

RESEARCH ARTICLE SUMMARY

SYNTHETIC BIOLOGY

#### Design and synthesis of a minimal bacterial genome

Clyde A. Hutchison III, \*† Ray-Yuan Chuang, † Vladimir N. Noskov, Nacyra Assad-Garcia, Thomas J. Deerinck, Mark H. Ellisman, John Gill, Krishna Kannan, Bogumil J. Karas, Li Ma, James F. Pelletier, Zhi-Qing Qi, R. Alexander Richter, Elizabeth A. Strychalski, Lijie Sun, Yo Suzuki, Billyana Tsvetanova, Kim S. Wise, Hamilton O. Smith, John I. Glass, Chuck Merryman, Daniel G. Gibson, J. Craig Venter\*

INTRODUCTION: In 1984, the simplest cells capable of autonomous growth, the mycoplasmas, were proposed as models for understanding the basic principles of life. In 1995, we reported the first complete cellular genome sequences (Haemophilus influenza, 1815 genes, and Mucoplasma genitalium, 525 genes). Comparison of these sequences revealed a conserved core of about 250 essential genes, much smaller than either genome. In 1999, we introduced the method of global transposon mutagenesis and experimentally demonstrated that M. genitalium contains many genes that are nonessential for growth in the laboratory, even though it has the

smallest genome known for an autonomously

RATIONALE: Since the first genome sequences, there has been much work in many bacterial models to identify nonessential genes and

replicating cell found in nature. This implied that it should be possible to produce a minimal cell that is simpler than any natural one. Whole genomes can now be built from chemically synthesized oligonucleotides and brought to life by installation into a receptive cellular environment. We have applied whole-genome design and synthesis to the problem of minimizing a cellular genome.

define core sets of conserved genetic functions, using the methods of comparative genomics. Often, more than one gene product can perform a particular essential function. In such cases, neither gene will be essential and neither will necessarily be conserved. Consequently, these approaches cannot, by themselves, identify a set of genes that is sufficient to constitute a viable genome. We set out to define a minimal cellular genome experimentally by designing and building one, then testing it for viability. Our goal is a cell so simple that we can determine the

> RESULTS: Whole-genome design and synthesis were used to minimize the 1079-kilobase pair (kbp) synthetic genome of M. mucoides JCVI-syn1.0. An initial design, based on collective knowledge of molecular biology in combination

molecular and biological function of every gene.

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with limited transposon mutagenesis data, failed to produce a viable cell. Improved transposon mutagenesis methods revealed a class of quasi-essential genes that are needed for

robust growth, explaining the failure of our initial design. Three more cycles of design, synthesis, and testing, with retention of quasiessential genes, produced JCVI-syn3.0 (531 kbp, 473 genes). Its genome is smaller than that of any autonomously replicating cell found in nature. JCVI-syn3.0 has a doubling time of ~180 min, produces colonies that are morphologically similar to those of JCVI-syn1.0, and appears to be polymorphic when examined microscopically.

CONCLUSION: The minimal cell concept appears simple at first glance but becomes more complex upon close inspection. In addition to essential and nonessential genes, there are many quasi-essential genes, which are not absolutely critical for viability but are nevertheless required for robust growth. Consequently, during the process of genome minimization, there is a trade-off between genome size and growth rate. JCVI-syn3.0 is a working approximation of a minimal cellular genome, a compromise between small genome size and a workable growth rate for an experimental organism. It retains almost all the genes that are involved in the synthesis and processing of macromolecules. Unexpectedly, it also contains 149 genes with unknown biological functions, suggesting the presence of undiscovered functions that are essential for life. JCVI-syn3.0 is a versatile platform for investigating the core functions of life and for exploring whole-genome design.

The list of author affiliations is available in the full article online. Corresponding author. E-mail: chutchis@jcvi.org (C.A.H.); cventer@jcvi.org (J.C.V.) These authors contributed equally to this work. Cite this article as C. A. Hutchison III et al., Science 351,

sciencemag.org SCIENCE

aad6253 (2016), DOI: 10.1126/science.aad6253

JCVI-syn1.0 1,078,809 bp 531,490 bp 0 Cloning JUVI- Syn30

Four design-build-test cycles produced JCVI-syn3.0

(A) The cycle for genome design, building by means of synthesis and cloning in yeast, and testing for viability by means of genome transplantation. After each cycle, gene essentiality is reevaluated by global transposon mutagenesis. (B) Comparison of JCVI-syn1.0 (outer blue circle) with JCVI-svn3.0 (inner red circle). showing the division of each into eight segments. The red bars inside the outer circle indicate regions that are retained in JCVI-syn3.0. (C) A cluster of JCVI-syn3.0 cells, showing spherical structures of varying sizes (scale bar, 200 nm)



1414 25 MARCH 2016 • VOL 351 ISSUE 6280

LETTER

NATURE 509 (19385-388), 2014)

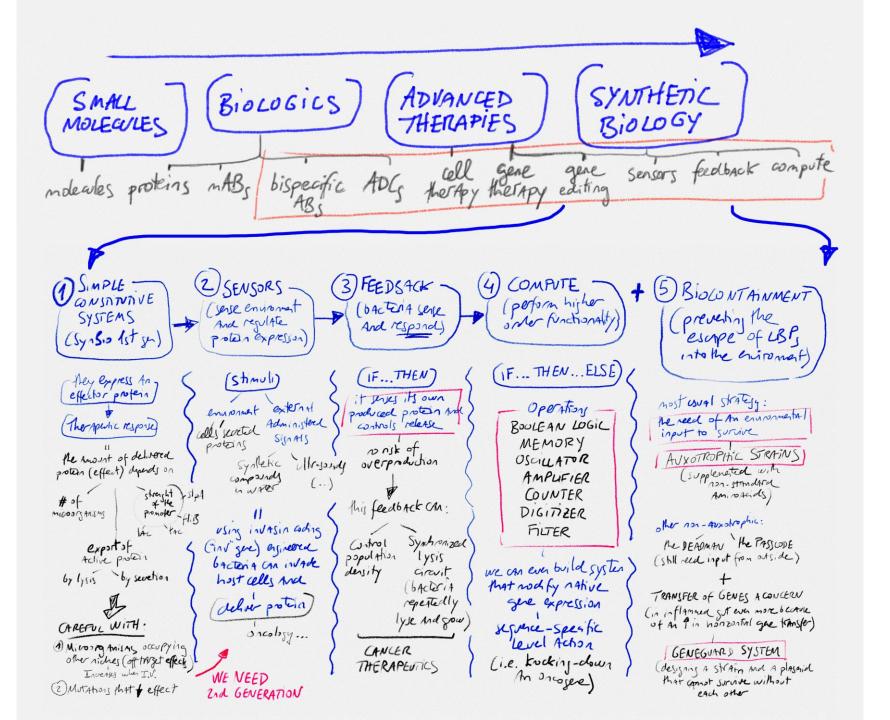
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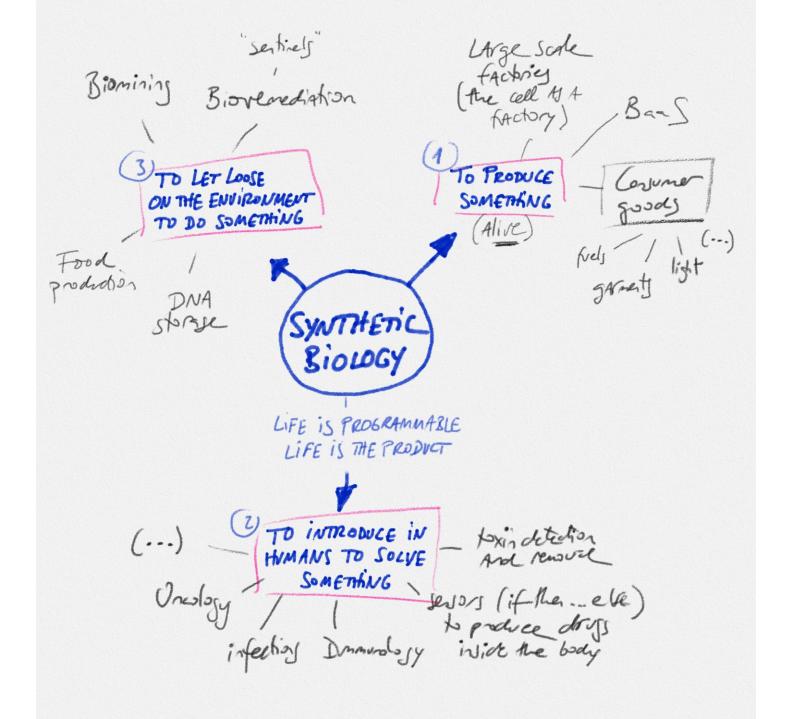
## A semi-synthetic organism with an expanded genetic alphabet

Denis A. Malyshev<sup>1</sup>, Kirandeep Dhami<sup>1</sup>, Thomas Lavergne<sup>1</sup>, Tingjian Chen<sup>1</sup>, Nan Dai<sup>2</sup>, Jeremy M. Foster<sup>2</sup>, Ivan R. Corrèa Jr<sup>2</sup> & Floyd E. Romesberg<sup>1</sup>

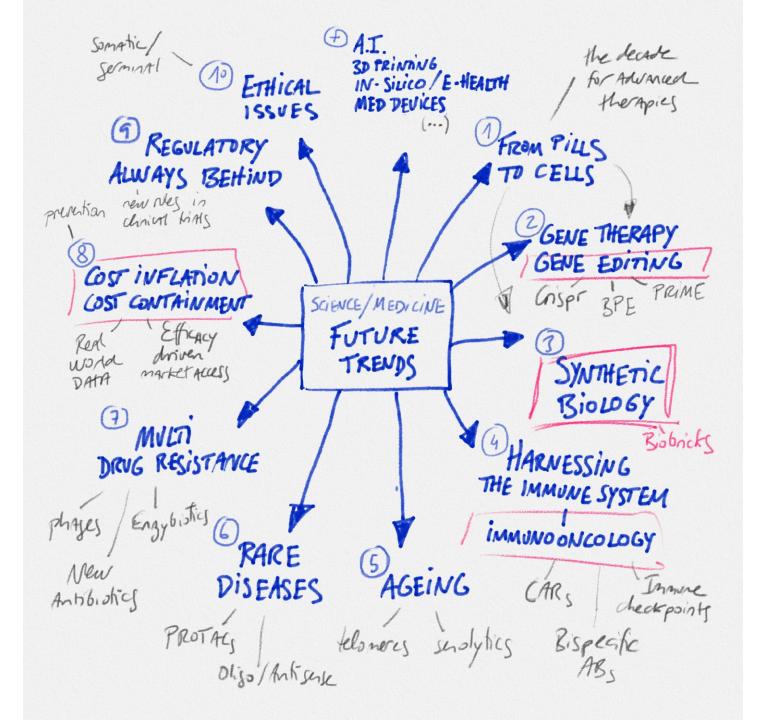
Organisms are defined by the information encoded in their genomes, and since the origin of life this information has been encoded using a two-base-pair genetic alphabet (A-T and G-C). In vitro, the alphabet has been expanded to include several unnatural base pairs (UBPs)1-3. We have developed a class of UBPs formed between nucleotides bearing hydrophobic nucleobases, exemplified by the pair formed between d5SICS and dNaM (d5SICS-dNaM), which is efficiently PCR-amplified1 and transcribed in vitro, and whose unique mechanism of replication has been characterized<sup>6,7</sup>. However, expansion of an organism's genetic alphabet presents new and unprecedented challenges: the unnatural nucleoside triphosphates must be available inside the cell; endogenous polymerases must be able to use the unnatural triphosphates to faithfully replicate DNA containing the UBP within the complex cellular milieu; and finally, the UBP must be stable in the presence of pathways that maintain the integrity of DNA. Here we show that an exogenously expressed algal nucleotide triphosphate transporter efficiently imports the triphosphates of both d5SICS and dNaM (d5SICSTP and dNaMTP) into Escherichia coli, and that the endogenous replication machinery uses them to accurately replicate a plasmid containing d5SICS-dNaM. Neither the presence of the unnatural triphosphates nor the replication of the UBP introduces a notable growth burden. Lastly, we find that the UBP is not efficiently excised by DNA repair pathways. Thus, the resulting bacterium is the first organism to propagate stably an expanded genetic alphabet.

suggest that decomposition is mediated by phosphatases. As no degradation was observed upon incubation in spent media, decomposition seems to occur within the periplasm. No increase in stability was observed in cultures of single-gene-deletion mutants of E. coli BW25113 lacking a specific periplasmic phosphatase<sup>19</sup> (as identified by the presence of a Sec-type amino-terminal leader sequence), including phoA, ushA, appA, aphA, yjjX, surE, yfbR, yjjG, yfaO, mutT, nagD, yggV, yrfG or ymfB, suggesting that decomposition results from the activity of multiple phosphatases. However, the extracellular stability of  $[\alpha^{-32}P]$ -dATP was significantly greater when 50 mM potassium phosphate (KPi) was added to the growth medium (Extended Data Fig. 3). Thus, we measured  $[\alpha^{-32}P]$ dATP uptake from media containing 50 mM KPi after induction of the transporter with isopropyl-β-D-thiogalactoside (IPTG) (Extended Data Fig. 4). Although induction with 1 mM IPTG resulted in slower growth, consistent with the previously reported toxicity of NTTs<sup>17</sup>, it also resulted in maximal  $[\alpha^{-32}P]$ -dATP uptake. Thus, after addition of 1 mM IPTG, we analysed the extracellular and intracellular stability of  $[\alpha^{-32}P]$ -dATP as a function of time (Extended Data Fig. 5). Cells expressing PtNTT2 were found to have the highest levels of intracellular  $[\alpha^{-32}P]$ -dATP, and although both extra- and intracellular dephosphorylation was still observed, the ratio of triphosphate to dephosphorylation products inside the cell remained roughly constant, indicating that the extracellular concentrations and PtNTT2-mediated influx are sufficient to compensate for intracellular decomposition.











#### **ARTICLE**



https://doi.org/10.1038/s41467-020-18008-4

**OPEN** 

# A machine learning Automated Recommendation Tool for synthetic biology

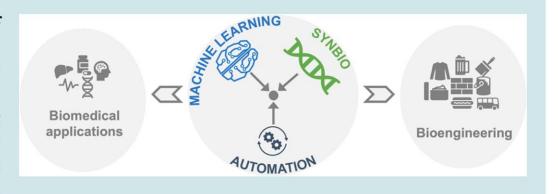
Tijana Radivojević (1,2,3), Zak Costello 1,2,3, Kenneth Workman (1,3,4) & Hector Garcia Martin (1,2,3,5 ⋈

Synthetic biology allows us to bioengineer cells to synthesize novel valuable molecules such as renewable biofuels or anticancer drugs. However, traditional synthetic biology approaches involve ad-hoc engineering practices, which lead to long development times. Here, we present the Automated Recommendation Tool (ART), a tool that leverages machine learning and probabilistic modeling techniques to guide synthetic biology in a systematic fashion, without the need for a full mechanistic understanding of the biological system. Using sampling-based

### Opportunities at the Intersection of Synthetic Biology, Machine Learning, and Automation

Pablo Carbonell, Tijana Radivojevic, and Héctor García Martín\*, \$\dangle\$, \$\bar{\pi}\$, and Héctor García Martín\*, \$\dangle\$, \$\bar{\pi}\$, \$\bar{\pi}\$, \$\bar{\pi}\$, \$\bar{\pi}\$ and Héctor García Martín\*, \$\dangle\$, \$\dangle\$ and Héctor García Martín\*, \$\dangle\$ and Héctor G

ABSTRACT: Our inability to predict the behavior of biological systems severely hampers progress in bioengineering and biomedical applications. We cannot predict the effect of genotype changes on phenotype, nor extrapolate the largescale behavior from small-scale experiments. Machine learning techniques recently reached a new level of maturity, and are capable of providing the needed predictive power without a detailed mechanistic understanding. However, they require



large amounts of data to be trained. The amount and quality of data required can only be produced through a combination of

<sup>&</sup>lt;sup>†</sup>Manchester Synthetic Biology Research Centre for Fine and Speciality Chemicals (SYNBIOCHEM), Manchester Institute of Biotechnology and School of Chemistry, University of Manchester, Manchester M1 7DN, United Kingdom

<sup>&</sup>lt;sup>‡</sup>DOE Agile BioFoundry, Emeryville, California 94608, United States

<sup>§</sup>DOE Joint BioEnergy Institute, Emeryville, California 94608, United States

Biological Systems & Engineering Division, Lawrence Berkeley National Laboratory, Berkeley, California 94720, United States

<sup>&</sup>lt;sup>1</sup>BCAM, Basque Center for Applied Mathematics, 48009 Bilbao, Spain