

# The impact of experience on software developer performance

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# My Background

## What developers actually wrote

Compiler writer – front ends, back ends, language translators

Static analysis – finding faults

## What developers meant to write

Book- The New C Standard: An Economic and Cultural Commentary  
[www.knosof.co.uk/cbook/cbook.html](http://www.knosof.co.uk/cbook/cbook.html)

# Introduction

Cognitive psychology

Predicting developer performance

A hypothesis

Source code measurements

Experiment

Results

# Human Mental Characteristics

## Orders-of-magnitude

$10^{-4}$  -  $10^{-2}$  Biological band

$10^{-1}$  -  $10^{+1}$  Cognitive band

$10^{+2}$  -  $10^{+5}$  Social band

## Abilities

Built-in – autonomic nervous system

Learned

# Some Performance Factors

## Performance improves with Practice

Response time, error rate

$$E = c P^{-m}$$

## Power law of forgetting

Retention rate decreases with time

$$R = k T^{-n}$$

# Developer Performance

## What improves?

How much; how to measure; cost of measurement  
Formula to calculate...

## Source code

My interest; lots available; can be measured

## Developers spend time interacting with code

Lots and lots of time  
Doing things not generally done elsewhere

# Binary Operator Precedence

## Lots of rules

13'ish rules (shared by C, C++, Java, Perl, Python, C#)

$x + y \mid z$

## Amenably to measurement

Source code

Developer performance

# Hypothesis

**Every source occurrence provides practice**

Relative percentage a measure of relative practice

**More practice aids learning/retention**

Practice only occurs when a decision has to be made

Occurrences rare enough that performance not 'saturated'

$$P = x + y ;$$

$$Q = a + b \mid c ;$$

**Prediction**

More source code occurrences → better developer performance



# Source Measurements

## What measured

Large C programs

Visible source

Binary operators common to C/C++/Java/Perl/etc.

Operator pairs in expressions

```
x = y + z ;  
a = b + c * d ;
```

## Ignored (not considered to be operators)

```
= . -> [ ] ( )
```

# The Experiment

## The ACCU

C and C++ user group: now includes Java, C#, Perl + others  
Annual conference: 250+ professional developers  
Willing to make lunchtime slot available

## Practical constraints

Time: 40 minutes

Venue: Room at a conference

Subjects: Volunteers willing to give time during lunch

# What Subjects asked to do

Three stage problem, repeated

Remember information

```
zip = 4;  
zap = 8;  
bat = 6;
```

Time filler task

```
x + y * z  
p || q >> r
```

Recall information

# Results '06/'07 Overview

## Numbers

Subjects (years experience): 17 (14.6) /6 (14.5)

Answers: 123.5/116.2 sd 35.0

Percent correct: 66.7/63.3 sd 8.7

Random answers, binomial distribution: 0.1% prob > 60% correct

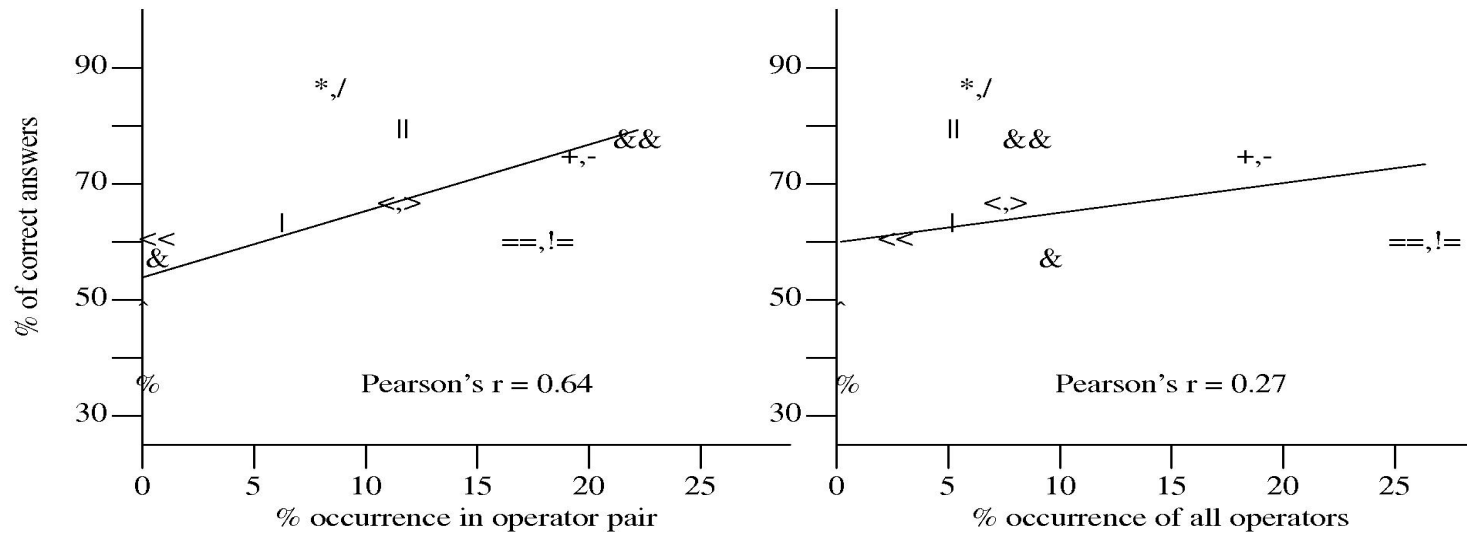
## Bradley-Terry Statistics

/ \* ^ + - & << | < % && == || !=

Highest

Lowest

# Performance/Source Correlation



# 33% incorrect!?!

## Implication for faults in real code

2% of expressions contain two or more binary operators

Implies almost 1% of expressions 'wrong'

## 'Naked' expressions rare in code

Expressions generally exist within a context

Expressions often contain context information

# Context Information

$x + y \mid z$

arith + context\_clue | bit

# Source Measurements

## Names of operand identifiers

Arithmetic names: `size`, `len`, `count`

Bitwise names: `flags`, `status`, `mask`

Boolean names: `finished`, `done`, `started`

Anonymous names: `val`, `temp`, `field`



# Experimental Manipulation

arith + arith\_bit\_anon | bit

# Result '07 Naming

arith + arith\_bit\_bool\_anon | bit

Same context	76.3 (96,56,58)
Match higher/Not match lower	72.5
Match higher/Match lower	61.5
Not match higher/Not match lower	64.4
Not match higher/Match lower	43.4

# Conclusion

## Occurrence/performance correlation

Exists for experienced developers  
Unexperienced developers?

## Use of non-precedence information

Developers associate some words with some operators  
Operator/operand spacing?

## TODO

Measurements of other language source