

# Search-Based Software Engineering

Search-based Testing

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Lehrstuhl für Software Engineering II

## Evolving Unit Tests

## Encoding Unit Tests

```
public class Foo {
  private Bar bar;

public Foo(Bar b) {
    this.bar = bar;
  }

public boolean isBar(int x) {
  if(bar.getValue() > x)
    return true;
  else
    return false;
  }
}
```

```
public class Bar {
  private int value = 0;

public void doStuff(int y) {
  if(y % 2 == 0)
    value++;
  }
}
```

#### **Unit Test:**

```
@Test
void test() {
   Bar bar = new Bar();
   Foo foo = new Foo(bar);
   foo.isBar(42);
   // omitting assertions
   // for now
}
```

#### Chromosome Encoding:

```
int x = 42;

Bar bar = new Bar();

Foo foo = new Foo(bar);

foo.isBar(x);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

#### Chromosome Encoding:

```
int x = 42;

Bar bar = new Bar();

Foo foo = new Foo(bar);

foo.isBar(x);
```

- A unit test is a list of statements
- A statement can be:
  - A call to a constructor
  - A method call on an existing object
  - A primitive value
  - ...
- The length of a unit test is variable
- There are dependencies between statements

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
      value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

<Foo>.isBar(<int>);

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
Foo foo = new Foo(<Bar>);
<Foo>.isBar(<int>);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
Foo foo = new Foo(<Bar>);
```

foo.isBar(<int>);

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
Bar bar = new Bar();

Foo foo = new Foo(<Bar>);

foo.isBar(<int>);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
Bar bar = new Bar();

Foo foo = new Foo(bar);

foo.isBar(<int>);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
int x = 42;

Bar bar = new Bar();

Foo foo = new Foo(bar);

foo.isBar(<int>);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
int x = 42;

Bar bar = new Bar();

Foo foo = new Foo(bar);

foo.isBar(x);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
int x = 42;

Bar bar = new Bar();

Foo foo = new Foo(bar);

foo.isBar(x);

<Foo>.isBar(<int>);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
int x = 42;

Bar bar = new Bar();

Foo foo = new Foo(bar);

foo.isBar(x);

foo.isBar(<int>);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
int x = 42;

Bar bar = new Bar();

Foo foo = new Foo(bar);

foo.isBar(x);

int y = 0;

foo.isBar(<int>);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
int x = 42;

Bar bar = new Bar();

Foo foo = new Foo(bar);

foo.isBar(x);

int y = 0;

foo.isBar(y);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
int x = 42;
Bar bar = new Bar();
Foo foo = new Foo(bar);
foo.isBar(x);
int y = 0;
foo.isBar(y);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
      value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
int x = 42;

Bar bar = new Bar();

Foo foo = new Foo(bar);

bar

foo.isBar(x);

int y = 0;

foo.isBar(y);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
      value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
int x = 42;
Bar bar = new Bar();
Foo foo = new Foo(bar);
bar.doStuff(<int>);
foo.isBar(x);
int y = 0;
foo.isBar(y);
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```
public class Bar {
  private int value = 0;
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    this.bar = bar;
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   if(bar.getValue() > x)
      return true;
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int x = 42;
Bar bar = new Bar();
Foo foo = new Foo(bar);
bar.doStuff(x);
foo.isBar(x);
int y = 0;
foo.isBar(y);
```

```
public class Bar {
  private int value = 0;
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public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

#### Change statement

```
int x = 42;

Bar bar = new Bar();

Foo foo = new Foo(bar);

bar.doStuff(x);

foo.isBar(x);

int y = 0;

foo.isBar(y);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

#### Change statement

```
int x = 38;

Bar bar = new Bar();

Foo foo = new Foo(bar);

bar.doStuff(x);

foo.isBar(x);

int y = 0;

foo.isBar(y);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

#### Change statement

```
int x = 38;

Bar bar = new Bar();

Foo foo = new Foo(bar);

bar.doStuff(x);

foo.isBar(x);

int y = 0;

foo.isBar(y);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
int x = 38;
Bar bar = new Bar();
Foo foo = new Foo(bar);
bar.doStuff(x);
foo.isBar(x);
int y = 0;
boolean ret = foo.isBar(y);
assertTrue(ret);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
int x = 38;

Bar bar = new Bar();

Foo foo = new Foo(bar);

bar.doStuff(x);

foo.isBar(x);

int y = 0;

foo.isBar(x);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
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public class Foo {
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    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
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```

```
int x = 38;

Bar bar = new Bar();

Foo foo = new Foo(bar);

bar.doStuff(x);

foo.isBar(x);

foo.isBar(x);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
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```
int x = 38;

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bar.doStuff(x);

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```

```
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   if(bar.getValue() > x)
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int x = 38;

Bar bar = new Bar();

Foo foo = new Foo(bar);

bar.doStuff(x);

foo.isBar(x);

foo.isBar(x);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

```
int x = 38;

Bar bar = new Bar();

bar.doStuff(x);
```

```
public class Bar {
  private int value = 0;
  public void doStuff(int y) {
    if(y \% 2 == 0)
     value++;
public class Foo {
  private Bar bar;
  public Foo(Bar b) {
    this.bar = bar;
  public boolean isBar(int x) {
   if(bar.getValue() > x)
      return true;
    else
      return false;
```

### Crossover

DateTime var0 = new DateTime()

int var I = 54

TimeOfDay var2 = var0.toTimeOfDay()

int var3 = var0.getSecondOfMinute()

long var 0 = 48

DateTime var I = new DateTime(var0)

DateTime var2 = var1.plusWeeks(var0)

DateTime var3 = var1.minus(var2)

## Crossover

DateTime var0 = new DateTime()

int var I = 54

DateTime var2 = var1.plusWeeks(var0)

DateTime var3 = var1.minus(var2)

long var 0 = 48

DateTime var I = new DateTime(var0)

TimeOfDay var2 = var0.toTimeOfDay()

int var3 = var0.getSecondOfMinute()

### Crossover

DateTime var0 = new DateTime()

int var I = 54

DateTime var2 = var0.plusWeeks(var1)

DateTime var3 = var2.minus(var1)

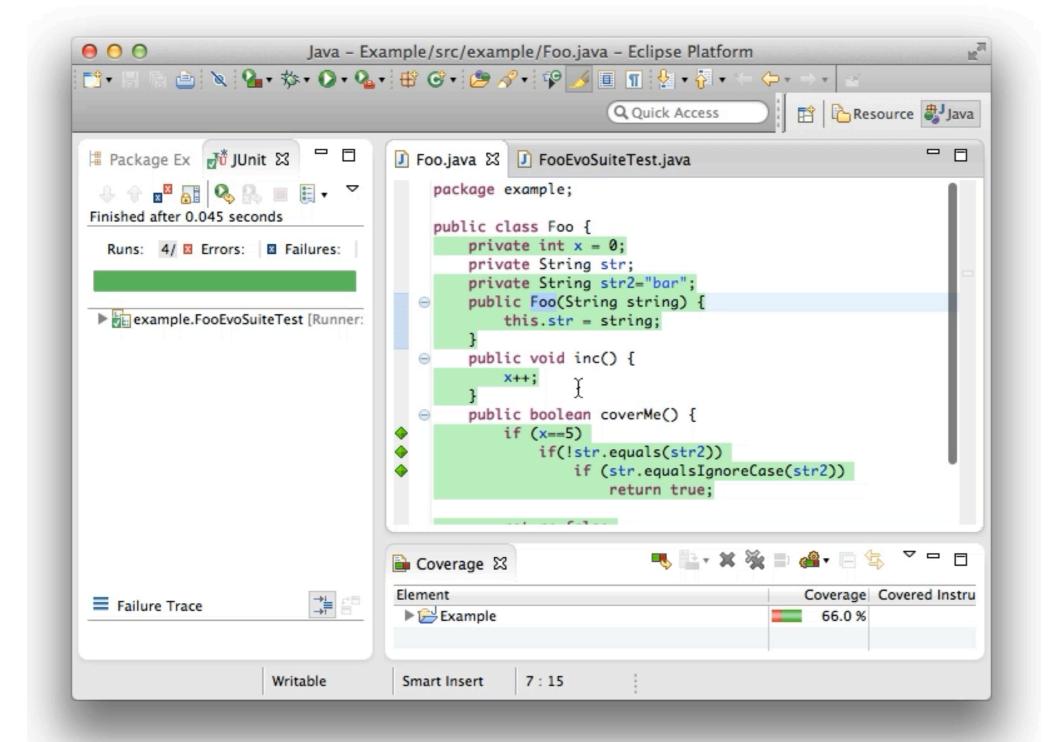
long var 0 = 48

DateTime var I = new DateTime(var0)

TimeOfDay var2 = var1.toTimeOfDay()

int var3 = var1.getSecondOfMinute()

Repair might be necessary because of dependencies





.

**★** ► ~/pynguin

 $\rightarrow$  pynguin --module-name queue\_example --project-path  $\underline{\cdot}$  --output-path  $\underline{\cdot}$  --seed 1629381673714481067 -v

→ ▼ 4s 

→ pynguin 

Ø 07:02:2

## Regression Assertions

### Assertions

```
class Foo {
  boolean isFoo();
  boolean hasBar();
  int getZoo();
  Boo getBoo();
}
```

```
Foo var0 = new Foo()

Foo var1 = new Foo()

...

var1.bar();

Boo var9 = var1.getBoo()
```

assertTrue(var0.isFoo());
assertFalse(var0.hasBar());
assert(var0.getZoo()==27);

```
class Foo {
  boolean isFoo();
  boolean hasBar();
  int getZoo();
  Boo getBoo();
}
```

```
Foo var0 = new Foo()
```

```
Foo var I = new Foo()
```

•••

var1.bar();

```
Boo var9 = var1.getBoo()
```

```
assertTrue(var0.isFoo());
assertFalse(var0.hasBar());
assert(var0.getZoo()==27);
assertTrue(var1.isFoo());
assertFalse(var1.hasBar());
assert(var1.getZoo()==27);
assertEqual(var0, var1);
```

```
class Foo {
  boolean isFoo();
  boolean hasBar();
  int getZoo();
  Boo getBoo();
}
```

```
Foo var0 = new Foo()
```

```
Foo var I = new Foo()
```

•••

var1.bar();

```
Boo var9 = var1.getBoo()
```

```
assertTrue(var0.isFoo());
assertFalse(var0.hasBar());
assert(var0.getZoo()==27);
assertTrue(var1.isFoo());
assertFalse(var1.hasBar());
assert(var1.getZoo()==27);
assertEqual(var0, var1);
```

```
class Foo {
  boolean isFoo();
  boolean hasBar();
  int getZoo();
  Boo getBoo();
}
```

```
Foo var0 = new Foo()
```

```
Foo var I = new Foo()
```

•••

var1.bar();

```
Boo var9 = var1.getBoo()
```

```
assertTrue(var0.isFoo());
assertFalse(var0.hasBar());
assert(var0.getZoo()==27);
assertTrue(var1.isFoo());
assertFalse(var1.hasBar());
assert(var1.getZoo()==27);
assertNotEqual(var0, var1);
```

```
class Foo {
  boolean isFoo();
  boolean hasBar();
  int getZoo();
  Boo getBoo();
}
```

```
Foo var0 = new Foo()
```

Foo var I = new Foo()

•••

var1.bar();

Boo var9 = var1.getBoo()

```
assertTrue(var0.isFoo());
assertFalse(var0.hasBar());
assert(var0.getZoo()==27);

assertTrue(var1.isFoo());
assertFalse(var1.hasBar());
assert(var1.getZoo()==27);

assertNotEqual(var0, var1);

assertTrue(var9.hasBoo())
```

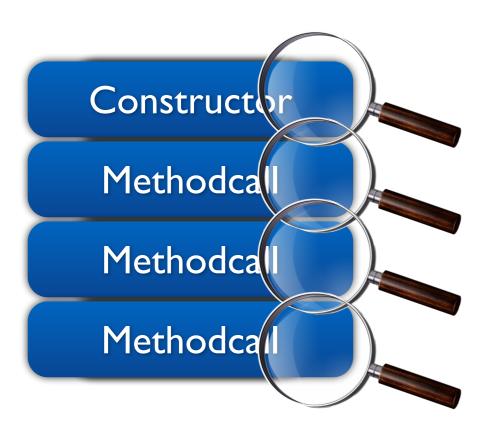
```
LocalDate date = new LocalDate(2010, 7, 15);
date.plusYears(1);
assertEquals(date.getYear(), 2011);
```

```
assertEquals(date.size(), 3);
assertEquals(date.getValue(YEAR), 2010);
assertEquals(date.getValue(MONTH OF YEAR), 7);
assertEquals(date.getValue(DAY OF MONTH), 15);
assertEquals(date.getLocalMillis(), ...);
assertEquals(date, date);
Lessel February (tate.compared Cotale), 0, 7, 15);
dasent Equitals (date, get Year Of Century (), ...);
assertEquals(date:getYear(), 2019);
assertEquals(date.getWeekyear(), ...);
assertEquals(date.getMonthOfYear(), 7);
assertEquals(date.getWeekOfWeekyear(), ...);
assertEquals(date.getDayOfWeek(), ...);
assertEquals(date.getDayOfMonth(), ...);
```

```
LocalDate date = new LocalDate(2010, 7, 15);
assertEquals(date.size(), 3);
assertEquals(date.getValue(YEAR), 2010);
assertEquals(date.getValue(MONTH_OF_YEAR), 7);
assertEquals(date.getValue(DAY OF MONTH), 15);
assertEquals(date.getLocalMillis(), ...);
assertEquals(date, date);
assertEquals(date.compareTo(date), 0);
assertEquals(date.getYearOfCentury(), ...);
assertEquals(date.getYear(), 2010);
assertEquals(date.getWeekyear(), ...);
assertEquals(date.getMonthOfYear(), 7);
assertEquals(date.getWeekOfWeekyear(), ...);
assertEquals(date.getDayOfWeek(), ...);
assertEquals(date.getDayOfMonth(), ...);
date.plusYears(1);
assertEquals(date.getYear(), 2011);
```

```
assertEquals(date.getDayOfMonth(), ...);
date.plusYears(1);
assertEquals(date.getYear(), 2011);
assertEquals(date.size(), 3);
assertEquals(date.getValue(YEAR), 2011);
assertEquals(date.getValue(MONTH_OF_YEAR), 7);
assertEquals(date.getValue(DAY_OF_MONTH), I5);
assertEquals(date.getLocalMillis(), ...);
assertEquals(date, date);
assertEquals(date.compareTo(date), 0);
assertEquals(date.getYearOfEra(), ...);
assertEquals(date.getYearOfCentury(), ...);
assertEquals(date.getWeekyear(), ...);
assertEquals(date.getMonthOfYear(), 7);
assertEquals(date.getWeekOfWeekyear(), ...);
assertEquals(date.getDayOfWeek(), ...);
assertEquals(date.getDayOfMonth(), ...);
```

```
class Foo {
  int bar(int x) {
    return 2 * x;
  }
}
```



```
class Foo {
  int bar(int x) {
    return 2 * x;
  }
}
```

Methodcall

Methodcall

Methodcall

Observation I

Observation 2

Observation I

Observation 2

Observation I

Observation 2

Observation I

Observation 2

```
class Foo {
  int bar(int x) {
    return 2 * x;
  }
}
```

Methodcall

Methodcall

Methodcall

Observation I

Observation 2

Observation I

Observation 2

Observation I

Observation 2

Observation I

Observation 2

```
class Foo {
  int bar(int x) {
    return 2 * x;
  }
}
```

Methodcall

Methodcall

**Methodcall** 

Observation I

Observation 2

Observation I

Observation 2

Observation I

Observation 2

Observation I

Observation 2

Constructor

Methodcall

Methodcall

**Methodcall** 

```
class Foo {
  int bar(int x) {
    return 2 * x;
  }
}
```

Methodcall

Methodcall

**Methodcall** 

Observation I

Observation 2

Observation I

Observation 2

Observation I

Observation 2

Observation I

Observation 2

Constructor

Methodcall

Methodcall

**Methodcall** 

```
LocalDate date = new LocalDate(2010, 7, 15);
assertEquals(date.size(), 3);
assertEquals(date.getValue(YEAR), 2010);
assertEquals(date.getValue(MONTH_OF_YEAR), 7);
assertEquals(date.getValue(DAY_OF_MONTH), I5);
assertEquals(date.getLocalMillis(), ...);
assertEquals(date, date);
assertEquals(date.compareTo(date), 0);
assertEquals(date.getYearOfCentury(), ...);
assertEquals(date.getYear(), 2010);
assertEquals(date.getWeekyear(), ...);
assertEquals(date.getMonthOfYear(), 7);
assertEquals(date.getWeekOfWeekyear(), ...);
assertEquals(date.getDayOfWeek(), ...);
assertEquals(date.getDayOfMonth(), ...);
date.plusYears(1);
assertEquals(date.getYear(), 2011);
```

### LocalDate date = new LocalDate(2010, 7, 15);

```
date.plus Years(1);
assertEquals(date.getYear(), 2011);
```

```
date.plusYears(1);
assertEquals(date.getYear(), 2011);
assertEquals(date.size(), 3);
assertEquals(date.getValue(YEAR), 2011);
assertEquals(date.getValue(MONTH_OF_YEAR), 7);
assertEquals(date.getValue(DAY_OF_MONTH), 15);
assertEquals(date.getLocalMillis(), ...);
assertEquals(date, date);
assertEquals(date.compareTo(date), 0);
assertEquals(date.getYearOfEra(), ...);
assertEquals(date.getYearOfCentury(), ...);
assertEquals(date.getWeekyear(), ...);
assertEquals(date.getMonthOfYear(), 7);
assertEquals(date.getWeekOfWeekyear(), ...);
assertEquals(date.getDayOfWeek(), ...);
assertEquals(date.getDayOfMonth(), ...);
```

```
date.plusYears(I);
assertEquals(date.getYear(), 2011);
assertEquals(date.getValue(YEAR), 2011);
```

```
LocalDate date = new LocalDate(2010, 7, 15);
date.plusYears(1);
assertEquals(date.getYear(), 2011);
assertEquals(date.getValue(YEAR), 2011);
```

```
LocalDate date = new LocalDate(2010, 7, 15);
date.plusYears(1);
assertEquals(date.getYear(), 2011);
```

LocalDate date = new LocalDate(2010, 7, 15); date.plusYears(1); assertEquals(date.hashCode(), 0x324773468);