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Binary decision diagram

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In [computer science](#), a **binary decision diagram** (**BDD**) or **branching program**, like a [negation normal form](#) (NNF) or a [propositional directed acyclic graph](#) (PDAG), is a [data structure](#) that is used to represent a [Boolean function](#). On a more abstract level, BDDs can be considered as a [compressed](#) representation of [sets](#) or [relations](#). Unlike other compressed representations, operations are performed directly on the compressed representation, i.e. without decompression.

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Definition [\[edit\]](#)

A Boolean function can be represented as a rooted, directed, acyclic [graph](#), which consists of several decision nodes and terminal nodes. There are two types of terminal nodes called 0-terminal and 1-terminal. Each decision node V_N is labeled by Boolean variable V_N and has two [child nodes](#) called low child and high child. The edge from node V_N to a low (or high) child represents an assignment of V_N to 0 (resp. 1). Such a **BDD** is called 'ordered' if different variables appear in the same order on all paths from the root. A BDD is said to be 'reduced' if the following two rules have been applied to its graph:

- Merge any [isomorphic](#) subgraphs.
- Eliminate any node whose two children are [isomorphic](#).

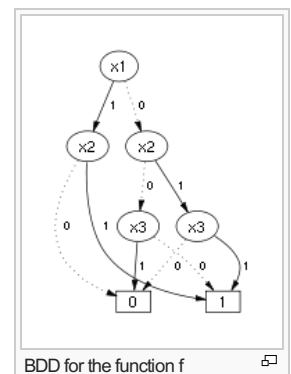
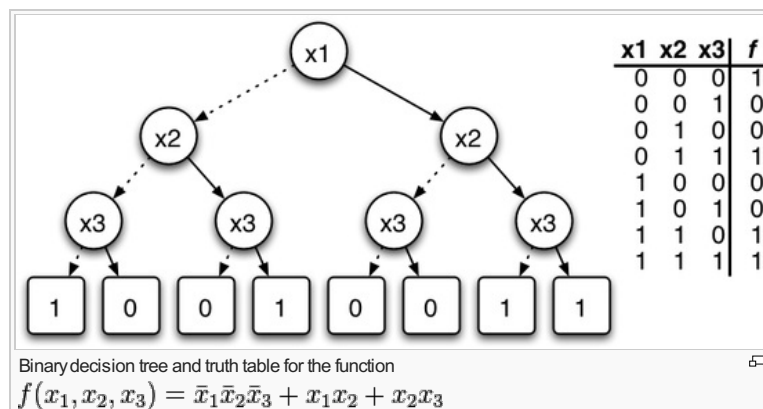
In popular usage, the term **BDD** almost always refers to **Reduced Ordered Binary Decision Diagram** (**ROBDD** in the literature, used when the ordering and reduction aspects need to be emphasized). The advantage of an ROBDD is that it is canonical (unique) for a particular function and variable order.^[1] This property makes it useful in [functional equivalence](#) checking and other operations like functional technology mapping.

A path from the root node to the 1-terminal represents a (possibly partial) variable assignment for which the represented Boolean function is true. As the path descends to a low (or high) child from a node, then that node's variable is assigned to 0 (resp. 1).

Example [\[edit\]](#)

The left figure below shows a binary [decision tree](#) (the reduction rules are not applied), and a [truth table](#), each representing the function $f(x_1, x_2, x_3)$. In the tree on the left, the value of the function can be determined for a given variable assignment by following a path down the graph to a terminal. In the figures below, dotted lines represent edges to a low child, while solid lines represent edges to a high child. Therefore, to find $(x_1=0, x_2=1, x_3=1)$, begin at x_1 , traverse down the dotted line to x_2 (since x_1 has an assignment to 0), then down two solid lines (since x_2 and x_3 each have an assignment to one). This leads to the terminal 1, which is the value of $f(x_1=0, x_2=1, x_3=1)$.

The binary decision *tree* of the left figure can be transformed into a binary decision *diagram* by maximally reducing it according to the two reduction rules. The resulting **BDD** is shown in the right figure.



History [\[edit\]](#)

The basic idea from which the data structure was created is the [Shannon expansion](#). A [switching function](#) is split into two sub-functions (cofactors) by assigning one variable (cf. *if-then-else normal form*). If such a sub-function is considered as a sub-tree, it can be represented by a [binary decision tree](#). Binary decision diagrams (BDD) were introduced by Lee,^[2] and further studied and made known by Akers^[3] and Boute.^[4]

The full potential for efficient algorithms based on the data structure was investigated by [Randal Bryant](#) at [Carnegie Mellon University](#): his key extensions were to use a fixed variable ordering (for canonical representation) and shared sub-graphs (for compression). Applying these two concepts results in an efficient data structure and algorithms for the representation of sets and relations.^{[5][6]} By extending the sharing to several BDDs, i.e. one sub-graph is used by several BDDs, the data structure *Shared Reduced Ordered Binary Decision Diagram* is defined.^[7] The notion of a BDD is now generally used to refer to that particular data structure.

In his video lecture *Fun With Binary Decision Diagrams (BDDs)*,^[8] [Donald Knuth](#) calls BDDs "one of the only really fundamental data structures that came out in the last twenty-five years" and mentions that Bryant's 1986 paper was for some time one of the most-cited papers in computer science.

[Adnan Darwiche](#) and his collaborators have shown that BDDs are one of several normal forms for Boolean functions, each induced by a different combination of requirements. Another important normal form identified by Darwiche is [Decomposable Negation Normal Form](#) or DNNF.

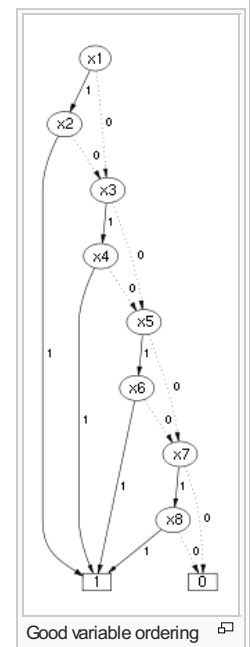
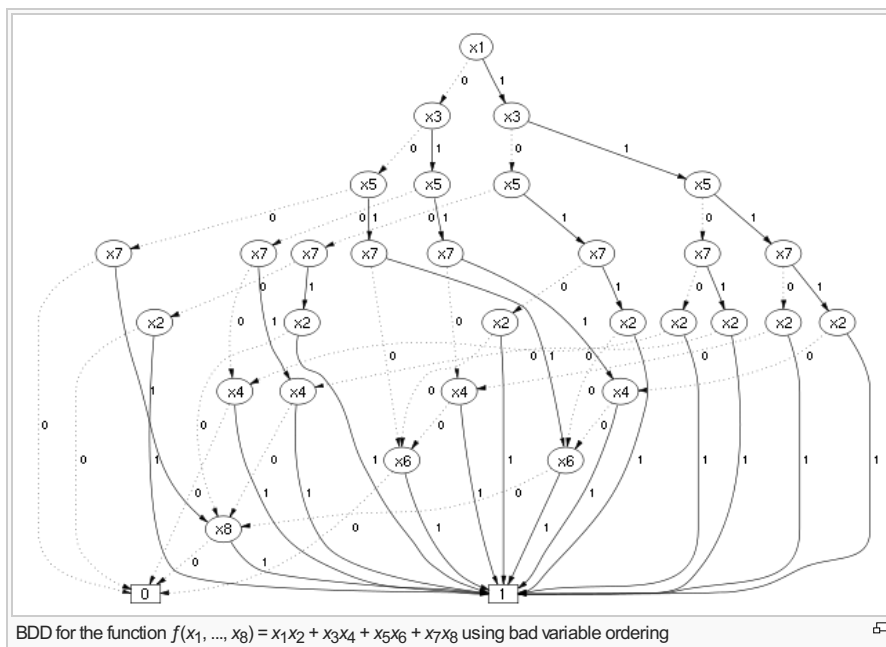
Applications [\[edit\]](#)

BDDs are extensively used in [CAD](#) software to synthesize circuits ([logic synthesis](#)) and in [formal verification](#). There are several lesser known applications of BDD, including [fault tree](#) analysis, [Bayesian](#) reasoning, product configuration, and [private information retrieval](#) ^[9] ^[10]^[citation needed].

Every arbitrary BDD (even if it is not reduced or ordered) can be directly implemented in hardware by replacing each node with a 2 to 1 [multiplexer](#); each multiplexer can be directly implemented by a 4-LUT in a [FPGA](#). It is not so simple to convert from an arbitrary network of logic gates to a BDD^[citation needed] (unlike the [and-inverter graph](#)).

Variable ordering [\[edit\]](#)

The size of the BDD is determined both by the function being represented and the chosen ordering of the variables. There exist Boolean functions $f(x_1, \dots, x_n)$ for which depending upon the ordering of the variables we would end up getting a graph whose number of nodes would be linear (in n) at the best and exponential at the worst case (e.g., a ripple carry adder). Let us consider the Boolean function $f(x_1, \dots, x_{2n}) = x_1x_2 + x_3x_4 + \dots + x_{2n-1}x_{2n}$. Using the variable ordering $x_1 < x_3 < \dots < x_{2n-1} < x_2 < x_4 < \dots < x_{2n}$, the BDD needs 2^{n+1} nodes to represent the function. Using the ordering $x_1 < x_2 < x_3 < x_4 < \dots < x_{2n-1} < x_{2n}$, the BDD consists of $2n + 2$ nodes.



It is of crucial importance to care about variable ordering when applying this data structure in practice. The problem of finding the best variable ordering is [NP-hard](#).^[11] For any constant $c > 1$ it is even NP-hard to compute a variable ordering resulting in an OBDD with a size that is at most c times larger than an optimal one.^[12] However there exist efficient heuristics to tackle the problem.^[13]

There are functions for which the graph size is always exponential — independent of variable ordering. This holds e. g. for the multiplication function^[1] (an indication^[citation needed] as to the apparent complexity of [factorization](#)).

Researchers have of late suggested refinements on the BDD data structure giving way to a number of related graphs, such as BMD

([binary moment diagrams](#)), ZDD ([zero-suppressed decision diagram](#)), FDD ([free binary decision diagrams](#)), PDD ([parity decision diagrams](#)), and MTBDDs (multiple terminal BDDs).

Logical operations on BDDs [\[edit\]](#)

Many logical operations on BDDs can be implemented by polynomial-time graph manipulation algorithms^[*citation needed*].

- [conjunction](#)
- [disjunction](#)
- [negation](#)
- [existential abstraction](#)
- [universal abstraction](#)

However, repeating these operations several times, for example forming the conjunction or disjunction of a set of BDDs, may in the worst case result in an exponentially big BDD. This is because any of the preceding operations for two BDDs may result in a BDD with a size proportional to the product of the BDDs' sizes, and consequently for several BDDs the size may be exponential.

See also [\[edit\]](#)

- [Boolean satisfiability problem](#)
- [L/poly](#), a [complexity class](#) that captures the complexity of problems with polynomially sized BDDs
- [Model checking](#)
- [Radix tree](#)
- [Binary key](#) – a method of species identification in biology using binary trees
- [Barrington's theorem](#)

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Further reading [\[edit\]](#)

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External links [\[edit\]](#)

- ↑ [Fun With Binary Decision Diagrams \(BDDs\)](#) , lecture by Donald Knuth
- ↑ [List of BDD software libraries](#) for several programming languages.



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