

The number of legal Go positions

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<http://tromp.github.io/>

65 year annivesary Go Club Amsterdam, Bergen aan Zee 2023









- Numbers
- Positions
- Legal
- Why
- History
- Algorithm
- Verifiability
- Concluding

Numbers

- positional notation, a.k.a. place-value, or base- b notation
- decimal (base 10) notation uses the 10 digits 0,1,2,3,4,5,6,7,8,9
$$4125 = 4125_{10} = 4 \cdot 1000 + 1 \cdot 100 + 2 \cdot 10 + 5 \cdot 1$$
$$= 4 \cdot 10^3 + 1 \cdot 10^2 + 2 \cdot 10^1 + 5 \cdot 10^0$$
- binary (base 2) notation uses the 2 binary digits 0,1
$$1010_2 = 1 \cdot 2^3 + 0 \cdot 2^2 + 1 \cdot 2^1 + 0 \cdot 2^0$$
$$= 1 \cdot 8 + 0 \cdot 4 + 1 \cdot 2 + 0 \cdot 1$$
$$= 8 + 2 = 10$$
- ternary (base 3) notation uses the 3 ternary digits 0,1,2
$$2010_3 = 2 \cdot 3^3 + 0 \cdot 3^2 + 1 \cdot 3^1 + 0 \cdot 3^0$$
$$= 2 \cdot 27 + 0 \cdot 9 + 1 \cdot 3 + 0 \cdot 1$$
$$= 54 + 3 = 57$$
- Go gives a new meaning to "positional notation"

Go positions

- Go-ternary notation uses the symbols +, ●, ○ instead of 0,1,2
- Go positions denote first $3^{n \times n}$ numbers

0	1	2	3	4	5	...	79	80
0-0 0-0	0-0 0-1	0-0 0-2	0-0 1-0	0-0 1-1	0-0 1-2	...	2-2 2-1	2-2 2-2
						...		

Legal positions

Definition

A position is *legal* iff all strings have liberties

Theorem

A position is legal iff it's reachable in a game

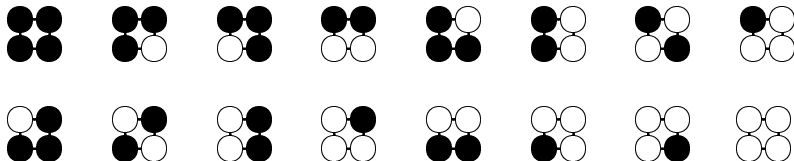
Proof.

- ⇒ have White pass while placing black stones, then have Black pass while placing white stones
- ⇐ game rules ensure strings have liberties




Illegal and legal 2×2

- 16 illegal 4-stone positions



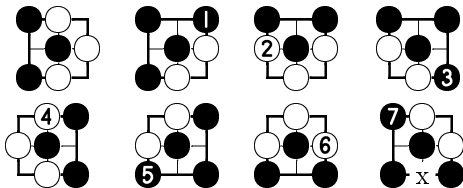
- 8 illegal 3-stone positions



- all positions with at most 2 stones are legal
- leaving $81 - 24 = 57$ legal 2×2 positions
- $L2 =$  in Go-ternary

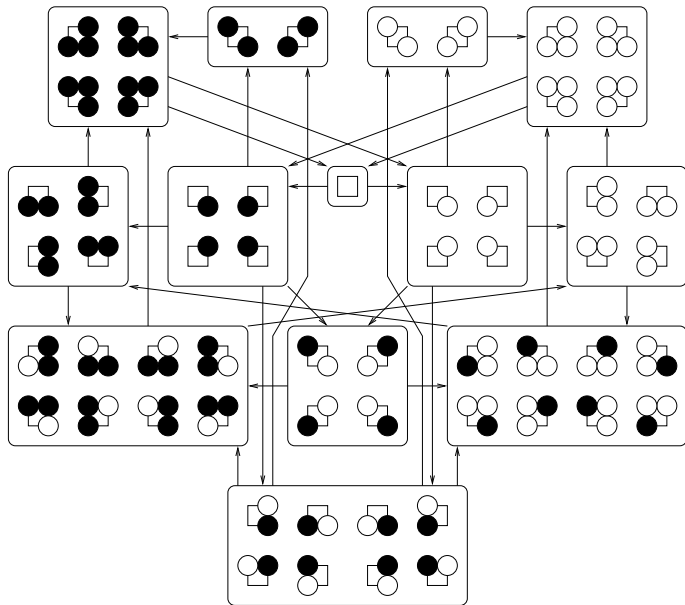
Symmetry

- Rotations and reflections generally produce *different* positions
- Identity of positions matters in *superko*
- Pinwheel ko



- Superko prevents White 8 at 'x' but not White 2

386,356,909,593 simple paths



Why?

- "Because it's there" – George Mallory
- "more than the number of atoms in the universe" is a horrible understatement
- interesting computational challenge
- major open problem left in "Combinatorics of Go" by myself and Gunnar Farnebäck from CG2006
<http://tromp.github.io/go/gostate.pdf>

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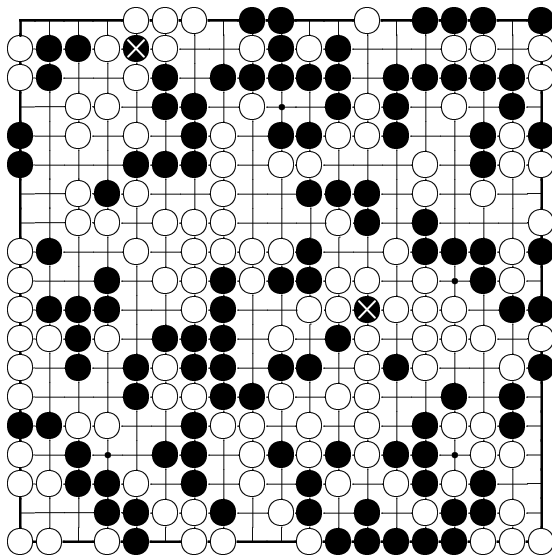
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The number of legal 19x19 positions is ...



L19 in Go-ternary



L19 in decimal

208168199381979984699478633344862770286522453884530548425
639456820927419612738015378525648451698519643907259916015
628128546089888314427129715319317557736620397247064840935

confirming 2006 estimate of $2.081681994 \cdot 10^{170}$

History

- 1992 Achim Flammenkamp estimates L19 at 1.2% of 3^{361}
- 1994 Jonathan Cano computes up to L(4,5) by brute force enumeration
- 2000 Les Fables describes a dynamic programming method
- 2005 Gunnar Farnebäck computes up to L(10,10)
- 2005 Tromp computes up to L(13,13) with optimized implementation
- 2006 Tromp+Koucky compute up to L(17,17) on CWI cluster
- 2014 Piet Hut at Princeton Institute for Advanced Studies (IAS)
- 2015 Tromp computes L(18,18); requests more computing power
- 2015 Michael Di Domenico at Princeton Institute for Defense Analysis (IDA)

Chinese Remainder Theorem

- Given some relatively prime numbers m_1, \dots, m_k
- any number $n < \prod m_i$ is uniquely determined by its remainders $n \bmod m_1, \dots, n \bmod m_k$
- Example with $m_1 = 5, m_2 = 8$

	0	1	2	3	4	5	6	7
0	0	25	10	35	20	5	30	15
1	16	1	26	11	36	21	6	31
2	32	17	2	27	12	37	22	7
3	8	33	18	3	28	13	38	23
4	24	9	34	19	4	29	14	39

- error detection

Independent jobs

- for d in $\{0, 3, 5, 7, 9, 11, 15, 45, 83\}$
- compute L19 modulo $2^{64} - d$

where	d	$2^{64} - d$	$L19 \bmod(2^{64} - d)$
IAS	0	18446744073709551616	8090796072333351655
IDA	3	18446744073709551613	2915461546443917794
IDA	5	18446744073709551611	7586469474294957788
IDA	7	18446744073709551609	6473614947737753186
IDA	9	18446744073709551607	10169697560205166237
IDA	11	18446744073709551605	8330618849129880355
IDA	15	18446744073709551601	15770133769769565723
IAS	45	18446744073709551571	18086767044943672066
IAS	83	18446744073709551533	4954386835027564217

- $9 \times 64 \text{ bits} = 576 \text{ bits}$, enough for 566 bit answer
- compute L19 using Chinese Remainder Theorem

Count on partial boards

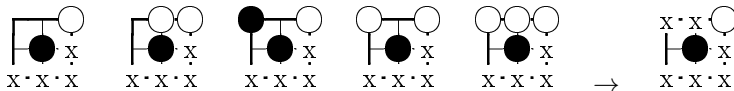
- partial board of i points has 3^i partial positions
- one count for all illegal partial positions
- other counts for legal partial positions
- extend partial positions one point at a time

$\begin{array}{c} \dot{A} \cdot x \cdot x \\ x \cdot x \cdot x \\ x \cdot x \cdot x \end{array}$	$\begin{array}{c} \sqcap \dot{A} \cdot x \\ x \cdot x \cdot x \\ x \cdot x \cdot x \end{array}$	$\begin{array}{c} \sqcap \sqcap \dot{A} \\ x \cdot x \cdot x \\ x \cdot x \cdot x \end{array}$	$\begin{array}{c} \sqcap \sqcap \sqcap \\ \dot{A} \cdot x \cdot x \\ x \cdot x \cdot x \end{array}$	$\begin{array}{c} \sqcap \sqcap \sqcap \\ \sqcap \dot{A} \cdot x \\ x \cdot x \cdot x \end{array}$
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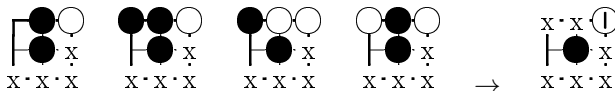
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Abstract from irrelevant details

- Only the last n points of the partial position matter



- Distinguish stones with and without liberties

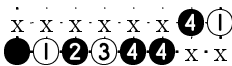


- Identify connections between libertyless stones

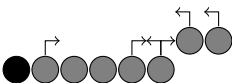


Efficient border state encoding

encode



as

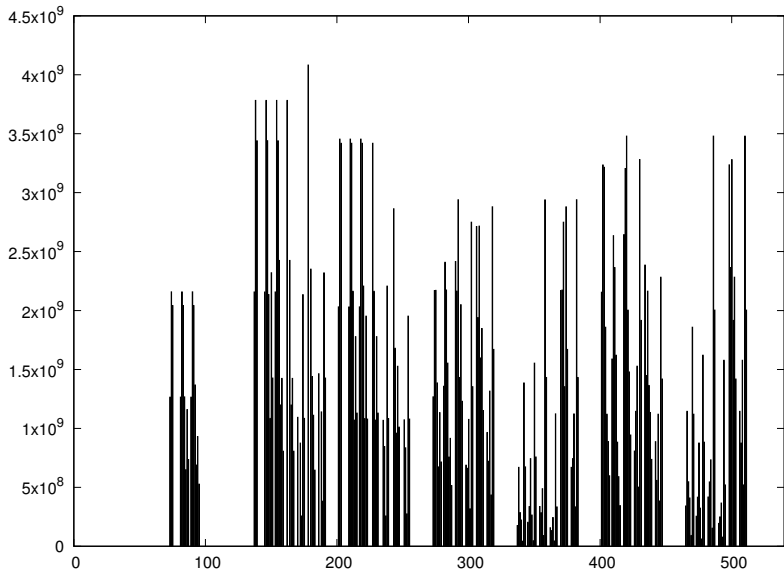


- infer string connections from left/right flags
- infer color of gray liberty less stones
- also exploit color symmetry (swapping all black/white)
- uses only 3 bits per point; 57 bits for L19

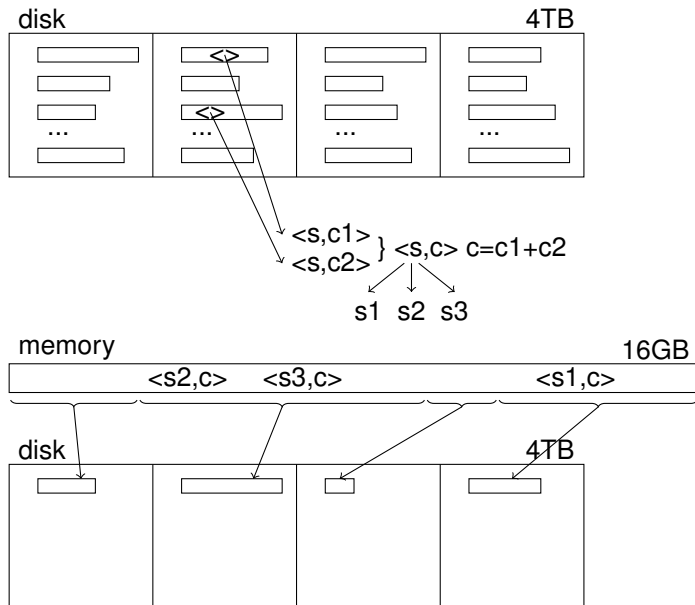
Huge datasets

- L19 has over 363 billion board states
- 16 bytes per <state,count> pair
- set of partial board counts takes 5.8TB of pairs
- ordered pairs allow delta state encoding
- redundancy unavoidable
- over 4TB per dataset
- partitioning allows for parallel processing

State density in code space



Extending all states



- Software available at <https://github.com/tromp/golegal>
- Use beefy server for additional congruences
 - 15TB of fast scratch disk space
 - 8 to 16 cores
 - 192GB of RAM
 - a few months of running time
- checksums on all files
- check summing to 3^i
- check that $L(19, n) = L(n, 19)$ computed earlier
- check against estimate $2.081681994 \cdot 10^{170}$ extrapolated from earlier results

Approximation formula

- $L(m, n) \approx \alpha \beta^{m+n} L^{mn}$ for some constants α , β , and L .



$$L = \lim_{n \rightarrow \infty} \frac{L(n, n)L(n+1, n+1)}{L(n, n+1)^2}$$



$$B = \lim_{n \rightarrow \infty} \frac{L(n, n+1)}{L(n, n)L^n} = \lim_{n \rightarrow \infty} \frac{L(n, n)}{L(n, n-1)L^n}$$



$$A = \lim_{n \rightarrow \infty} \frac{L(n, n)}{B^{2n} L^{n^2}}$$

Base of Liberties

n	$L(n, n)L(n + 1, n + 1)/L(n, n + 1)^2$
3	2.979
4	2.9756
5	2.975732
6	2.9757343
7	2.9757341927
8	2.9757341918
9	2.975734192044
10	2.975734192044
11	2.975734192043350
12	2.975734192043355
13	2.97573419204335727
14	2.975734192043357255
15	2.97573419204335724932
16	2.975734192043357249362
17	2.9757341920433572493811
18	2.97573419204335724938097

Concluding Remarks

- Dynamic Programming reduces an problem exponential in n^2 (impossible) to a problem exponential in n (feasible). For factoring numbers as big as L19, similar improvements are possible over trial division.
- answered
Ultimate question of liberties, the universe, and everystring
- newly computed $L(19, 19)$, $L(19, 18)$, and $L(18, 18)$ improve accuracy in approximation formula
$$L(m, n) \equiv 2.975734192043357249381^{mn} \times 0.96553505933837387^{m+n} \times 0.8506399258457145$$
- Go counting could make nice server benchmark
- The king of games versus the game of kings

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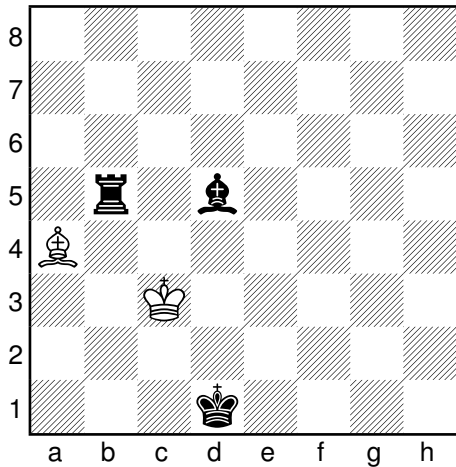
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Chess counting



Server benchmark

- Task is well defined, easily understood, and non-artificial
- Program code is small and self-contained
- Generated data sets are huge
- Problem is a typical instance of map-reduce, and thus representative of a wide class of popular problems
- Computation requires a good balance of multi-core processing power, memory for sorting, and disk-IO
- Board size parameter gives family of benchmarks, in 5x effort increments