



Business  
Technology Days

BIG  
DATA  
CON

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Hands-on with the *Checker Framework*:  
Preventing Null Pointer Exceptions at  
Compile Time



# Bug Evolution

Photo # NH 96566-KN (Color) First Computer "Bug", 1947

0800 Andtan started  
1000 " stopped - andtan ✓  
1300 MC (033) MP-MC 1.98276990  
                                2.130476415 convd  
                                (033) PRO-2 2.130476415  
                                convd 2.130676415  
Relays 6-2 in 033 failed spiral speed test  
in Relay 11.000 test.  
Relays changed  
1100 Started Cosine Tape (Sine check)  
1525 Started Multi Adder Test.  
1545

Relay #70 Panel F  
(moth) in relay.

First actual case of bug being found.  
1630 Andtan started.  
1700 closed down.

Relay 3145  
Relay 337

<http://www.history.navy.mil/photos/images/h96000/h96566k.jpg>



# Bug Evolution

Photo # NH 96566-KN (Color) First Com

9/2  
9/9  
0800 Arctan started  
1000 " stopped - arctan ✓  
1300 (032) MP - MC 2.130  
(033) PRO 2 2.130  
convd 2.130  
Relays 6-2 in 033 failed  
in relay  
Relays changed  
1100 Started Cosine Tape (Sin  
1525 Started Multi-Adder To  
1545 Relays (moth)  
First actual case of bug  
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<http://dimages.businessweek.com/imageserve/0arRbTldRSg3e/630x418.jpg>



<http://checkerframework.org/>

# Cost of software failures

**\$312 billion per year** global cost of software bugs (2013)

**\$300 billion** dealing with the Y2K problem

**\$440 million** loss by Knight Capital Group Inc. in 30 minutes in August 2012

**\$650 million** loss by NASA Mars missions in 1999; unit conversion bug

**\$500 million** Ariane 5 maiden flight in 1996; 64 bit to 16 bit conversion bug



# Software bugs can cost lives

**225 deaths:** jet crash caused by radar software (1997)

**28 deaths:** Patriot missile guidance system (1991)

**11 deaths:** blackout (2003)

**>8 deaths:** Radiation therapy (1985-2000)

2011: Software cause for 25% of all medical device recalls



# Outline

- Solution: Pluggable type-checking
- Tool: Checker Framework
- Nullness Checker
- Creating your own type system
- Project components



# Java's type system is too weak

Type checking prevents many errors

```
int i = "hello";
```

Type checking doesn't prevent **enough** errors

```
System.console().readLine();
```

```
Collections.emptyList().add("one");
```



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Type checking prevents many errors

```
int i = "hello";
```

Type checking doesn't prevent **enough** errors

```
System.console().readLine();
```

```
Collections.e
```

NullPointerException





# Java's type system is too weak

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Type checking doesn't prevent **enough** errors

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# Java's type system is too weak

Type checking prevents many errors

```
int i = "hello";
```

Type checking doesn't prevent **enough** errors

```
System.console().readLine();
```

```
Collections.emptyList().add("one");
```

UnsupportedOperationException



# Some errors are silent

```
Date date = new Date();  
myMap.put(date, "now");  
date.setSeconds(0);    // round to minute  
myMap.get(date);
```



# Some errors are silent

```
Date date = new Date();  
myMap.put(date, "now");  
date.setSeconds(0); // round to minute  
myMap.get(date);
```



Element not found



# Some errors are silent

```
dbStatement.executeQuery(userInput);
```



# Some errors are silent

```
dbStatement.executeQuery(userInput);
```

SQL injection attack

Initialization, data formatting, equality tests, ...

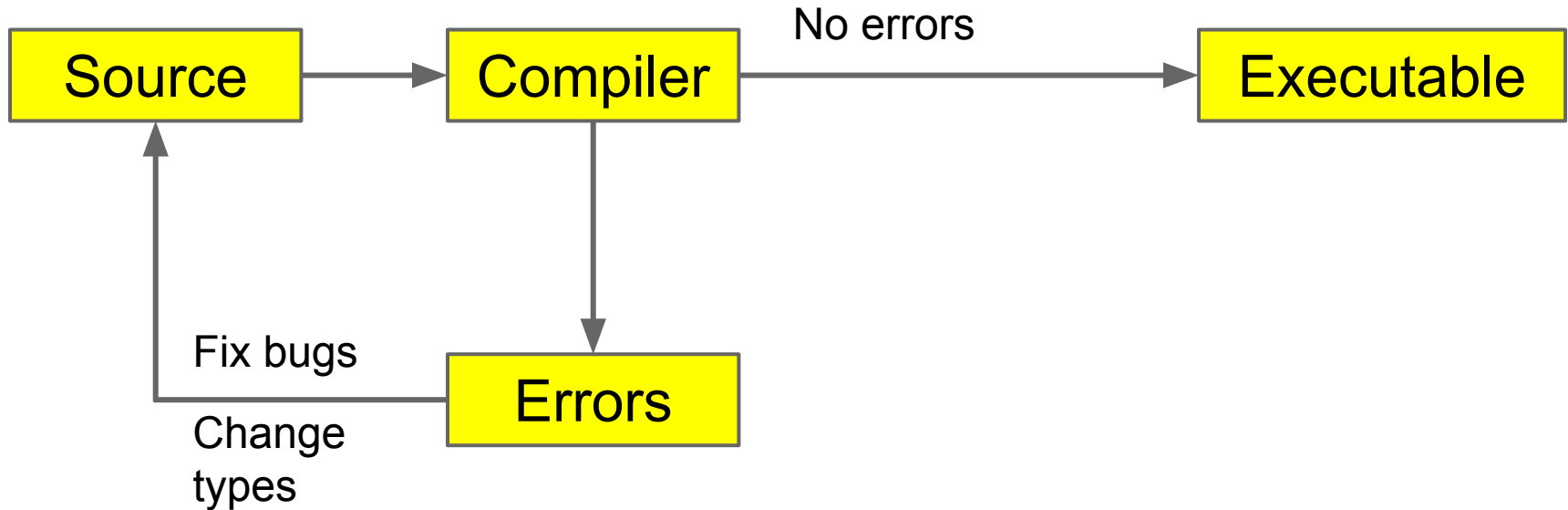


# Solution: Pluggable Type Checking

1. Design a type system to solve a specific problem
2. Write type qualifiers in code (or, use type inference)
3. Type checker warns about violations (bugs)

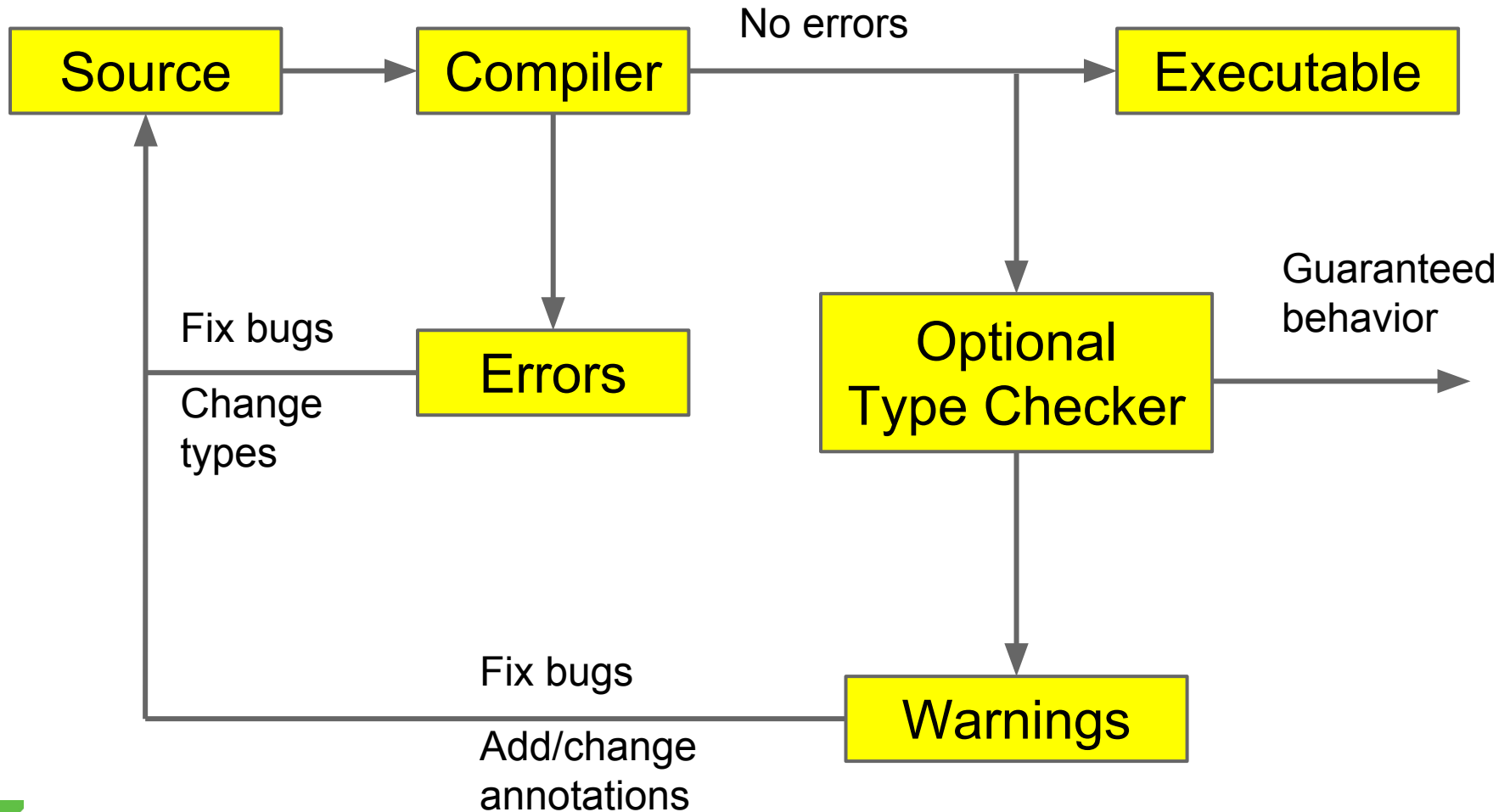


# Type Checking

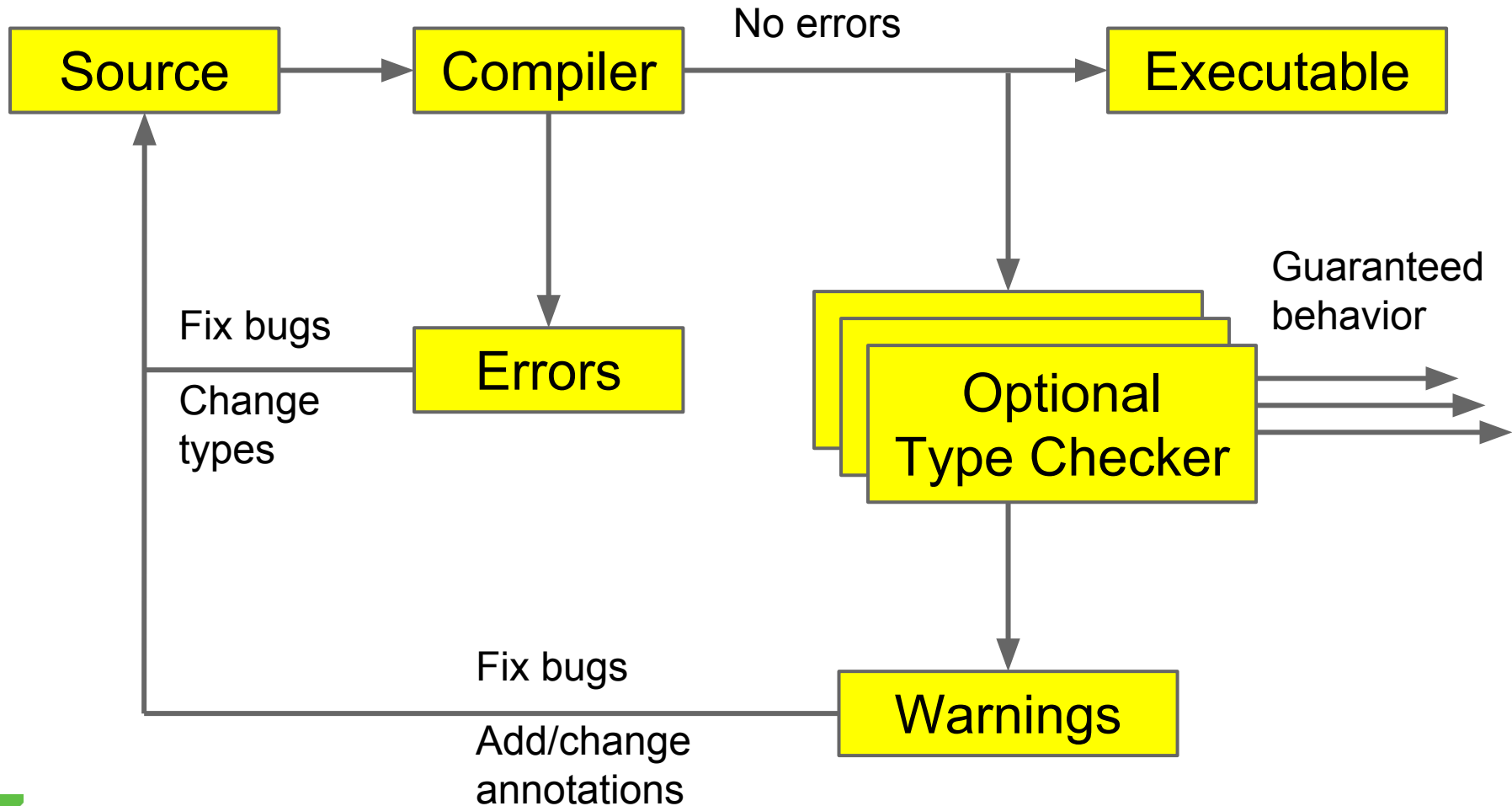




# Optional Type Checking



# Optional Type Checking



# Prevent null pointer exceptions

Type system that statically guarantees that the program only dereferences known non-null references

Types of data

**@NonNull**      reference is never null

**@Nullable**    reference may be null



# Null pointer exception

```
String op(Data in) {  
    return "transform: " + in.getF();  
}
```

...

```
String s = op(null);
```



# Null pointer exception

## Where is the defect?

```
String op(Data in) {  
    return "transform: " + in.getF();  
}
```

...

```
String s = op(null);
```



# Null pointer exception

## Where is the defect?

```
String op(Data in) {  
    return "transform: " + in.getF();  
}
```

...

```
String s = op(null);
```



# Null pointer exception

**Where is the defect?**

```
String op(Data in) {  
    return "transform: " + in.getF();  
}
```

...

```
String s = op(null);
```

**Can't decide without specification!**



# Let's use the Nullness Checker!

`http://checkerframework.org/`

```
wget http://types.cs.washington.  
edu/checker-framework/current/checker-  
framework-1.9.13.zip
```





# Specification 1: non-null parameter

```
String op(@NonNull Data in) {  
    return "transform: " + in.getF();  
}
```

...

```
String s = op(null);
```



# Specification 1: non-null parameter

```
String op(@NonNull Data in) {  
    return "transform: " + in.getF();  
}
```

...

```
String s = op(null);           // error
```



# Specification 2: nullable parameter

```
String op(@Nullable Data in) {  
    return "transform: " + in.getF();  
}
```

...

```
String s = op(null);
```



# Specification 2: nullable parameter

```
String op(@Nullable Data in) {  
    return "transform: " + in.getF();  
}                                     // error
```

...

```
String s = op(null);
```



# Benefits of type systems

- **Find bugs** in programs
  - Guarantee the **absence of errors**
- **Improve documentation**
  - Improve code structure & maintainability
- Aid compilers, optimizers, and analysis tools
  - E.g., could reduce number of run-time checks



# Benefits of type systems

- **Find bugs** in programs
  - Guarantee the **absence of errors**
- **Improve documentation**
  - Improve code structure & maintainability
- Aid compilers, optimizers, and analysis tools
  - E.g., could reduce number of run-time checks
- Possible negatives:
  - Must write the types (or use type inference)
  - False positives are possible (can be suppressed)



# Input Format Validation

Demo: ensure that certain strings contain **valid regular expressions**.



# Regular Expression Example

```
public static void main(String[] args) {  
    String regex = args[0];  
    String content = args[1];  
    Pattern pat = Pattern.compile(regex);  
    Matcher mat = pat.matcher(content);  
    if (mat.matches()) {  
        System.out.println("Group: " + mat.group(1));  
    }  
}
```





# Regular Expression Example

```
public static void main(String[] args) {  
    String regex = args[0]:  
    String content  
    Pattern pat =  
    Matcher mat = pat.matcher(content);  
    if (mat.matches()) {  
        System.out.println("Group: " + mat.group(1));  
    }  
}
```

PatternSyntaxException

IndexOutOfBoundsException



# Fixing the Errors

`Pattern.compile`    only on valid regex

`Matcher.group(i)`    only if  $> i$  groups

...

```
if (!RegexUtil.isRegex(regex, 1)) {  
    System.out.println("Invalid: " + regex);  
    System.exit(1);  
}
```

...



# The Checker Framework

A framework for pluggable type checkers  
“Plugs” into the OpenJDK or OracleJDK  
compiler

```
javac -processor MyChecker ...
```

Standard error format allows tool integration



# Eclipse plug-in

```
3 public class Test {  
4  
5     public static void main(String[] args) {  
6         Console c = System.console();  
7         c.printf("Test");  
8     }  
9 }
```

Problems @ Javadoc Declaration Search

0 errors, 1 warning, 0 others

Description

Warnings (1 item)

dereference of possibly-null reference c  
c.printf("Test");

```
3 public class Test {  
4  
5     public static void main(String[] args) {  
6         Console c = System.console();  
7         c.printf("Test");  
8     }  
9 }
```

Problems @ Javadoc Declaration Search Console Task

0 errors, 1 warning, 0 others

Description	Resource
Warnings (1 item)	
dereference of possibly-null reference c c.printf("Test");	Test.java



# Ant and Maven integration

```
<presetdef name="jsr308.javac">
  <javac fork="yes"
    executable="${checkerframework}/checker/bin/${cfJavac}" >
    <!-- JSR-308-related compiler arguments -->
    <compilerarg value="-version"/>
    <compilerarg value="-implicit:class"/>
  </javac>
</presetdef>
```

```
<dependencies>
  ... existing <dependency> items ...
  <!-- annotations from the Checker Framework:
    nullness, interning, locking, ... -->
  <dependency>
    <groupId>org.checkerframework</groupId>
    <artifactId>checker-qual</artifactId>
    <version>1.9.7</version>
  </dependency>
</dependencies>
```



# Web interface

## <http://eisop.uwaterloo.ca/live/>

### Checker Framework Live Demo

Write Java code here:

```
1 import org.checkerframework.checker.nullness.qual.Nullable;
2 class YourClassNameHere {
3     void foo(Object nn, @Nullable Object nbl) {
4         nn.toString(); // OK
5         nbl.toString(); // Error
6     }
7 }
```

Choose a type system:

Check

#### Examples:

Nullness: [NullnessExample](#) | [NullnessExampleWithWarnings](#)

MapKey: [MapKeyExampleWithWarnings](#)

Interning: [InterningExample](#) | [InterningExampleWithWarnings](#)

Lock: [GuardedByExampleWithWarnings](#) | [HoldingExampleWithWarnings](#) | [EnsuresLockHeldExample](#) | [Local](#)

# Example type systems

Null dereferences (`@NonNull`)

>200 errors in Google Collections, javac, ...

Equality tests (`@Interned`)

>200 problems in Xerces, Lucene, ...

Concurrency / locking (`@GuardedBy`)

>500 errors in BitcoinJ, Derby, Guava, Tomcat, ...

Fake enumerations (`@Fenum`)

problems in Swing, JabRef



# String type systems

Regular expression syntax (`@Regex`)

56 errors in Apache, etc.; 200 annos

printf format strings (`@Format`)

104 errors, only 107 annotations required

Signature format (`@FullyQualified`)

28 errors in OpenJDK, ASM, AFU

Compiler messages (`@CompilerMessageKey`)

8 wrong keys in Checker Framework





# Security type systems

Command injection vulnerabilities (@OsTrusted)  
5 missing validations in Hadoop

Privacy (@Source)  
SPARTA detected malware in Android apps



You can write your own checker!

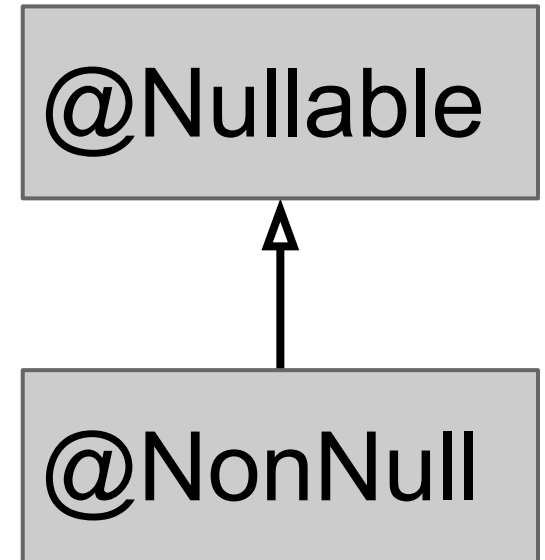


# Preventing Null-Pointer Exceptions

Basic type system:

`@Nullable`    might be null

`@NonNull`    non-null



Default is `@NonNull`

(Opposite of Java's assumption)

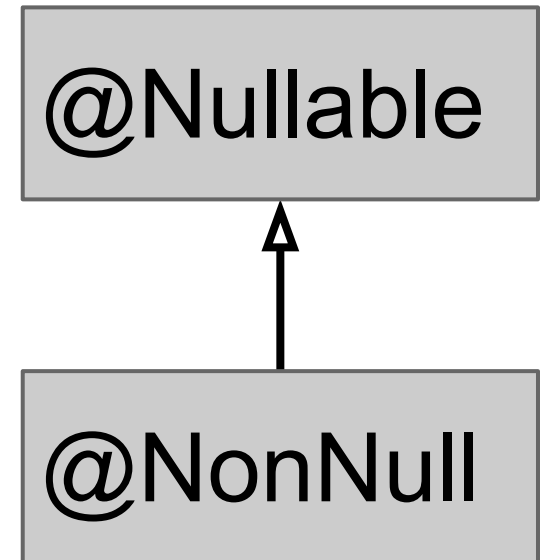
- Makes the dangerous case explicit
- Requires fewer annotations



# CLIMB-to-top defaulting rule (applies to all type systems)

Top type is the default for:

- **C**asts
- **L**ocal variables
- **I**nstanceof
- **iM**plicit **B**ounds



Type refinement from assignments

```
myVar = new Foo();
```

Likewise for cast/instanceof expression

Top for implicit types allows every instantiation



# Dynamic checks

```
if (x != null) {  
    x.hashCode();  
}
```

```
if (!RegexUtil.isRegex(userInput)) {  
    throw new RuntimeException(...);  
}
```

```
Pattern p = Pattern.compile(userInput);
```



# One check for `null` is not enough

```
if (myField != null) {  
    method1();  
    myField.hashCode();  
}
```

3 ways to express persistence across side effects:

```
@SideEffectFree void method1() { ... }  
@EnsuresNonNull("myField") method1()  
{...}  
@MonotonicNonNull myField;
```



# Side effects

`@SideEffectFree`

Does not modify externally-visible state

`@Deterministic`

If called with `== args` again, gives `== result`

`@Pure`

Both side-effect-free and deterministic

The side-effect annotations are trusted, not checked



# Lazy initialization and persistence across side effects

`@MonotonicNonNull`

Might be null or non-null

May only be (re-)assigned a non-null value

Purpose: avoid re-checking

Once non-null, always non-null



# Method pre- and post-conditions

## Preconditions:

`@RequiresNonNull`

## Postconditions:

`@EnsuresNonNull`

`@EnsuresNonNullIf`

```
@EnsuresNonNullIf(expression="#1", result=true)  
public boolean equals(@Nullable Object obj) { ... }
```





# Polymorphism over qualifiers

`@PolyNull`

Each occurrence is a use of an implicitly-defined type qualifier variable

`@PolyAll`

Same for all type systems



# A non-null field might contain null

```
@NonNull String name;  
... myObject.name ...
```

## Initialization

`@Initialized` (constructor has completed)

`@UnderInitialization(Frame.class)`

Its constructor is currently executing

`@UnknownInitialization`

Might be initialized or under initialization



# Map keys and Map.get

```
Map<String, @NonNull Integer> gifts;  
... gifts.get("pipers piping") ...
```

Map.get can return null unless

- value type is non-null, **and**
- argument key appears in the map

@KeyFor [rarely written, usually inferred]



# Suppressing warnings

Because of Checker Framework false positives

`@SuppressWarnings("nullness")`

Use smallest possible scope (e.g., local var)

Write the rationale

```
assert x != null : "@AssumeAssertion(nullness)";
```

More: <http://types.cs.washington.edu/checker-framework/current/checker-framework-manual.html#suppressing-warnings>



# Optional checks

- AInt=redundantNullComparison

Warns if comparing a non-null value to null

- AInt=uninitialized

Warns if the constructor does not initialize all fields (even primitives that have a default)



# Building a checker is easy

Example: Ensure encrypted communication

```
void send(@Encrypted String msg) {...}  
@Encrypted String msg1 = ...;  
send(msg1);    // OK  
String msg2 = .....;  
send(msg2);    // Warning!
```



# Building a checker is easy

Example: Ensure encrypted communication

```
void send(@Encrypted String msg) {...}  
@Encrypted String msg1 = ...;  
send(msg1);    // OK  
String msg2 = ....;  
send(msg2);    // Warning!
```

The complete checker:

```
@Target(ElementType.TYPE_USE)  
@SubtypeOf(Unqualified.class)  
public @interface Encrypted {}
```



# Encrypted Checker Demo

Let's build it!





# Defining a type system

1. Qualifier hierarchy
  - defines subtyping
2. Type introduction rules
  - types for expressions, declarations
3. Type rules
  - checker-specific errors
4. Flow-refinement
  - better types than the programmer wrote



# Defining a type system

1. Qualifier hierarchy
  - subtyping, assignments

```
@SubtypeOf(UnknownRegex.class)  
public @interface Regex {
```



# Defining a type system

## 2. Type introduction rules

- types for expressions, declarations

```
@ImplicitFor( trees = {  
    Tree.Kind.NEW_CLASS,  
    Tree.Kind.NEW_ARRAY, ... })
```

```
@DefaultQualifierInHierarchy
```

```
@DefaultForUnannotatedCode({  
    DL.PARAMETERS, DL.LOWER_BOUNDS })
```



# Defining a type system

## 3. Type rules

- checker-specific errors

```
void visitSynchronized(SynchronizedTree node) {  
    ExpressionTree expr = node.getExpression();  
    AnnotatedTypeMirror type =  
        getAnnotatedType(expr);  
    if (!type.hasAnnotation(NONNULL))  
        checker.report(Result.failure(...), expr);  
}
```



# Defining a type system

## 4. Flow-refinement

- better types than the programmer wrote

```
if (ElementUtils.matchesElement(method,  
    IS_REGEX_METHOD_NAME,  
    String.class, int.class)) {  
    ...  
}
```



# Testing infrastructure

jtreg-based testing as in OpenJDK

Lightweight tests with in-line expected errors:

```
String s = "%+s%";  
//:: error: (format.string.invalid)  
f.format(s, "illegal");
```



# Tips

- Start by type-checking part of your code
- Only type-check properties that matter to you
- Use subclasses (not type qualifiers) if possible
- Write the spec first (and think of it as a spec)
- Avoid warning suppressions when possible
- Avoid raw types such as `List`; use `List<String>`



# Checkers are usable

- Type-checking is **familiar** to programmers
- Modular: fast, incremental, partial programs
- Annotations are **not too verbose**
  - **@NonNull**: 1 per 75 lines
  - **@Interned**: 124 annotations in 220 KLOC revealed 11 bugs
  - **@Format**: 107 annotations in 2.8 MLOC revealed 104 bugs
  - Possible to annotate part of program
  - Fewer annotations in new code
- Few false positives
- First-year CS majors preferred using checkers to not
- **Practical**: in daily use at Google, on Wall Street, etc.





# What a checker guarantees

The program satisfies the type property. There are:

- No bugs (of particular varieties)
- No wrong annotations

Caveat 1: only for code that is checked

- Native methods (but handles reflection!)
- Code compiled without the pluggable type checker
- Suppressed warnings
  - Indicates what code a human should analyze
- Checking part of a program is still useful

Caveat 2: The checker itself might contain an error



# Java 8 extends annotation syntax

Annotations on all occurrences of types:

```
@Untainted String query;  
List<@NonNull String> strings;  
myGraph = (@Immutable Graph) tmp;  
class UnmodifiableList<T>  
    implements @ReadOnly List<T> {}
```

Stored in classfile

Handled by javac, javap, javadoc, ...



# Java 6 & 7 compatibility

Annotations in comments:

```
List</*@Nonnull*/ String> strings;
```

(Requires use of jsr308-langtools compiler.)



# Annotating external libraries

When type-checking clients, need library spec

Can write manually or automatically infer

Two syntaxes:

- As separate text file (stub file)
- Within its .jar file (from annotated partial source code)



# Checker Framework facilities

- Full type systems: inheritance, overriding, ...
- Generics (type polymorphism)
  - Also qualifier polymorphism
- Qualifier defaults
- Dataflow framework
- Pre-/post-conditions
- Warning suppression
- Testing infrastructure



# Verification

- **Goal:**  
prove that no bug exists
- **Specifications:**  
user provides
- **False negatives:**  
none
- **False positives:**  
user suppresses warnings
- **Downside:**  
user burden

# Bug-finding

- **Goal:**  
find some bugs at low cost
- **Specifications:**  
infer likely specs
- **False negatives:**  
acceptable
- **False positives:**  
heuristics focus on most important bugs
- **Downside:**  
missed bugs

Neither is “better”; each is appropriate in certain circumstances.



# Community

Open source project:

<https://github.com/typetools/checker-framework>

Community:

- uWashington: Michael Ernst, Suzanne Millstein, Javier Thaine, Dan Brown ...
- uWaterloo: Werner Dietl, Jeff Luo, Jason Li, Mier Ta, Charles Chen, ...
- Bug reports, test cases, patches, ... from users



# Conclusions

Checker Framework for creating type checkers

- Featureful, effective, easy to use, scalable

Prevent bugs at compile time

Create custom type-checkers

Improve your code!



<http://CheckerFramework.org/>

@CheckerFrmwrk on Twitter  
CheckerFramework on Facebook & Google+



<http://checkerframework.org/>