

1 Blockchain Biology

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10 Taking the world by storm in recent years, blockchain technology revolutionizes the way
11 we transact assets, manage data, and enforce agreements. Originally developed by Satoshi
12 Nakamoto for the cryptocurrency Bitcoin, blockchain has been adapted for diverse data
13 management applications such as streamlining remittances, enhancing food traceability, securing
14 electronic health records, ensuring genomic data privacy, training artificial intelligence, bolstering
15 cybersecurity, tackling climate change, and supporting clinical trials (1–6).

16 Blockchains are decentralized, append-only ledgers. Instead of a centralized entity, for
17 example a bank, controlling an entire ledger, multiple parties (nodes) form a network to maintain
18 a synchronized, distributed, and identical record. Decentralization safeguards the integrity of the
19 ledger when individual nodes are lost. The ledger is comprised of blocks that store data, such as
20 the details of a financial transaction, and are linked chronologically to create a metaphorical chain
21 of blocks. The append-only design of blockchain guarantees a complete, traceable, and virtually
22 tamper-proof ledger.

23 Despite its implementation in many industries, blockchain has never been harnessed to
24 directly study biological mechanisms. Current uses of blockchain technology in biology and
25 medicine has been limited to peripheral applications such as storing sequencing data or preventing
26 tampering of clinical trial data. Although longstanding problems in computational biology mirror
27 those addressed by blockchain, the technology has never been exploited to answer fundamental
28 biological questions. Proposed here is a conceptual framework for employing blockchain
29 technology to probe biological mechanisms. How principles of decentralization, synchronicity,
30 immutability, and contracts can be utilized for cancer evolution and synthetic biology are explored.

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32 **Decentralized Ledgers and Modeling Cancer Evolution**

33 The rigorous recordkeeping capabilities of blockchain can be harnessed to probe cancer
34 evolution and lineage tracing. Clonal evolution in cancer exhibits strikingly similar features as
35 blockchain (Figure 1). Accruing genetic and epigenetic alterations in a stepwise, sequential manner,
36 cancer cell clones are subject to Darwinian natural selection throughout their growth. Clonal
37 architectures involve a founder mutation, for example *ETV6-RUNX1* fusion in acute lymphoblastic
38 leukemia, that drives clonal expansion and subsequent diversification (7). Defining the ledger as
39 the complete history of a cancer, this critical origin can be represented by the genesis block of a
40 blockchain. The dataset in each block harbors a snapshot of the cancer state in time, ideally the
41 entire single-cell omics signature. Accordingly, appending a new block to the ledger corresponds
42 to adding an updated snapshot of the cancer state to the cancer history. Appending new blocks is
43 critical because cancer cells are constantly subjected to dynamic evolutionary pressures, including
44 resource competition, microenvironmental constraint, and therapeutic intervention (8).
45 Decentralization can be achieved by treating every cell as an individual node and connections as
46 intercellular relationships. Reconstructing the ledger necessitates integration of the intrinsic omics
47 of a single cell and all its intercellular relationships. In this model, despite heterogeneity across cells,

48 they are synchronous in their ability to contribute to the reconstruction of a cancer history ledger.
49 Establishing nodal connections are realistic given the significant computational advances in
50 characterizing cell-cell communication (9).

51 What guarantees that a newly appended block is an accurate updated snapshot of the
52 cancer state? The cryptographic hash and proof-of-work mechanisms of a blockchain can
53 guarantee that the evolutionary trajectory is faithfully documented (temporal, lineage, and omic
54 accuracy). Cryptographic hash functions are one-way functions (inputs can only be determined by
55 trial-and-error, not rationally, from outputs) that map an arbitrary dataset to a fixed value such as
56 a string of binary digits. Each block contains the hash of the previous block and its own unique
57 hash that is a function of both its intrinsic data and the previous hash, enabling an append-only
58 chain. A cryptographic hash function can map a single-cell omics signature to a dimension-reduced
59 fingerprint of the cancer. Such processing is realistic given the substantial progress made in
60 computational methods for multimodal integration of single-cell omics data (10). The linear
61 organization of blocks ensures that changes during the inter-block timeframe in any arbitrary
62 feature of the cancer, say flux through a signaling pathway in a specific cell, can be determined by
63 comparing the contents of block ' $n+1$ ' and block ' n '. Proof-of-work dictates that hashes need to
64 meet certain conditions, thus requiring brute force computations as a prerequisite for adding new
65 blocks due to the one-way nature of cryptographic hash functions. Because adjusting the hash
66 conditions modulates the difficulty of adding new blocks, proof-of-work establishes the inter-block
67 timeframe and tunes the temporal resolution of the cancer history.

68 By establishing a high fidelity cancer history, a blockchain model of cancer evolution may
69 be a powerful model for retrospective lineage tracing. Retrospectively reconstructing cell lineage
70 information is valuable for understanding human diseases because experimental manipulation is
71 impossible (11). Naturally occurring mutations, such as copy number variations, single-nucleotide
72 variants, LINE-1 transpositions, microsatellite mutations, and mtDNA mutations, can moonlight
73 as endogenous lineage barcodes (12), which can serve as a starting point for reconstructing the
74 cancer history blockchain. Integrating a blockchain model with current methods may expand the
75 comprehensiveness and utility of retrospective lineage tracing.

76

77 **Smart Contracts and Biological Boolean Logic Gates**

78 Smart contracts make blockchain an attractive platform to encode Boolean logic gates for
79 biological systems. Originally conceptualized by Nick Szabo and eventually integrated with the
80 Ethereum blockchain by Vitalik Buterin, smart contracts are protocols that automatically execute
81 upon fulfilment of certain conditions and enjoy all the cardinal features of blockchain such as
82 decentralization, immutability, and validity. For example, instead of hiring a real estate broker,
83 smart contracts on a blockchain can automatically process the sale of property via an agreement
84 that cannot be lost or fraudulently altered.

85 Both smart contracts and Boolean logic gates share core principles of conditionality.
86 Boolean logic applies logic operators, such as conjunction (AND), disjunction (OR), negation
87 (NOT), and exclusivity (XOR), to binary values (true and false or 1 and 0). Smart contracts are
88 classically programmed using the procedural language Solidity. Procedural languages outline step-
89 by-step how a process is performed, whereas declarative languages define what goal must be met.
90 Considerable efforts have been made to shift towards declarative programming to create logic-
91 based smart contracts that are less error-prone and ambiguous than traditional smart contracts
92 (13,14).

93 As knowledge of molecular mechanisms and signaling pathways rapidly grows, Boolean
94 logic gates offer a powerful approach to model complex networks and extract relevant biological

95 relationships (15). Beyond modeling and analysis, boolean logic gates are integral for synthetic
96 biological systems and networks with wide-ranging applications such as biosensing,
97 pharmaceuticals, and biofuels (16). Boolean logic gates are experimentally encoded by various
98 synthetic DNA, RNA, protein, and photosensitive molecules (17,18). Importantly, Boolean logic
99 gating facilitates the development of highly specific and selective therapeutics, particularly
100 monoclonal antibodies and chimeric antigen receptor (CAR) T cells. Conditionally functional
101 AND-gated antibodies based on binary toggling between phosphorylated and non-phosphorylated
102 states have been synthesized (19). Multi-antigen targeting CAR-T cells can be engineered to exhibit
103 AND, OR, and NOT logic gating with the goal of restricting antigen escape and toxicity (20).

104 Because Boolean logic gates are central to synthetic biology, logic-based smart contracts
105 present a novel computational approach to modeling biochemical circuits. A central component
106 of synthetic biological circuits is assaying output and performance, and this is often achieved by
107 detecting fluorescent reporters (21). However, fluorescent reporters have limitations such as a
108 requirement for artificial overexpression and susceptibility to protein degradation. Furthermore,
109 encoding more advanced outputs such as oscillation, which requires co-expression of repressors
110 (22), and permitting multiplexing can be challenging. Because smart contracts serve to eliminate
111 third-party confirmation, logic-based smart contracts can eliminate the need for individual
112 reporters directly downstream of individual biological Boolean logic gates and shift the burden of
113 verification to a global, blockchain-based reporter instead (Figure 2). Confidence that biological
114 Boolean logic gates function correctly can be attributed to trust in a blockchain, which can be
115 designed to be a ledger of the state of a particular cell for example. This simplification is valuable
116 for complex networks and may facilitate efforts to engineer dynamic and multiplexed circuits. As
117 evidenced by recent advances in adapting machine learning algorithms to design gene circuits (23),
118 computational methods like blockchain should be utilized in tandem with experimental techniques
119 to maximize synthetic biology capabilities.

120
121 Blockchain technology remains under-tapped. Outlined here are two applications of
122 “blockchain biology,” the application of blockchain principles to directly study and model
123 biological mechanisms. Considerable development is needed to advance blockchain technology to
124 a functional computational biology paradigm. In addition to expanding the range of biological
125 contexts amenable to interrogation by blockchain principles, significant methods development is
126 crucial. From proof-of-work versus proof-of-stake to lightning network addressing scalability, the
127 numerous possibilities for blockchain infrastructure is clearly evidenced by the diverse forms of
128 cryptocurrency. Biology remains an uncharted territory for the immense potential of blockchain,
129 a future ripe to begin building block by block.

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131 **Acknowledgements**

132 A.C.C. is supported by NIH Medical Scientist Training Program Training Grant T32GM007739.

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134 **Declaration of Interests**

135 A.C.C. trades cryptocurrencies, primarily Bitcoin and Ethereum.

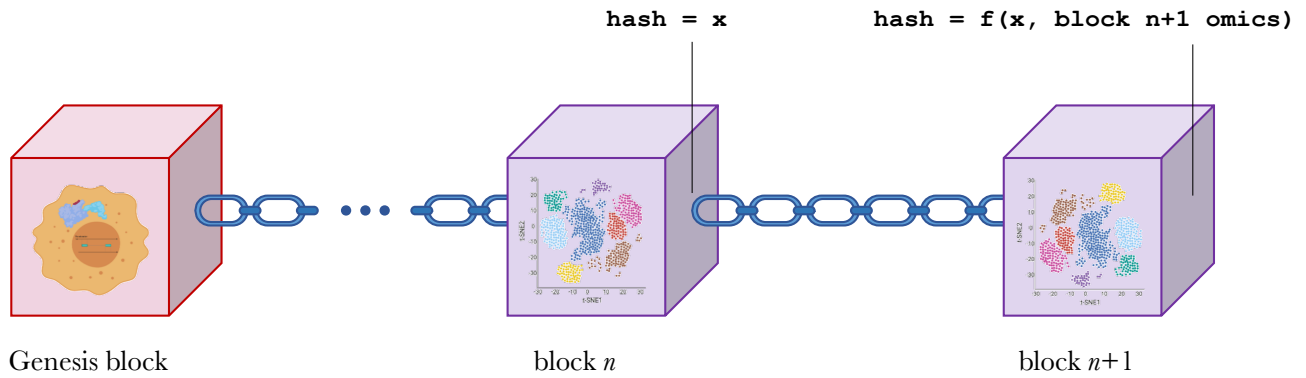
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Figure 1. Blockchain model of cancer evolution. Founder mutation (represented by lavender and turquoise fusion protein) initiates genesis block. Contents of every block encompass the complete single-cell omics of the cancer at a certain time point. Each block is marked by a unique hash that is a function of the hash of the previous block and its own contents. Proof-of-work determines the timeframe elapsed between each block. The entire ledger is decentralized across every cancer cell.

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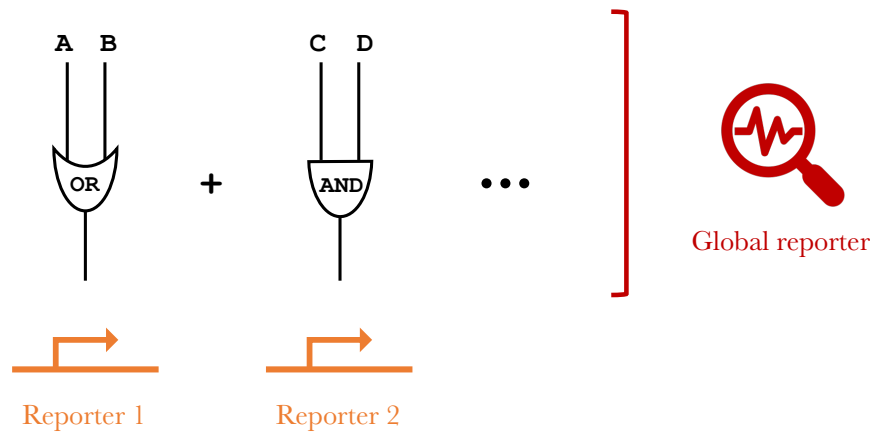


Figure 2. Model for logic-based smart contracts integrated with biological Boolean logic gates. Complex synthetic biological circuits can involve many unique signal inputs into multiple Boolean logic gates of different types, each requiring an independent reporter (orange). Implementing logic-based smart contracts eliminates the need for individual reporters to validate an individual logic gate, potentially allowing for a general global, blockchain-based reporter (red) that can model dynamic and multiplexed circuits.

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