# Parallel Programming Patterns

Like all programs, parallel programs contain many **patterns**: useful ways of writing code that are used repeatedly by most developers because they work well in practice. These patterns have been documented by developers over time so that useful ways of organizing and writing good parallel code can be learned by new programmers (and even seasoned veterans).

### An organization of parallel patterns

When writing parallel programs, developers use patterns that can be grouped into two main categories:

- 1. Strategies
- 2. Concurrent Execution Mechanisms

### **Strategies**

When you set out to write a program, whether it is parallel or not, you should be considering two primary strategic considerations:

- 1. What algorithmic strategies to use
- 2. Given the algorithmic strategies, what *implementation strategies* to use

In the examples in this document we introduce some well-used patterns for both algorithmic strategies and implementation strategies. Parallel algorithmic strategies primarily have to do with making choices about what tasks can be done concurrently by multiple processing units executing concurrently. Parallel programs often make use of several patterns of implementation strategies. Some of these patterns contribute to the overall structure of the program, and others are concerned with how the data that is being computed by multiple processing units is structured. As you will see, the patternlets introduce more algorithmic strategy patterns and program structure implementation strategy patterns.

#### **Concurrent Execution Mechanisms**

There are a number of parallel code patterns that are closely related to the system or hardware that a program is being written for and the software library used to enable parallelism, or concurrent execution. These *concurrent execution* patterns fall into two major categories:

- 1. *Process/Thread control* patterns, which dictate how the processing units of parallel execution on the hardware (either a process or a thread, depending on the hardware and software used) are controlled at run time. For the patternlets described in this document, the software libraries that provide system parallelism have these patterns built into them, so they will be hidden from the programmer.
- 2. *Coordination* patterns, which set up how multiple concurrently running tasks on processing units coordinate to complete the parallel computation desired.

In parallel processing, most software uses one of two major *coordination patterns*:

- 1. **message passing** between concurrent processes on either single multiprocessor machines or clusters of distributed computers, and
- 2. **mutual exclusion** between threads executing concurrently on a single shared memory system.
- These two types of computation are often realized using two very popular C/C++ libraries:
- 1. MPI, or Message Passing Interface, for message passing.
- 2. OpenMP for threaded, shared memory applications.

OpenMP is built on a lower-level POSIX library called Pthreads, which can also be used by itself on shared memory systems.

A third emerging type of parallel implementation involves a *hybrid computation* that uses both of the above patterns together, using a cluster of computers, each of which executes multiple threads. This type of hybrid program often uses MPI and OpenMP together in one program, which runs on multiple computers in a cluster.

## Race condition

A race condition or race hazard is the behavior of an electronics, software, or other system where the output is dependent on the sequence or timing of other uncontrollable events. It becomes a bug when events do not happen in the order the programmer intended.

The term was already in use by 1954, for example in DA Huffman's paper "The synthesis of sequential switching circuits".

Race conditions can occur especially in logic circuits, and in multithreaded or distributed software programs.

#### Software

Race conditions arise in software when an application depends on the sequence or timing of processes or threads for it to operate properly. As with electronics, there are critical race conditions that result in invalid execution and bugs. Critical race conditions often happen when the processes or threads depend on some shared state. Operations upon shared states are critical sections that must be mutually exclusive. Failure to obey this rule opens up the possibility of corrupting the shared state.

The memory model defined in the C11 and C++11 standards uses the term "data race" for a race condition caused by potentially concurrent operations on a shared memory location, of which at least one is a write. A C or C++ program containing a data race has undefined behavior

Race conditions have a reputation of being difficult to reproduce and debug, since the end result is nondeterministic and depends on the relative timing between interfering threads. Problems occurring in production systems can therefore disappear when running in debug mode, when additional logging is added, or when attaching a debugger, often referred to as a "Heisenbug". It is therefore better to avoid race conditions by careful software design rather than attempting to fix them afterwards.

# **Categorizing Patterns**

There has been a fair amount of work by several researchers who have categorized patterns found in parallel programs. We have shown you simple examples of several of them that are very common when writing OpenMP programs that use shared memory. Now that you have seen them, you can try to imagine the patterns falling into the categories shown on the following diagram:

