

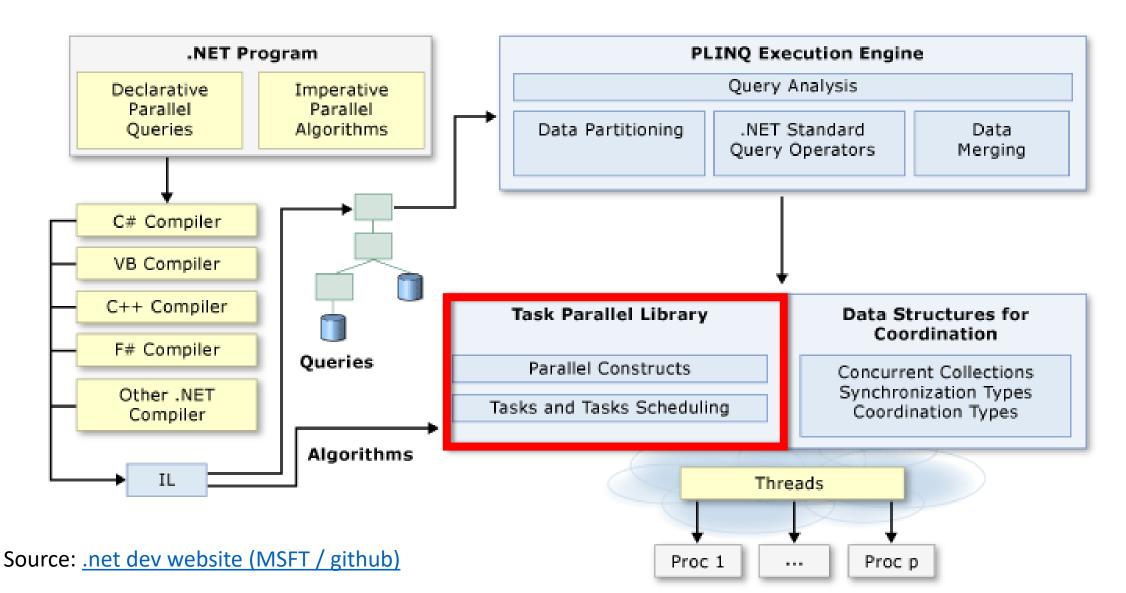
## Parallel Programming Patterns in .NET

- Introduction
- Task Parallel Library (TPL)
- Parallel LINQ (PLINQ)
- Data Structures for Coordination
- Introduction to TPL Dataflow

## Some Concepts

- Decompose
  - Your work into discrete units of work aka tasks
- Coordinate
  - These tasks as they run in parallel (e.g. join, fork)
- Share
  - The data needed to perform the tasks
- Potential Parallelism
  - Your program is written so that it runs faster when parallel hardware is available → parallel execution is not guaranteed!

## Parallel Programming in .NET - Overview



## Parallelize My FOR Loop – Basic Idea

- Assumption / Precondition: many core CPU
- Decomposition: one iteration step is a discrete unit of work
  - body of the for-loop is split evenly between all cores
  - we could use one thread per core
- Coordination: Wait until all iteration steps are executed
- Share: the current step (counter-variable of type int)

static void MyParallelFor(int inclusiveLowerBound, int exclusiveUpperBound, Action<int> body);

#### Demo



My Parallel FOR Loop (AsyncConsoleApp Demo02)

## MyParallelFor: Pro / Cons

- Pro: dedicated threads exist purely to process our code
- NET 4.x: Costs of a thread: 1 MB RAM → OutOfMemoryException
- NET core : extra layer & configuration → prevent memory exception
- Costs of a thread: start / stop time
- Oversubscription: reuse our loop in another async method
  - T1 creates T2 creates T3 ...
  - Thread context switches are expensive

## MyParallelFor: Improvements?

- Compensation: we could use ThreadPool class
  - Faster start-up / managed by OS (or .net core)
  - if workload is not equivalent for each iteration 

    how to balance load?
  - Limits for available threads
- Balancing by partitioning in dynamic iterations / thread
  - E.g.: threads compete for iterations, instead of static iterations splitting
  - Requires more load balancing work & code → more code executed!
- Spectrum of partitioning tradeoffs
  - Fully static partitioning
     Less Synchronization
     vs. More Load Balancing

## Task Parallel Library (TPL)

- Class Parallel, since .NET 4.0, supports delightfully parallel loops
- Parallel.For, Parallel.ForEach<TSource>
- Some highlights:
  - Use ThreadPool under the hoods
  - Exception handling
  - Efficient load balancing
  - Handles nested parallelism (Parallel.For -> Parallel.For)
  - Early breakout of a loop

#### Demo



Parallel.For

(Parallel Demo02ParallelFor)

## Exception handling: AggregateException

```
try
 Parallel.For(1, 10, i =>
                                 Console.WriteLine("Step {0}", i);
                                 if (i > 5) { throw new Exception("bäh"); }
                         });
catch (AggregateException ae)
 Console.WriteLine("InnerExceptions Count: {0}", ae.InnerExceptions.Count());
```

## Fork / Join Pattern

- Parallel.Invoke executes given delegates in parallel (FORK)
- Waits for completion of the given delegates (JOIN)
- class Parallel takes care of propagating exceptions and task scheduling

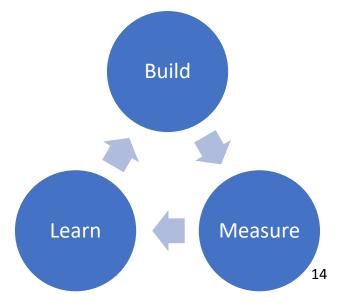
```
Parallel.Invoke (
    () => ComputeMean(),
    () => ComputeMedian(),
    () => ComputeMode() );
```

#### Parallel Anti-Patterns & Potential Pitfalls

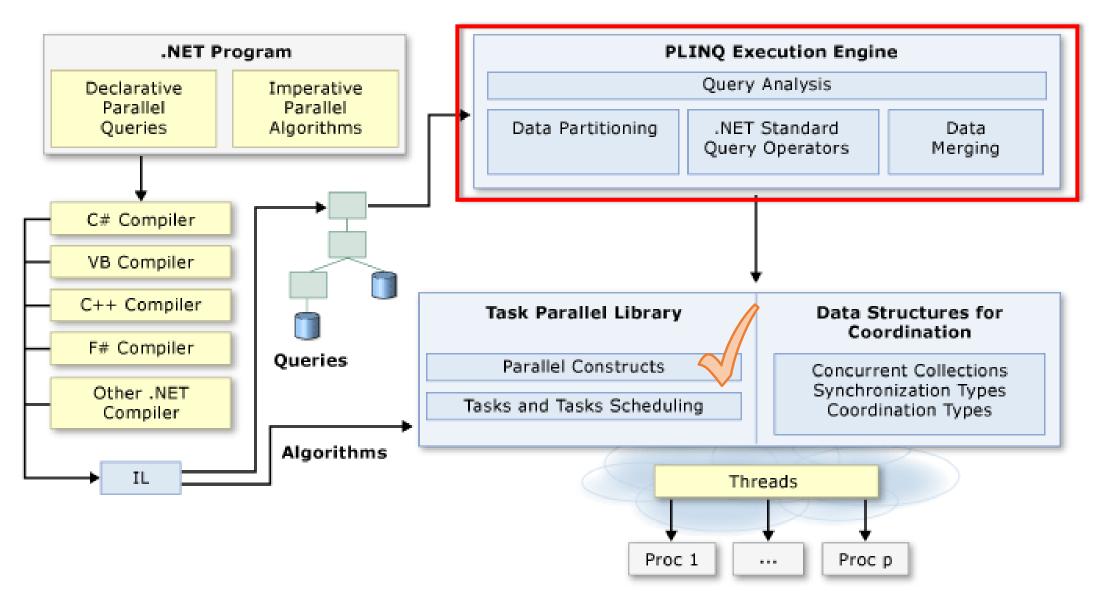
- Avoid shared data
  - don't share data between iteration steps
  - Use System.Threading.ThreadLocal<T> to share state between steps
  - If you update a globally shared data: code for concurrent access is needed
- No downward iteration
  - often dependencies between iteration steps
  - for(int i=upperBound-1; i>=0; --i) { /\*...\*/ }
- No stepped iterations in for-loop
  - Not directly supported in the overloaded methods

#### Parallel Anti-Patterns & Potential Pitfall

- Avoid very 'small / short' loop bodies
  - There is overhead for creating and calling parallel code
  - But: too coarse-grained steps is also bad (no partitioning possible)
- Avoid executing Parallel loops on the UI thread
  - Caller waits for response → UI is not responsive anymore!
- Don't assume Parallel. For is always faster
  - Build measure performance learn (= optimize)



# Parallel Programming in .NET Overview



#### PLINQ

- Parallel implementation of LINQ to Objects
- Classes ParallelEnumerable and ParallelQuery<T>
  - Transform a IEnumerable<T> by calling extension method AsParallel() to a ParallelQuery<T>

#### Demo

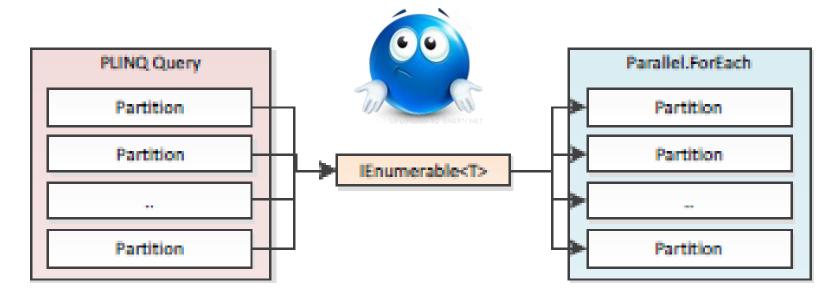


PLINQ

(Parallel Demo03)

## PLINQ and Parallel – Don't mix!

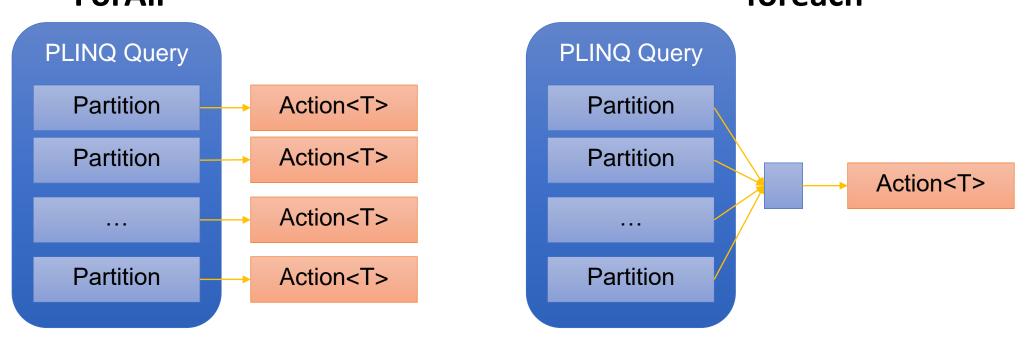
- Don't mix Parallel loop and ParallelQuery
  - PLINQ partitions → streams to IEnumerable → Parallel partitions again



• Use ParallelEnumerable.ForAll to iterate a ParallelQuery<T>

#### ForAll Method vs foreach Statement

Iterating a ParallelQuery with ParallelEnumerable.ForAll or foreach
 ForAll



### PLINQ Anti-Patterns and Pitfalls

- Small computational cost / short running methods
  - The more computational expensive, the greater the opportunity for speedup

```
var queryA = from num in numberList.AsParallel()
    select ExpensiveFunction(num); //good for PLINQ

var queryB = from num in numberList.AsParallel()
    where num % 2 > 0
    select num; //not good for PLINQ
```

### PLINQ Anti-Patterns and Pitfalls

Avoid over-parallelization

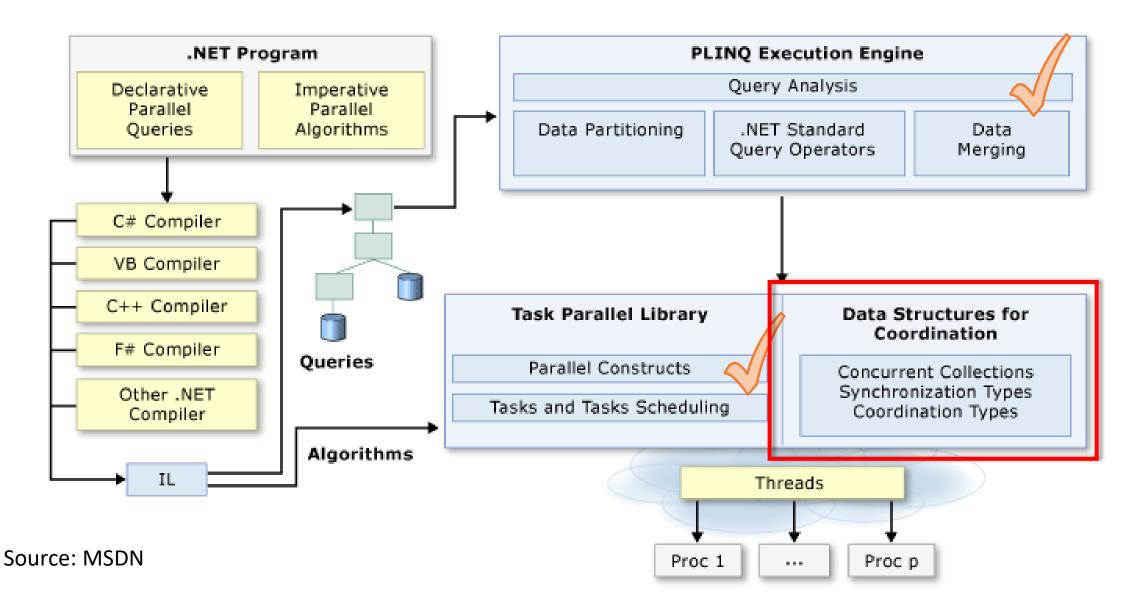
```
var q = from cust in customers.AsParallel()
    from order in cust.Orders.AsParallel()
    where order.OrderDate > date
    select new { cust, order };
```

- Avoid unnecessary ordering operations

## PLINQ Anti-Patterns and Pitfalls

- Avoid calls to non-thread-safe methods
- Limit calls to thread-safe methods
  - lock(syncObj) is expensive
  - Use class ReadWriteLockSlim
- Avoid accessing shared memory
  - E.g. static variables

## Parallel Programming in .NET Overview



#### Data Structures for Coordination

#### Collection classes aka Thread-safe collections

- System.Collections.Concurrent.**BlockingCollection**<T>
- ConcurrentBag<T>
- Concurrent**Dictionary**<TKey, TValue>
- ConcurrentQueue<T>
- Concurrent**Stack**<T>

#### Demo



Producer / Consumer with BlockingCollection

#### Data Structures for Coordination

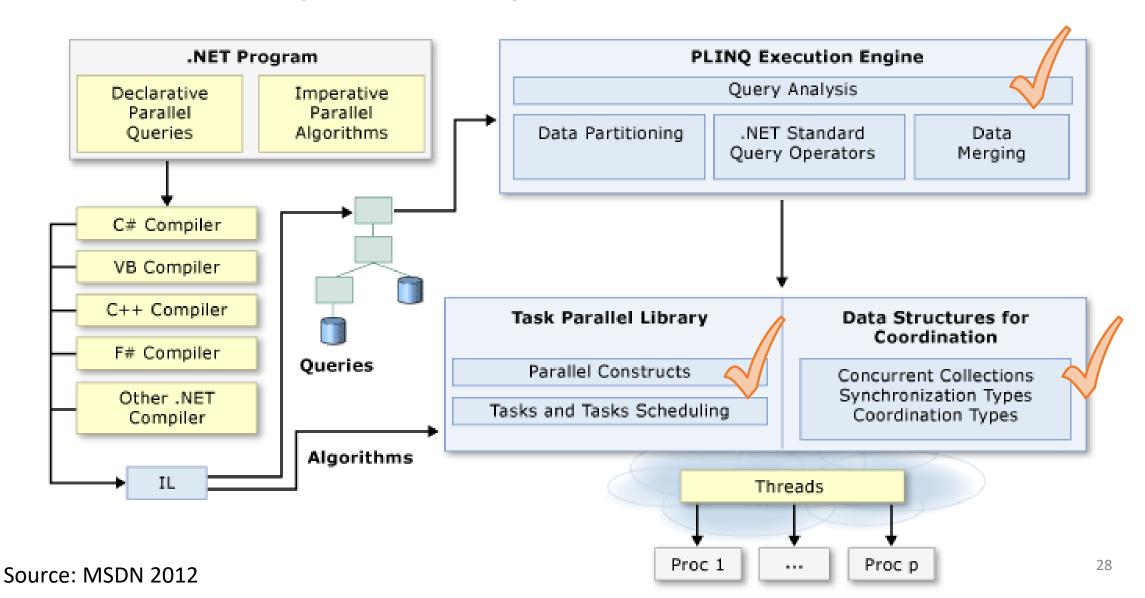
- Same data structures used for coordinating Threads, such as
  - System.Threading.Barrier class
    - Enables multiple threads to work on an algorithm in parallel by providing a point at which each task can signal its arrival and then block until some or all tasks have arrived.
  - CountdownEvent
    - Simplifies fork and join scenarios by providing an easy rendezvous mechanism.
  - ManualResetEventSlim
  - SemaphoreSlim
    - A synchronization primitive that limits the number of threads that can concurrently access a resource or a pool of resources.

#### Data Structures for Coordination

#### Lazy initialization classes:

- System.Lazy<T>
   Provides lightweight, thread-safe lazy-initialization i.e. deferring the creation of large / resource intensive objects.
- System.Threading.ThreadLocal<T>
   Provides a lazily-initialized value on a per-thread basis, with each thread lazily-invoking the initialization function.
- System.Threading.LazyInitializer
   Provides static methods that avoid the need to allocate a dedicated, lazy initialization instance. Instead, they use references to ensure targets have been initialized as they are accessed.

## Parallel Programming in .NET Overview



# One more thing ...

- Introduction to TPL Dataflow
- Hint: Take a look at Reactive Extensions (Rx)



## TPL Dataflow (TDF)

- TPL Dataflow (TDF) is a.NET library for building concurrent applications.
- It promotes actor/agent-oriented designs through primitives for inprocess message passing, dataflow, and pipelining.
- TDF builds upon the APIs and scheduling infrastructure provided by the Task Parallel Library (TPL, since .NET 4), and integrates with the language support for asynchrony provided by C#, Visual Basic, and F#.

#### TPL Dataflow Introduction

# **Dataflow Tasks**

Task Parallel Library

Coordination Data Structures

## Threads

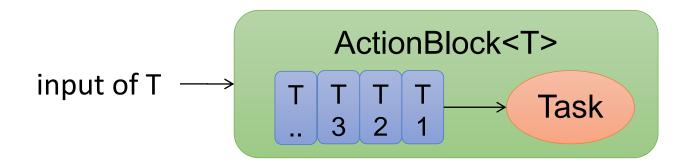
#### TDF Introduction

- Network of data flow blocks
- Like pipelines / consumer producers / message processing agents



## TDF (TPL Data Flow) Introduction

- A DataFlow block is a message buffering strategy with an async Task processing the messages
  - E.g. ActionBlock<T> which executes an action for each <T>
  - Degree of parallelism is configurable



#### Demo



Single ActionBlock

(Parallel Demo06)

#### TDF Introduction

- Data is always processed asynchronously
  - Tasks need not be scheduled explicitly
- TDF is a generator of tasks (like Parallel class and PLINQ)
  - Developers declaratively express data dependencies
- System.Threading.Tasks.Dataflow (NuGet package)

#### TDF Block Interfaces

- ISourceBlock<TOutput> generates messages
- ITargetBlock<TInput> processes messages
- IPropagatorBlock<in TInput, out TOutput> processes incoming messages and outputs the result to the next block
  - IPropagatorBlock inherts from ISourceBlock and ITargetBlock
  - Most of the predefined blocks are propagator blocks

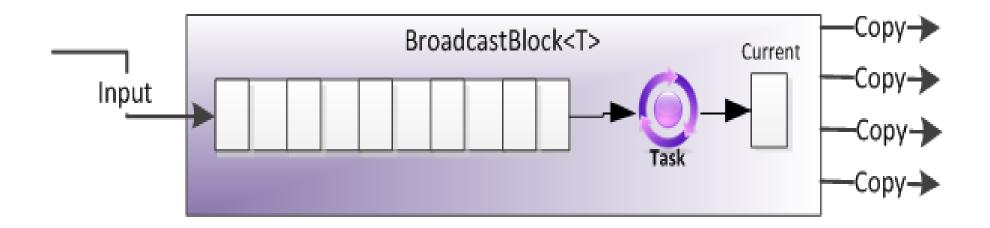
## TDF Block Categories

#### There are three built –in TDF block categories:

- Pure buffering blocks
  - Buffer data in various ways
- Execution blocks
  - Execute user –provided code in response to data provided to the block
- Grouping blocks
  - Group data across one ore more source and under various constraints

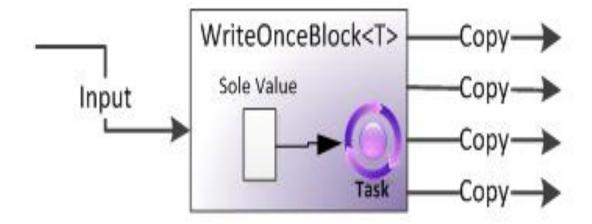
## Pure Buffering Blocks

- BufferBlock<T>
  - Propagator for buffering instances of T for later consumption (FIFO queue)
  - Only one receiver
- BroadcastBlock<T>
  - All targets receive a copy by a user-provided cloning Fun<T,T>



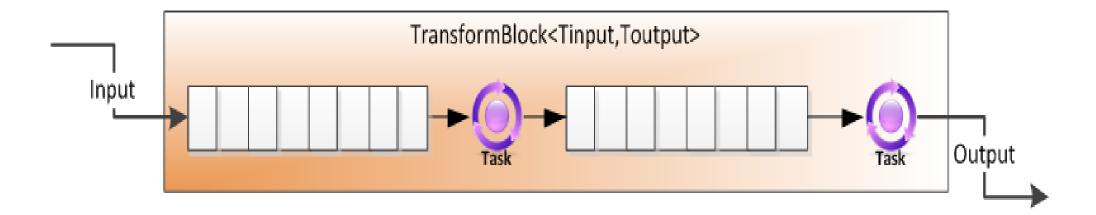
## Pure Buffering Blocks

- WriteOnceBlock<T>
  - Similar to a read-only variable: write one value once in a time



#### **Execution Blocks**

- ActionBlock<T>
  - execution of a delegate to perform some action for each input
  - Can be used with synchronous and asynchronous action methods
- TransformBlock<TInput,TOutput>
  - Like ActionBlock but with an output Func<TInput, TOutput>

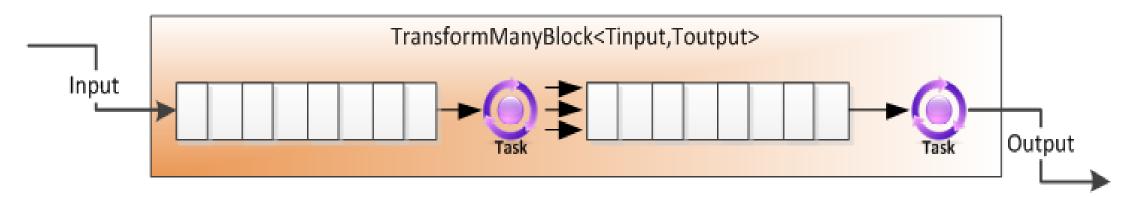


#### **Execution Blocks**

TransformBlock code sample

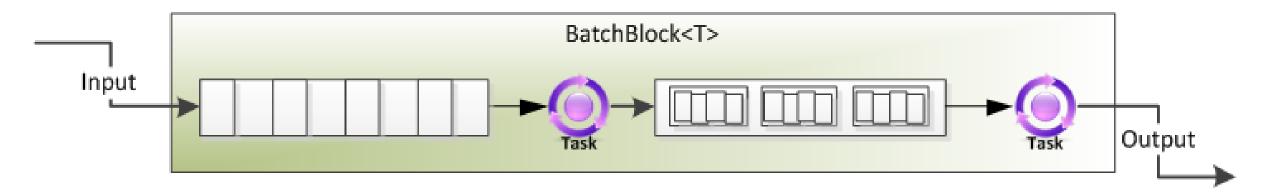
```
var compressor = new TransformBlock<byte[],byte[]>(input => Compress(input));
var encryptor = new TransformBlock<byte[],byte[]>(input => Encrypt(input));
compressor.LinkTo(encryptor);
```

- TransformManyBlock <TInput, TOutput>
  - Like TransformBlock but produces 1-N outputs for each input



## Grouping Blocks

- BatchBlock<T>
  - combines N single items into one batch item, represented as an array of elements
  - Supports greedy and non greedy modes

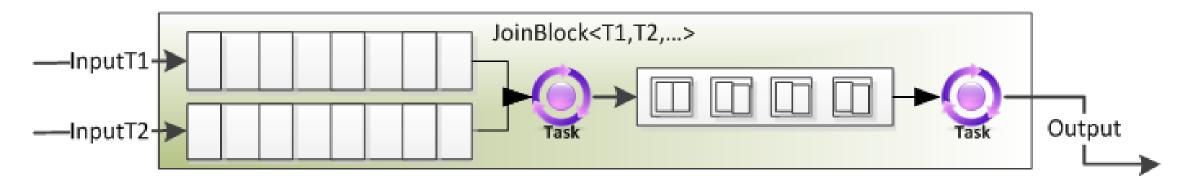


## Grouping Blocks

BatchBlock code exsample

```
var batchRequests = new BatchBlock<Request>(batchSize:100);
var sendToDb = new ActionBlock<Request[]>(reqs => SubmitToDatabase(reqs));
batchRequests.LinkTo(sendToDb);
```

- JoinBlock<T1,T2,...>
  - Group from multiple inputs to one output using Tuple<>



## Hint: Reactive Extensions (Rx)

- Idea: use LINQ query operators with live data streams
   (e.g., events received from Azure Event Hub, or Kafka, not Event Grid)
- Rx elevates live data streams to first-class citizens in .NET / JavaScript, allowing developers to react to data as it arrives
  - handle continuous stream of events
- It is built around the IObservable<T> (IAsyncObservable<T>) and IObserver<T> interfaces, enabling a push-based collection model
  - event is pushed into your code, when it becomes available
- To compose asynchronous and event-based programs declaratively
- TPL offers AsObserver / AsObservable extension methods
- GitHub dotnet/reactive: The Reactive Extensions for .NET

## Summary

- Task Parallel Library Delightful parallel loops
- PLINQ declarative, parallel linq queries
- Coordination data structures
- TDF delightful parallel algorithms using data flow blocks, where data flows through a network of blocks