived from an earlier work [23]. Experiments performed by Wolffs *et al.* show a value of -3.3229 for the slope in this equation, which yields $E = 0.99959$. While the experiments in the paper of Wolffs *et al.* were performed using real-time PCR, the results stated therein are suggestive of a high efficiency in our experiment. The initial 30 molecules in a 100 μL solution will become 3×10^{12} molecules, giving a concentration of 0.05 μM . Table 1 shows the materials for PCR. The products were run in a 10–20% gradient Tris-HCl polyacrylamide gel. The gel was stained in SYBR Gold for 40 min and the image was taken using a 488-nm laser.

The results in Fig. 1 show a band around 90 bp from lanes 1 to 8. The long dark bands above 90 bp in lanes 1 and 2 with initial 30×10^6 random DNA molecules may be explained as those 90-base DNA oligomers that act as their own primers, thus producing long primer dimers. The long dark bands above 90 bp in lanes 3 and 4 with initial 30 000 random DNA molecules can be accounted for in the same way. In contrast, the initial 300 molecules produce fewer long bands with more primer strands left in lanes 5 and 6. For the initial 30 molecules in lanes 7 and 8, the longest bands do not appear and the primers produced more primer dimers around 40 bp. The control lanes (9–12) without the template show no amplified signals around 90 bp. The results indicate that we succeeded in getting larger quantities (approximately 5 pmol) of multiplicities of 30 different molecules using 38 cycles hot-start PCR.

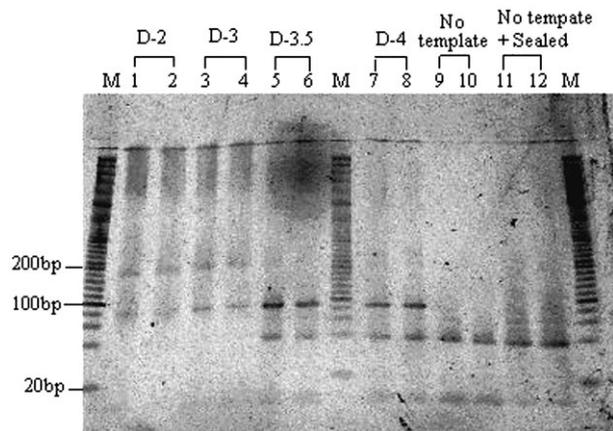


Figure 1. Gel electrophoresis of PCR amplifying random DNA sequence in a 10–20% gradient Tris-HCl polyacrylamide gel. Lane M, 20 bp DNA marker. Lanes 1 and 2, PCR amplicons of D-2; lanes 3 and 4, PCR amplicons of D-3; lanes 5 and 6, PCR amplicons of D-3.5; lanes 7 and 8, PCR amplicons of D-4; lanes 9 and 10 are controls without the initial DNA template; lanes 11 and 12, controls with sealed caps.

3.2 Making two basis vectors and their probes using asymmetric PCR

From the above PCR products, two samples containing 30 different amplified molecules were chosen and labeled as A and B. Theoretically, these two samples should each contain 30 different molecules, and there is a small probability that they have one sequence in common. Each of these two samples represents a “basis vector”. In this case, the sequences that are complementary to each of these samples can be isolated and used to “eliminate” one of the basis vectors by allowing them to hybridize. Our method using several different types of molecules has an advantage over the use of a single type of molecule due to the difficulties inherent in the amplification of such a small sample (such as obtaining a single molecule from a solution and the time required for PCR). Further, since the readout of a result is given as a ratio of intensities in gel, this

Table 1. Materials used in PCR

	1	2	3	4	5	6	7	8	9	10	11	12
	[μL]											
1 μL template	D-2	D-2	D-3	D-3	D-3.5	D-3.5	D-4	D-4	0	0	0	0
10 mM dNTP	2	2	2	2	2	2	2	2	2	2	2	2
2 U/ μL hot start DNA polymerase	1.2	1.2	1.2	1.2	1.2	1.2	1.2	1.2	1.2	1.2	1.2	1.2
10 \times hot start reaction buffer	10	10	10	10	10	10	10	10	10	10	10	10
20 μM Left L20	1	1	1	1	1	1	1	1	1	1	1	1
20 μM Right R20	1	1	1	1	1	1	1	1	1	1	1	1
Nuclease-free water	83.8	83.8	83.8	83.8	83.8	83.8	83.8	83.8	84.8	84.8	84.8	84.8

system is fault tolerant. To improve the signal to noise ratio, the standard aliquot used for a basis vector has only to be increased. The signal will then become brighter in a polyacrylamide gel by a factor much larger than any errors in the system.

The buffer and small molecules were eliminated from the solution by the Edge gel filtration method. Initially, two Edge gel filtration cartridges were centrifuged at 2900 rpm for 3 min. The cartridges were then transferred to two clean microcentrifuge tubes and 80 μ L A or B were added to the packed columns. Finally, they were centrifuged at 2900 rpm for 2 min and the pure DNA oligomers were obtained and used as the template for the following asymmetric PCR. For the asymmetric PCR, the solution was first heated to 94°C for 10 min. This was followed by 30 cycles of PCR (94°C for 30 s to denature dsDNA, and 50°C for 90 s for annealing and extension steps) to linearly amplify the templates. Finally, the solutions were kept at 72°C for 10 min to optimize the polymerization. In Table 2 shows the 20-base primers and 22-base TET-labeled primers used.

In Fig. 2, lanes 1–4 contain six bands. Compared to 90-base template 90-002 in lane 9, the band around 140 bp is the 90-base ssDNA amplified by asymmetric PCR, and the band at 90 bp is the remaining 90-bp template after the asymmetric PCR. The higher intensity of bands in lanes 1 and 3 than those of lanes 2 and 4 indicates that the efficiency of the asymmetric PCR using one direction primer is larger than using the other direction primer due to the annealing temperature difference between these two primers. Using software AnnHyb 4.920, the melting temperature for 1.25 μ M primer L20 at 50 mM salt concentration is 56.5°C, while the melting temperature for 1.25 μ M primer R20 at 50 mM salt concentration is 53.9°C. Therefore, primer L20 has a higher annealing ability than primer R20 when 50°C is used as the annealing temperature. The other possible reason is that the 3' GG end of

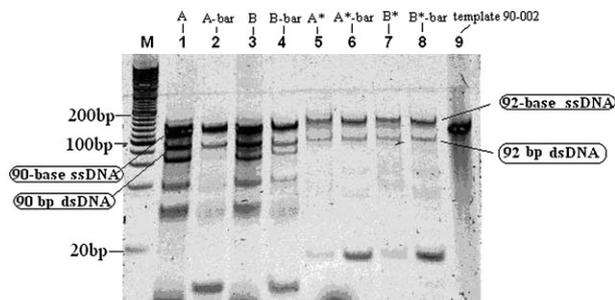


Figure 2. Gel electrophoresis of 30-cycle asymmetric PCR products at 107 V at 40°C in a 15% TBE gel. Lane M, 20-bp DNA ladder. Lane 1, products of template A and primer L20 only; lane 2, template A and primer R20 only; lane 3, products of template B and primer L20 only; lane 4, template B and primer R20 only; lane 5, product of template A and Tag-L20 only; lane 6, product of template A and Tag-R20 only; lane 7, product of template B and Tag-L20 only; lane 8, product of template B and Tag-R20 only; lane 9, 10 μ L 0.5 μ M template 90-002.

primer L20-002 is much easier to anneal to template than the 3' TC end of primer R20. The three bands between 20 and 80 bp may come from primer dimers. The amplified 92-base ssDNA and 92-bp dsDNA with overhang in lanes 5–8 move slower than the 90-base ssDNA and 90-bp dsDNA in lanes 1–4, respectively, due to the two extra As and TET at the 5' end of Tag-primer L20 and Tag-primer R20. Figure 2 shows that the formation of ssDNA using Tag-primers has a lower product than that of primers. This indicates that asymmetric PCR using an imperfectly matched primer will yield low products, which may be caused by steric hindrance due to the tag's presence. This mechanism needs further study.

3.3 Purifying the 90-base ssDNA and its complement after the asymmetric PCR

The asymmetric PCR products come with some unwanted longer or shorter strands. To get pure am-

Table 2. Samples used in the asymmetric PCR

	1'	2'	3'	4'		5'	6'	7'	8'
	[μ L]	[μ L]	[μ L]	[μ L]		[μ L]	[μ L]	[μ L]	[μ L]
Template	16A	16A	16B	16B	Template(μ L)	16A	16A	16B	16B
10 mM dNTP	4	4	4	4	10 mM dNTP	4	4	4	4
2 U/ μ L hot start DNA Polymerase	2.4	2.4	2.4	2.4	2 U/ μ L hot start	2.4	2.4	2.4	2.4
10 \times hot start Reaction Buffer	20	20	20	20	10 \times hot start	20	20	20	20
50 μ M Left L20	5	0	5	0	100 μ M Tag-L20	2.5	0	2.5	0
50 μ M Right R20	0	5	0	5	100 μ M Tag-R20	0	2.5	0	2.5
Nuclease-free water	152.6	152.6	152.6	152.6	Nuclease-free water	155.1	155.1	155.1	155.1

plicons, each band was excised on the gel from the eight samples, and the gel containing the asymmetric PCR-amplified ssDNA strands was cut. ssDNA strands were purified following the QIAEX® II gel extraction procedure. The diffusion coefficient can be obtained using the Nernst-Einstein relation: $D = \mu kT/q$, where μ is the mobility, k is Boltzmann's constant, T is the temperature in Kelvin, and q is the charge. In our experiment, the length of DNA was 90 bases, so $\mu \approx 5 \times 10^{-5} \text{ cm}^2/\text{vs}$, $kT \approx 1/40 \text{ eV}$ at room temperature and $q = 90e$. Thus, $D \approx 10^{-8} \text{ cm}^2/\text{s}$ and the root mean square (RMS) of diffusion length over 3 h would be $\lambda_{rms} = (Dt)^{1/2} = 0.1 \text{ mm}$. Because the size of the gel fragments after grinding is smaller than 0.1 mm, the DNA oligomers in the gel can easily diffuse out into the elution buffer (0.5 M ammonium acetate, 10 mM magnesium acetate, 1 mM EDTA, pH 8.0, 0.1% SDS) which is maintained at 50°C.

Of each ssDNA strand, 20 μL was obtained using QIAEX II gel extraction kits. Of this, 2 μL was taken and diluted with 8 μL nuclease-free water and loaded into a 15% TBE gel. The electrophoresis was run at 107 V and 40°C for 80 min. The gel was then soaked in SYBR Gold gel stain solution for 40 min. The image shown in Fig. 3 was taken using 312-nm UV light. The concentrations of ssDNA in lanes 1–8 were calculated by comparison with the 0.5 μM template 90-002 in lane 9, and these are shown in Fig. 4. Because 2 μL of initial concentration of samples were diluted into 8 μL nuclease-free water, the initial concentration should be calculated as $C_{\text{initial}} = 5C_{\text{measured}}$ as shown in Table 3.

We then tested the annealing efficiency of ssDNA strands and their complements. Table 4 shows the sample components. For samples 1 and 2, the excess A and A-bar, and the excess B and B-bar were mixed with nuclease-free water. For sample 3, the excess A and B-bar were mixed with nuclease-free water. For sample 4, A and B were mixed together. Samples 5–8 are similar but contain about 40 mM NaCl. Figures 5a and b show the electrophoresis of samples with the annealing temperature at 37°C and at 60°C, respectively. In both figures, the increased intensity of 90-bp dsDNA in lanes 5 and 6 compared to that of lanes 1 and 2 shows that 30–40 mM NaCl enhances the annealing efficiency because it can weaken the electro-repulsion

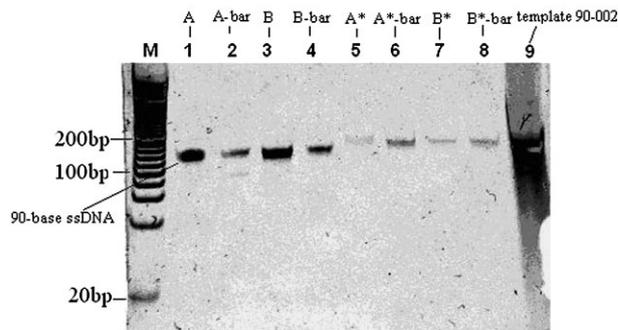


Figure 3. Gel electrophoresis of purified ssDNA in a 15% TBE gel. Lane M, 20-bp DNA ladder. Lanes 1–8, pure ssDNA samples from corresponding lanes of Fig. 2. Lane 9, 10 μL 0.5 μM template 90-002.

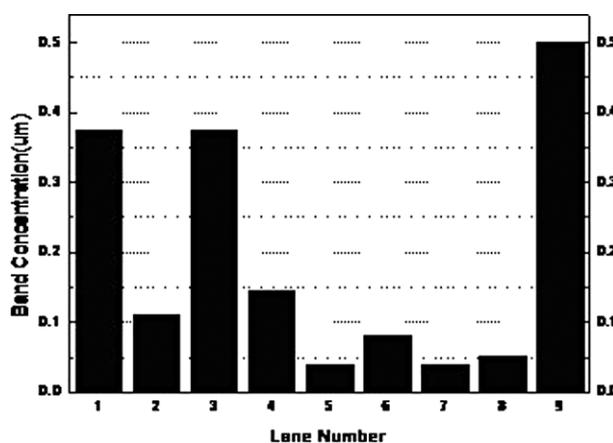


Figure 4. Calculated band concentration of purified ssDNA strands versus lane numbers. The standard, lane 9, has a concentration of 0.5 μM .

force between the two complementary strands and thus lower T_m .

In Fig. 5a, lanes 5–7 with 30–40 mM NaCl contain thicker bands near the top of the gel, which may come from tangled DNA strands. When the annealing temperature was increased to 60°C, the bands disappeared and more dsDNA at 90-bp was formed as shown in lanes 5–7 of Fig. 5b. Comparing these two images, it can be seen that the efficiency of produced dsDNA greatly increases as the annealing temperature increases. Thus, 30–40 mM NaCl and an annealing temperature of 60°C are two impor-

Table 3. Calculated initial concentration of pure samples

	1	2	3	4	5	6	7	8
Label	A	A-bar	B	B-bar	TET-A	TET-A-bar	TET-B	TET-B-bar
Name	A	A-bar	B	B-bar	A*	A*-bar	B*	B*-bar
Concentration (μM)	1.87	0.55	1.86	0.72	0.2	0.4	0.2	0.25

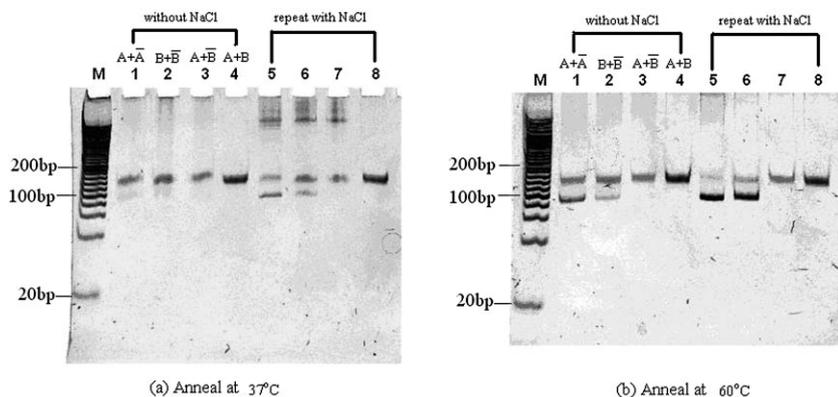


Figure 5. Gel electrophoresis of DNA samples annealed at 37°C (a) and 60°C (b) in 15% TBE gels. Lane M, 20-bp DNA ladder. Lanes 1 and 2, annealing products of A and A-bar, B and B-bar, respectively; lane 3, bubble DNA formed by annealing A and B-bar; lane 4, ssDNA A and B; lanes 5–8, repeat of lanes 1–4 annealing with 30–40 mM NaCl.

Table 4. Samples for testing the annealing conditions for ssDNA oligomers and their complements.

Sample component
1 1 μ L 1.87 μ M A + 3 μ L 0.55 μ M A-bar + 6 μ L nuclease-free water
2 1 μ L 1.86 μ M B + 2 μ L 0.72 μ M B-bar + 7 μ L nuclease-free water
3 1 μ L 1.87 μ M A + 2 μ L 0.72 μ M B-bar + 7 μ L nuclease-free water
4 1 μ L 1.87 μ M A + 1 μ L 1.86 μ M B + 8 μ L nuclease-free water
5 1 μ L 1.87 μ M A + 3 μ L 0.55 μ M A-bar + 6 μ L 50 mM NaCl
6 1 μ L 1.86 μ M B + 2 μ L 0.72 μ M B-bar + 7 μ L 50 mM NaCl
7 1 μ L 1.87 μ M A + 2 μ L 0.72 μ M B-bar + 7 μ L 50 mM NaCl
8 1 μ L 1.87 μ M A + 1 μ L 1.86 μ M B + 8 μ L 50 mM NaCl

tant factors to obtain dsDNA from random ssDNA and its complement.

3.4 Vector addition of two DNA vectors

To determine whether the basis vectors made of random strands are useful, we again tested the vector addition of two DNA vectors [19], but this time using our new random DNA basis vectors. Using the procedures described above, we obtained two basis vectors, which we label A and B, along with their complementary strands (A-bar and B-bar) and fluorescent probes. We define two vectors that we wished to add as V_1 and V_2 : $V_1 = A + 0.5B$, $V_2 = -0.5A + 0.25B = 0.5A\text{-bar} + 0.25B$, where the negative basis vector has been represented by the complement of the basis vector as discussed above. The sum of the two vectors is: $V_{\text{total}} = V_1 + V_2 = (A + 0.5B) + (0.5A\text{-bar} + 0.25B) = 0.5A + 0.5(A|A\text{-bar}) + 0.75B = 0.5A + 0.75B$, where the dsDNA (A|A-bar) is defined to be zero. Figure 6 shows the detailed vector addition in a 2-D coordinate system, in which distances along the positive X axis are proportional to the concentration of the basis vector A, whereas along the negative X axis the distances are proportional to the concentration of A-bar. A simi-

Table 5. Vectors detected using four fluorescent probes

Vector + probes	Results
1 $V_1 + A^*$	$A + 0.5B + A^*$
2 $V_1 + A^*\text{-bar}$	$(A A^*\text{-bar}) + 0.5B$
3 $V_1 + B^*$	$A + 0.5B + B^*$
4 $V_1 + B^*\text{-bar}$	$A + 0.5(B B^*\text{-bar}) + 0.5B^*\text{-bar}$
5 $V_2 + A^*$	$0.5(A\text{-bar} A^*) + 0.25B + 0.5A^*$
6 $V_2 + A^*\text{-bar}$	$0.5A\text{-bar} + 0.25B + A^*\text{-bar}$
7 $V_2 + B^*$	$0.5A\text{-bar} + 0.25B + B^*$
8 $V_2 + B^*\text{-bar}$	$0.5A\text{-bar} + 0.25(B B^*\text{-bar}) + 0.75B^*\text{-bar}$
9 $V_{\text{total}} + A^*$	$0.5A + 0.5(A A\text{-bar}) + 0.75B + A^*$
10 $V_{\text{total}} + A^*\text{-bar}$	$0.5(A A^*\text{-bar}) + 0.5A^*\text{-bar} + 0.5(A A\text{-bar}) + 0.75B$
11 $V_{\text{total}} + B^*$	$0.5A + 0.5(A A\text{-bar}) + 0.75B + B^*$
12 $V_{\text{total}} + B^*\text{-bar}$	$0.5A + 0.5(A A\text{-bar}) + 0.75(B B^*\text{-bar}) + 0.25B^*\text{-bar}$

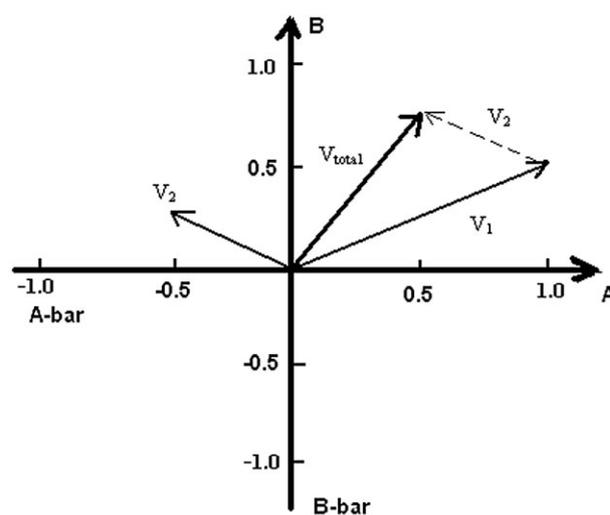


Figure 6. Addition of two vectors using the representation in DNA basis vector space. Two basis vectors A and B are represented by DNA strands amplified by the asymmetric PCR. $V_1 = A + 0.5B$, $V_2 = -0.5A + 0.25B$ and $V_{\text{total}} = 0.5A + 0.75B$.

Table 6. Concentration of basis vectors, and their complements and fluorescent probes for the vector addition experiment

	A	A-bar	B	B-bar	A*	A*-bar	B*	B*-bar
Concentration (μM)	2.43	0.9	1.88	1.15	0.34	0.48	0.4	0.48
Volume for 1 U (μL)	0.62	1.66	0.8	1.3	4.45	3.12	3.76	3.15

Table 7. Basis vector composition of three vectors^{a)}

$8V_1$	8A+4B	4.96 μL A+ 3.2 μL B +1 μL 1 M NaCl +10.84 μL N-water
$8V_2$	4A-bar+2B	6.64 μL A-bar+ 1.6 μL B+ 1 μL 1 M NaCl +10.76 μL N-water
$4V_{\text{total}}$	$4V_1 + 4V_2$	2.48 μL A+3.32 μL A-bar+2.4 μL B+ 1 μL 1 M NaCl + 10.8 μL water

a) N-water, nuclease-free water.

lar convention holds for the Y axis. Table 5 shows how to test three vectors with four probes A*, A*-bar, B* and B*-bar. The letters with stars represent fluorescent probes, with A*, A*-bar, B* and B*-bar being the complements of A-bar, A, B-bar and B, respectively, but with two extra bases and TET molecules dangling at the 5' end.

Table 6 shows the concentration of eight ssDNA molecules used in this experiment. We defined 1.5 pmol as 1 U and calculated the volume of 1 U of different DNA strands. First, $8V_1$ and $8V_2$ are made as shown in Table 7. Then $4V_{\text{total}}$ is made by mixing half of $8V_1$ and half of $8V_2$ together. Nuclease-free water (10 μL) was added to $4V_1$ and $4V_2$ (final volume 20 μL). All the samples were then incubated at 60°C for 1 h; 13 samples were made (as shown in Table 8) and samples 1–12 were incubated at 60°C for 1 h. After being mixed with 1 \times loading buffer, all of these materials were loaded onto a 15-well 15% TBE gel. The electrophoresis was run at 107 V and 40°C for 80 min. The fluorescence image of the TET-labeled DNA shown in Fig. 7 was taken with the excitation of a 15-mW 514-nm laser.

In Table 5, samples 1, 3, 6, 7, 9 and 11 contain only ssDNA probes, so only the ssDNA bands can be seen. The signals in the corresponding lanes in Fig. 7A support our prediction. Samples 2, 4, 5, 8, 10 and 12 contain dsDNA formed by normal ssDNA and probes, which correspond to the fluorescence signals in Fig. 7A. Those thickest bands near the top of the gel in lanes 2, 4, 6, 7, 10 and 12 may be clusters formed by the reaction between probe-bar and non-complement DNA or between DNA-bar and non-complement probe. The ssDNA band in lane 2 may come from the excess amount of A*-bar. From Table 5, the amount of ssDNA B*-bar and dsDNA (B|B*-bar) in sample 4 is equal, which matches well with the signals in lane 4 of Fig. 7A. The theoretical prediction of the ratio of ssDNA A* to dsDNA (A-bar|A*) of sample 5 is 1:1; however, the signal of ssDNA is apparently stronger than that of dsDNA in lane 5, which may be caused by the excess

Table 8. Samples for detecting addition results using four fluorescence probes

1	5 μL V_1 +4.45 μL A* + 0.5 μL 1 M NaCl + 5.05 μL water
2	5 μL V_1 +3.12 μL A*-bar + 0.5 μL 1 M NaCl + 6.38 μL water
3	5 μL V_1 +3.76 μL B* + 0.5 μL 1 M NaCl + 5.74 μL water
4	5 μL V_1 +3.15 μL B*-bar + 0.5 μL 1 M NaCl + 6.35 μL water
5	5 μL V_2 +4.45 μL A* + 0.5 μL 1 M NaCl + 5.05 μL water
6	5 μL V_2 +3.12 μL A*-bar + 0.5 μL 1 M NaCl + 6.38 μL water
7	5 μL V_2 +3.76 μL B* + 0.5 μL 1 M NaCl + 5.74 μL water
8	5 μL V_2 +3.15 μL B*-bar + 0.5 μL 1 M NaCl + 6.35 μL water
9	5 μL V_{total} +4.45 μL A* + 0.5 μL 1 M NaCl + 5.05 μL water
10	5 μL V_{total} +3.12 μL A*-bar + 0.5 μL 1 M NaCl + 6.38 μL water
11	5 μL V_{total} +3.76 μL B* + 0.5 μL 1 M NaCl + 5.74 μL water
12	5 μL V_{total} +3.15 μL B*-bar + 0.5 μL 1 M NaCl + 6.35 μL water
13	3 μL 1 μM TET-prime L20

probes A*. The theoretical prediction of the ratio between B* and (B|B*-bar) of sample 8 is 3:1, and the ratio between the intensity of ssDNA signal and that of dsDNA signal matches well. The theoretical prediction of the ratio between A*-bar and (A|A*-bar) of sample 10 is 1:1, but the signal of ssDNA is weaker than that of dsDNA. It may be that some A*-bar and ssDNA B formed the cluster DNA shown at the top of lane 10 due to the alternative opening and closing states of bubble-dsDNA structures, which are easily trapped in the gel. The theoretically predictable ratio between (B|B*-bar) and B*-bar of sample 12 is 3:1, but the ratio between these two bands in lane 12 is slightly smaller, because some of probes B*-bar react with A and form longer DNA clusters that can be seen at the top of lane 12. The intensities of dsDNA in lanes 2, 4, 5, 8, 10 and 12 of Fig. 7A indicate the components of A of V_1 , B of V_1 , A-bar of V_2 , B of V_2 , A of V_{total} , and B of V_{total} , respectively. By integrating the intensity of these dsDNA signals, and dividing them by the intensity of A of V_1 , the normalized components were obtained as $V_1=1A+0.62B$, $V_2=-0.28A+0.25B$ and $V_{\text{total}}=0.51A+0.88B$ shown in Fig. 7B. The theoretical and experimental data were plotted in Fig. 7C.

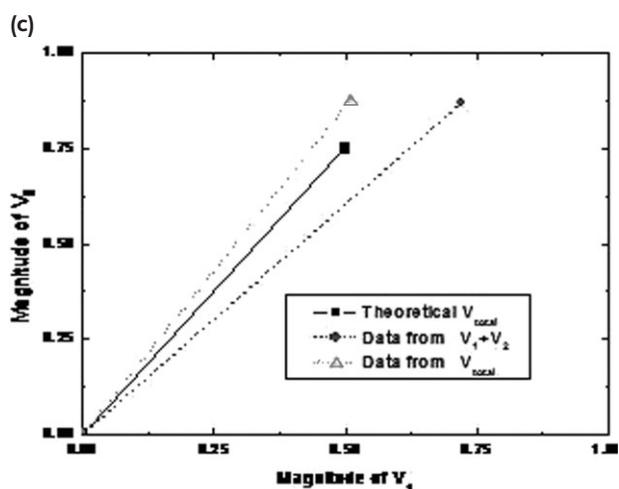
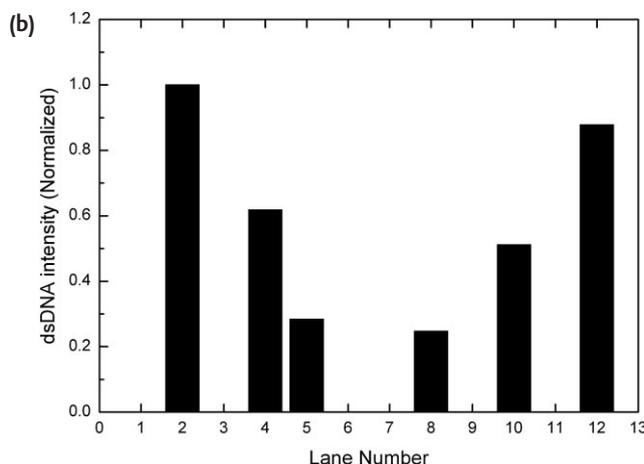
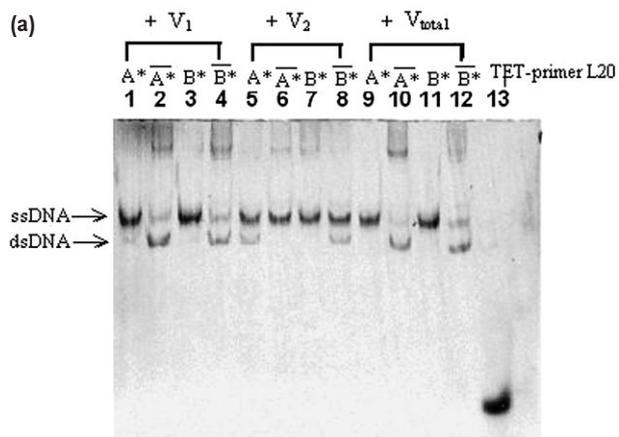


Figure 7. Fluorescence images of vectors using a 15-mW 514-nm laser. The electrophoresis was run at 107 V and 40°C for 80 min. (a) Lanes 1–4, fluorescence signal of V_1 detected using A^* , A^* -bar, B^* and B^* -bar, respectively. Lanes 5–8, fluorescence signal of V_2 detected using A^* , A^* -bar, B^* and B^* -bar, respectively. Lanes 9–12, fluorescence signal of V_{total} using A^* , A^* -bar, B^* and B^* -bar, respectively. Lane 13, 3 pmol 22-base TET primer L20. (b) The normalized intensities. Experimental results are $V_1=1A + 0.62B$, $V_2=-0.28A + 0.25B$ and $V_{total}=0.51A + 0.88B$ obtained directly from the fluorescence signals. (c) The plot of theoretical value $V_{total}=0.5A + 0.75B$, data from the numerical sum of the separate intensities measured for V_1 and V_2 and data from the DNA vector sum V_{total} .

The results indicate that the theoretical value and experimental value fit well.

To further investigate the theoretical prediction, the gel was stained in SYBR Gold solution for 40 min and the image shown in Fig. 8 was taken with 312-nm UV light. The overall trend in Fig. 8 is similar to that in Fig. 7. Samples 1, 3, 6, 7 and 13 contain only ssDNA, which can be seen in lanes 1, 3, 6, 7 and 13 of Fig. 8. The others contain dsDNA and can be seen in the corresponding lanes in Fig. 8. In lanes 2 and 4, only dsDNA bands can be seen because most of ssDNA formed DNA clusters at the top band. In lanes 5 and 8, both a dsDNA and ssDNA band are seen and their intensity is approximately equal because more SYBR Gold binds to dsDNA than to an equal length of ssDNA. In lanes 9 and 11, the intensity of ssDNA is stronger than that of dsDNA because the amount of dsDNA is much less than that of ssDNA. In lane 12, the amount of dsDNA is much larger than that of ssDNA so that the intensity of dsDNA is much stronger than that of ssDNA. Thus, vector addition

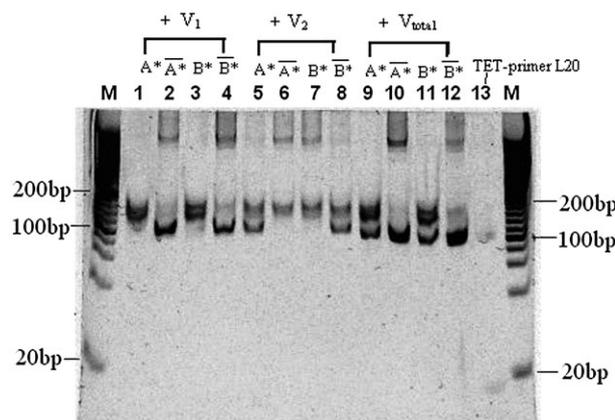


Figure 8. Gel images of vectors using 312-nm UV light after SYBR Gold gel stain. The electrophoresis was run at 107 V and 40°C for 80 min. Lane M, 20-bp DNA ladder. Lanes 1–4, SYBR Gold signal of V_1 with A^* , A^* -bar, B^* and B^* -bar, respectively. Lanes 5–8, SYBR Gold signal of V_2 with A^* , A^* -bar, B^* and B^* -bar, respectively. Lanes 9–12, SYBR Gold signal of V_{total} with A^* , A^* -bar, B^* and B^* -bar, respectively. Lane 13, 22-base ssDNA TET-primer L20.

can be implemented by random DNA strands from PCR and asymmetric PCR.

Comparing these results with the similar earlier experiment on vector addition [19] using DNA unit vectors supplied by a commercial vendor using solid state synthesis, the results of the previous experiment exhibited deviations from perfect addition amounting to 10–40% of the expected vector increments, but were qualitatively the same as the results obtained in the present work. The inaccuracies may be attributed to uncertainties in pipetting small volumes of liquid and in imprecisely known concentrations of the DNA components.

4 Concluding remarks

Here we proposed a method to obtain large numbers of different DNA oligomer samples that are relatively inexpensive and unlikely to hybridize with each other. Samples containing only 30 random molecules were successfully amplified using PCR. These multiplicities of 30 molecules were further amplified using asymmetric PCR to give useful quantities of DNA oligomers that may be utilized as basis vectors for matrix operations. The basis vectors are thus represented by solutions of ssDNA oligomers and their complements. Starting with two basis vectors and their complements, we constructed two vectors, the amplitudes of which were proportional to the concentrations of the basis vectors. The two vectors were added by mixing their representative solutions, and vector sum so formed agreed to within 25% of the expected vector sum. We conclude that our random amplicons are able to implement some of the vector operations that will be required in a DNA implementation of an analog neural network.

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