

An introduction to

# Property based testing

with



# Peter Laggner



**Based** in Graz



**Working** remotely at Cargonexx



**Modelling and solving** a vehicle routing problem  
using Kotlin and Timefold



**Kotlin** enthusiast since 2017



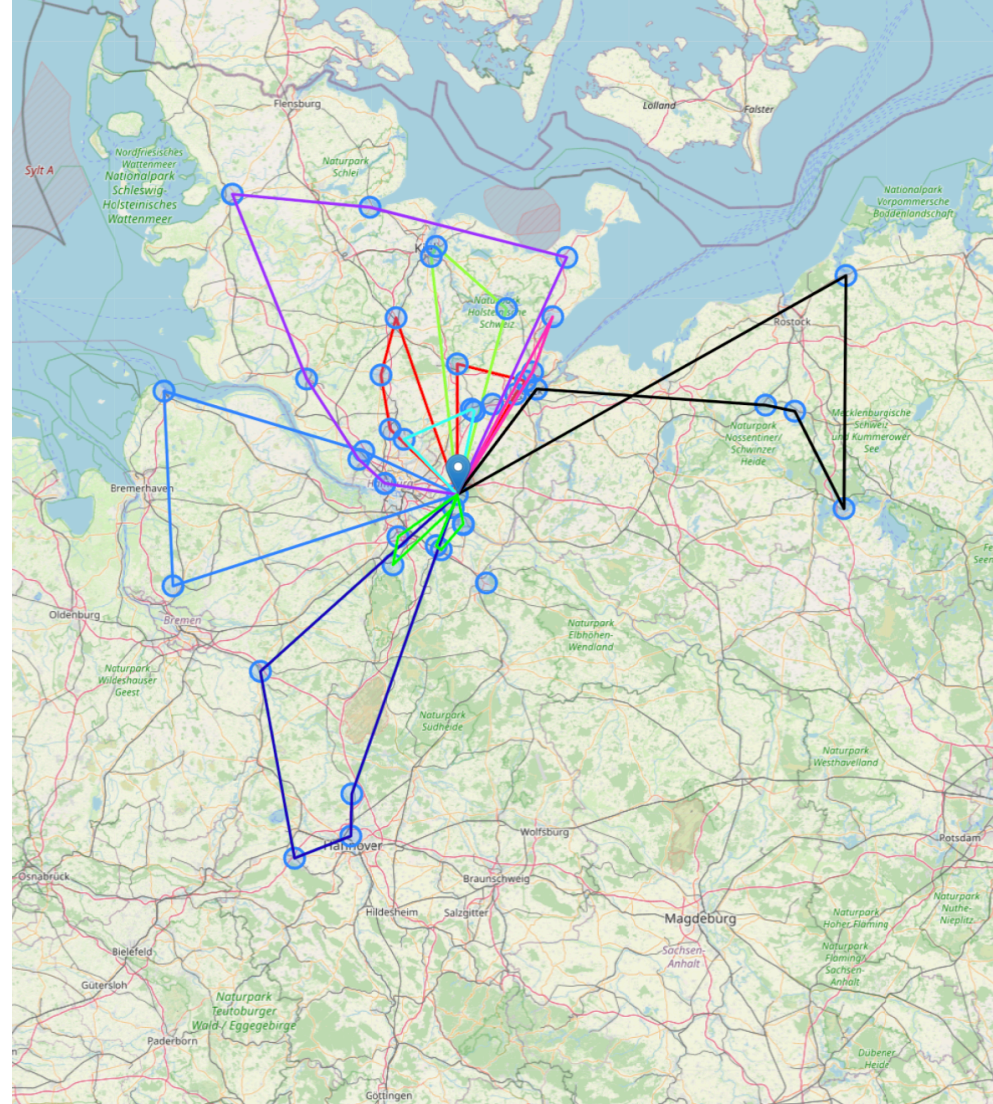
greyhairredbear



greyhairredbear

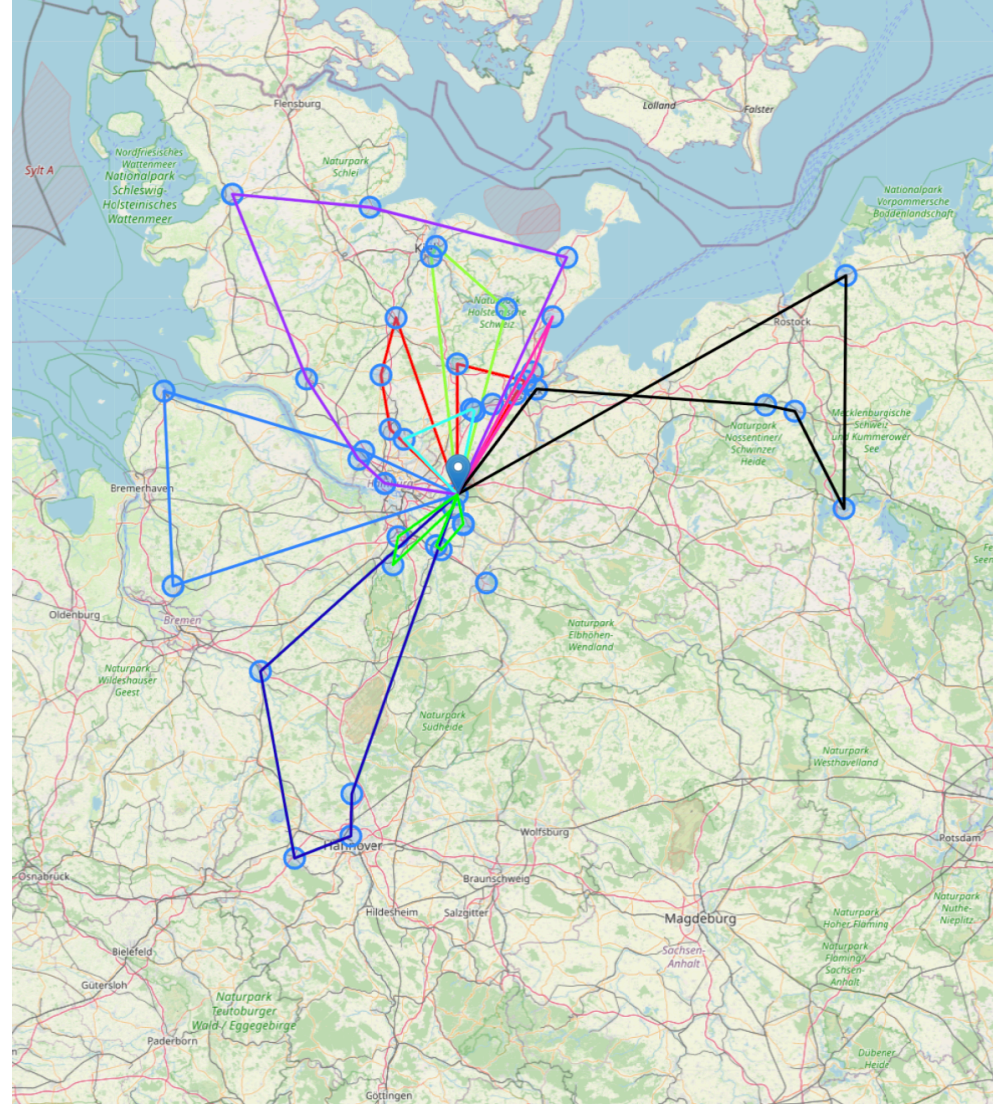


# Motivation



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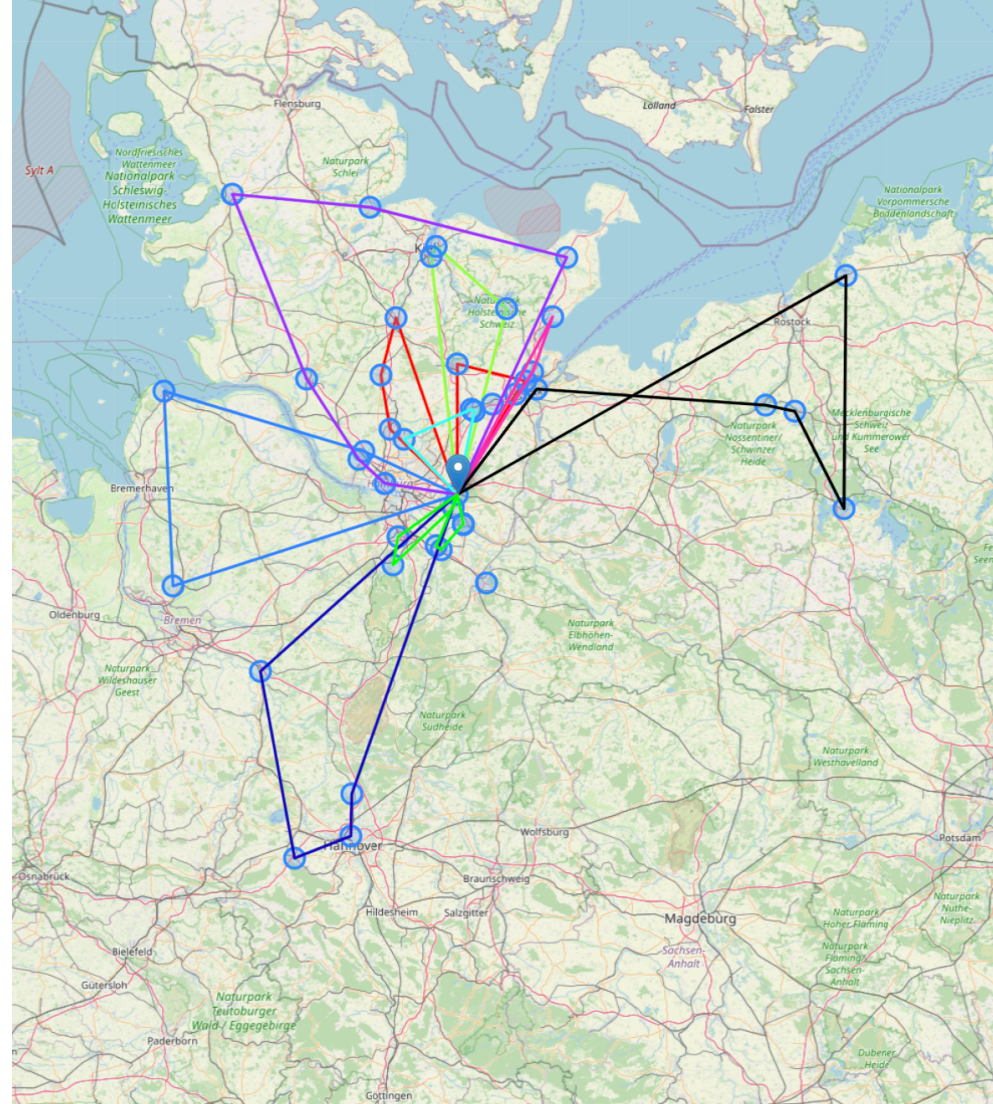
- Vehicle Routing Problem (VRP)
  - Complex domain
  - Computationally complex





# Motivation

- Vehicle Routing Problem (VRP)
  - Complex domain
  - Computationally complex
- Build trust with potential users
  - Ensure complex problem is solved correctly



# A simple exercise\*

*"Write a function that adds two numbers..."*

\*shamelessly adapted from Scott Wlaschin

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*"Write a function that adds two numbers..."*

...using altered form of ping-pong TDD

- you're paired with a colleague
- your job: Only write the tests

Meet your colleague



# Meet your colleague

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# Meet your colleague

- Some say, he can be a bit tricky to work with
- Others say, he is a bit cynical about TDD
- Some even call him "Enterprise Developer from Hell" (EDFH)
- But how bad can it get?

# Let's get to it

```
add(1, 2) shouldBe 3
```



# Let's get to it

```
fun add(a: Int, b: Int): Int = 3
```

# Let's get to it

```
add(1, 2) shouldBe 3
```

```
add(29, 13) shouldBe 42
```

```
add(-1, 5) shouldBe 4
```

```
add(1024, 1024) shouldBe 2048
```

# Let's get to it

```
fun add(a: Int, b: Int): Int = when {  
    a == 1 && b == 2 -> 3  
    a == 29 && b == 13 -> 42  
    a == -1 && b == 5 -> 4  
    a == 1024 && b == 1024 -> 2048  
    else -> 31415926 // "\_(ツ)_/"  
}
```

Let's get to it

// (J°□°) J \_ 

Let's try random input



# Let's try random input

```
import kotlin.random.Random

repeat(1000) {
    val a = Random.nextInt(Int.MIN_VALUE / 2, Int.MAX_VALUE / 2)
    val b = Random.nextInt(Int.MIN_VALUE / 2, Int.MAX_VALUE / 2)


    add(a, b) shouldBe a + b
}
```

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    add(a, b) shouldBe a + b
}
```



EDFH doesn't really seem to bring out the best in us

# Property based testing - Commutativity

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```
import kotlin.random.Random

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    val a = Random.nextInt(Int.MIN_VALUE / 2, Int.MAX_VALUE / 2)
    val b = Random.nextInt(Int.MIN_VALUE / 2, Int.MAX_VALUE / 2)

    add(a, b) shouldBe add(b, a)
}
```



# Property based testing - Commutativity

```
fun add(a: Int, b: Int): Int = a * b
```

# Property based testing - Successor

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```
import kotlin.random.Random

repeat(1000) {
    val a = Random.nextInt(Int.MIN_VALUE / 2, Int.MAX_VALUE / 2)
    add(add(a, 1), 1) shouldBe add(a, 2)
}
```

# Property based testing - Successor

```
fun add(a: Int, b: Int): Int = 42
```

# Property based testing - Identity

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```
import kotlin.random.Random

repeat(1000) {
    val a = Random.nextInt(Int.MIN_VALUE / 2, Int.MAX_VALUE / 2)
    add(a, 0) shouldBe a
}
```

# Property based testing - Identity

```
fun add(a: Int, b: Int): Int = a + b
```

# Revisiting random inputs

How to ...



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How to ...

- ... make your test data generation reusable?
- ... reproduce test runs using random data?
- ... ensure seeds are deterministic for a test run?
- ... shrink your test data?
  - *Shrinking*: Get the least complex input that fails your test

# Kotest's property test framework

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# Kotest's property test framework

- API for random input generation
- Lots of generators available (just like Kotest assertions)
- Test shrinking
- Nice documentation

# Real example - VRP input pre-processing

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```
class Load(  
    val id: String,  
    val measurements: Measurements,  
    val requirements: List<String>,  
    pickupTimeWindow: Interval,  
    val pickupLocation: Location,  
    dropoffTimeWindow: Interval,  
    val dropoffLocation: Location,  
    val planningDate: LocalDate,  
    val containedLoadIds: List<String> = listOf(id)  
) { ... }
```

# Real example - VRP input pre-processing

- Every load entity makes computation harder
- Grouping loads with same pickup and dropoff locations is beneficial (usually)

```
fun List<Load>.grouped(  
    loadGroupingConfig: LoadGroupingConfig  
): List<Load>
```

# Real example - VRP input pre-processing

- Every load entity makes computation harder
- Grouping loads with same pickup and dropoff locations is beneficial (usually)

```
data class LoadGroupingConfig(  
    // loading (milli)meters, weight in kg  
    val maxMeasurements: Measurements,  
    val minTimeWindowOverlapInHours: Long,  
)
```

# Real example - VRP input pre-processing



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**Property:** Grouping a second time should not change the outcome

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**Property:** Grouping a second time should not change the outcome

```
checkAll(
  inputLoadGen,
  groupingConfigGenerator
) { input, groupingConfig ->
  val result = input.grouped(groupingConfig)
  result shouldContainExactlyInAnyOrder result.grouped(groupingConfig)
}
```

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**Property:** Don't drop any loads during grouping

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**Property:** Don't drop any loads during grouping

```
checkAll(
  inputLoadGen,
  groupingConfigGenerator
) { input, groupingConfig ->
  input.grouped(groupingConfig).flatMap {
    it.containedLoadIds
  } shouldContainExactlyInAnyOrder input.map { it.id }
}
```

# Real example - VRP input pre-processing

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**Property:** Don't assign loads to more than one group

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```
checkAll(
  inputLoadGen,
  groupingConfigGenerator
) { input, groupingConfig ->
  val result = input.grouped(groupingConfig)
  result.flatMap { it.containedLoadIds }.shouldNotContainDuplicates()
}
```



# Real example - VRP input pre-processing

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**Property:** Don't add more loads during grouping

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**Property:** Don't add more loads during grouping

```
checkAll(
  inputLoadGen,
  groupingConfigGenerator
) { input, groupingConfig ->
  input.grouped(groupingConfig).count() shouldBeLessThanOrEqual
    input.count()
}
```

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**Property:** Adhere to maximum measurements of grouping configuration for grouping loads

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**Property:** Adhere to maximum measurements of grouping configuration for grouping loads

```
forAll(inputLoadGen, groupingConfigGenerator) { input, groupingConfig ->
    val groupedLoadsMeasurements =
        input
            .grouped(groupingConfig)
            .filter { it.containedLoadIds.count() > 1 }
            .map { it.measurements }

    groupedLoadsMeasurements.none {
        it.ldmm > groupingConfig.maxMeasurements.ldmm ||
        it.weightInKg > groupingConfig.maxMeasurements.weightInKg
    }
}
```

# Generators

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DSL for generating random input



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DSL for generating random input

```
fun givenLoadGroupingConfigGenerator(): Arb<LoadGroupingConfig> =  
    arbitrary {  
        LoadGroupingConfig(  
            givenMeasurementGenerator().bind(),  
            Arb.long(1L..96).bind(),  
        )  
    }
```

# Assumptions

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Filter test data with assertions

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Filter test data with assertions

```
checkAll(givenVehicleGenerator()) {  
    val firstAction = it.actions.firstOrNull()  
    assume {  
        firstAction.shouldNotBeNull()  
        firstAction.isOnSameVehicleAsRelatedAction.shouldBeTrue()  
    }  
  
    firstAction!!.isScheduledBeforeRelatedAction.shouldBeTrue()  
}
```

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**Bottom line:** Mix property tests with your regular example based tests!

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- Slides created with slidev: <https://sli.dev>
- This presentation: <https://github.com/greyhairredbear/presentations>  
( /intro-property-based-testing )

Questions