# IMPLEMENTATION OF MBRACE FOR LARGE-SCALE CLOUD COMPUTING

DIPLOMA PROJECT

Kostas Rontogiannis July 2015

National Technical University of Athens School of Electrical and Computer Engineering

## WHAT IS MBRACE?

- MBrace is a simple programming model for cloud programming.
- · Written in F#/.NET.
- · Nessos Information Technologies.
- · Open source https://github.com/mbraceproject.
- Refactored from a monolithic framework to a runtime agnostic model (MBrace.Core).

### **DIPLOMA THESIS**

- The MBrace programming model.
- Implement a runtime for MBrace on top of Microsoft Azure (MBrace.Azure).

## PROGRAMMING MODEL

### MBRACE.CORE

- · MBrace programming model.
- Basic data structures and algorithms.
- Foundations for implementing MBrace runtimes.

## F# COMPUTATION EXPRESSIONS

- MBrace is based on F# computation expressions.
- · Give custom semantics to F# code.
- Additional grammar rule :  $\langle expr \rangle := \langle cbuilder \rangle' \{' \langle cexpr \rangle' \}'$

#### **SYNTAX**

```
⟨cexpr⟩ := 'do!' < expr >
    'let!' <pat> '=' <expr> 'in' <cexpr>
    'let' <pat> '=' <expr> 'in' <cexpr>
    'return!' <expr>
    'return' <expr>
    <cexpr> ':' <cexpr>
    'if' <expr> 'then' <cexpr> 'else' <cexpr>
    'match' <expr> 'with' <pat> '->' <cexpr>
    'while' <expr> 'do' <cexpr>
    'for' <pat> 'in' <expr> 'do' <cexpr>
    'use' <val> '=' <expr> 'in' <cexpr>
    'use!' <val> '=' <expr> 'in' <cexpr>
    'try' <cexpr> 'with' <pat> '->' <cexpr>
    'try' <cexpr> 'finally' <expr>
    <expr>
```

Defining a custom computation expression (like the cloud workflow) is straightforward by creating a **cbuilder** class and defining certain special methods on the class like **Bind**, **Return**, etc.

### **ASYNC WORKFLOWS**

```
let getLength (uri : Uri) : int =
    let client = new System.Net.WebClient()
    let html = client.DownloadString(uri)
    html.Length
```

```
let getLengthAsync (uri : Uri) : Async<int> =
    async {
        let client = new System.Net.WebClient()
        let! html = client.AsyncDownloadString(uri)
        return html.Length
    }
```

- The effect of let! is to enable execution to continue on other threads.
- After the right side of the let! binding returns, the rest of the asynchronous workflow resumes execution.

### **MONADS**

Computation expressions provide convenient syntax for monads.

Method Signature

Bind : M<'T> \* ('T  $\rightarrow$  M<'U>)  $\rightarrow$  M<'U>

Return : 'T  $\rightarrow$  M<'T>

Cloud<T> is the basic type for all cloud workflows.

```
let helloWorld : Cloud<int> =
    cloud {
        return 42
    }

let runtime = Runtime.GetHandle(azureConfiguration)
let result = runtime.Run helloWorld

val result : int = 42
```

Example 1: The MBrace hello world

Parallelism

## **PARALLEL**

Cloud.Parallel : Cloud<'T> seq  $\rightarrow$  Cloud<'T []>

```
Cloud.Parallel : Cloud<'T> seq \rightarrow Cloud<'T []>
```

```
let parallelWorkflow : Cloud<int []> =
    cloud {
        let compute i = cloud { return i * i }
        let! results =
            [1..10]
            |> List.map compute
            |> Cloud.Parallel
        return results
// Evaluate workflow
runtime.Run(parallelWorkflow)
val it : int [] = [|1;4;9;16;25;36;49;64;81;100|]
```

## CHOICE

Cloud.Choice : Cloud<'T option> seq  $\rightarrow$  Cloud<'T option>

## Cloud.Choice : Cloud<'T option> $seq \rightarrow Cloud<'T option>$

```
let findIndex (xs : 'T []) (item : 'T) : Cloud<int option> =
    cloud {
         return! xs | > Seq.mapi (fun index x \rightarrow index, x)
                     \mid > Seq.map (fun (i,x) \rightarrow
                           cloud {
                               return
                                    if x = item then Some i
                                    else None
                           })
                     l > Cloud, Choice
// Evaluate workflow
runtime.Run(findIndex [|0..100|] 42)
val it : int option = Some 42
```

## **STARTASTASK**

 ${\tt Cloud.StartAsTask} \; : \; {\tt Cloud<'T>} \; \rightarrow \; {\tt Cloud<ICloudTask<'T>>} \;$ 

### Cloud.StartAsTask : Cloud<'T> → Cloud<ICloudTask<'T>>

```
let workflow : Cloud<int * TimeSpan> =
    cloud {
        // Spawn a CloudTask
        let! ctask =
            Cloud.StartAsTask(
                cloud {
                    do! Cloud.Sleep 20000
                    return 42
                })
        let watch = Stopwatch.StartNew()
        // Block until ctask completes
        let! value = ctask.AwaitResult()
        watch.Stop()
        return value, watch. Elapsed
    } // (42, 00:00:22.4323827)
```

## mbrace.flow

MBrace.Flow is Spark-like library, that provides and easy way to describe data parallel streaming computations, with caching and in-memory computation capabilities.

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```
open MBrace.Flow
let workflow : Cloud<(string * int64) []> =
    CloudFlow.OfCloudFileByLine "foobar.txt"
    |> CloudFlow.collect(fun line → line.Split(' '))
    |> CloudFlow.filter(fun word → word.Length > 3)
    |> CloudFlow.countBy id
    |> CloudFlow.toArray
```

#### OTHER APIS

**Cancellation** Cooperative cancellation like .NET; using cancellation tokens.

**Exception handling** Exceptions can be raised, handled and transferred between machines.

Job scheduling Force execution of jobs in specific workers.

**Constraining execution** Suppress any distribution effects, force computation evaluation in-memory, etc.

## **PITFALLS**

```
let workflow : Cloud<int> =
    cloud {
        let cell = ref 0
        do! [1...10]
             \mid > List.map (fun \_ \rightarrow
                  cloud { cell := !cell + 1 })
             |> Cloud.Parallel
             |> Cloud.Ignore
        return !cell
runtime.Run workflow
val it : int = 0
```

Example 3: Value mutation and race conditions

Example 4: Capturing large objects

### **STORAGE**

**MBrace** offers a plethora of abstractions for managing data in a global, machine-wide scope.

## CLOUDVALUE<T>

- · Lightweight reference to persisted data.
- · Immutable, can be either initialized or dereferenced.
- · Can be cached in-memory.

Example 5: Using a CloudValue

## mbrace storage primitives

**CloudFile** reference to untyped binary files.

CloudValue immutable, typed data.

**CloudSequence** immutable, collection of items, on-demand fetch.

CloudChannel send/receive messages.

**CloudAtom** mutable data with concurrency control (atomic or non-atomic updates).

CloudDictionary key-value store.

How to handle hardware (worker node) or unrecoverable runtime failure?

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The high-level strategy is:

- · Define your retry strategy and policy.
- Try the operation that could result in a transient fault.
- · If transient fault occurs, invoke the retry policy.
- If all retries fail, raise a FaultException.

```
type FaultPolicy =
     { Policy : int → exn → TimeSpan option }

Cloud.FaultPolicy: Cloud<FaultPolicy>
Cloud.WithFaultPolicy:
     FaultPolicy → Cloud<'T> → Cloud<'T>
Cloud.StartAsTask:
     (Cloud<'T> * FaultPolicy) → Cloud<ICloudTask<'T>>
```

```
let result =
    runtime.Run(
        [1..4]
         \mid > List.map (fun i \rightarrow
             cloud { return i <> 2 || exit 1 })
         |> Cloud.Parallel
    , faultPolicy = FaultPolicy.NoRetry)
MBrace.Core.FaultException:
 Fault exception when running job
    '071b96a23264423890cb6577184c6fa6', faultCount '1'
at Cloud.Parallel(seg<Cloud<Boolean» computations)
```

## IMPLEMENTATION

## **CONTINUATIONS**

Cloud<T> is the basic type describing any cloud computation.

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Cloud<T> is the basic type describing any cloud computation. By performing a CPS transformation on cloud expressions we can view a Cloud<T> as continuation based distributed computation.

```
type Continuation<'T> = {
    SCont : 'T → unit
    ECont : exn → unit
    CCont : OperationCancelledException → unit
}
```

### CONTINUATIONS

How to implement a non-trivial operator like Cloud. Parallel?

- Continuation<T> declares the semantics (cancel on first exception, etc).
- We need a handle to runtime resources in order to enqueue jobs, etc.

**ExecutionContext** contains all types necessary for a computation to interact with the runtime.

#### **EXECUTION CONTEXT**

# Is Continuation<T> enough?

- Cloud<T>/Continuation<T> are transferred across the cluster (serializable).
- But ExecutionContext is has a machine/local scope: worker state, local cache, custom resources, etc.

#### READER MONAD

- · Read values and pass state from a shared environment.
- ExecutionContext is the machine-local environment.
- The continuations are constructed by supplying the worker's ExecutionContext.

```
type Continuation < 'T> = {
   SCont : ExecutionContext → 'T → unit
   ECont : ExecutionContext → exn → unit
   CCont : ExecutionContext → OperationCancelledException → unit
}
```

```
type Continuation < 'T> = {
   SCont : ExecutionContext → 'T → unit
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}
```

```
Cloud.FromContinuations<'T> :
    (ExecutionContext → Continuation<'T> → unit) → Cloud<'T>
Cloud.GetResource<'T> : unit → 'T
```

A cloud workflow Cloud<T> is a function accepting three continuations, scont, econt, ccont and a context ectx.

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```
\textbf{type} \hspace{0.2cm} \textbf{Cloud} \texttt{<'T>} \hspace{0.2cm} = \hspace{0.2cm} \textbf{ExecutionContext} \rightarrow \hspace{0.2cm} \textbf{Continuation} \texttt{<'T>} \rightarrow \hspace{0.2cm} \textbf{unit}
```

The cloud monad forms a continuation over reader monad.

# RUNTIME

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MBrace.Azure is based on Microsoft Azure services.

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**Service Bus** is a cloud-based messaging system for connecting distributed applications.

Azure Storage provides the capability to store large amounts of binary data in Azure Blobs, as well as structured NoSQL based records with Azure Tables.

**Cloud Services MBrace.Azure** is hosted in a Worker Role (Platform as a Service).

# mbrace.azure FEATURES

- · Complete implementation of MBrace.Core.
- Hosted as a Azure worker role / standalone executable for local testing.
- · Worker monitoring: cpu, memory, network utilization, etc.
- Execute computations as 'processes': statistics about execution time, current status, number of jobs spawned, etc.
- Job tracking: execution times, number of retries, serialized job size, current status, assigned worker, etc.
- · Logging.

# mbrace.azure FEATURES

- Fault tolerance, built on top of Service Bus Lease/Lock mechanism.
- · All storage primitives:
  - · CloudFiles are implemented as Azure Blobs.
  - CloudAtoms, CloudDictionaries are implemented on top of the Azure Table storage.
  - · CloudChannels are implemented using Service Bus queues.
- Cloud scripting from Visual Studio; automatic assembly upload.

# CONCLUSION

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- MBrace.Core offers a simple, but powerfull model for describing distributed cloud computations.
- MBrace.Azure offers a complete cloud scripting experience.

# **GOALS**

 Keep up with MBrace.Core, stabilize API, MBrace.Core 1.0.

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- Provide a common foundation for implementing MBrace runtimes (MBrace.Runtime.Core).
- Make it easier for someone to contribute.
- I hope that MBrace becomes the 'go-to' framework for cloud computing in .NET.

# thanks! :-)

- http://www.m-brace.net/
- http://github.com/mbraceproject/MBrace.Azure
- · krontogiannis / MBrace.Azure @ e688c87