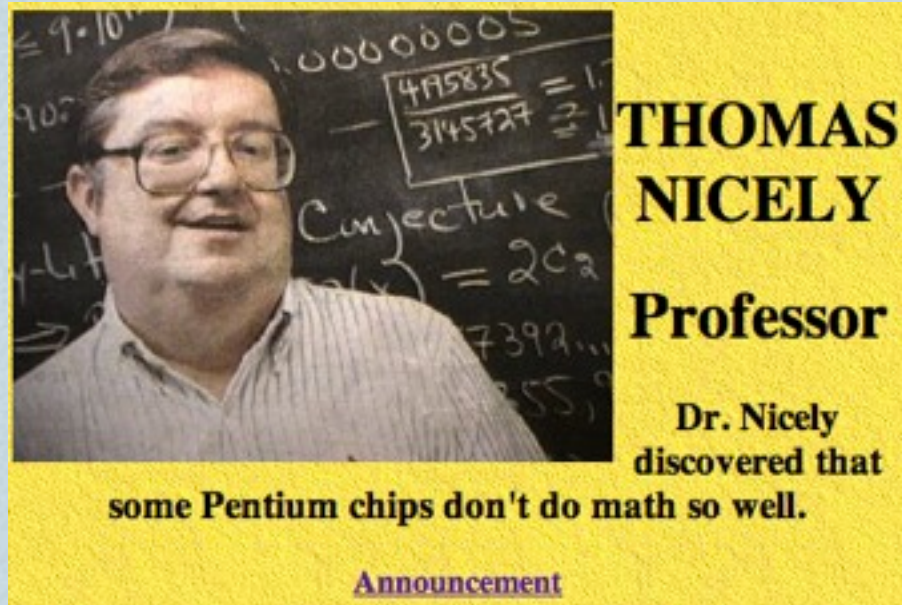


Circuit Verification: The BDD Revolution

Jean Goubault-Larrecq

Bugs: The Intel FDIV Bug



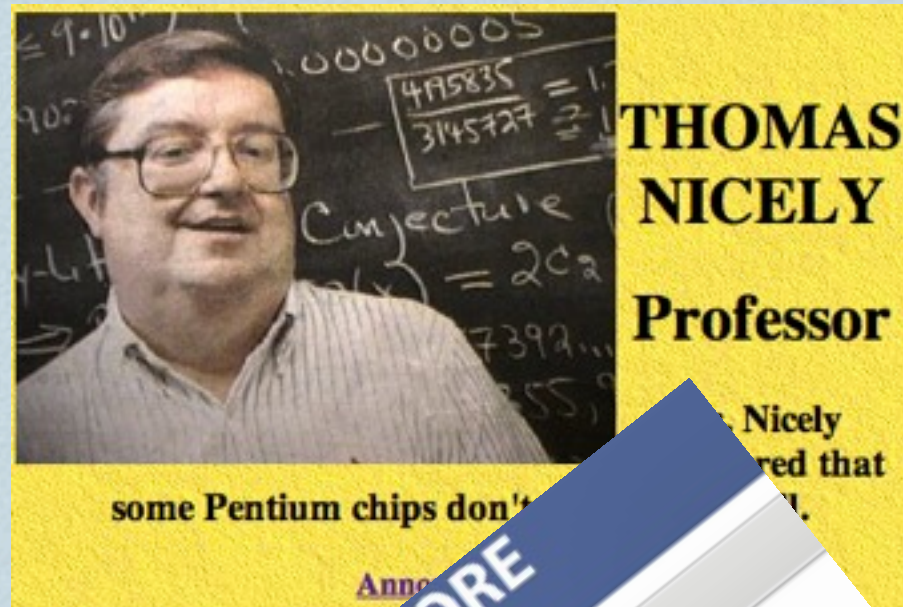
The correct value is

$$\frac{4195835}{3145727} = 1.333820449136241002$$

However, the value returned by the flawed Pentium is incorrect beyond four significant digits^[9]:

$$\frac{4195835}{3145727} = 1.333739068902037589$$

Bugs: The Intel FDIV Bug



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However, the value returned by the flawed Pentium is incorrect beyond four significant digits^[9]:

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Intel has to recall all flawed chips.

Cost: \$475 million



Bugs: Are they Hard to Find?

- ❖ Which chip below has the **FDIV** bug?



Bugs: Are they Hard to Find?

- ❖ Which chip below has the **FDIV** bug?



P5



P54CS

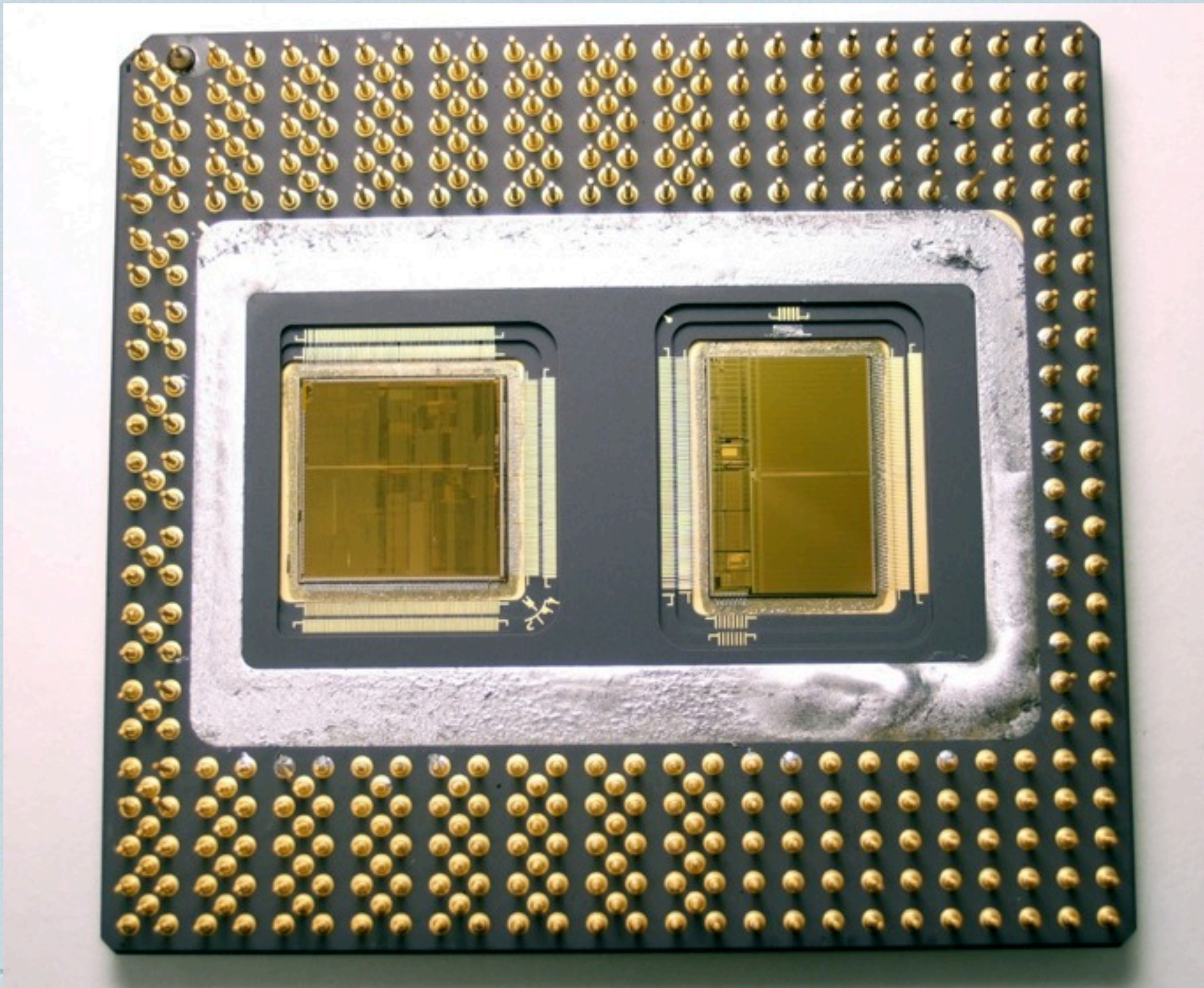


Pentium Pro

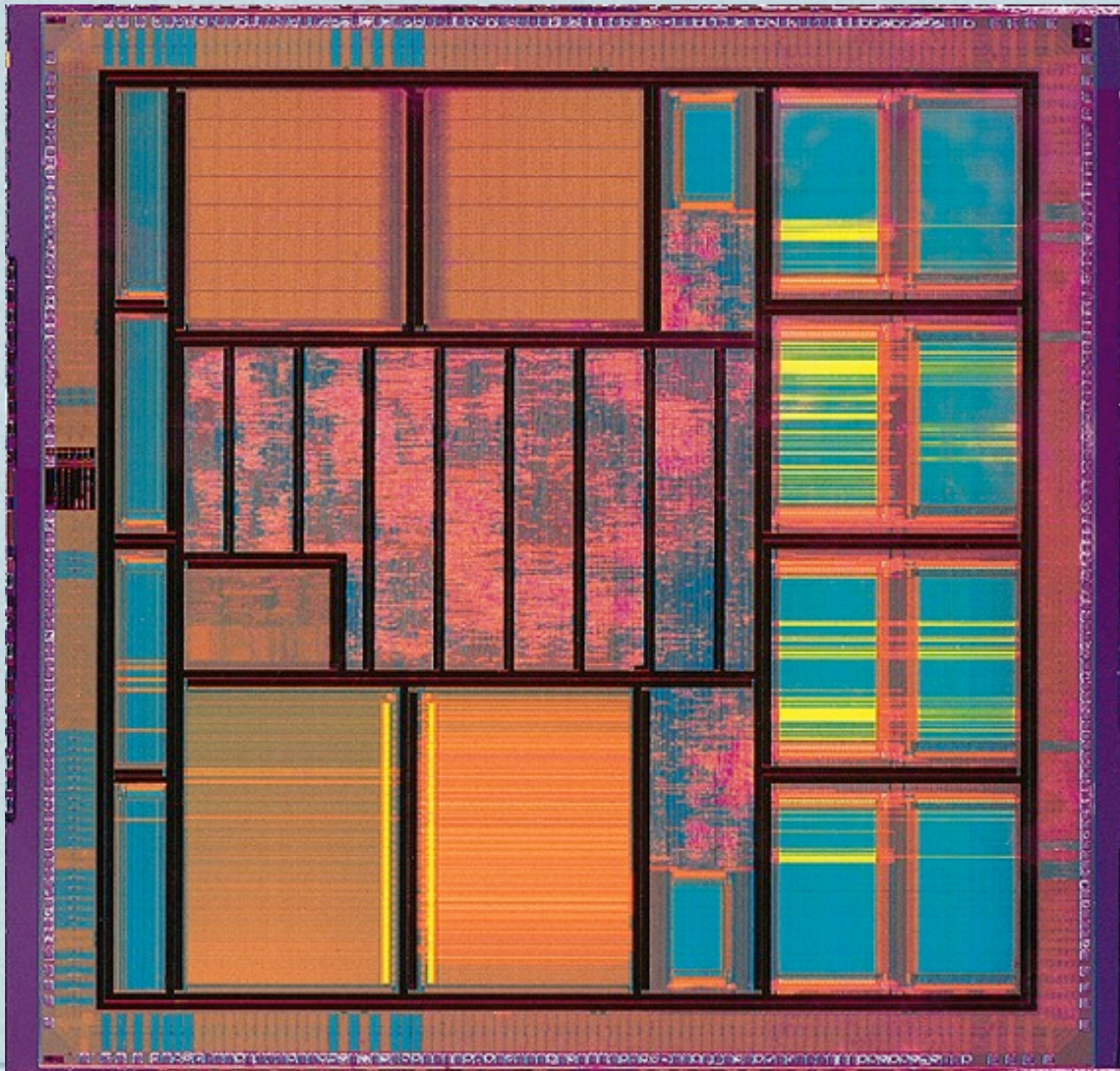
Let's Look Inside



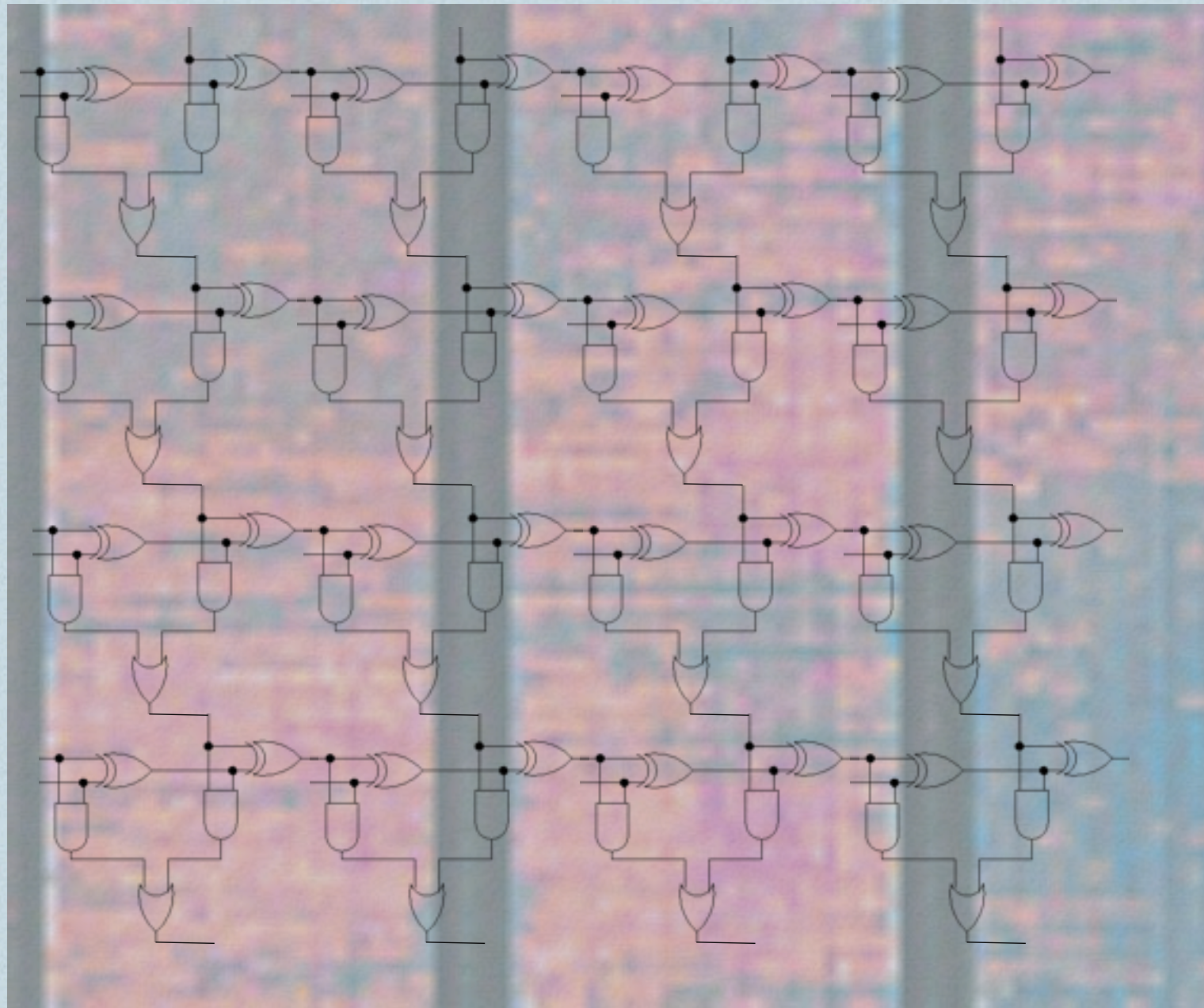
Let's Look Inside



Let's Look Inside

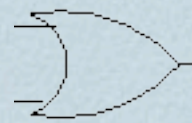


Let's Look Inside

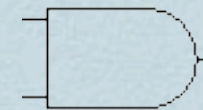


Circuits

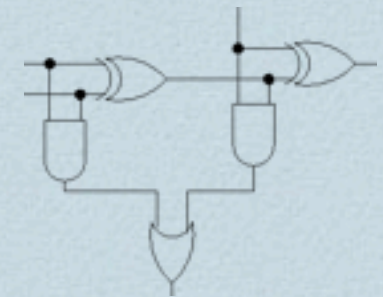
- ❖ Made of simple **gates**
- ❖ connected by **wires**



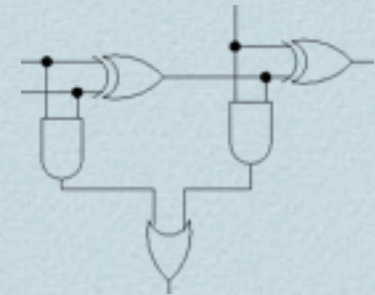
A	B	A or B
0	0	0
1	0	1
0	1	1
1	1	1



A	B	A and B
0	0	0
1	0	0
0	1	0
1	1	1



Circuits



❖ Made of simple **gates**

❖ connected by **wires**

❖ In the Pentium

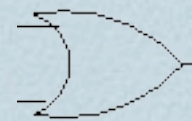
❖ ~ 1 million gates

❖ ~ 3 million wires, each having value 0 or 1

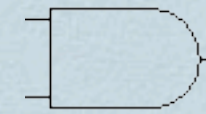
❖ $2^{3,000,000}$ possible distinct configurations to check

❖ This is **1 followed by 900,000 zeros!**

(number of atoms in the universe: only 1 followed by 82 zeros...)

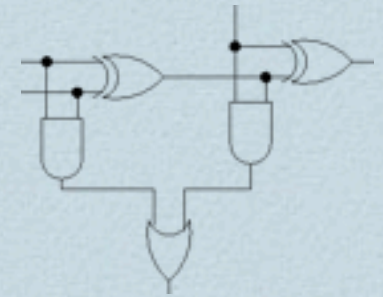


<i>A</i>	<i>B</i>	<i>A or B</i>
0	0	0
1	0	1
0	1	1
1	1	1



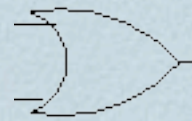
<i>A</i>	<i>B</i>	<i>A and</i>
0	0	0
1	0	0
0	1	0
1	1	1

Circuits

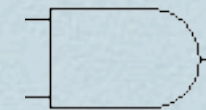


❖ Made of simple **gates**

❖ connected by **wires**



A	B	$A \text{ or } B$
0	0	0
1	0	1
0	1	1
1	1	1



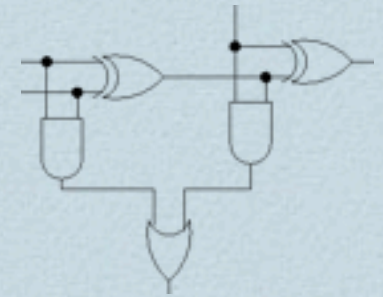
A	B	$A \text{ and } B$
0	0	0
1	0	0
0	1	0
1	1	1

❖ In practice, we would be happy to check elementary units (e.g., a divisor, a multiplier, an adder)

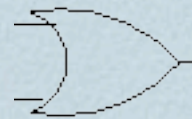
❖ with a few thousand wires

❖ Before 1986, this was **out of reach** of all known methods

Circuits

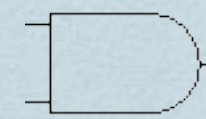


❖ Made of simple **gates**



A	B	$A \text{ or } B$
0	0	0
0	1	1
1	0	1
1	1	1

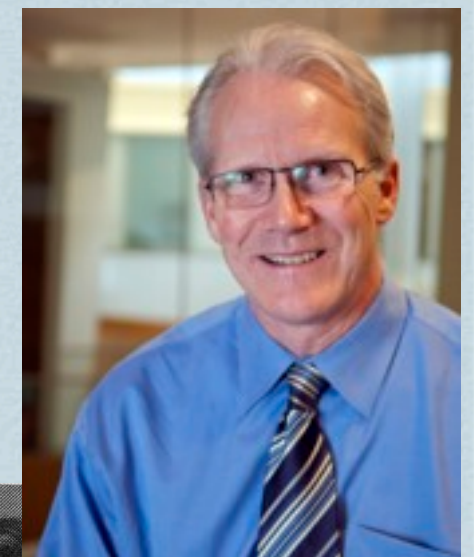
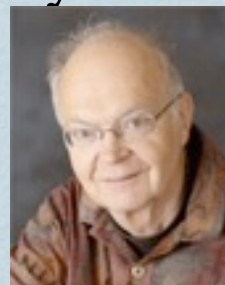
❖ connected by **wires**



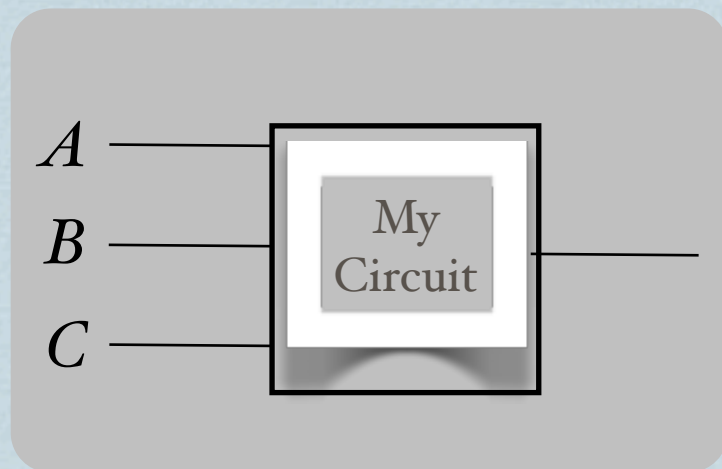
A	B	$A \text{ and } B$
0	0	0
0	1	0
1	0	0
1	1	1

❖ Then **R.L. Bryant** (1986) found a way:
BDDs (Binary Decision Diagrams)
[improving on Sh. B. Akers (1978)]

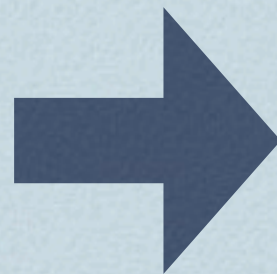
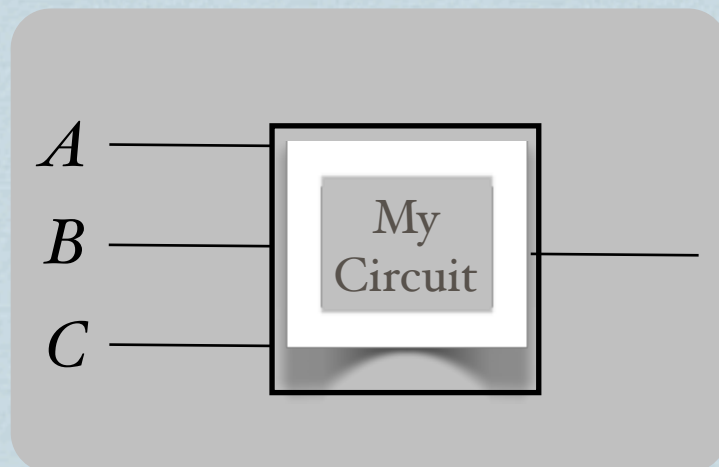
❖ «One of the only really fundamental
data structures that came out
in the last twenty-five years»
— Donald E. Knuth



Circuits...

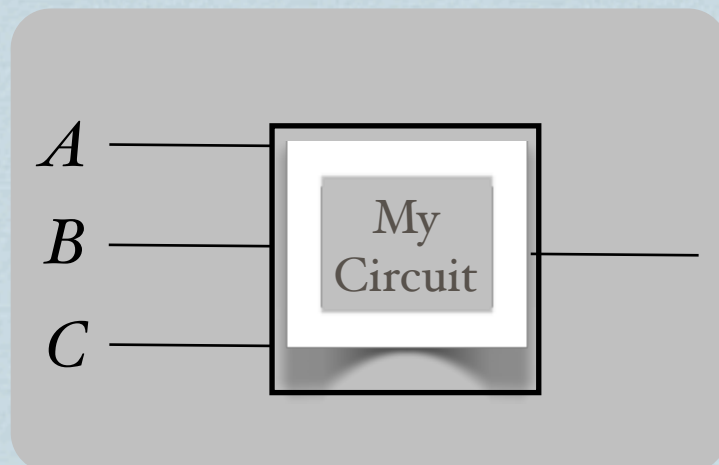


... and Truth Tables

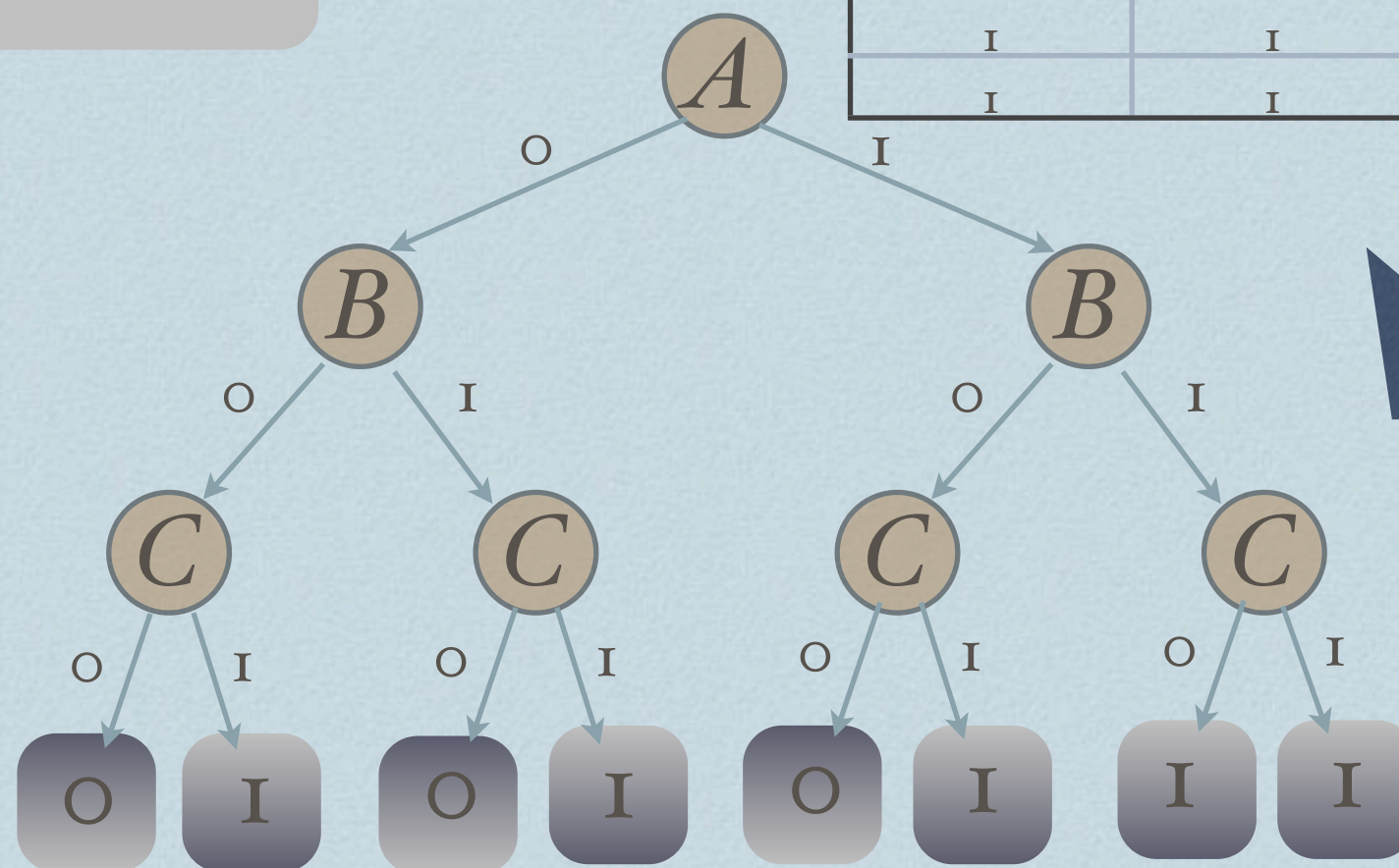


A	B	C	
O	O	O	O
O	O	I	I
O	I	O	O
O	I	I	I
I	O	O	O
I	O	I	I
I	I	O	I
I	I	I	I

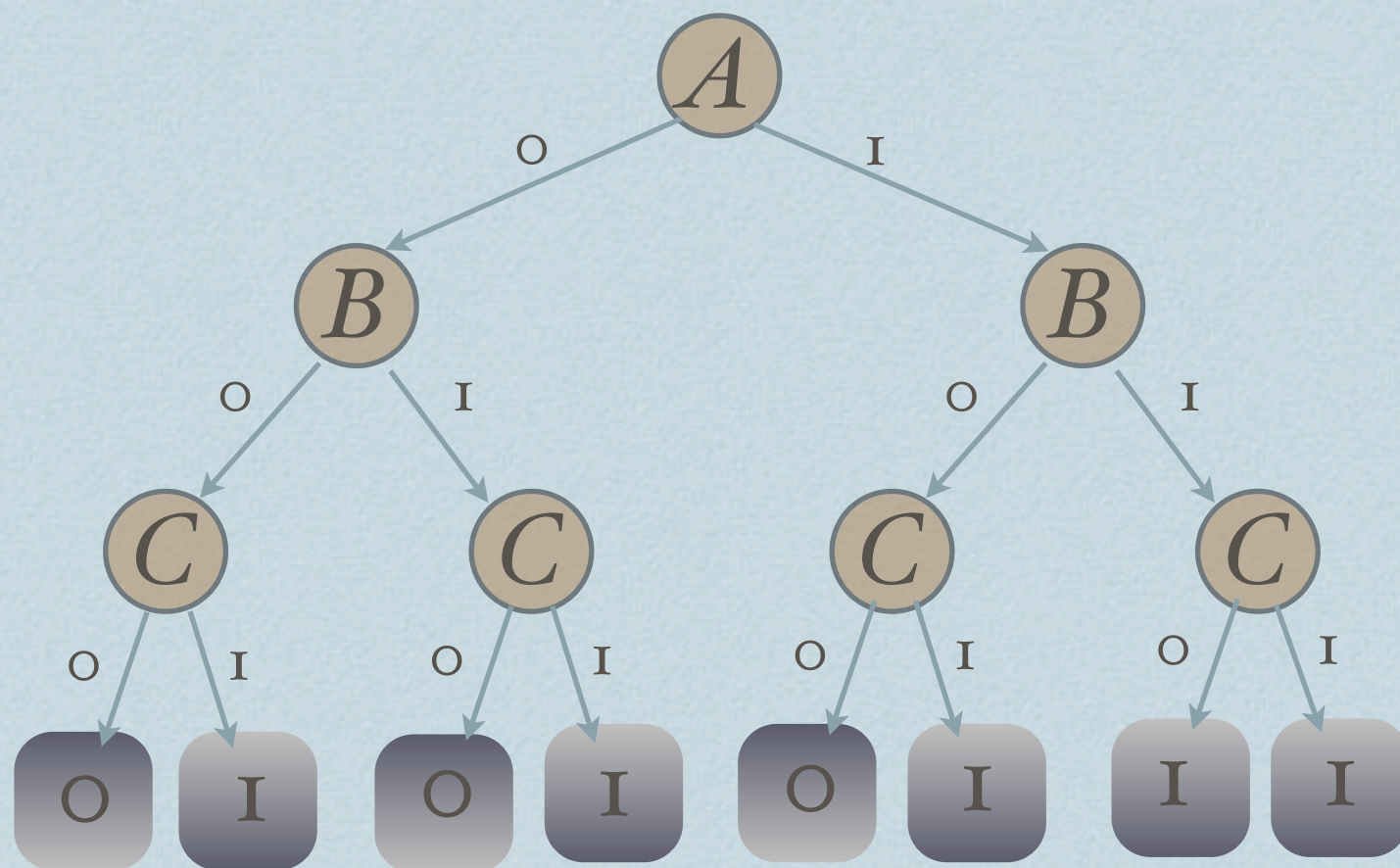
Decision Trees



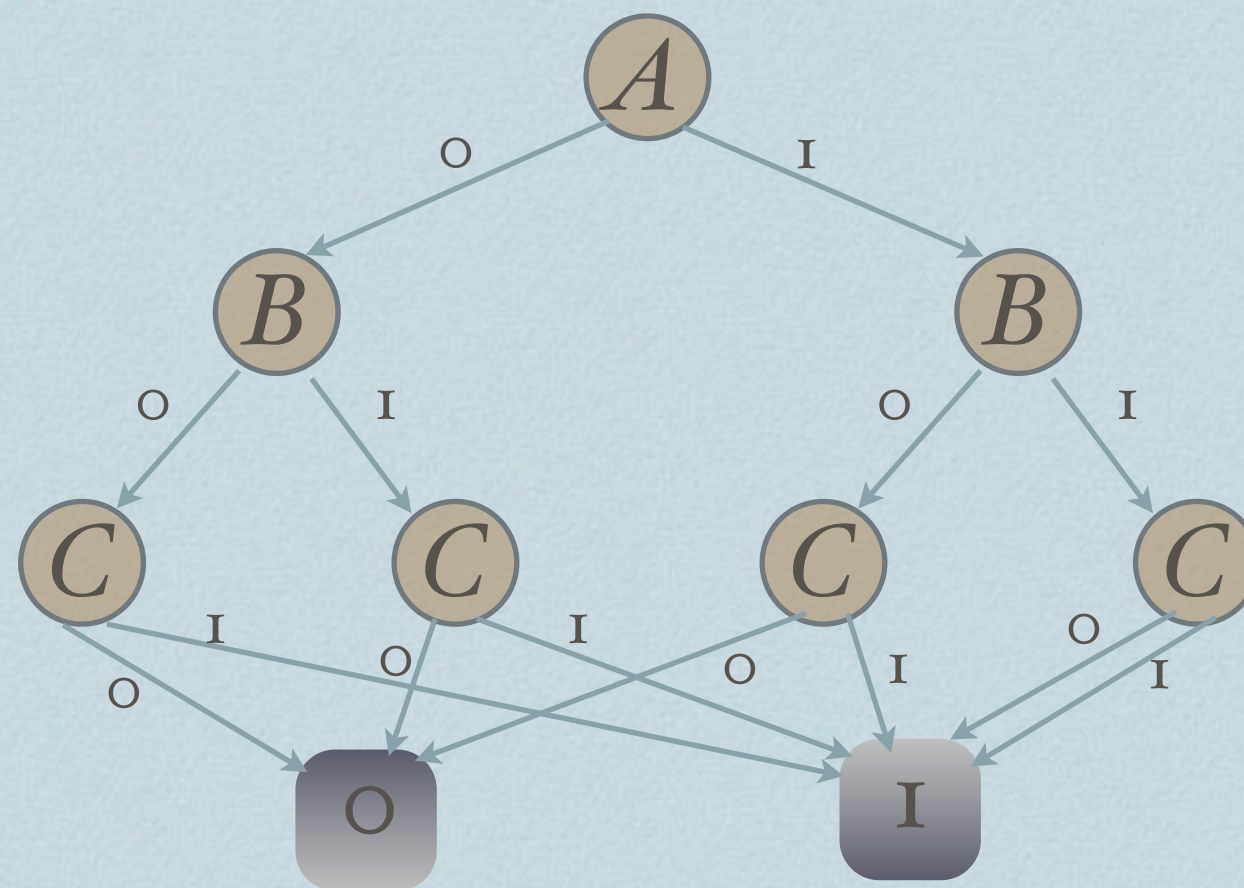
A	B	C	
O	O	O	O
O	O	I	I
O	I	O	O
O	I	I	I
I	O	O	O
I	O	I	I
I	I	O	I
I	I	I	I



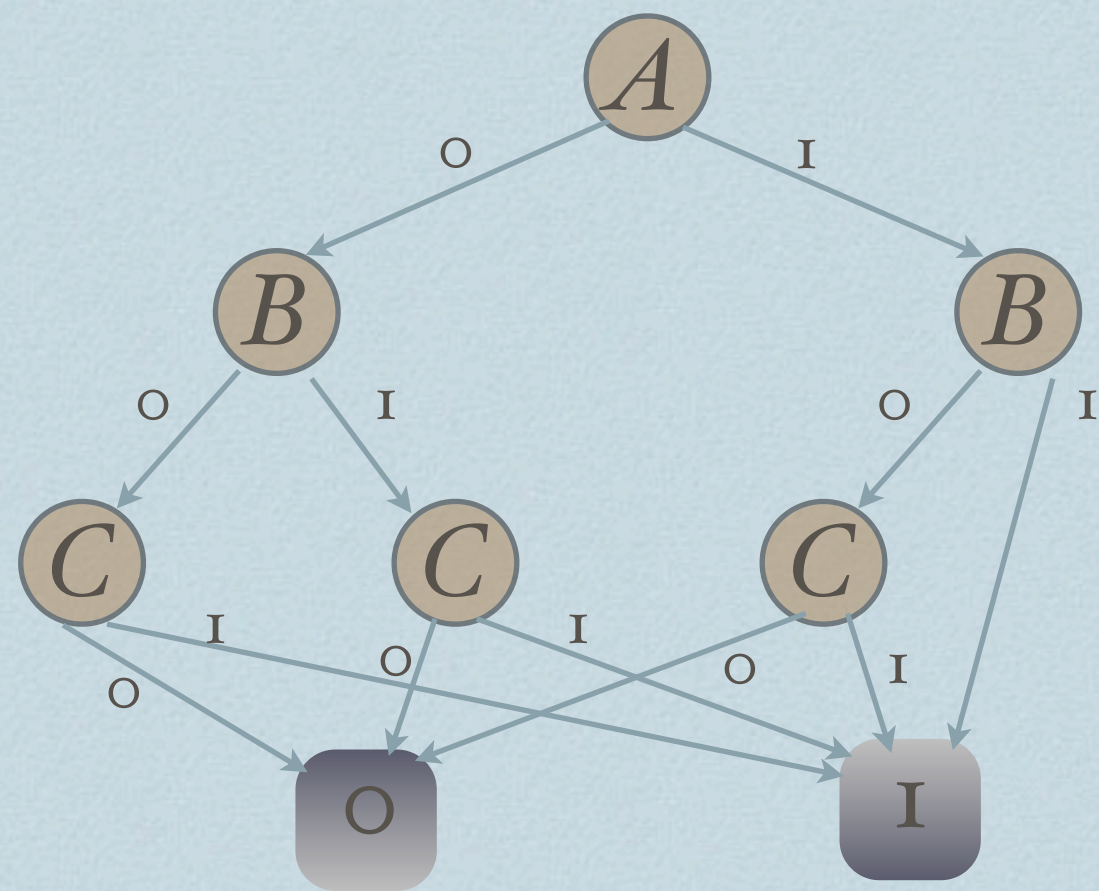
BDDs: Sharing



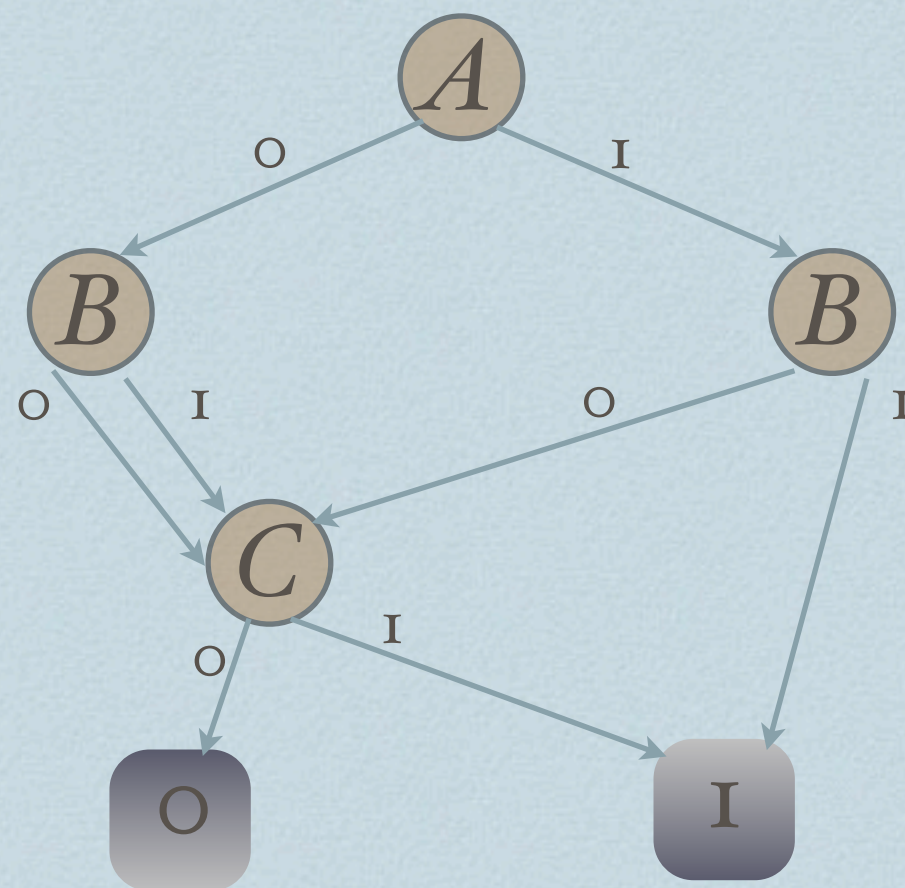
BDDs: Sharing



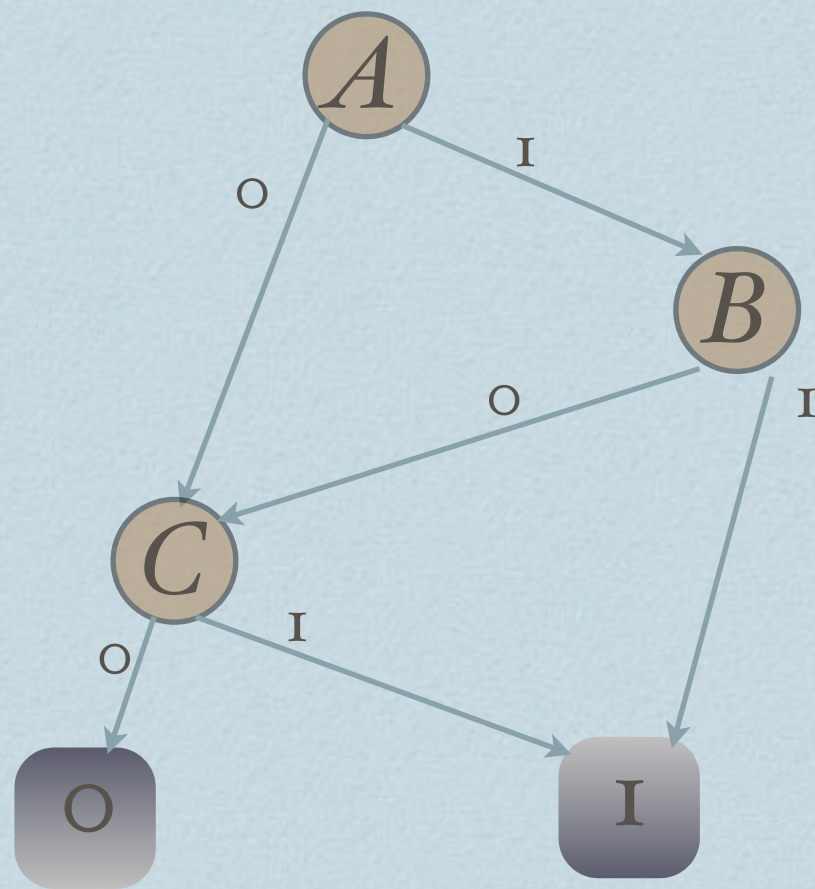
BDDs: Reduction



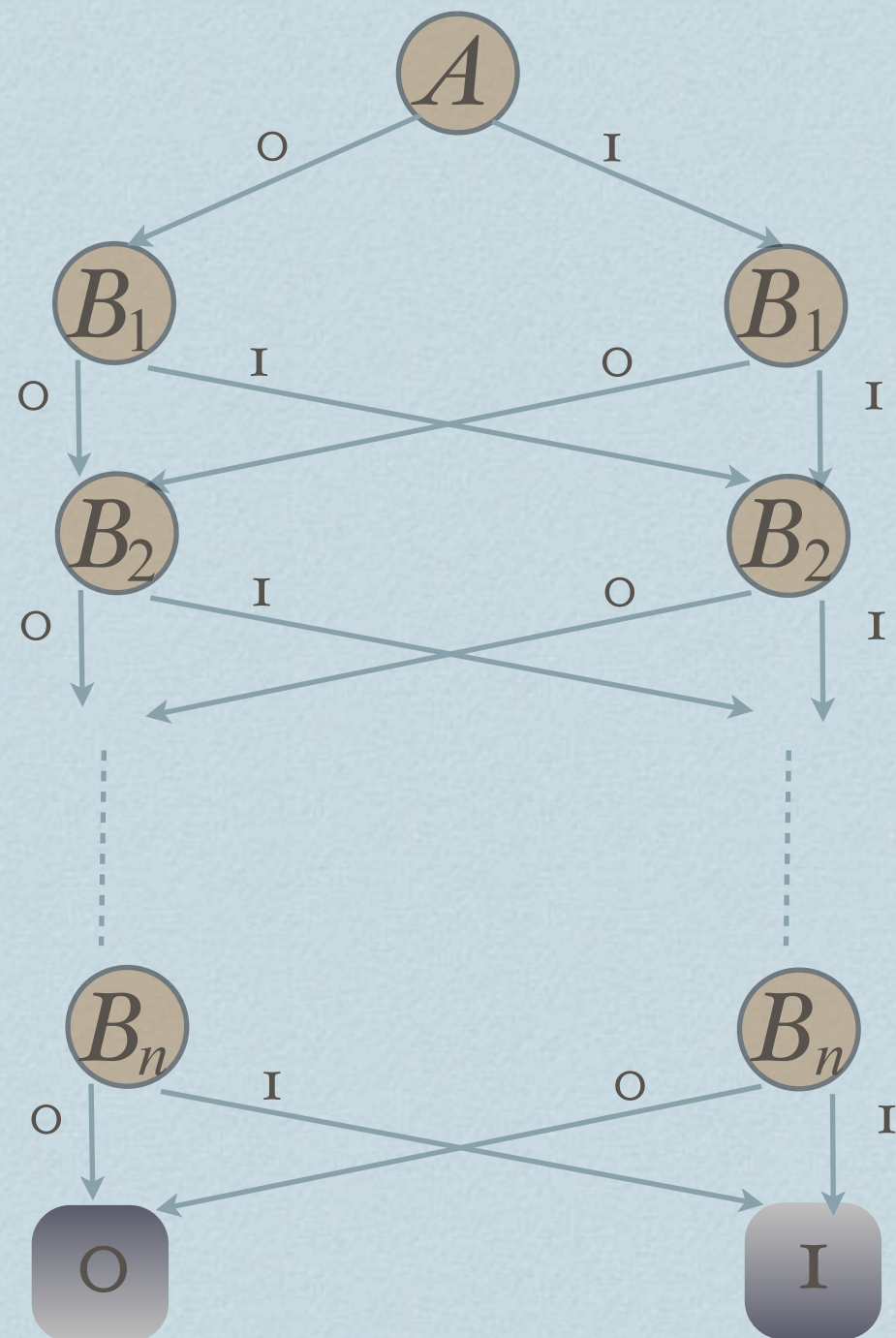
BDDs: Sharing



BDDs: Reduction



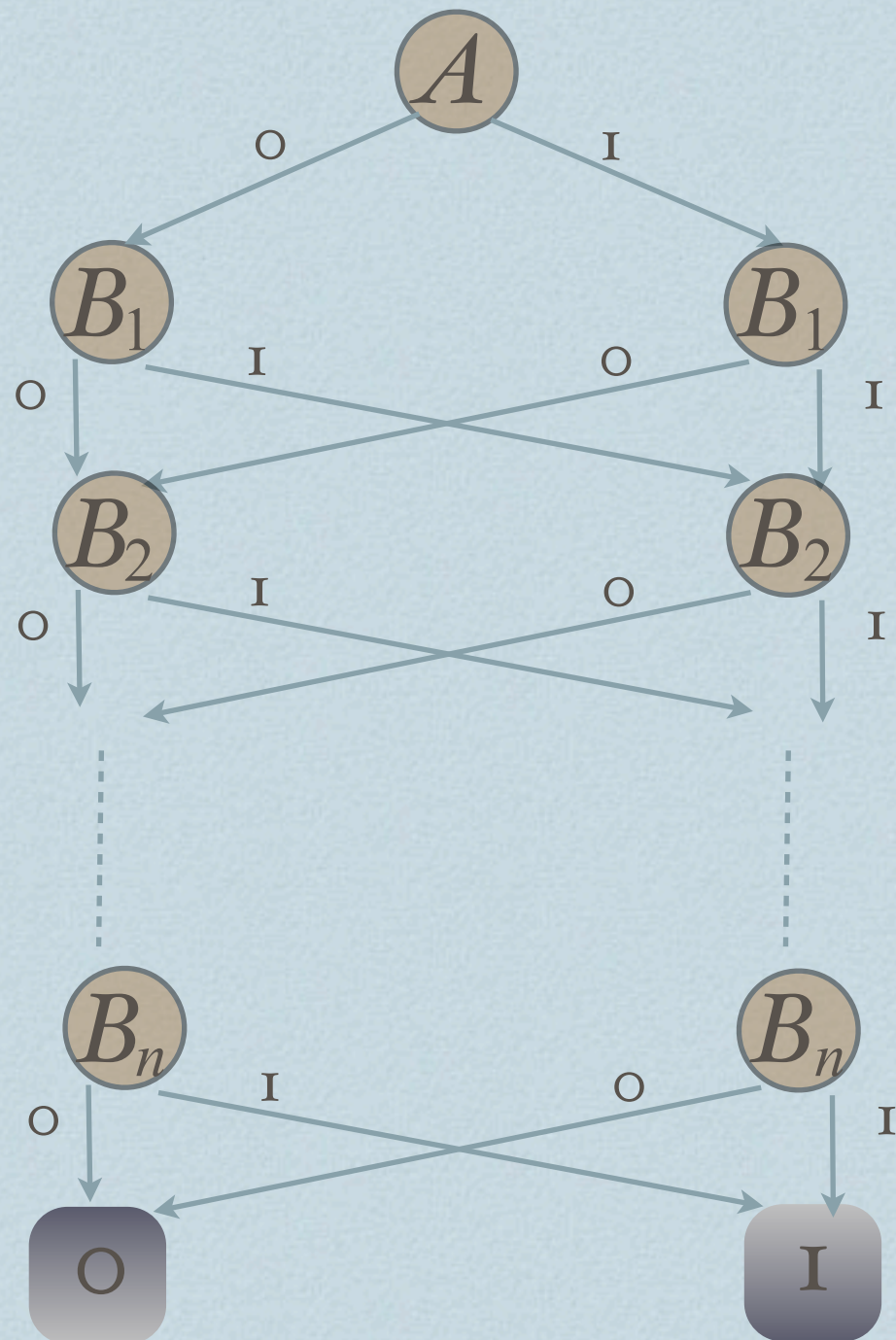
BDDs are Compact



❖ Space used: $2n+3$ nodes

❖ #configurations (paths): 2^{n+1}

BDDs are Compact



❖ Space used: $2n+3$ nodes

❖ #configurations (paths): 2^{n+1}

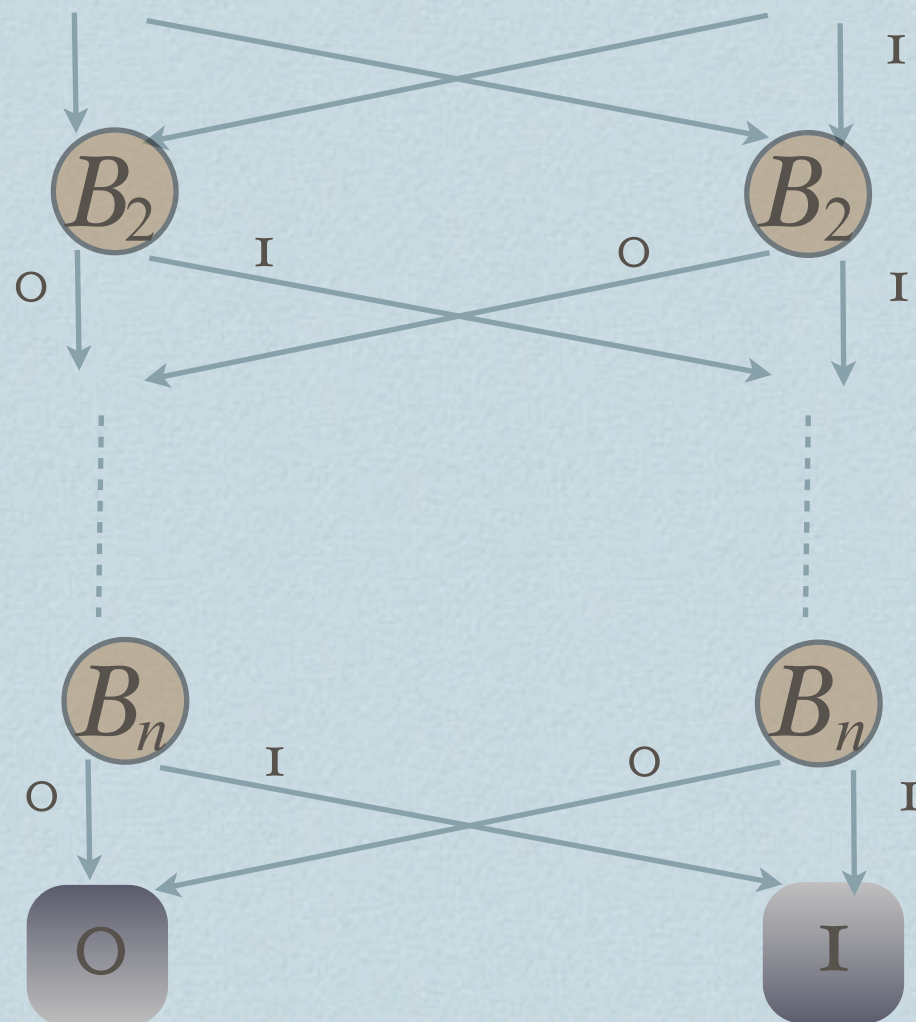
n	space used	# configs
50	103	$2 \cdot 10^{15}$
100	203	$2 \cdot 10^{30}$
150	303	$2 \cdot 10^{45}$
200	403	$2 \cdot 10^{60}$
250	503	$2 \cdot 10^{75}$
300	603	$2 \cdot 10^{90}$
350	703	$2 \cdot 10^{105}$
400	803	$2 \cdot 10^{120}$
450	903	$2 \cdot 10^{135}$

* Each node typically takes 16 bytes

BDDs are Compact

❖ Space used: $2n+3$ nodes

❖ #configurations (paths): 2^{n+1}



n	space used	# configs
50	103	$2 \cdot 10^{15}$
100	203	$2 \cdot 10^{30}$
150	303	$2 \cdot 10^{45}$
200	403	$2 \cdot 10^{60}$
250	503	$2 \cdot 10^{75}$
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400	803	$2 \cdot 10^{120}$
450	903	$2 \cdot 10^{135}$

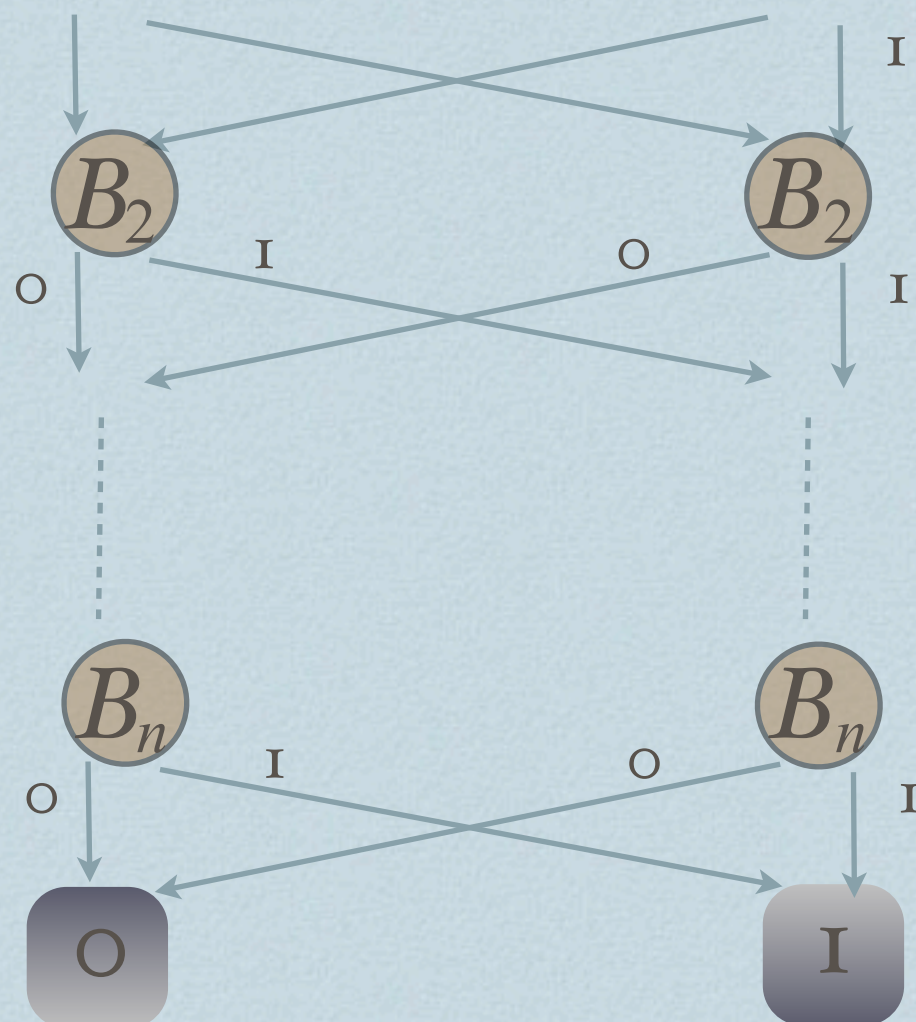
* Each node typically takes 16 bytes

BDDs are Compact

Smaller than your
typical
Word document

❖ Space used: $2n+3$ nodes

❖ #configurations (paths): 2^{n+1}



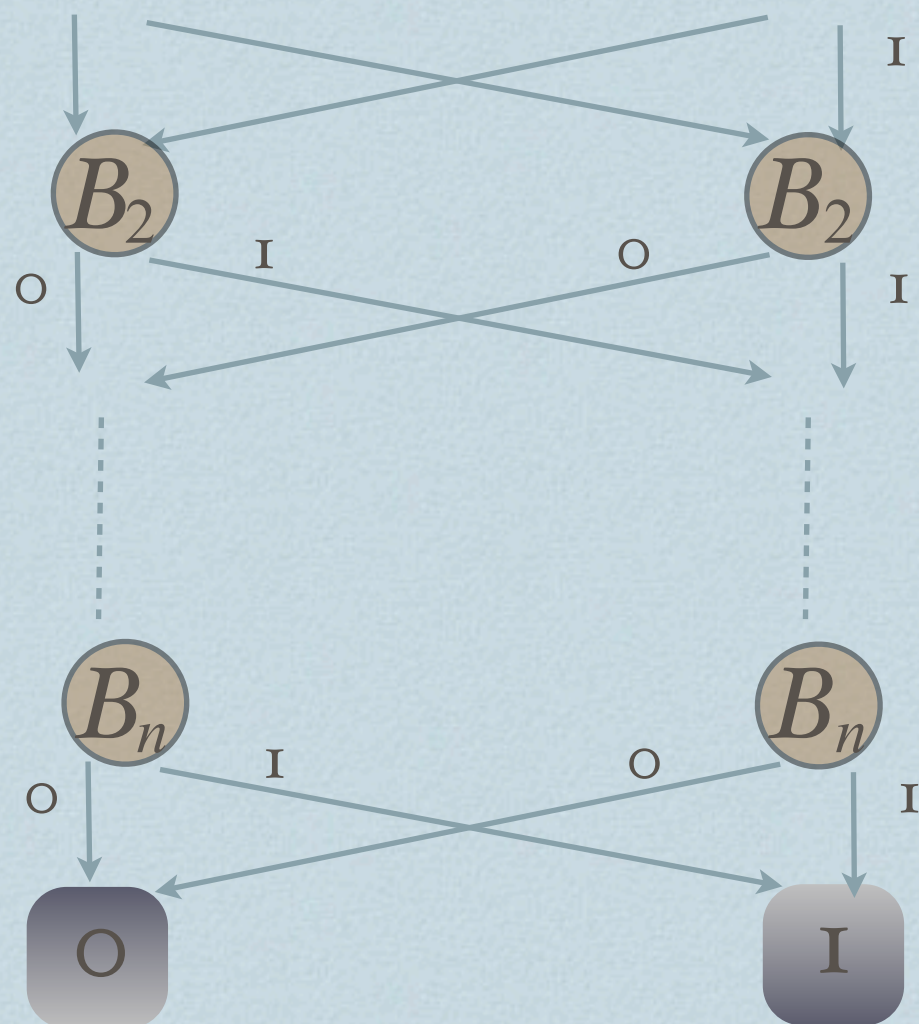
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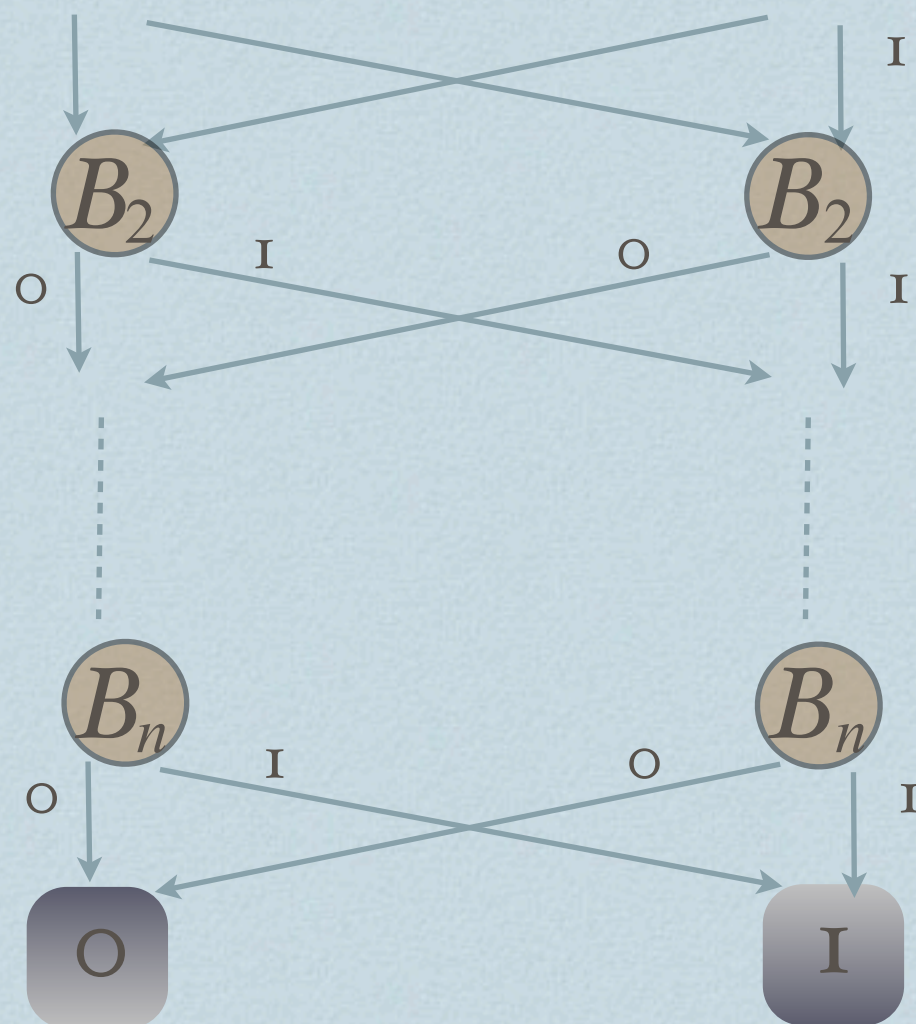
* Each node typically takes 16 bytes

BDDs are Compact

Larger than
your computer's
memory

❖ Space used: $2n+3$ nodes

❖ #configurations (paths): 2^{n+1}



n	space used	# configs
50	103	$2 \cdot 10^{15}$
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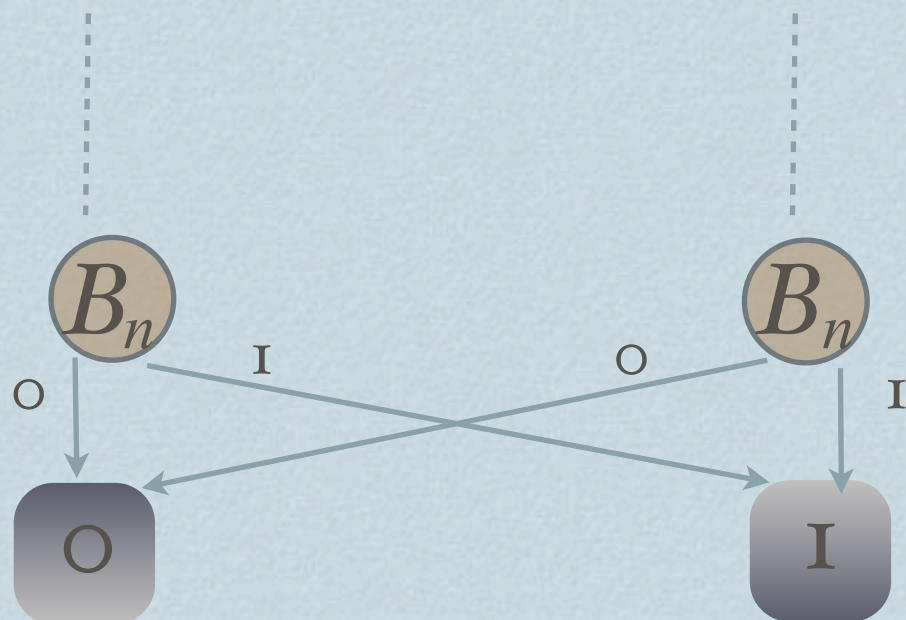
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BDDs are Compact

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memory

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- ❖ #configurations (paths): 2^{n+1}

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50	103	$2 \cdot 10^{15}$
100	203	$2 \cdot 10^{30}$
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* Each node typically takes 16 bytes

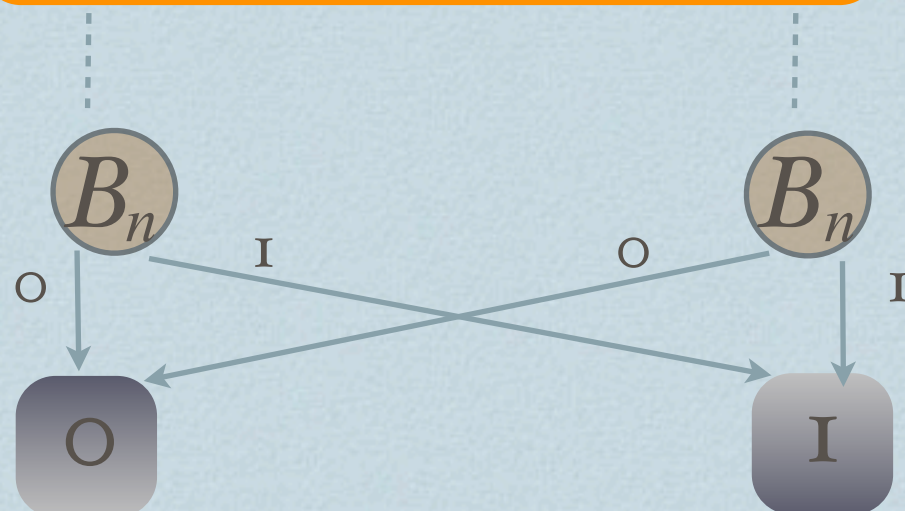
BDDs are Compact

Larger than
your computer's
memory

❖ Space used: $2n+3$ nodes

❖ #configurations (paths): 2^{n+1}

Larger than
the universe



n	space used	# configs
50	103	$2 \cdot 10^{15}$
100	203	$2 \cdot 10^{30}$
150	303	$2 \cdot 10^{45}$
200	403	$2 \cdot 10^{60}$
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350	703	$2 \cdot 10^{105}$
400	803	$2 \cdot 10^{120}$
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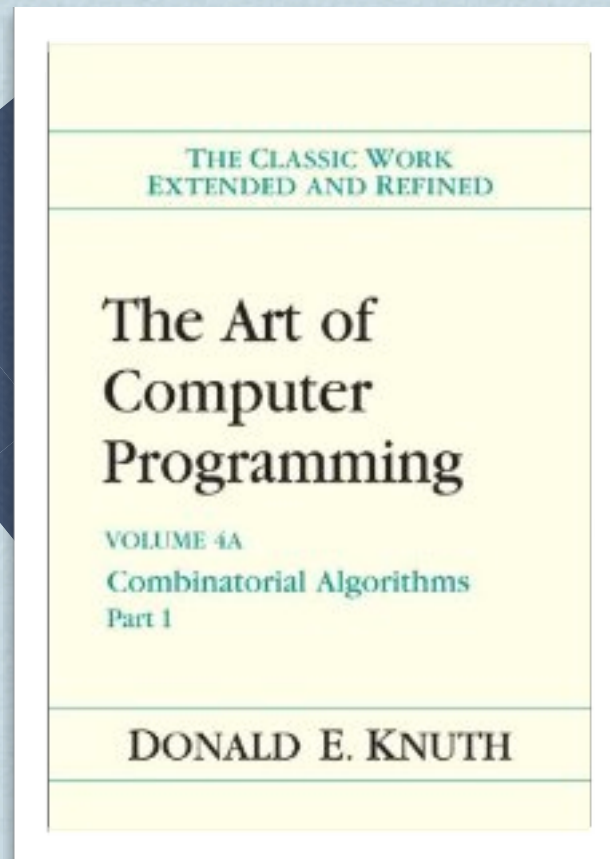
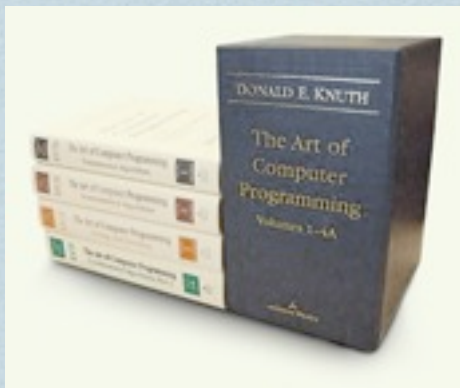
* Each node typically takes 16 bytes

BDDs Today

- ❖ Circuit verification
- ❖ Model-checking: verification, beyond circuits
- ❖ Circuit design
- ❖ Fault diagnosis
- ❖ Production configuration
- ❖ Etc.



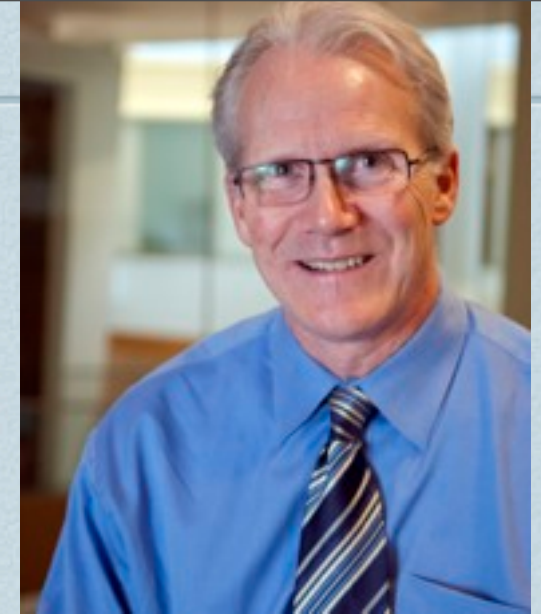
Want to Know More?



Volume 4A – Combinatorial Algorithms, Part 1

- Chapter 7 – Combinatorial Searching
 - 7.1. [Zeros and Ones](#)
 - 7.1.1. [Boolean](#) Basics
 - 7.1.2. Boolean Evaluation
 - 7.1.3. [Bitwise](#) Tricks and Techniques
 - 7.1.4. [Binary Decision Diagrams](#)
 - 7.2. Generating All Possibilities
 - 7.2.1. Generating Basic Combinatorial Patterns
 - 7.2.1.1. Generating all n-[tuples](#)
 - 7.2.1.2. Generating all permutations
 - 7.2.1.3. Generating all [combinations](#)
 - 7.2.1.4. Generating all [partitions](#)
 - 7.2.1.5. Generating all [set partitions](#)
 - 7.2.1.6. Generating all trees
 - 7.2.1.7. History and further references

Quick reference: http://en.wikipedia.org/wiki/Binary_decision_diagram



References

- ❖ **Sh. B. Akers**, “Binary decision diagrams,” *IEEE Transactions on Computers*, Vol. C-27, No. 6 (June, 1978), pp. 509-516
- ❖ **R.E. Bryant**, “Graph-based algorithms for Boolean function manipulation,” *IEEE Transactions on Computers*, Vol. C-35, No. 8 (August, 1986), pp. 677–691
- ❖ J.R. Burch, E.M. Clarke, K.L. McMillan, D.L. Dill, L.J. Hwang, “Symbolic model-checking: 10^{20} states and beyond,” *Information and Computation*, 98 (1992), pp. 142-170