

13.12.2018

AACHEN, EUREGJUG

# Datenanalysen in der Softwareentwicklung mit Software Analytics

**Markus Harrer**  
**Software Development Analyst**

**INOQ**



**Markus Harrer**

@feststelltaste



Antwort an [@rotnroll666](#)

Thanks for the kind words! But I'm just  
hacking my way through all the data with  
pure stubbornness 😊

Tweet übersetzen

10:25 - 20. Apr. 2017

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1 „Gefällt mir“-Angabe



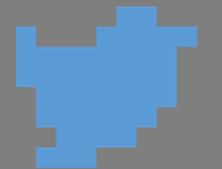


I ❤ legacy code!



# Markus Harrer

Software Development Analyst



@feststelltaste

Blog: [feststelltaste.de](http://feststelltaste.de)

Web: [markusharrer.de](http://markusharrer.de)

Work: **INNOQ**

# Agenda

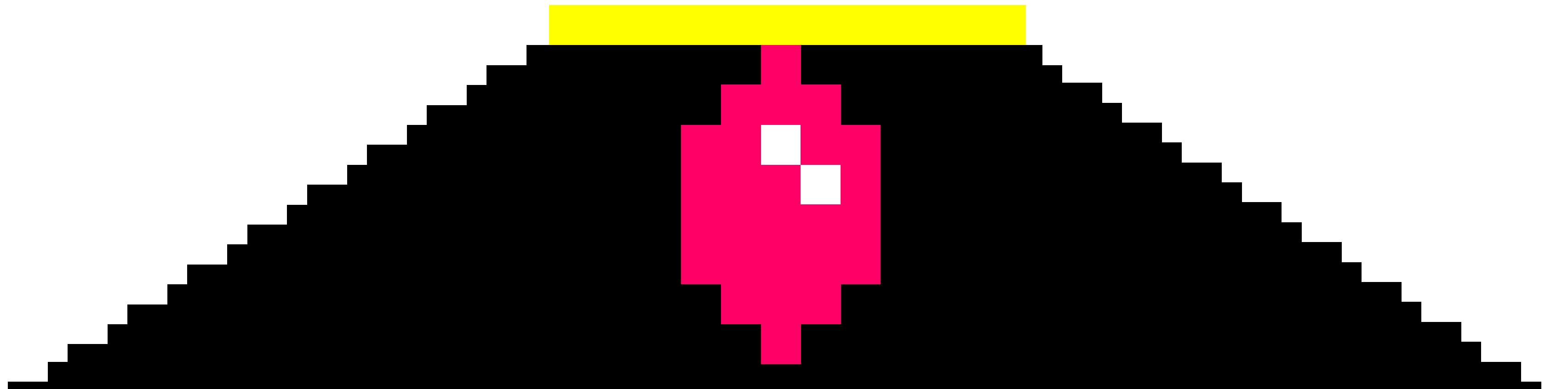
- Warum? — 
  - WTF? — 
  - Wie? — 
  - Was? — 
- Datenanalysen  
in der Software-  
entwicklung

Warum?

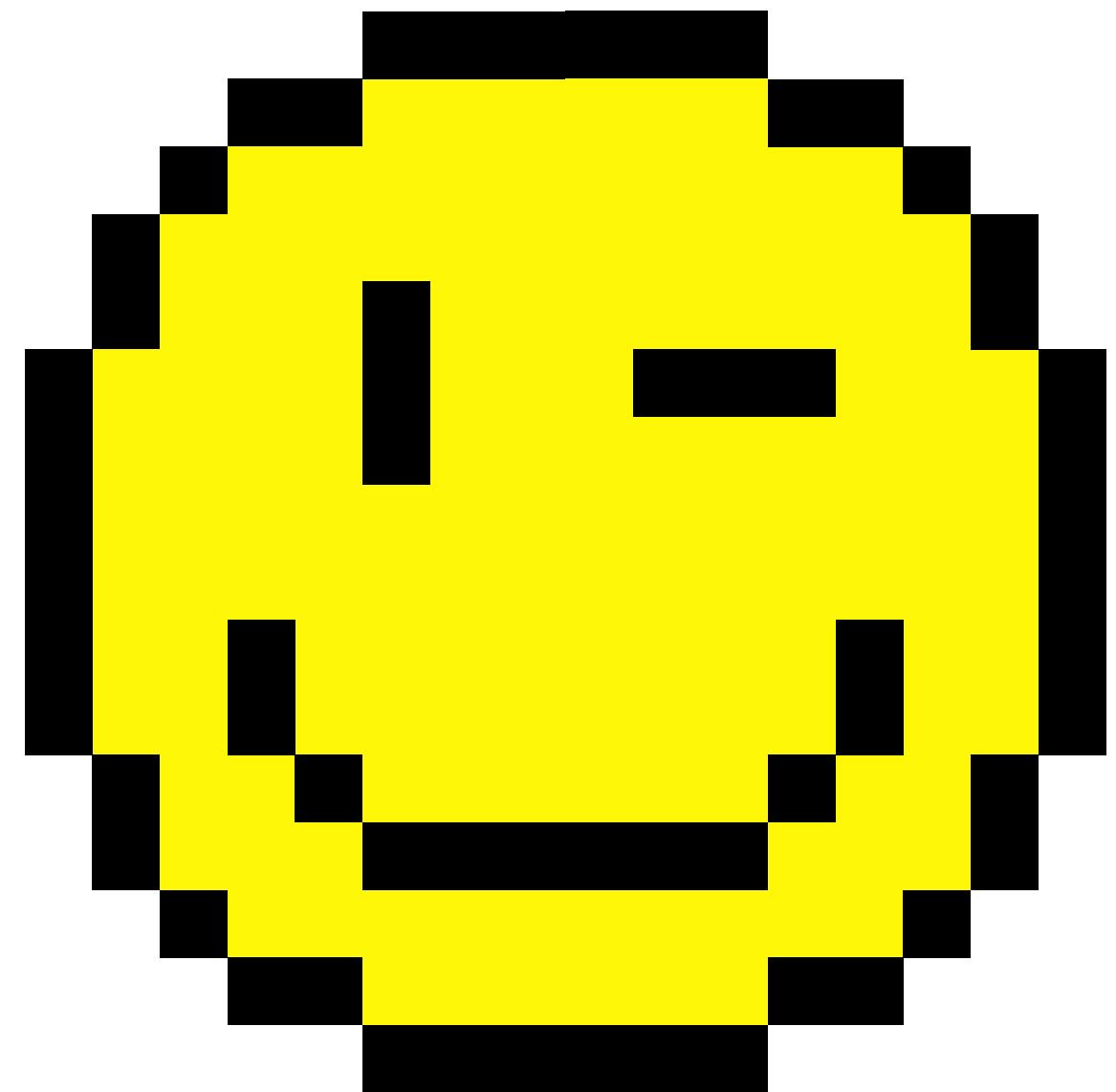


@feststelltaste

# Management



# Entwickler





Abends in der Kneipe...

**Wir haben jetzt  
eine 7-Schichten-  
architektur!**

**Jedes Jahr gibt es  
ne' neue Schicht, um  
den Mist vom letzten  
Jahr zu überdecken!**

**Wie kommt es denn  
zu sowas?**



# Symptombesehrungen

Gestern ist unser  
Flaggschiffprodukt  
in Produktion  
abgeraucht!

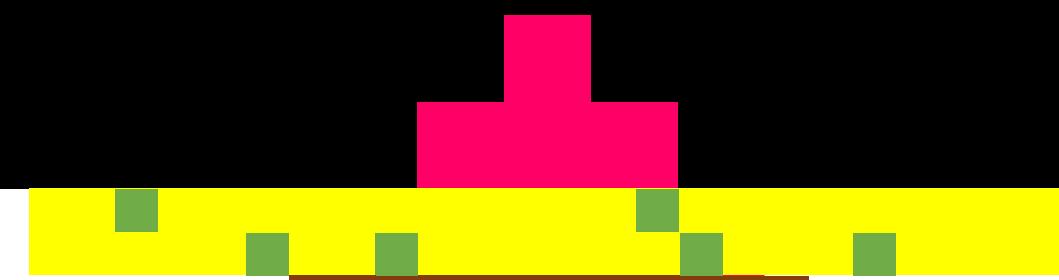


Schrecklich! Was ist  
denn passiert?

Nichts! Niemand  
verwendet es...

**Wahrnehmungsdiskrepanz**

# Management



# *Software History* repeating

10 REWRITE

20 SLEEP 3

30 GOTO 10

...the only iterative software development process that works every single time!

WTF-P



MANAGEMENT  
RISIKEN



KOMMUNIKATIONSBARRIERE

KONSEQUENZEN



ENTWICKLER

# MANAGEMENT

RISIKEN



# wie?



@feststelltaste

# THE EMPIRIC STRIKES BACK

Not a long time ago, from brains  
not far, far away....

# **SOFTWARE ANALYTICS**

*A definition of*

**MENZIES & ZIMMERMANN**

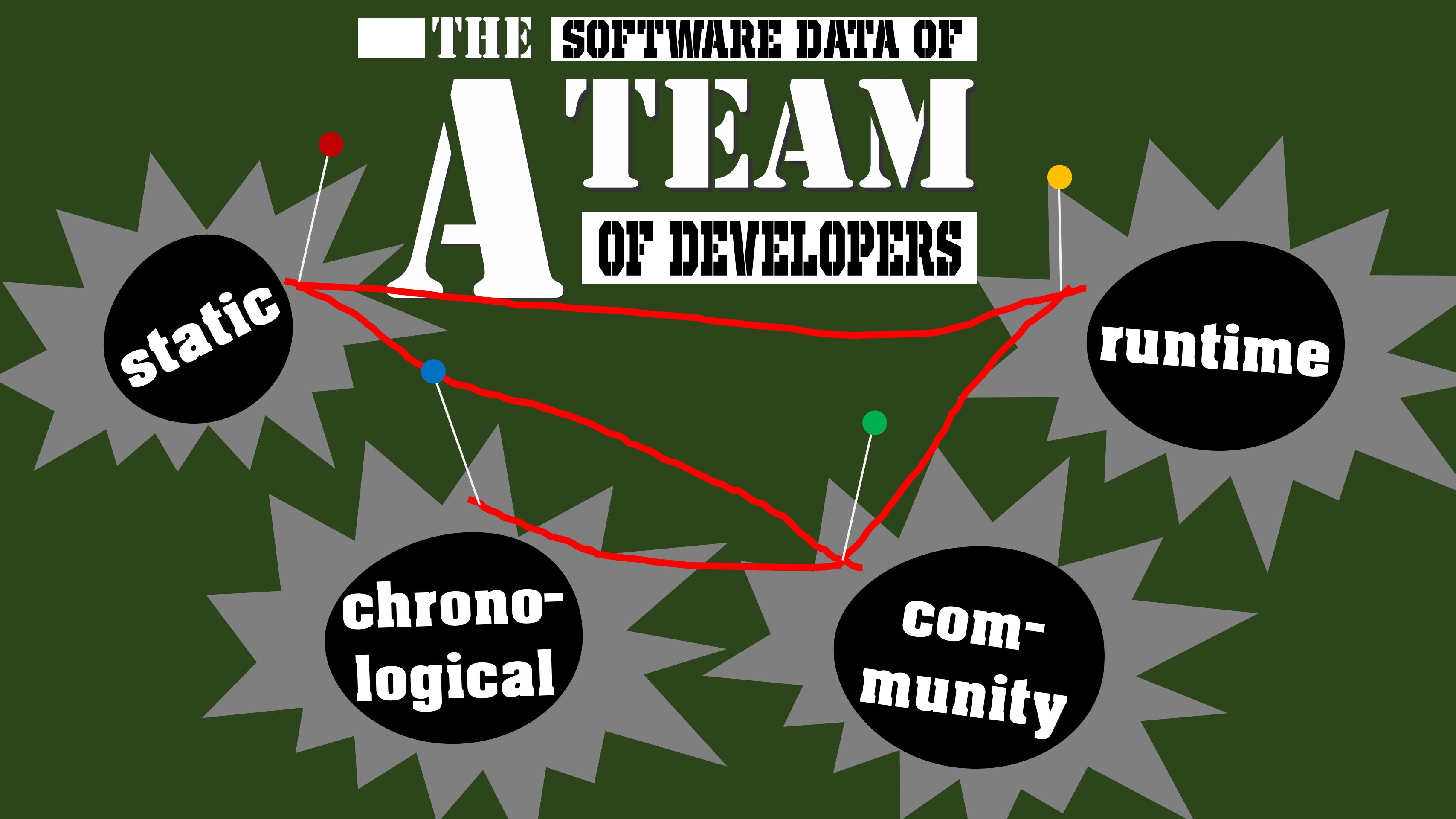
**Software Analytics**

*is analytics on software data for  
managers and software engineers*

*with the aim of empowering  
software development individuals  
and teams*

*to gain and share insight from  
their data to make better  
decisions.*

THE SOFTWARE DATA OF  
**A TEAM  
OF DEVELOPERS**



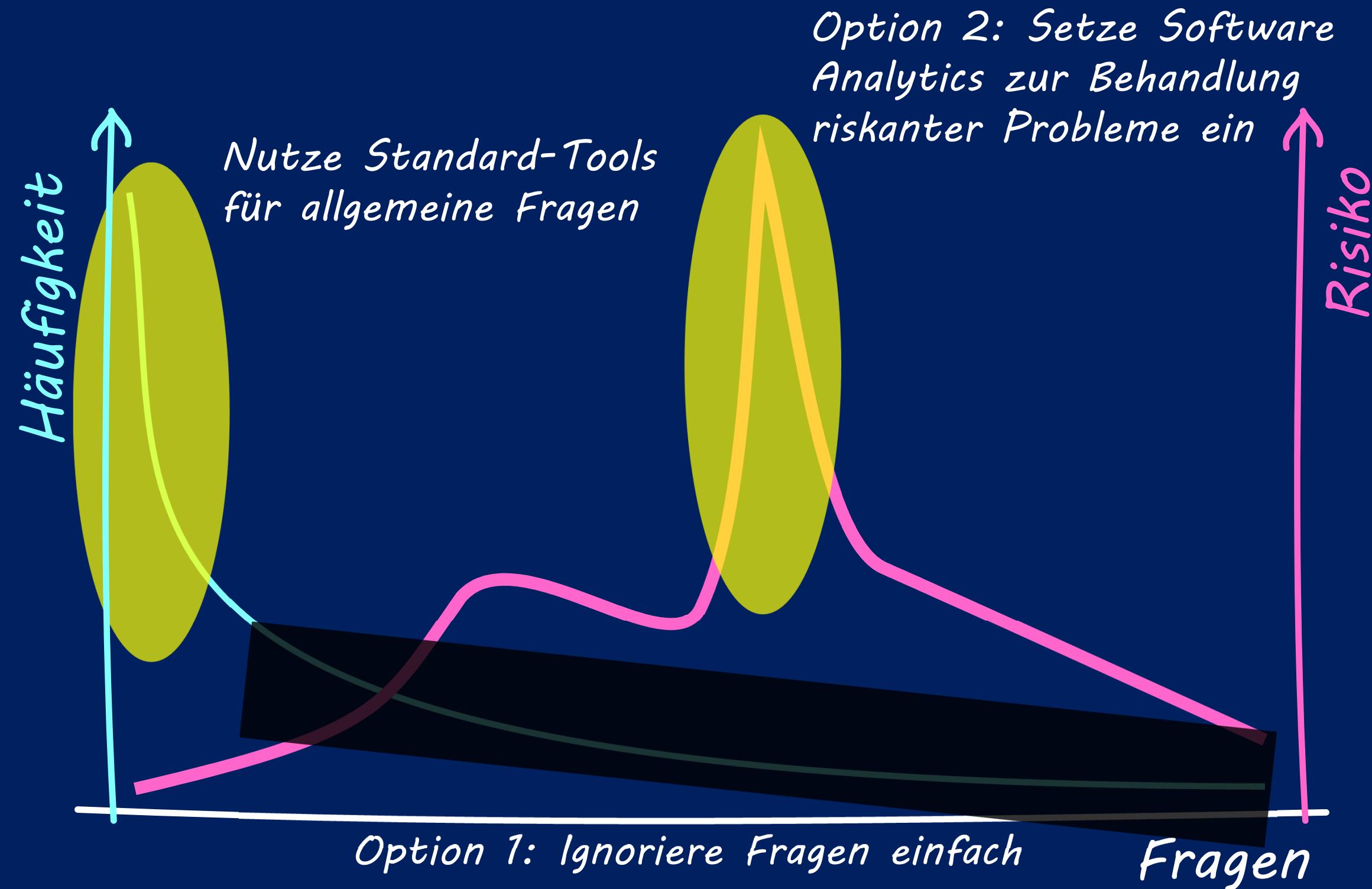
static

runtime

chrono-  
logical

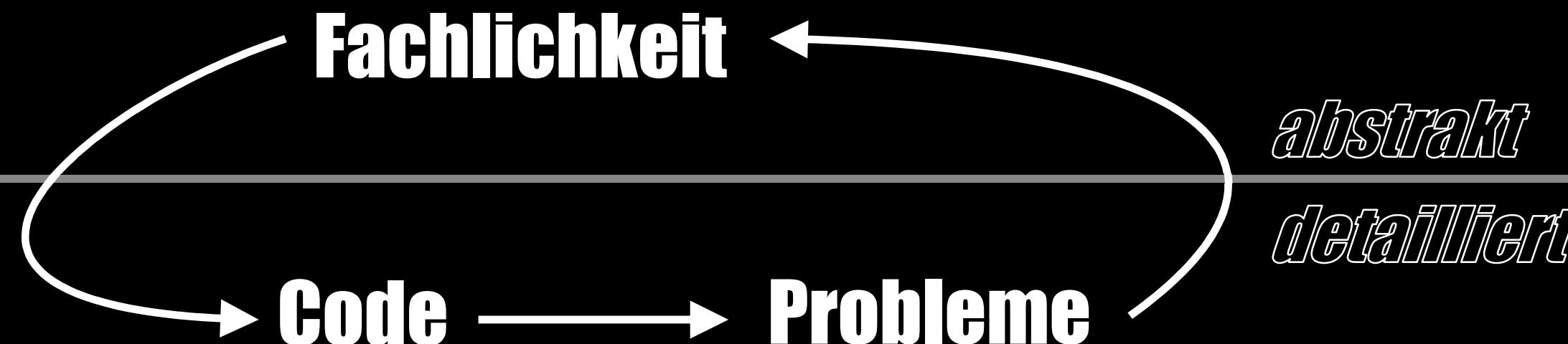
com-  
munity

# Software Analytics fokussiert sich auf wichtige Fragen



# MINE THE GAP !

- **Code verschmilzt mit Fachlichkeit**
- **Data Science bringt datenorientierte Problemanalyse zu Entwicklern**
- **Werkzeuge bilden und vernetzen verschiedene Perspektiven**





# Notebook

- 📄 Kontext dokumentiert
  - 💡 Ideen, Daten, Annahmen und Vereinfachungen aufgeführt
  - 📝 Berechnungen verständlich dargelegt
  - ↪ Zusammenfassungen erklärt
  - ☑ Komplett automatisiert

(und zur Ausrechnung benutzen) Man erhält so in unserem Falle die bis  $\delta \geq 1$  konvergente Entwicklung

$$z = y - 0,1768y^2 - 0,0034y^3 - 0,0005y^4 \dots$$

Wir führen nun die Beziehungen ein

$$\frac{z}{y} \in \mathcal{F}_Y \}, \dots, \dots$$

Zum gelten für das ungestättigte ideale Gas, d. h. zwischen  $y = 0$  und  $y = 2,615$  die Beziehungen

$$\frac{\bar{g}}{n} = \frac{3}{2} \times P(Fly) \quad \dots \dots \quad (9c)$$

$$\mu_r = R P_7 F_7) ; \dots \dots \quad (22c)$$

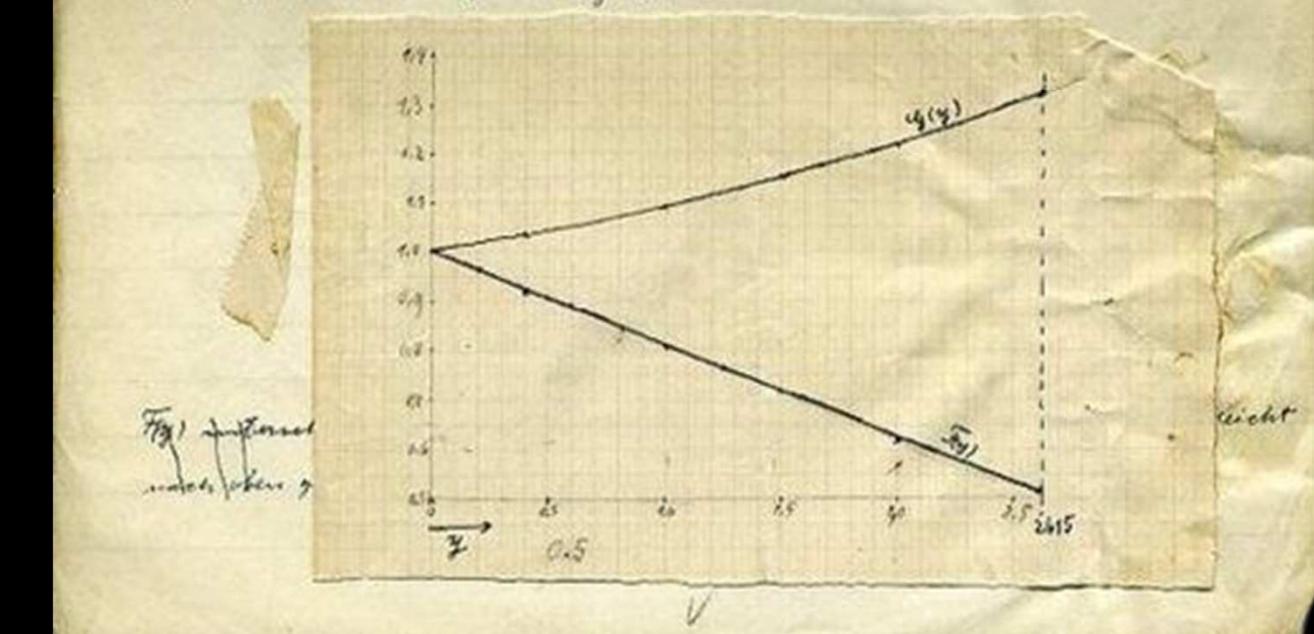
*scrubii* *gossypii* is

$$\gamma = \frac{h^3}{(2\pi m k T)^{\frac{3}{2}}} \cdot \frac{n}{V} = \frac{h^3 N k T}{(2\pi M R T)^{\frac{3}{2}}} \quad \dots (18c)$$

Stue (196) erhält man für die auf das Mol bezogene spezifische Wärme bei konstantem Volumen  $c_V$ :

$$c_1 = \frac{3}{2} R (\bar{F}(\bar{y}) - \frac{3}{2} y \bar{F}'(\bar{y})) = \frac{3}{2} R G(y), \quad \psi \in \mathcal{C}$$

Wir geben <sup>die</sup> zur leichteren Übersicht eine graphische Darstellung der Funktionen  $F(x)$  und  $G(x)$ .





## Context

John Doe remarked in [#AP1432](#) that there may be too much code in our application that isn't used at all. Before migrating the application to the new platform, we have to analyze which parts of the system are still in use and which are not.

## Idea

To understand how much code isn't used, we recorded the executed code in production with the coverage tool [JaCoCo](#). The measurement took place between 21st Oct 2017 and 27st Oct 2017. The results were exported into a CSV file using the JaCoCo command line tool with the following command:

```
java -jar jacococli.jar report "C:\Temp\jacoco.exec" --classfiles \
C:\dev\repos\buschmais-spring-petclinic\target\classes --csv jacoco.csv
```

The CSV file contains all lines of code that were passed through during the measurement's time span. We just take the relevant data and add an additional LINES column to be able to calculate the ratio between covered and missed lines later on.

In [1]:

```
1 import pandas as pd
2 coverage = pd.read_csv("../input/spring-petclinic/jacoco.csv")
3 coverage = coverage[['PACKAGE', 'CLASS', 'LINE_COVERED', 'LINE_MISSED']]
4 coverage['LINES'] = coverage.LINE_COVERED + coverage.LINE_MISSED
5 coverage.head(1)
```

Out[1]:

	PACKAGE	CLASS	LINE_COVERED	LINE_MISSED	LINES
0	org.springframework.samples.petclinic	PetclinicInitializer	24	0	24

# Analysis

It was stated that whole packages wouldn't be needed anymore and that they could be safely removed. Therefore, we sum up the coverage data per class for each package and calculate the coverage ratio for each package.

```
In [2]: 1 grouped_by_packages = coverage.groupby("PACKAGE").sum()
2 grouped_by_packages['RATIO'] = grouped_by_packages.LINE_COVERED / grouped_by_packages.LINES
3 grouped_by_packages = grouped_by_packages.sort_values(by='RATIO')
4 grouped_by_packages
```

Out[2]:

PACKAGE	LINE_COVERED	LINE_MISSED	LINES	RATIO
org.springframework.samples.petclinic.repository.jdbc	0	152	152	0.000000
org.springframework.samples.petclinic.util	13	17	30	0.433333
org.springframework.samples.petclinic.web	75	40	115	0.652174
org.springframework.samples.petclinic.model	75	33	108	0.694444
org.springframework.samples.petclinic.repository.jpa	21	7	28	0.750000
org.springframework.samples.petclinic.service	16	2	18	0.888889
org.springframework.samples.petclinic	24	0	24	1.000000

We plot the data for the coverage ratio to get a brief overview of the result.

```
In [3]: 1 %matplotlib inline
2 grouped_by_packages[['RATIO']].plot(kind="barh", figsize=(8,2))
```

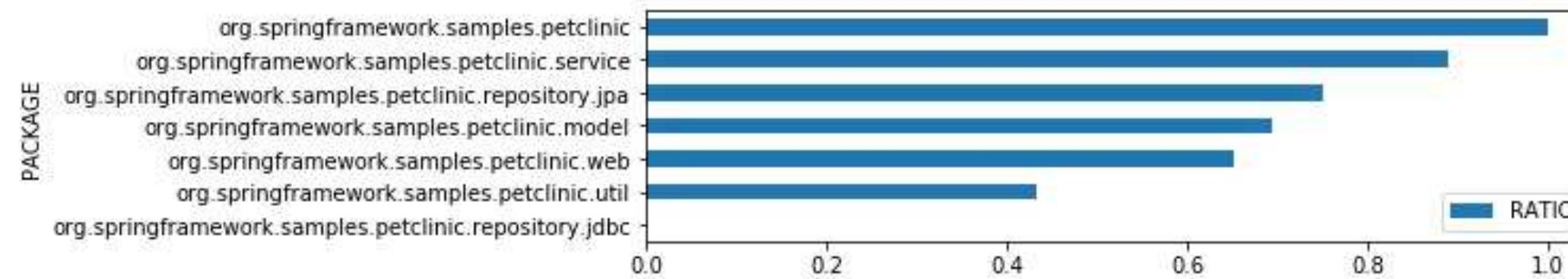
Out[3]: <matplotlib.axes.\_subplots.AxesSubplot at 0x1874cdde9e8>

org.springframework.samples.petclinic.util	13	17	30	0.433333
org.springframework.samples.petclinic.web	75	40	115	0.652174
org.springframework.samples.petclinic.model	75	33	108	0.694444
org.springframework.samples.petclinic.repository.jpa	21	7	28	0.750000
org.springframework.samples.petclinic.service	16	2	18	0.888889
org.springframework.samples.petclinic	24	0	24	1.000000

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```

```
Out[3]: <matplotlib.axes._subplots.AxesSubplot at 0x1874cdde9e8>
```



## Conclusion

The JDBC package `org.springframework.samples.petclinic.repository.jdbc` isn't used at all and can be left out safely when migrating to the new platform.

# STANDARDWERKZEUGE

## Jupyter

Interaktives Notizbuch: Zentrale Stelle für Datenanalysen und Dokumentation

## Python

Data Scientist's best friend: Einfache, effektive, schnelle Programmiersprache

## Pandas

Pragmatisches Datenanalyse-Framework: Großartige Datenstrukturen und gute Integration mit Machine Learning Tools

## matplotlib

Plotting-Bibliothek für einfache Visualisierungen (Linien-, Balken-, Tortendiagramme etc.)

# TOOLS advanced level

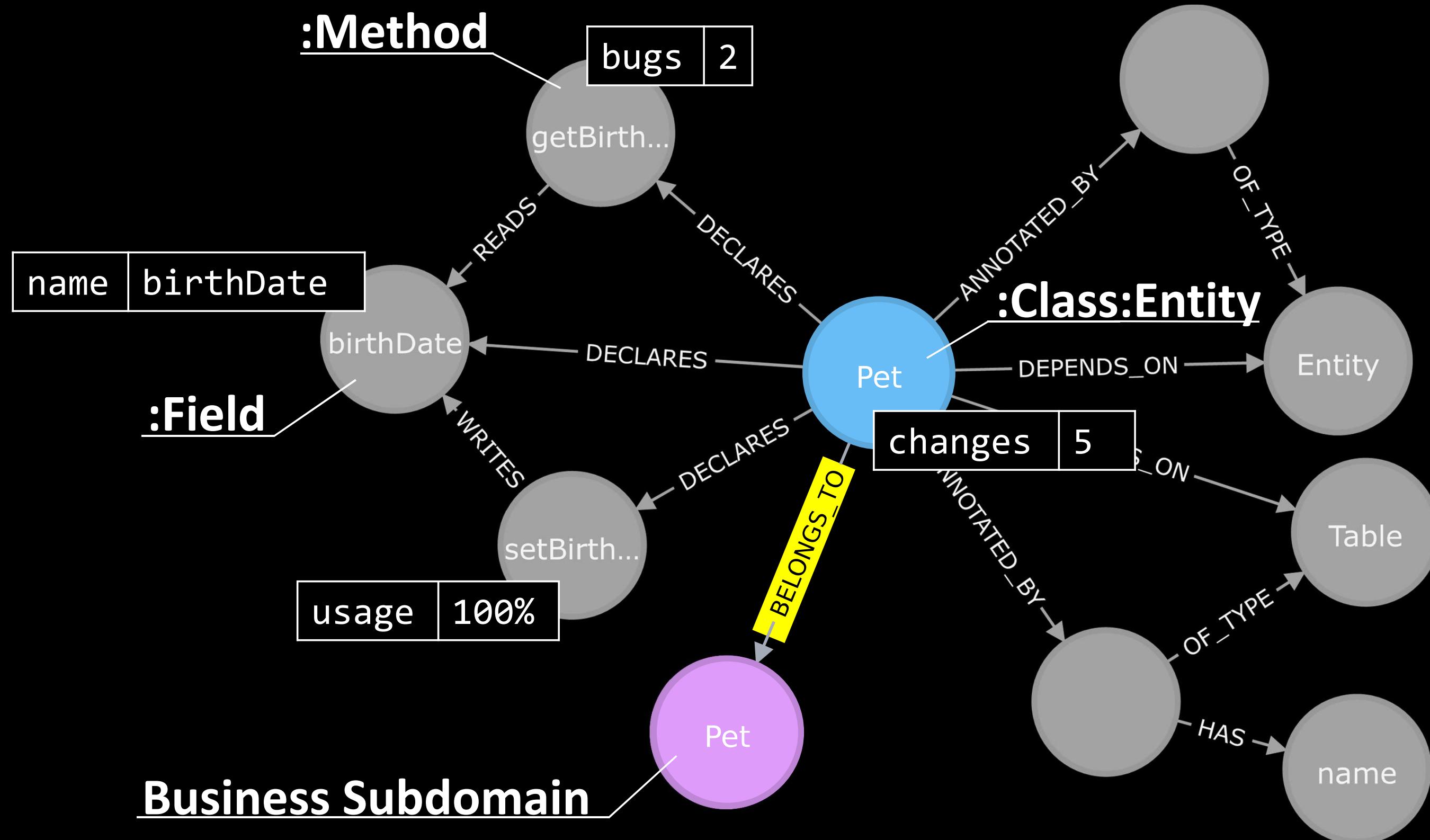
## Structural Code Analysis Framework

1. Scanne Softwarestrukturen
2. Speichere in Graphdatenbank
3. Analysiere und erstelle Verbindungen
4. Füge eigene Konzepte hinzu
5. Finde Antworten



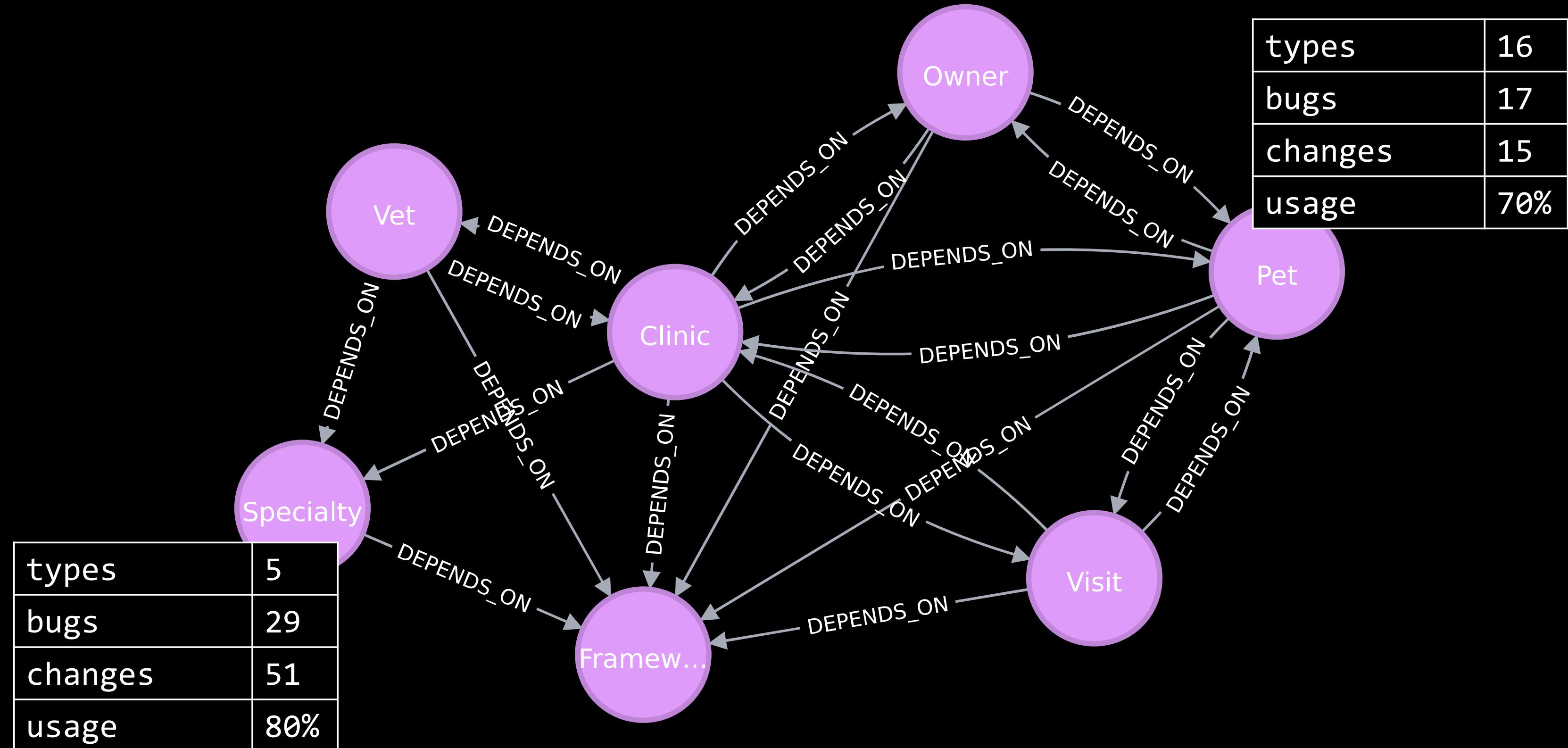
# jQAssistant – Die komplexe Softwarelandschaft als Graph

<https://github.com/buschmais/spring-petclinic>



# jQAssistant – Die komplexe Softwarelandschaft als Graph

<https://github.com/buschmais/spring-petclinic>



# **ANALYSEN ZUM TERMINIEREN VON PROBLEmen**

- Quantifizierung des Wissensverlusts bei Entwicklerfluktuation
- Verprobung von Modularisierungsvarianten (“virtuelles Refactoring”)
- Erstellung von Codeinventar / Musterkatalog / Behebungslisten
- Ermittlung von Performance-Hotspots über Call-Tree-Analyse
- Identifikation von besonders fehlerbehafteten Code-Bereichen
- ...

*Individuelle Probleme* im eigenen Softwaresystem **sichtbar machen!**  
e. g. race conditions, architecture smells, build breaker, programming errors, dead code, ...

*Was?*

# *DEMOS*

*No-Go-Areas*

*Code Smells*

*Strategic Redesign*

# DEMOS

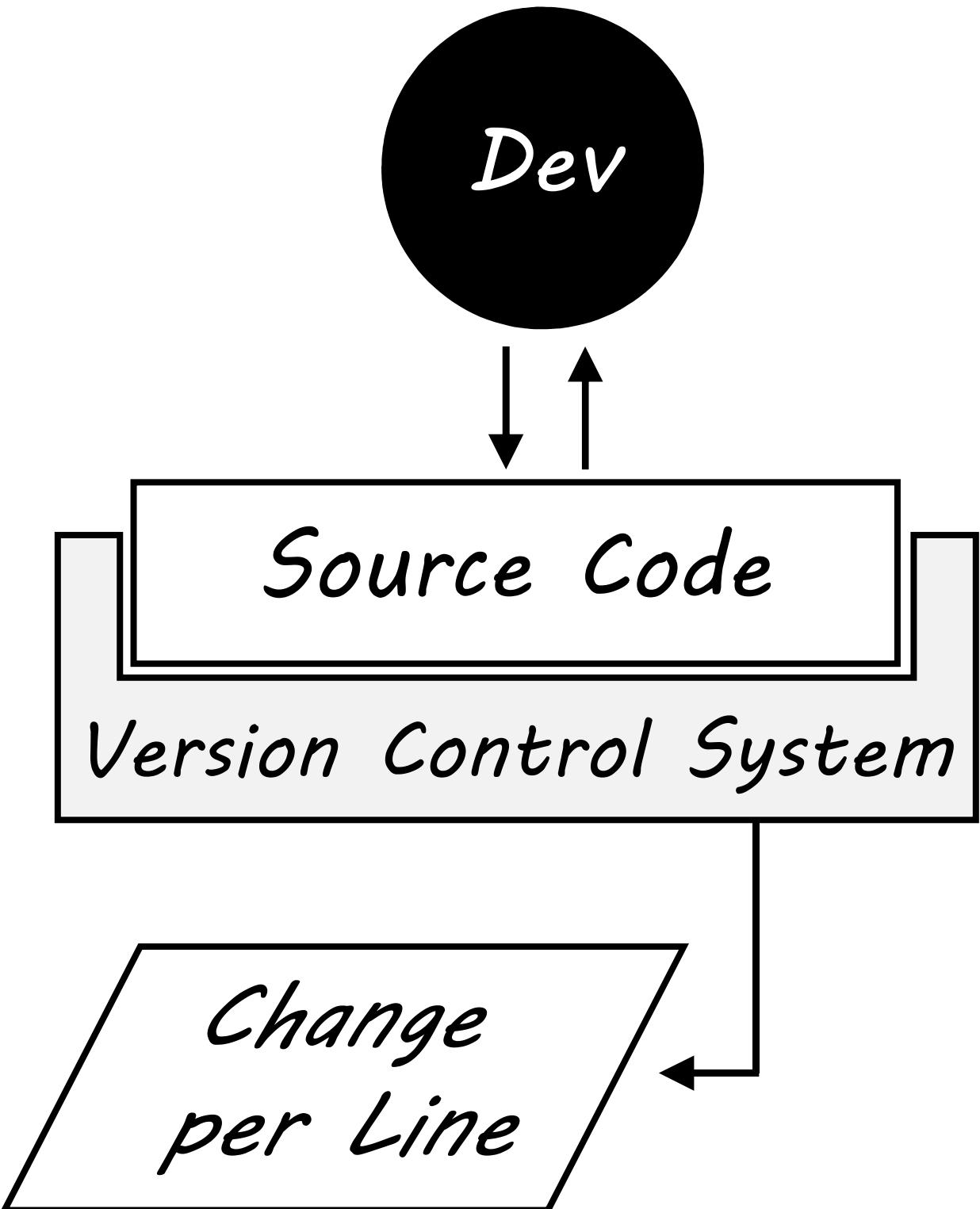
No-Go-Areas

Code Smells

Strategic Redesign

# Identification of No-Go areas using version control data

Demo  
No-Go Areas in  
the Linux kernel



# *Identification of No-Go Areas: Starting Point*

```
void rb532_mask_and_ack_irq(struct irq_data *d)
{
    disable_irq(d);
    local_irq(group_to_ip(irq_to_group(d->irq)));
}

int rb532_set_type(struct irq_data *d, unsigned type)
{
    gpio = d->irq - GPIO_MAPPED_IRQ_BASE;
    group = irq_to_group(d->irq);

    if (group != GPIO_MAPPED_IRQ_GROUP)
```

*Source Code*

# *Identification of No-Go Areas: Idea*

```
static void rb532_mask_and_ack_irq(struct irq_data *d)
{
    rb532_disable_irq(d);
    ack_local_irq(group_to_ip(irq_to_group(d->irq)));
}

static int rb532_set_type(struct irq_data *d, unsigned type)
{
    int gpio = d->irq - GPIO_MAPPED_IRQ_BASE;
    int group = irq_to_group(d->irq);

    if (group != GPIO_MAPPED_IRQ_GROUP)
```

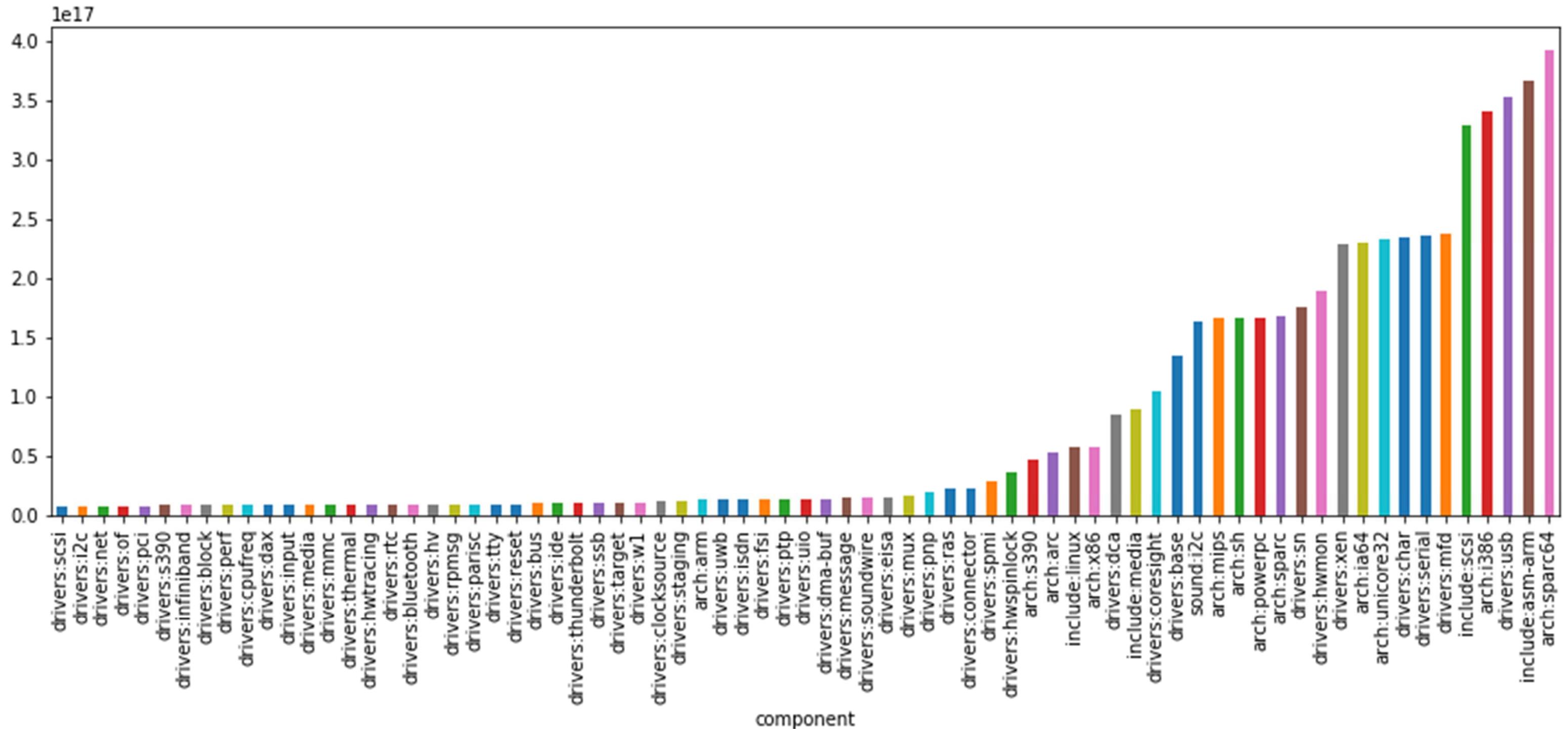
*Change per Line*

# *Identification of No-Go Areas: Idea*

efb02d	arch/irq.c	(Thomas Gleixner)	2011-03-23	21:09:10	+0000	164)	stat:
73b439	arch/irq.c	(Ralf Baechle)	2008-07-16	16:12:25	+0100	165)	{
efb02d	arch/irq.c	(Thomas Gleixner)	2011-03-23	21:09:10	+0000	166)	rb5
efb02d	arch/irq.c	(Thomas Gleixner)	2011-03-23	21:09:10	+0000	167)	ack
73b439	arch/irq.c	(Ralf Baechle)	2008-07-16	16:12:25	+0100	168)	}
73b439	arch/irq.c	(Ralf Baechle)	2008-07-16	16:12:25	+0100	169)	
efb02d	arch/irq.c	(Thomas Gleixner)	2011-03-23	21:09:10	+0000	170)	stat:
4aa0f4	arch/irq.c	(Phil Sutter)	2008-11-28	20:45:10	+0100	171)	{
efb02d	arch/irq.c	(Thomas Gleixner)	2011-03-23	21:09:10	+0000	172)	int
efb02d	arch/irq.c	(Thomas Gleixner)	2011-03-23	21:09:10	+0000	173)	int
4aa0f4	arch/irq.c	(Phil Sutter)	2008-11-28	20:45:10	+0100	174)	
efb02d	arch/irq.c	(Thomas Gleixner)	2011-03-23	21:09:10	+0000	175)	if

*Change per Line*

# *Identification of No-Go Areas: Result*



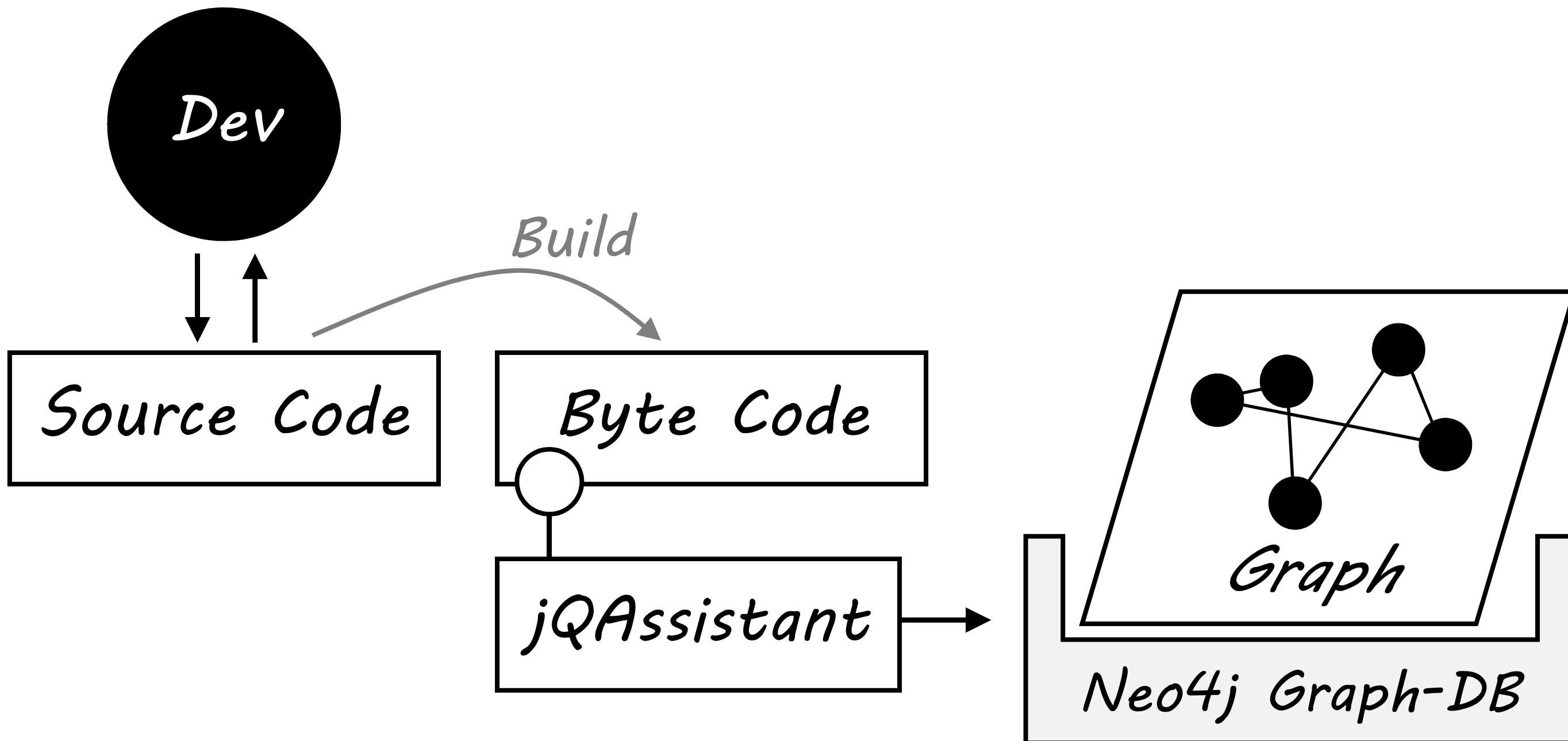
*DEMOS*

*No-Go-Areas*

*Code Smells*

*Strategic Redesign*

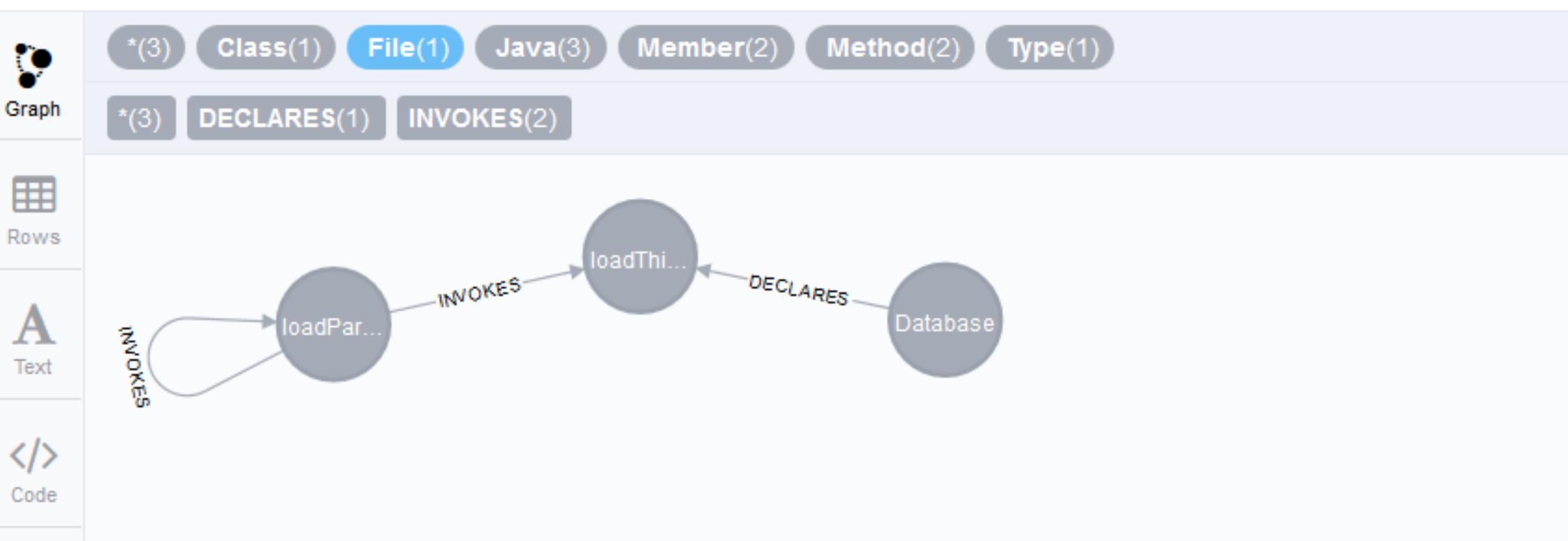
# Code Smells: Seeing Software as a Graph



# Code Smells: Seeing Software as a Graph

```
1 // Rekursive Aufrufe zur Datenbank
2 MATCH
3   (m:Method) - [:INVOKES*] -> (m) - [:INVOKES] -> (dbMethod:Method) ,
4   (dbMethod) <- [:DECLARES] - (dbClass:Class)
5 WHERE dbClass.name ENDS WITH "Database"
6 RETURN m, dbMethod, dbClass
```

```
$ MATCH (m:Method) - [:INVOKES*] -> (m) - [:INVOKES] -> (dbMethod:Method) , (dbMethod) <- [:DECLARES] - (dbClass:Class)
```



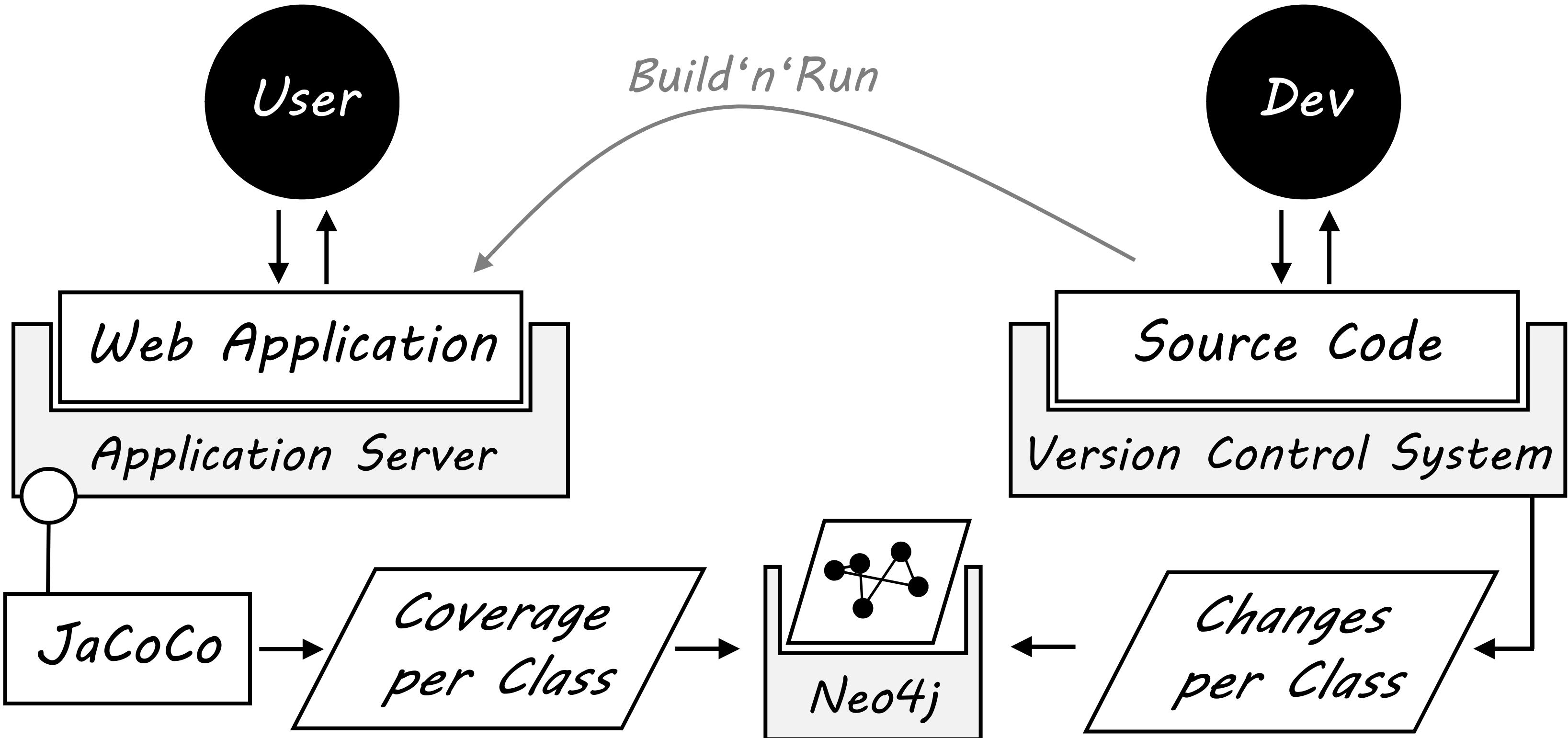
# *DEMOS*

*No-Go-Areas*

*Code Smells*

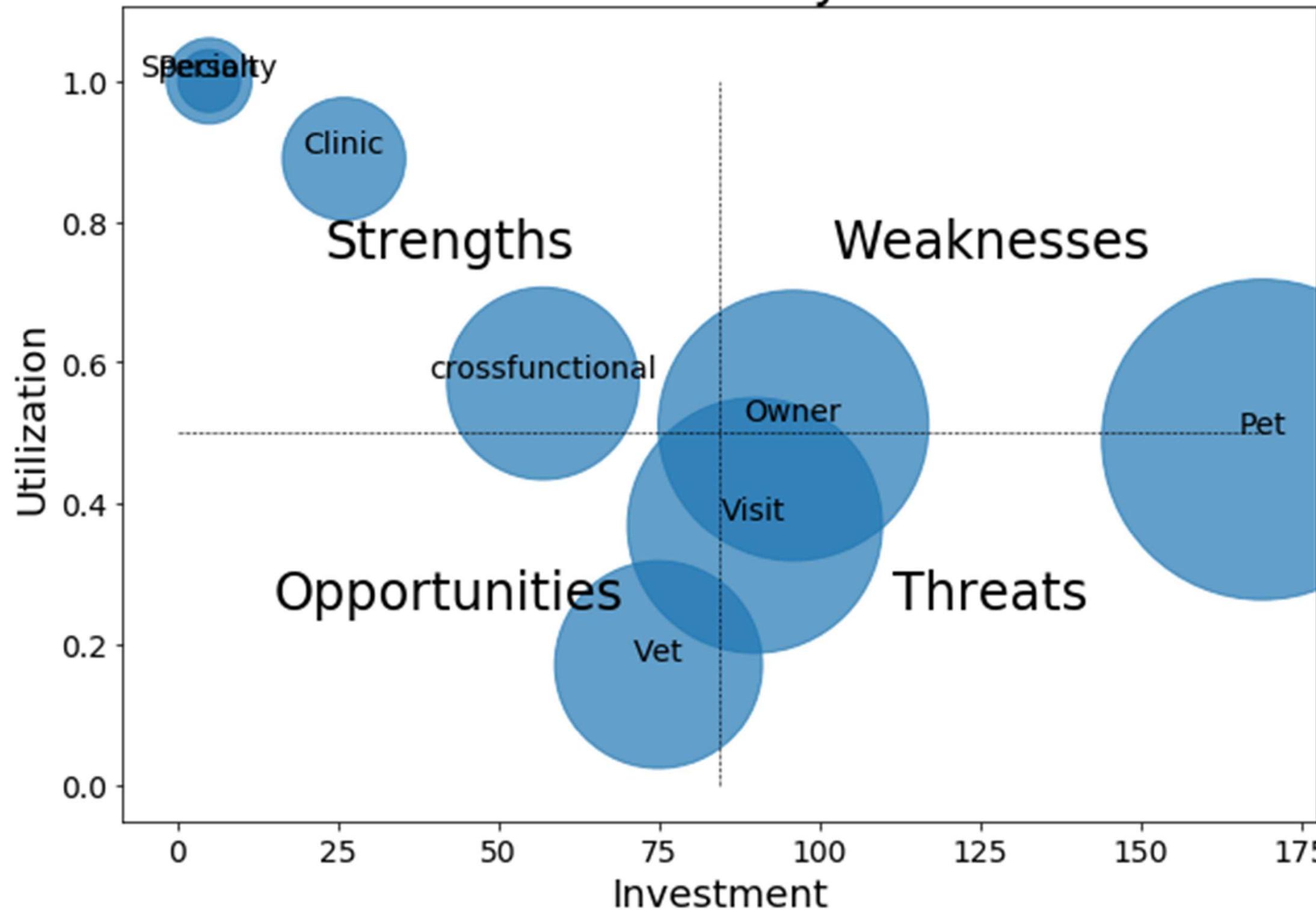
*Strategic Redesign*

# Strategic Redesign: Fixing code that's actually used



# *Strategic Redesign: Fixing code that's actually used*

## SWOT analysis



# Zusammenfassung



## **Werkzeuge sind da!**

- + Erste Schritte sind einfach durchführbar
- + Tiefergehende Analysen sind es wert

## **Sichtbarkeit möglich!**

- + Probleme im Code können identifiziert, aggregiert und kommuniziert werden
- + Sichten für Nicht-Techniker erstellbar

## **Analysen wirken!**

- + Risiken neutral darstellen und adressieren
- + Ursachen beheben statt Symptome fixen!

# Mehr Informationen

## Literatur

Christian Bird, Tim Menzies, Thomas Zimmermann:

The Art and Science of Analyzing Software Data

Tim Menzies, Laurie Williams, Thomas Zimmermann:

Perspectives on Data Science for Software Engineering

Wes McKinney: Python For Data Analysis

Adam Tornhill: Software Design X-Ray

## Software

Python Data Science Distribution: [anaconda.com](https://anaconda.com)

DataCamp: <https://projects.datacamp.com/projects/111>

jQAssistant: [github.com/JavaOnAutobahn/spring-petclinic](https://github.com/JavaOnAutobahn/spring-petclinic)

My Repo: [github.com/feststelltaste/software-analytics](https://github.com/feststelltaste/software-analytics)

THE END

# QUESTION



ASK ' EM ALL

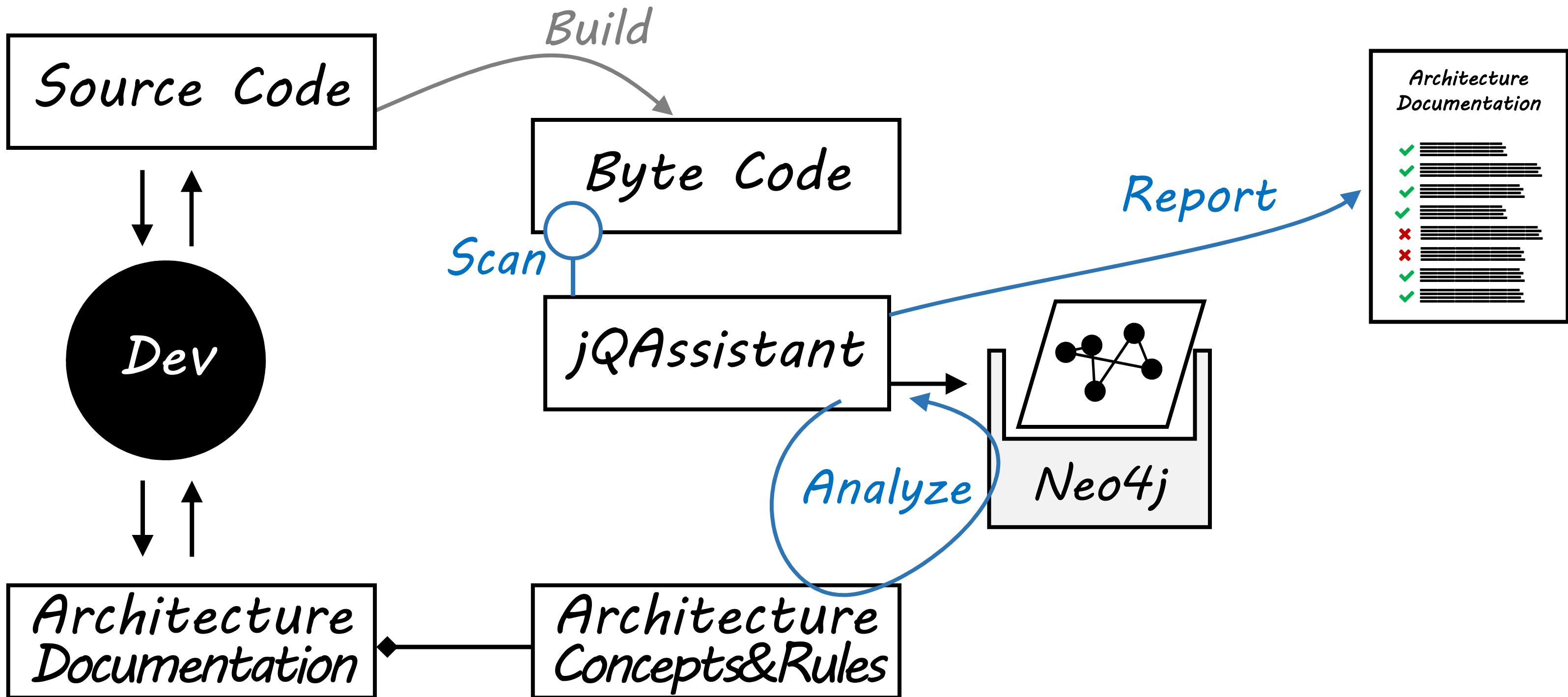
Was?

Bonus Demos

# Bonus Demo

*Living, self-validating  
architecture documentation*

# Living, self-validating architecture documentation



# Living, self-validating architecture documentation

- *Architecture documentation with AsciiDoc*
- *Definition of concepts aka pattern language*
- *Rule validation by checking constraints*
- *Redocumentation of the actual design*

The screenshot shows a web browser window titled "Spring PetClinic Coding Rules". The URL in the address bar is `file:///C:/dev/repos/buschmais-spring-petclinic_joa/target/html/index.html#_constraints`. The page content is as follows:

**Table of Contents**

- 1. Summary
- 2. CI Build
- 3. Maven
- 3.1. Concepts
- 3.2. Reports
- 4. Package
  - 4.1. Reports
- 5. Layer
  - 5.1. Concepts
  - 5.2. Constraints
  - 5.3. Reports
- 6. Spring Components
  - 6.1. Overview
  - 6.2. Constraints
  - 6.3. Concepts
  - 6.4. Reports
- 7. JPA Model
  - 7.1. Constraints
- 8. Business
  - 8.1. Concepts
- 9. Management
  - 9.1. Reports

**7. JPA Model**

The following constraints are verified:

- [All JPA entities must be located in packages named "model".](#)

**7.1. Constraints**

*All JPA entities must be located in packages named "model".*

```
MATCH
  (package:Package) -[:CONTAINS] ->(entity:Jpa:Entity)
WHERE
  package.name <> "model"
RETURN
  entity AS EntityInWrongPackage
```

Status: FAILURE Severity: MAJOR

**EntityInWrongPackage**

org.springframework.samples.petclinic.repository.PetType

# Danke!

**INNOQ**  
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**“Tools only  
find, people  
have to find  
out!”**

Markus Harrer

Software Development Analyst  
bei innoQ Deutschland GmbH



- Datenanalysen in der Softwareentwicklung
- Architektur-, Design- und Code-Reviews
- Reverse- und Re-Engineering von Legacy-Code

# Bildnachweise

## Emoji One

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Source: Wikimedia Commons ([https://commons.wikimedia.org/wiki/File:Emojione\\_1F37A.svg](https://commons.wikimedia.org/wiki/File:Emojione_1F37A.svg))

## Michelangelo: Creation of Adam

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Source: Wikimedia Commons ([https://en.wikipedia.org/wiki/The\\_Creation\\_of\\_Adam#/media/File:Creaci%C3%B3n\\_de\\_Ad%C3%A1n\\_\(Miguel\\_%C3%81ngel\).jpg](https://en.wikipedia.org/wiki/The_Creation_of_Adam#/media/File:Creaci%C3%B3n_de_Ad%C3%A1n_(Miguel_%C3%81ngel).jpg))

## Edvard Munch: The Screams

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Source: Wiki Commons ([https://commons.wikimedia.org/wiki/File:The\\_Scream.jpg](https://commons.wikimedia.org/wiki/File:The_Scream.jpg))

## Albert Einstein: Abhandlung

Citation: Einstein, Albert: Quantentheorie des einatomigen idealen Gases – Zweite Abhandlung. In: Sitzungsberichte der preussischen Akademie der Wissenschaften, page 14, Reichsdruckerei

Source: Lorentz Archive ([https://www.lorentz.leidenuniv.nl/history/Einstein\\_archive/Einstein\\_1925\\_publication/Pages/paper\\_1925\\_12.html](https://www.lorentz.leidenuniv.nl/history/Einstein_archive/Einstein_1925_publication/Pages/paper_1925_12.html))

## Python Logo

Adopted based on work by www.python.org ([www.python.org](http://www.python.org))

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Source: Wikimedia Commons (<https://commons.wikimedia.org/wiki/File:Python-logo-notext.svg>)

## Yoni S. Hamenahem: Chuck Norris - The Delta Force 1986

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Source: Wikimedia Common ([https://commons.wikimedia.org/wiki/File:Chuck\\_Norris,\\_The\\_Delta\\_Force\\_1986.jpg](https://commons.wikimedia.org/wiki/File:Chuck_Norris,_The_Delta_Force_1986.jpg))