

Beam SDKs Don't Have to Look the Same

A Quick Look at an alternative Go SDK design

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B E A M
S U M M I T

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We know what a Beam SDK looks like, right?



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```
@OnTimer(END_OF_BUFFERING_ID)
    .withTimestampProvider(Timestamps.ofCurrentTimeInMs())
    .withWindowAssigner(WindowingStrategy.global());
    .apply(new WindowedWordLengthFn());
    .withOutputCoder(TypeDescriptors.integers());
    .withSideInput(
        PCollection<Integer> wordLengths = words.apply(
            MapElements.into(TypeDescriptors.integers())
                .via((String word) -> word.length())));
    .withStartTimestampProvider(Timestamps.ofCurrentTimeInMs());
    .withEndTimestampProvider(Timestamps.ofCurrentTimeInMs());
```

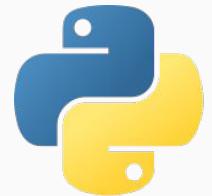
```
class FooFn extends DoFn<String, KV<String, Integer>> {
    @ProcessElement
    public void processElement(@WindowedValue String word,
                               WindowContext context,
                               @WindowExpiryTimestamp long windowExpiration,
                               OutputReceiver<KV<String, Integer>> receiver,
                               @Key String key,
                               @StateId long storedBatchSize,
                               @TimerId END_OF_BUFFERING_ID endOfBufferingTimer,
                               @TimerId TIMER_HOPPING_ID hoppingTimer, ...) { ... }
```

```
[Final Output PCollection] = [Initial Input PCollection].apply([First Transform])
    .apply([Second Transform])
    .apply([Third Transform])
```



BEAM SDK

```
    @on_timer(WATERMARK_TIMER)
    word_lengths = words | beam.FlatMap(lambda word: [len(word)])
    word_lengths | beam.WindowedKeyedPCollectionFn(
        window=beam.DoFn.WindowParam,
        key=beam.DoFn.KeyParam,
        buffer_1=beam.DoFn.StateParam(BUFFER_STATE_1),
        buffer_2=beam.DoFn.StateParam(BUFFER_STATE_2))
    def start_bundle(self):
    class FooFn(beam.DoFn):
        def process(self, element):
            if watermark_estimator_state(self, element, restriction):
                self.create_watermark_estimator(state):
[Final Output PCollection] = ([Initial Input PCollection] | [First Transform]
    | [Second Transform]
    | [Third Transform])
```



```
func (fn *FooFn) OnTimer(sp state.Provider,  
    ...)  
  
func wordLengths(word string) int { return len(word) }  
func init() { register.Function1x1(wordLengths) }  
  
func applyWordLenAnon(s beam.Scope, words beam.PCollection) beam.PCollection {  
    return beam.ParDo(s, wordLengths, words)  
}  
  
type BeamDataset{...} and beam.PCollection  
func init() { register.DoFnStringToRangeRestriction(&BeamDataset{}) }  
  
func (fn BeamDoFn) ProcessElement(element (type spittableDoFn)) SplitRestriction(filename string, rest offsetrange.Restriction) (splits []offsetrange.Restriction)  
func (fn BeamDoFn) FindBeamPCollection(restriction offsetrange.Restriction) (splits []offsetrange.Restriction)  
  
[Second PCollection] := beam.ParDo(scope, [First Transform], [Initial Input PCollection])  
[Third PCollection] := beam.ParDo(scope, [Second Transform], [Second PCollection])  
[Final Output PCollection] := beam.ParDo(scope, [Third Transform], [Third PCollection])
```



One of these things are not like the others



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The Differences with Go

vs Java and Python

- No Overloading
 - Prevents PCollection.apply like syntax
- No Inheritance
 - DoFns and their methods are inferred reflectively*
- No built in Serialization or Pickling
 - Prevents closures and reliable anonymous functions
- No Annotations
 - Prevents targeting methods or fields for specific uses.
- No Generics
 - SDK must typecheck itself.
- No user defined Iterators



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- No Annotations
- ~~No Generics~~
 - SDK must typecheck itself?
- ~~No user defined Iterators~~



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Why these aspects matter

- Affects how discoverable features are to users
 - IDE Support, Documentation
- Affects how we can add features to the SDK
 - How much code is required to correctly implement a feature
- Affects performance at construction time
 - Is the framework aware of this features use?
 - Can the SDK put it into the portable pipeline graph?
 - Can the compiler prevent mistakes entirely?
- Affects performance at execution time
 - Can the SDK make better choices for efficient execution?



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The Challenge:
Does a Beam SDK *have* to look like
that?



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An alternative Go SDK

Designed for Today's Go

- Make use of Generics
- Not constrained to look like existing SDKs
- Not constrained by compatibility.
- Can it be easier for users?
- Can it be easier for maintainers?



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What can we do differently, with Today's Go?

- How small can we make the User API surface?
- Can we have compile time type safety at pipeline construction?
- Can we reduce the burden of graph construction?
- Can we avoid Registering DoFns?
- Can we enable anonymous funcs or closures?
- <many more questions>



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Reading Go - quick notes

- Types are specified after names,
 - “var name string”
- Function return types are after the parameters
 - func calculateWeight(thing MyThing) float64 { ... }
- Generic Type Parameters are declared in square brackets
 - type MyCollection[T any] struct{ ... }



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```
type MyDoFn struct{
    Config string
    Side SideInputMap[int, string]
    Exceptions beam.CounterInt64
    Out beam.Output[string]
    beam.OnFinishBundle
}

func (fn *MyDoFn) ProcessBundle(dfc *beam.DFC[string]) error {
    ...
}
```

Serializable configuration

Static types for Side input Access pattern

Metrics!

Statically typed output emitters!

Types for specialized features

Single method to implement

```
type MyDoFn struct{ ... }

func (fn *MyDoFn) ProcessBundle(dfc *beam.DFC[string]) error {
    // StartBundle happens on the ProcessBundle call

    // Configure the ProcessElement function on the DFC.
    dfc.Process(func(ec beam.ElmC, elm string) error {
        fn.Processed.Inc(dfc, 1)
        fn.Output.Emit(ec, newElm)
        return nil
    })

    fn.OnBundleFinish.Do(dfc, func() error {
        // Do some FinishBundle in the callback.
        return nil
    })
    // Per Bundle state cleaned up by Garbage collector
    return nil
}
```

Field Based Design

- Allows users to express intent around
 - DoFn configuration
 - Access Metadata
 - Side Metrics
 - Counters
 - State
 - Timers
 - Emitters
- Framework can observe that intent ahead of time

```
type MyDoFn struct{
    Config string

    Side SideInputMap[int, string]

    Exceptions beam.CounterInt64
    Size         beam.DistributionInt64

    LastVal beam.StateValue[string]
    Callback beam.TimerEventTime

    Out beam.Output[string]
    Partition []beam.Output[string]

    beam.OnFinishBundle
    beam.ObserveWindow
}
```



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Combiners

- Dedicated “shape” based wrapper functions to build.
 - beam.FullCombine
 - beam.SimpleMerge
 - beam.AddMerge
 - beam.MergeExtract
- To be used by both
 - beam.CombinePerKey(
 - beam.CombineGlobal

```
type MeanFn[E constraints.Integer | constraints.Float] struct{}
```

```
type meanAccum[E constraints.Integer | constraints.Float] struct {
    Count int32
    Sum   E
}
```

```
func (MeanFn[E]) AddInput(a meanAccum[E], i E) meanAccum[E] {
    a.Count += 1
    a.Sum += i
    return a
}
```

```
func (MeanFn[E]) MergeAccumulators(a meanAccum[E], b meanAccum[E])
meanAccum[E] {
    return meanAccum[E]{Count: a.Count + b.Count, Sum: a.Sum + a.Sum}
}
```

```
func (MeanFn[E]) ExtractOutput(a meanAccum[E]) float64 {
    return float64(a.Sum) / float64(a.Count)
}
```

```
...
beam CombinePerKey(s, keyedSrc.Output,
beam FullCombine(MeanFn[int]{}))
...

```



Compile Time type safety

- Need to have element types in the processing method type.
- Need to have a way of indicating output types.
- Want to have pipeline safety at compile time



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Pipeline Construction

- Happens in a function provided to `beam.Run`
 - A “no pipeline approach”
 - Allows inline, or separated construction
- Also serves as the “init” switch
- Still to come: Operational Options
 - Construction time options
 - Worker side options

```
pr, err := beam.Run(ctx, func(s *beam.Scope) error {
    imp := beam.Impulse(s)
    src := beam.ParDo(s, imp, &SourceFn{
        Count: 10,
    })
    other := beam.ParDo(s, imp, &OtherSourceFn{
        Config: "configuration!",
    })
    inc := beam.ParDo(s, src.Output, &MyIncDoFn{
        Side: beam.AsSideIter(other.Output)
    })
    lw := beam.Map(s, inc.Output, func(v int) int { return v - 1 },
        beam.Name("Decrement"))
    beam.ParDo(s, lw, &DiscardFn[int]{}, beam.Name("sink"))
    return nil
}, beam.Name("testjob"))
```



How do workers work?

- Pipeline Construction is re-done to register DoFns on the worker.
 - Non-deterministic construction could cause problems. Mitigatable by computing non-deterministic values at construction time, and transmitting them via pipeline options.
- Bundle Processing DoFns are strung together in a type safe way via reflection, and the DFC parameter.
 - Details are not included in this talk.
- Very little between DoFns: Outputs nearly directly passed to consumers



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What about Splittable DoFns?

Still in progress, current attempt:

```
type BoundedSDF[FAC RestrictionFactory[E, R, P], E any, T Tracker[R, P], R  
Restriction[P], P, WES any] struct{}
```

```
fn.BoundedSDF.Process(dfc,  
    func(rest OffsetRange) *ORTTracker {...},  
    func(ec ElmC, elm int, or OffsetRange, tc TryClaim[int64]) error { ... })
```



Future Work

- Submit jobs to Dataflow
 - Can already execute in Docker!
- State and Timer support
- Windowing Strategy and Triggers



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What can we do differently, with Today's Go?

- How small can we make the User API surface?
 - YES!
- Can we have compile time type safety at pipeline construction?
 - YES!
- Can we reduce the burden of graph construction?
 - A little.
- Can we avoid Registering DoFns?
 - Yes!
- Can we enable anonymous funcs or closures?
 - Yes!



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```
type MyDoFn struct{  
    ...  
}  
  
lw := beam.Map(func.Output, func(v int) int { return v * 2 })  
  
StartBundler: Intialize in ProcessA  
  
t := FooFn struct{  
    ...  
    Output beam.Output[string]  
}  
  
Fin: Beam API lists callback in ProcessB  
  
beam.ParDo(scope[Initial Input collection], dofn1)  
do fn1 beam.ParDo(scope[Input collection], dofn1, Options)  
do fn2 beam.ParDo(scope[Input collection], dofn2, Options)
```

THANK YOU!!

