

## **Cello: genetic circuit design automation**

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### **Abstract**

DNA is the single most important part of all the organisms present on the planet. It consists of the genetic instructions used in the functioning, growth, and development of all known living organisms. Due to this, to study biological architecture, we need to perform computations in living cells by DNA-encoded circuits which indeed process sensory information and control all the biological functions. But due to the various complexions like time and design, these computations become close to impossible. Thus to tackle this problem, we study Cello[4], which serves as a design environment where the user gives a Verilog code as input that is automatically transformed into a DNA sequence providing a genetic circuit design.

### **Introduction**

You could say "I want a cell that can detect certain elements in water and provide different color output signals. Also, the output signals generated should correlate to the concentration of the elements specified detected." These are the types of problems which could be efficiently simulated by Cello. Cello is a web based open source tool that is used to build genetic circuit diagrams. It's a joint initiative between Boston University and MIT, initiated by the CIDAR lab at Boston.[5]

Its input consists of a Verilog script. This script is then parsed into a truth table which is further synthesized to generate a genetic circuit diagram with the genetically available gate types in the library. For simulating the circuit, a predicted score guides a breadth-first search or a Monte Carlo simulated annealing search. Among all the predicted scores, the one with the highest score is selected. The one which is selected could then be implemented using the various genetic layouts. For finalizing among one or more DNA sequences for the designated circuit, the Eugene language is used which further processes upon the rule based combinatorial design.

To briefly analyze Cello, firstly, we start with the actual/internal working of cello and begin to visualize how the Verilog input is converted to a desired genomic circuit. Later we look into an example and find out the various functionalities provided by the web app.

## Working

### VERILOG SPECIFICATION

When opening the website <http://www.cellocad.org/verilog.html>, we are greeted with a text editor which enables us to input the Verilog script. Cello accepts three forms of Verilog scripts namely case statements, assign statements and structural statements. The Verilog programs usually start with module keyword, followed by the name taking a list of output and input wire names as its arguments. We now focus on all the three specified Verilog types.

1. Case: This style is usually preferred when we directly want to specify the truth table for our circuit as shown in figure 1.

in1	in2	out1
0	0	0
0	1	1
1	0	1
1	1	0

```
module XOR(output out1, input in1, in2);
  always@(in1,in2)
  begin
    case({in1,in2})
      2'b00: {out1} = 1'b0;
      2'b01: {out1} = 1'b1;
      2'b10: {out1} = 1'b1;
      2'b11: {out1} = 1'b0;
    endcase
  end
endmodule
```

2. Assign: This style is usually preferred when we want to specify circuit using boolean operators. For detailing the order of operations, parentheses are used. One thing should be noted that all the internal wires must be defined before use as shown in figure 2.

```
module XOR(output out1, input in1, in2);
  wire w1, w2;
  assign w1 = ~in1 & in2;
  assign w2 = in1 & ~in2;
  assign out1 = w1 | w2;
endmodule
```

3. Structural: This style is usually preferred when we want a gate-level wiring diagram to be specified. Again all the internal wires need to be defined before use as shown in figure 3. Here, within, the parenthesis, the first argument is the output wire and all the other trailing arguments are the inputs. The symbol at the beginning of each line is an operator.

```

module XOR(output out1, input in1, in2);
  wire w1, w2, w3, w4;
  not (w1, in1);
  not (w2, in2);
  not (w3, in1, w2);
  not (w4, in2, w1);
  or (out1, w3, w4);
endmodule

```

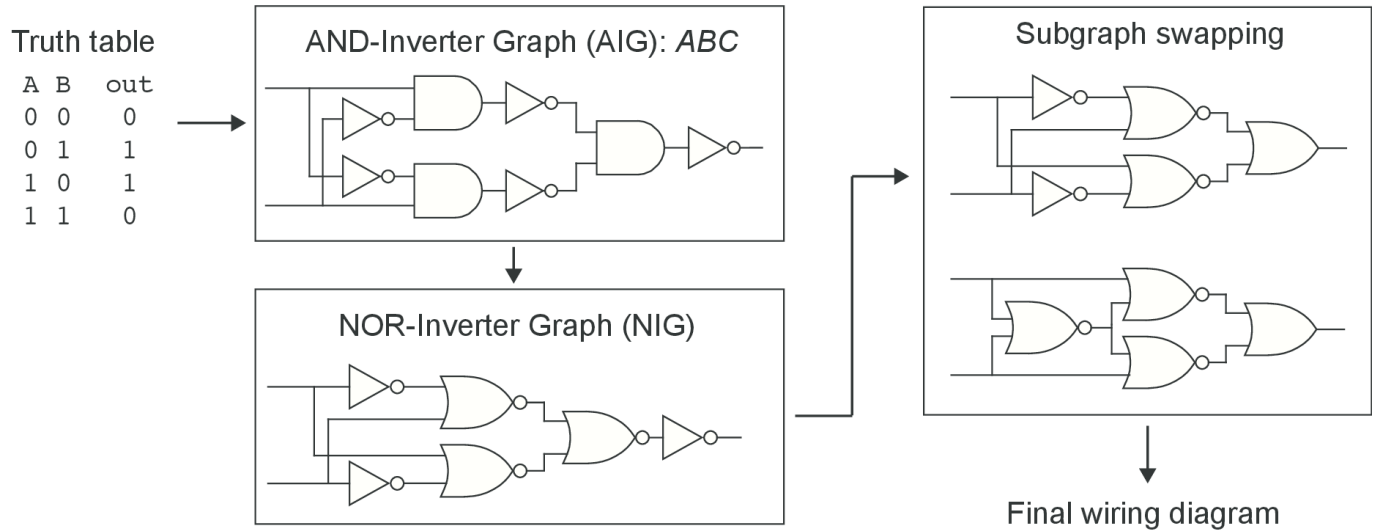
By providing the Verilog input in any of the above three designs, we then move onto the logical synthesis step.

## LOGIC SYNTHESIS

The Verilog script is then parsed to generate a truth table. The truth table is then converted to the final wiring diagram in the following steps.

1. AND-Inverter Graph: The table is converted to an AND-Inverted graph consisting of 2-input AND gates and NOT gates.
2. NOR-Inverter Graph: The above is then converted to a NOR-Inverter Graph using DeMorgan's rule
3. Subcircuit substitutions: The above is then simplified and further substituted with smaller but functionally equivalent logic diagrams in order to reduce the number of gates. In this step, other gate types can also be included.[3]

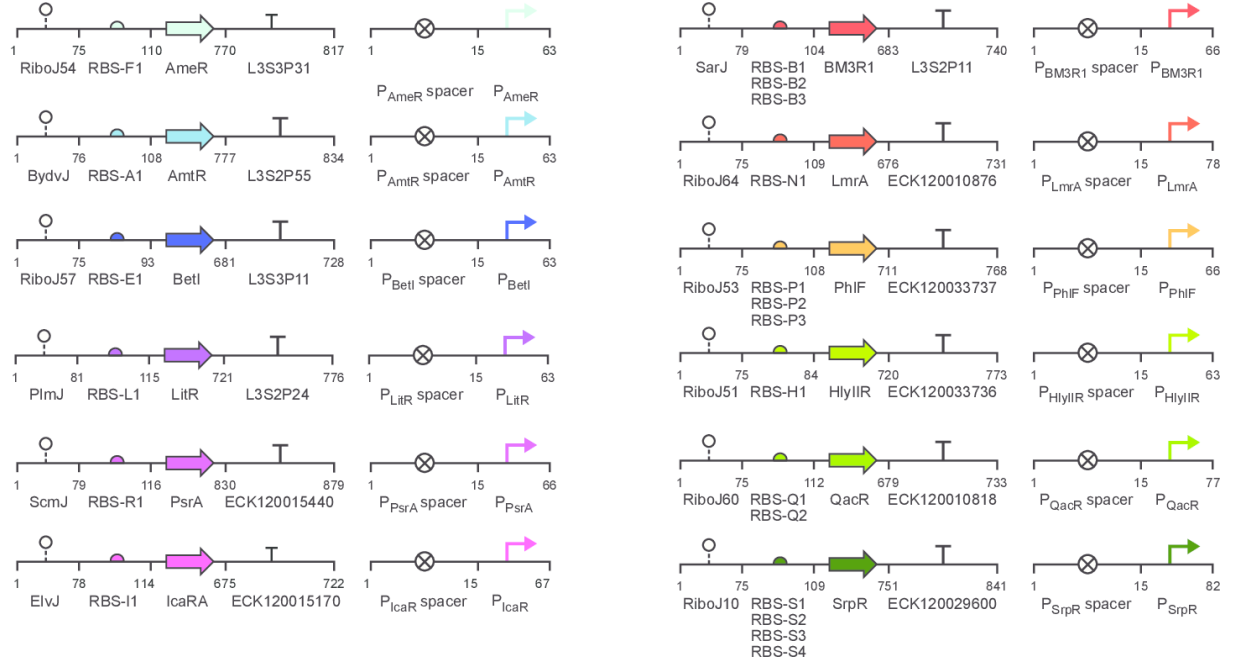
The above process is better described in the figure shown below in figure .



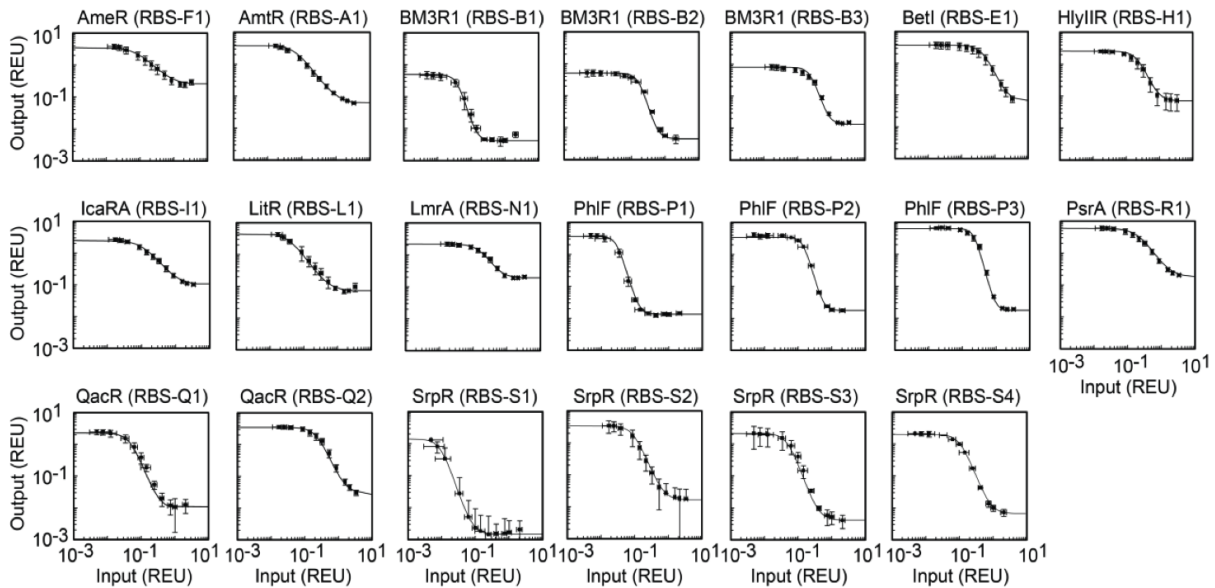
After creating the simplified wiring diagram, we then assign gates to the diagram from the Cello library as per specification detailed in the next subsection.

## GATE ASSIGNMENT

Some basic gates in the gate library are shown below in figure . If we want to add other gates to our library, we can add those using the UCF



All the gates shown above have an experimentally determined response function that relates one or more input values to an output value which is specified in standardized units (RPU = Relative Promoter Units). These response functions are then fitted to a Hill function which takes ymax, ymin, K,n as its 4 arguments. The response functions of the above figured gates are shown below in figure :



But still, the main question remains as to how do we assign gates to all the elements in the circuit. This assignment is done using the following assignment algorithms.

1. Breadth-first search: This algorithm guarantees to select a genetic circuit with a global max score among all other assignments. It starts with the gates which are closest to the inputs. The algorithm then goes one gate at a time where signal mismatches are faulty. For each acceptance in the traversal then next breadth first order gate is exhaustively assigned following the same procedure again until all the gates have been visited. After the completion, the circuit with the highest assignment score is selected. [3]
2. Hill climbing: This algorithm starts with a random assignment, and then swapping the assignment of 2 gates. Over here, gate 1 is randomly selected from the circuit to process and gate 2 is selected from the circuit or the gates which are left unused in the gate library for cello. The above specified swap is accepted if the initially initialized circuit score increases. After running this extensively on the whole circuit, the circuit with the highest assignment score is selected.[3]
3. Simulated annealing: This is same as hill climbing except from the difference that the swaps that decrease circuit score with a probability that recombines/anneals over time are selected.[3]

Now for a given assignment, we can have a lot of combination of the arranging the genetic parts into physical diagrams. This problem is solved and assessed using the Eugene specification. The final DNA sequences that result from the Eugene variants is then placed into the genomic locations specified in the earlier describes UCF.

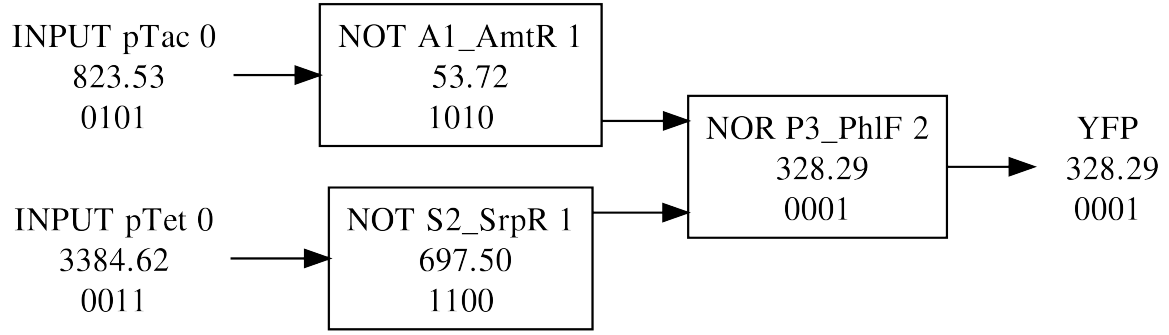
## Example

Now let us take a verilog script and run it on cello webapp to find out the various logs and outputs provided by the software.[2]

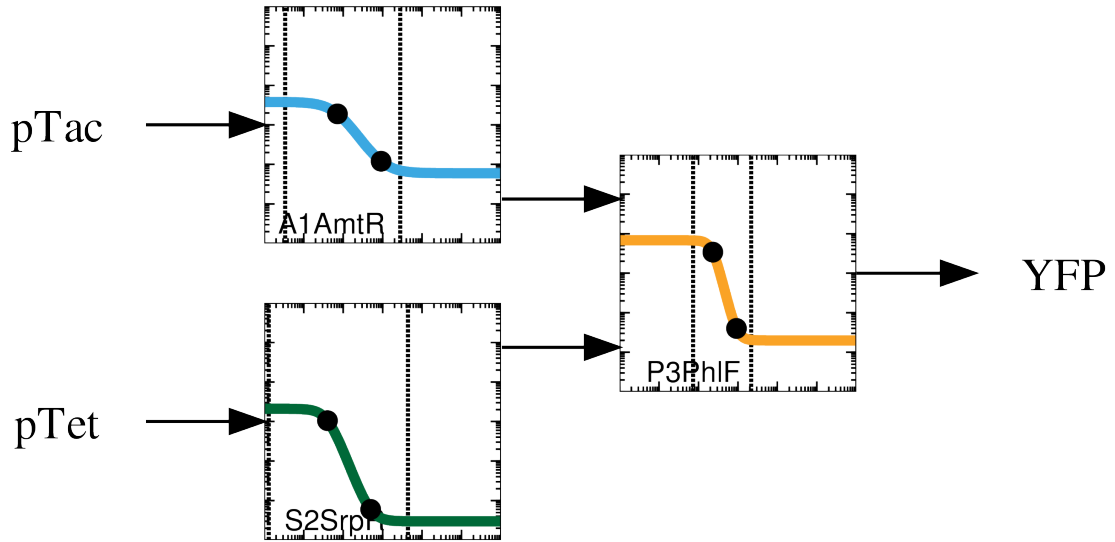
### input Verilog

```
module A(output out1, input in1, in2);
  always@(in1,in2)
  begin
    case({in1,in2})
      2'b00: {out1} = 1'b0;
      2'b01: {out1} = 1'b0;
      2'b10: {out1} = 1'b0;
      2'b11: {out1} = 1'b1;
    endcase
  end
endmodule
```

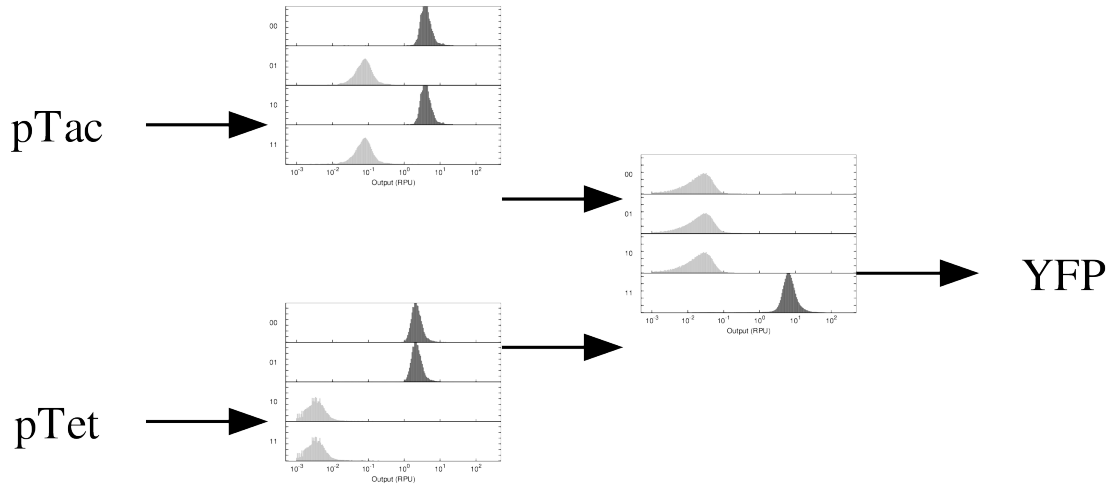
On running the above case script in figure for AND gate and selecting the inputs as pTac and pTet along with the output as RPF, we firstly get the following gate assignment after its logical synthesis as shown below in figure :



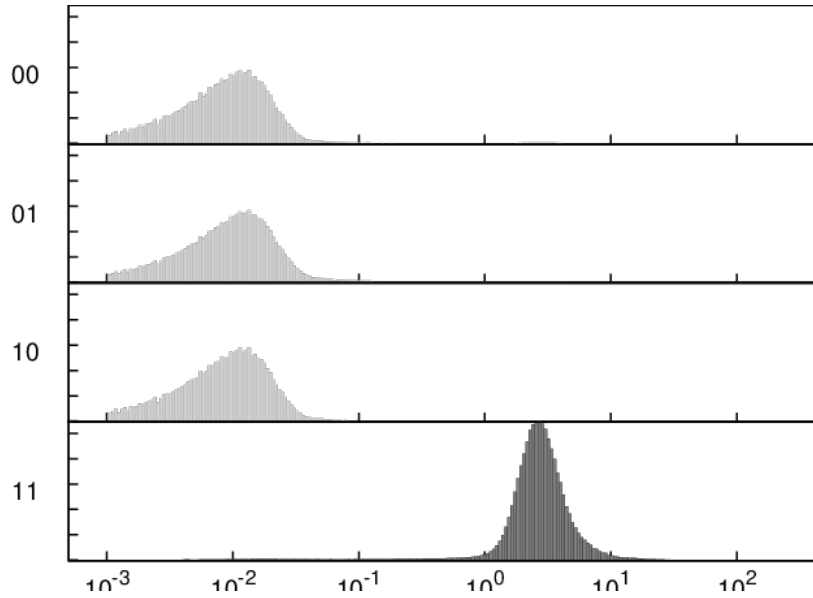
The Response function of the above gate assignment circuit is shown below in figure :



As stated before, in the gate assignment subsection, all the gates have a predefined output in RPU's(Relative Promoter Units). For the circuit, we see the predicted RPU's of the gates as shown below in figure .

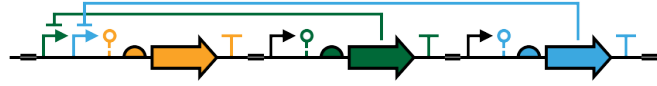


On providing the assignment algorithms we get the predicted gate output as shown below in figure :



The final circuit diagram created by the software is shown below in figure after processing through the Eugene rules.

In all the steps shown above, log files are also generated which further provide a detailed understanding of all the above steps as simulated by the Cello software. In the end we are greeted with sbol and plasmid log files which are indeed the results that we needed. Some snapshots of the logs files are attached below for reference



LOCUS	test1_AND_A000_plasmid_circuit_P000	7741 bp ds-DNA	circular	05-Mar-2017
FEATURES	Location/Qualifiers			
backbone	1..53			
	/label=backbone			
	/ApEinfo_fwdcolor=pink			
	/ApEinfo_revcolor=pink			
scar	54..57			
	/label=Escar			
	/ApEinfo_fwdcolor=gray			
	/ApEinfo_revcolor=gray			
promoter	58..139			
	/label=p5rPr			
	/ApEinfo_fwdcolor=green			
	/ApEinfo_revcolor=green			
promoter	140..202			
	/label=pAmR			
	/ApEinfo_fwdcolor=green			
	/ApEinfo_revcolor=green			
ribozyme	203..281			
	/label=RiboJ53			
	/ApEinfo_fwdcolor=magenta			
	/ApEinfo_revcolor=magenta			
rbs	282..299			
	/label=P3			
	/ApEinfo_fwdcolor=blue			
	/ApEinfo_revcolor=blue			
cds	300..902			
	/label=PhlF			
	/ApEinfo_fwdcolor=cyan			
	/ApEinfo_revcolor=cyan			
terminator	903..959			
	/label=ECK120033737			
	/ApEinfo_fwdcolor=red			
	/ApEinfo_revcolor=red			
scar	960..963			
	/label=Xscar			
	/ApEinfo_fwdcolor=gray			
	/ApEinfo_revcolor=gray			
promoter	964..1037			

rbs	2042..2075	/label=A1	
		/ApEinfo_fwdcolor=blue	
		/ApEinfo_revcolor=blue	
cds	2076..2744	/label=AmtR	
		/ApEinfo_fwdcolor=cyan	
		/ApEinfo_revcolor=cyan	
terminator	2745..2801	/label=L3S2P55	
		/ApEinfo_fwdcolor=red	
		/ApEinfo_revcolor=red	
scar	2802..2805	/label=Cscar	
		/ApEinfo_fwdcolor=gray	
		/ApEinfo_revcolor=gray	
backbone	2806..5882	/label=sensor_module	
		/ApEinfo_fwdcolor=pink	
		/ApEinfo_revcolor=pink	
backbone	5883..7741	/label=backbone	
		/ApEinfo_fwdcolor=pink	
		/ApEinfo_revcolor=pink	

ORIGIN

1	CCAATTATTG	AAGGCCCTCC	TAACGGGGGG	CCTTTTTTTG	TTTCTGGTCT	CCGctttTCT
61	ATGATTGGTC	CAGATTCTGT	ACCAATTGAC	AGCTAGCTCA	GCTCTAGGTA	TATACATACA
121	TGCTTGTGTTG	TTTGTAAACC	TTGTCCAACC	AAATGATTGC	TATCCAAATTG	ACAGTTTCTTA
181	TCGATCTATA	GATAATGCTA	GCCTGAAGCG	GTCACGCAT	GTGCTTTTGC	TTCTGATGAG
241	ACAGTGATGT	GAATAACGCC	TCTACAAATA	ATTTTGTTTA	ACTTTTACGAG	GGCGATCCTTA
301	TGGCACGTAC	CCCGAGCCGT	AGCAGCATTG	GTAGCTCGCG	TAGTCCGACT	ACCCATAAAG
361	CAATTCTGAC	CAGCACCATT	GAAATCCTGA	AAGAAATGTGG	TTATAGCTG	CTGACATTG
421	AAAGCGTTGC	ACGTCGTGCC	GGTGCAAGCA	AACCGACCAT	TTATCGTTGG	TGGACCAATA
481	AAGCAGCACT	GATTGCCGAA	GTGTATGAAA	ATGAAAGCGA	ACAGGTGCGT	AAATTTCGCG
541	ATCTGGGTAG	CTTTAAAGCC	GATCTGGATT	TTCTGCTGCG	GAAGTGTGGG	AAAGTTTCCGG
601	GTGAAACCAT	TTGTGGTGAA	GCATTTCGTT	GTGTTATTGC	AGAAGCACAG	CTGACCCTTG
661	CAACCTGAC	CCAGCTGAAA	GATCAGTTTA	TGGAAAGCTG	TCGTGAGATG	CCGAAAAAAG
721	TGGTTGAAAA	TGCCATTAGC	AATGGTGAAC	TGCCGAAAGA	TACCAATCGT	GAAGTCTGCG
781	TGGATATGAT	TTTGGTTTTT	TGTTGGTATC	GCTCTGCTAC	CGAAGACAGT	ACCGTTGAAC
841	AGGATATTGA	AGAATTTACC	TTCTGTCTGA	TTAATGGTGT	TTGTCCGGGT	ACACAGCGCT

## Discussions

The environment surrounding a cells allows it to respond to make decisions, coordinate tasks and build structures. Coordinating all these processes are computational operations performed by dense networks of proteins that control the timing of gene expression. Through research[1] it has been shown that cells ca programmed using synthetic circuits composed of regulators organised to generate the desired operation.

One such enthusiastic group applied Cello to design 60 circuits of Escherichia coli. Here, the circuit function was specified using Verilog script and then further converted into a DNA sequence. These DNA sequences required 8,80,000 base pairs of DNA assembly without any additional tuning. Out of these, 45 circuits performed correctly in every given output state. Across all of the implementations



92 percent of the 412 output states functioned as predicted. Some detailed visuals of the experiment as shown below:

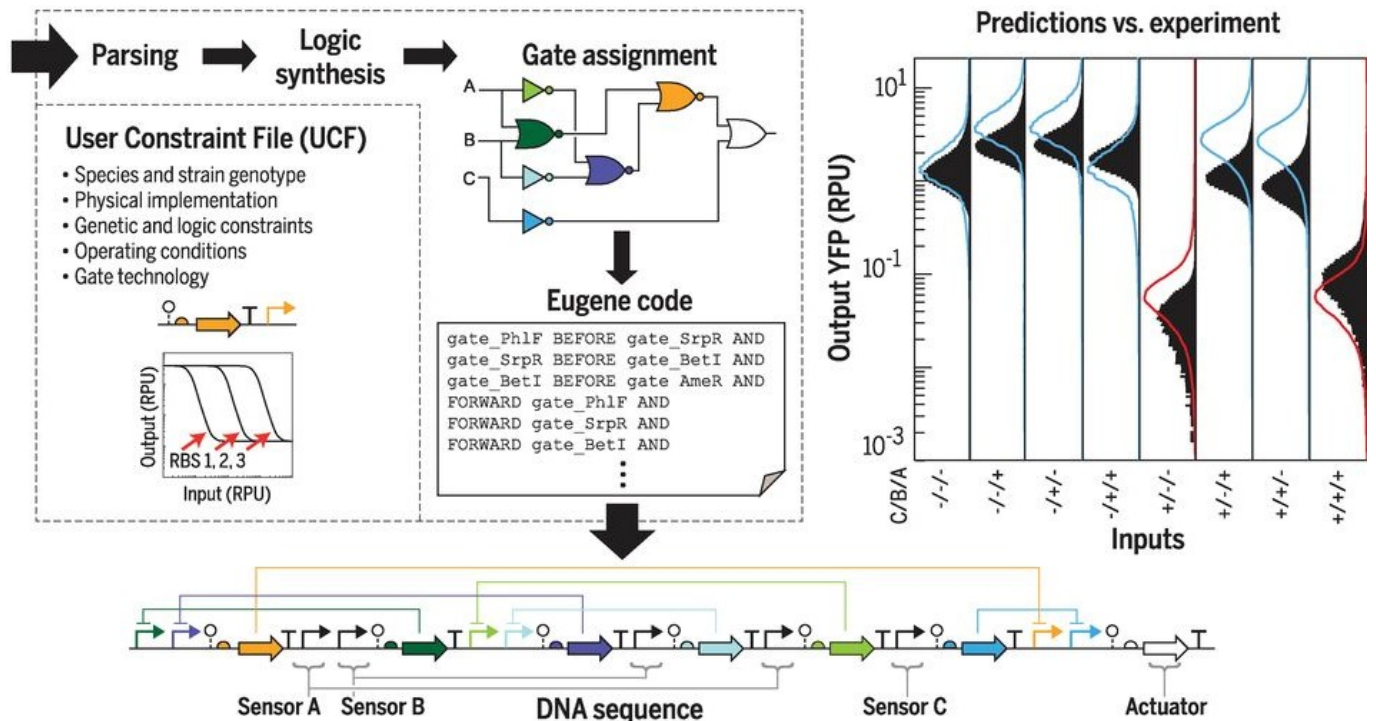
Sensors			
name	low	high	promoter sequence
A	0.003	2.8	AACGATCGTTGGCTGTGTTGACAATT
B	0.001	4.4	TACTCCACCGTTGGCTTTTTTCCCTA
C	0.008	2.5	ACTTTTCATACTCCCGCATTTCAGAG

Verilog			
<pre> module 0xF6(output out, input A,B,C);  always@(C,B,A) begin     case({C,B,A})         3'b000: {out} = 1'b1;         3'b001: {out} = 1'b1;         3'b010: {out} = 1'b1;         3'b011: {out} = 1'b1;         3'b100: {out} = 1'b0;         3'b101: {out} = 1'b1;         3'b110: {out} = 1'b1;         3'b111: {out} = 1'b0;     endcase end endmodule </pre>			

Actuators	
name	sequence
YFP	ATGGTGAGCAAGGGCGAGGAGCTGTTACCGGGGT



## References

- [1] Genetic circuit design automation, nielsen, a. a. k., der, b. s., shin, j., vaidyanathan, p., paralanov, v., strychalski, e. a., ross, d., densmore, d. and voigt, c. a., 2016.
- [2] Cellocad. Cellocad, 2017.
- [3] Cidarlab/Cello. Cello, 2016.
- [4] ncbiRefs. Genetic circuit design automation. - pubmed - ncbi, 2016.
- [5] Reddit/cerenity. Mit develops cello, 2016.