Naming Practices in Object-oriented Programming: An Empirical Study

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Abstract Currently, research indicates that comprehending code takes up far more developer time than writing code. Given that most modern programming languages place little to no limitations on identifier names, and so developers are allowed to choose identifier names at their own discretion, one key aspect of code comprehension is the naming of identifiers. Research in naming identifiers shows that informative names are crucial to improving the readability and maintainability of programs: essentially, intention-revealing names make code easier to understand and act as a basic form of documentation. Poorly named identifiers tend to hurt the comprehensibility and maintainability of software systems. However, most computer science curricula emphasize programming concepts and language syntax over naming guidelines and conventions. Consequently, programmers lack knowledge about naming practices. This article is an extension of our previous study on naming practices. Previously, we set out to explore naming practices of Java programmers. To this end, we analyzed 1,421,607 identifier names (i.e., attributes, parameters, and variables names) from 40 open-source Java projects and categorized these names into eight naming practices. As a follow-up study to further investigate naming practices, we examined 40 open-source C++ projects and categorized 1,181,774 identifier names according to the previously mentioned eight naming practices. We examined the occurrence and prevalence of these categories across C++ and Java projects and our results also highlight in which contexts identifiers following each naming practice tend to appear more regularly. Finally, we also conducted an online survey questionnaire with 52 software developers to gain insight from the industry. All in all, we believe the results based on the analysis of 2,603,381 identifier names can be helpful to enhance programmers awareness and contribute to improving educational materials and code review methods.

Keywords: Naming Identifiers, Program Comprehension, Mining Software Repositories

1 Introduction

Reading and comprehending source code plays a vital role in software development (Allamanis et al., 2014). Evidences suggest that choosing proper names to identifiers in software systems can positively impact code comprehension (Lawrie et al., 2007b; Fakhoury et al., 2018; Oliveira et al., 2020). Although giving meaningful names to identifiers is a widely accepted best practice, coming up with proper names is challenging (Deissenboeck and Pizka, 2006). As stated by Host and Ostvold (2007), even though naming is part of daily life for programmers, it entails a great deal of time and thought: names should convey to others the purpose of the code (Martin, 2008) and reflect the meaning of domain concepts (Marcus et al., 2004). Meaningful identifier names are key to bridging the gap between intention and implementation (Wainakh et al., 2021). Therefore, given that poorly chosen identifier names might hinder source code comprehension (Schankin et al., 2018), using meaningful identifier names is a recommended practice present in several coding style guides and conventions.

According to the Java language naming conventions¹, names should be "*short yet meaningful*". In a similar fashion, Google C++ style guide² states that names should be "*as descriptive as possible*". Martin (2008) argues that programmers should choose intention-revealing names as a way

to avoid disinformation. He also advocates that names have to contain meaningful distinctions and be descriptive (not abbreviated). The GNU Coding Standards³ posit that programmers should not "choose terse names – instead, [they should] look for names that give useful information about the meaning of the variable". Although programming communities and internationally renowned experts have proposed best practices related to naming identifiers, little is known about the extent to which programmers follow these naming practices (Arnaoudova et al., 2016).

We argue that without proper guidance, programmers are more prone to resort to less than ideal naming practices as using number series or noise words. For example, bad naming practices can foster the sense that names as Person person1 and Person person2 are intuitive and understandable. Careless naming practices might hinder not only code comprehension but also overall team communication. Therefore, we argue that it is crucial for software engineering researchers to learn how to support programmers by understanding how naming practices are used "in the wild" and, through this better understanding, defining naming guidelines for educational materials (Charitsis et al., 2021) and code review (Nyamawe et al., 2021).

In our previous study (Gresta et al., 2021), we set out to investigate naming practices in the context of Java programs, thus we looked only into Java programmer's name attributes, parameters, and variables. This article is an extension of our previous work on naming practices in which we also inves-

¹oracle.com/java/technologies/javase/

codeconventions-namingconventions.html

²google.github.io/styleguide/cppguide.html

³www.gnu.org/prep/standards/

Table 1. Java programs used in our experiment.

Project	LoC	Contributors	Commits	Kir	ıgs	Mec	lian	Dit	to	Cogn	ome	Dimin	utive	Shor	ten	Inde	ex	. Total
				Total	%	Total.	%	Total.	%	Total.	%	Total.	%	Total.	%	Total.	%	
aeron	108,442	86	14,409	606	6.34	450	4.71	5,205	54.46	933	9.76	1,932	20.21	114	1.19	318	3.33	9,558
androidutilcode	39,030	32	1,317	179	7.74	21	0.91	1,170	50.56	385	16.64	73	3.15	77	3.33	409	17.68	2,314
archunit	100,276	49	1,499	91	3.07	16	0.54	1,744	58.86	596	20.11	303	10.23	9	0.30	204	6.88	2,963
boofcv	650,019	14	4,520	7,483	23.19	1,696	5.26	1,573	4.87	266	0.82	880	2.73	1,354	4.20	19,017	58.93	32,269
butterknife	13,279	97	1,016	135	21.95	8	1.30	358	58.21	68	11.06	14	2.28	4	0.65	28	4.55	615
corenlp	581,374	107	16,280	2,372	9.53	831	3.34	4,281	17.20	3,864	15.52	610	2.45	1,622	6.52	11,310	45.44	24,890
dropwizard	74,215	364	5,789	53	1.85	14	0.49	1,993	69.64	343	11.98	269	9.40	29	1.01	161	5.63	2,862
dubbo	179,477	386	4,681	754	6.39	81	0.69	6,983	59.19	1,096	9.29	644	5.46	369	3.13	1,870	15.85	11,797
eventbus	8,369	20	507	4	1.33	0	0.00	195	65.00	59	19.67	23	7.67	1	0.33	18	6.00	300
fastjson	179,996	158	3,863	8,205	49.88	77	0.47	4,255	25.87	1,264	7.68	243	1.48	387	2.35	2,019	12.27	16,450
glide	76,418	129	2,583	105	2.77	22	0.58	2,442	64.47	629	16.61	194	5.12	45	1.19	351	9.27	3,788
guice	72,980	59	1,931	178	2.85	46	0.74	3,871	61.92	1,043	16.68	216	3.45	51	0.82	847	13.55	6,252
hdiv	30,631	11	1,086	106	9.72	11	1.01	573	52.52	63	5.77	177	16.22	31	2.84	130	11.92	1,091
ical4j	24,130	35	2,303	132	11.22	15	1.28	682	57.99	167	14.20	48	4.08	2	0.17	130	11.05	1,176
j2objc	1,810,274	75	5,284	5,523	10.13	866	1.59	9,302	17.06	4,750	8.71	1,276	2.34	3,978	7.30	28,827	52.87	54,522
jenkins	175,150	654	31,156	658	6.15	161	1.51	3,273	30.61	794	7.43	314	2.94	185	1.73	5,308	49.64	10,693
jtk	204,105	9	1,373	2,627	13.03	4,557	22.60	1,008	5.00	55	0.27	37	0.18	1,068	5.30	10,813	53.62	20,165
junit4	31,242	151	2,474	55	3.15	18	1.03	985	56.38	248	14.20	32	1.83	47	2.69	362	20.72	1,747
keywhiz	23,337	32	1,538	89	5.67	23	1.46	1,036	65.99	178	11.34	90	5.73	14	0.89	140	8.92	1,570
libgdx	272,510	505	14,661	49,315	47.83	21,653	21.00	11,800	11.44	1,831	1.78	2,041	1.98	2,252	2.18	14,215	13.79	103,107
litiengine	75,877	20	3,324	316	11.86	46	1.73	771	28.94	448	16.82	253	9.50	21	0.79	809	30.37	2,664
lottie-android	16,258	102	1,292	80	7.41	104	9.64	442	40.96	145	13.44	126	11.68	21	1.95	161	14.92	1,079
mockito	55,751	220	5,523	234	9.87	12	0.51	1,288	54.35	285	12.03	126	5.32	38	1.60	387	16.33	2,370
mpandroidchart	25,232	69	2,068	134	6.85	36	1.84	385	19.69	232	11.87	155	7.93	38	1.94	975	49.87	1,955
nutch	141,710	43	3,215	236	7.68	28	0.91	1,353	44.01	467	15.19	113	3.68	164	5.34	713	23.19	3,074
okhttp	48,465	235	4,848	455	16.01	39	1.37	1,902	66.92	161	5.67	126	4.43	21	0.74	138	4.86	2,842
orienteer	55,681	12	2,274	63	2.68	27	1.15	1,122	47.77	584	24.86	395	16.82	22	0.94	136	5.79	2,349
picasso	9,136	97	1,368	64	8.82	36	4.96	546	75.21	27	3.72	10	1.38	7	0.96	36	4.96	726
rest-assured	73,511	105	2,020	121	5.85	32	1.55	1,440	69.57	288	13.91	107	5.17	14	0.68	68	3.29	2,070
rest.li	523,972	89	2,617	2,158	9.26	533	2.29	10,054	43.16	4,712	20.23	3,458	14.84	237	1.02	2,143	9.20	23,295
retrofit	26,513	152	1,865	60	2.49	7	0.29	1,691	70.14	352	14.60	18	0.75	6	0.25	277	11.49	2,411
riptide	27,072	18	2,131	4	0.52	0	0.00	650	85.08	22	2.88	46	6.02	8	1.05	34	4.45	764
rxjava	468,957	277	5,877	2,371	10.25	34	0.15	4,275	18.48	573	2.48	115	0.50	373	1.61	15,387	66.53	23,128
spring-boot	343,138	804	32,096	443	2.74	95	0.59	10,868	67.24	1,354	8.38	3,002	18.57	91	0.56	309	1.91	16,162
tomcat	343,703	61	23,140	1,142	6.68	263	1.54	7,374	43.16	1,675	9.80	696	4.07	846	4.95	5,089	29.79	17,085
twelvemonkeys	99,418	42	1,334	379	8.43	123	2.73	912	20.28	808	17.96	588	13.07	327	7.27	1,361	30.26	4,498
unirest-java	15,979	43	1,603	12	1.75	1	0.15	310	45.19	58	8.45	23	3.35	22	3.21	260	37.90	686
webmagic	12,926	40	1,119	28	2.87	3	0.31	763	78.26	80	8.21	27	2.77	10	1.03	64	6.56	975
xchart	24,406	50	1,451	119	7.93	31	2.07	628	41.84	338	22.52	50	3.33	26	1.73	309	20.59	1,501
zxing	107,064	109	3,582	208	9.78	137	6.44	695	32.68	267	12.55	108	5.08	157	7.38	555	26.09	2,127
Total	7,111,470	5,519	217,869	87,297	20.79	32,153	7.65	110,198	26.24	31,508	7.50	18,958	4.51	14,088	3.35	125,688	29.93	419,890

tigate name practices in the context of C++ programs. To investigate how C++ and Java programmers name attributes, parameters, and variables we carried out an empirical study in which we analyzed 1,421,607 identifier names from 40 open-source Java projects and 1,181,774 identifier names from 40 open-source C++ projects. We performed repository mining to determine how often eight categories of naming practices are within and across these projects. We also looked at how prevalent these naming practices are in certain code contexts (i.e., ATTRIBUTE, PARAMETER, METHOD, FOR, WHILE, IF, and SWITCH).

In this extended version, our results are based on two large samples of programs: the previous version of this study analyzed 40 open-source Java programs, and results from this extended version of the article also include the analysis of 40 open-source C++ projects. Moreover, to understand the industry practices, we conducted an online survey questionnaire to gain insight from software programmers. Throughout a survey, we gathered quantitative data on programmers' perceptions about the use and occurrence of the investigated naming practices. The online survey questionnaire ran from November 2021 to January 2022 and had 52 responses.

This extended version of our study makes the following contributions:

- Our results show that the naming practice categories (*Kings*, *Median*, *Ditto*, *Diminutive*, *Cognome*, *Shorten*, *Index* and *Famed*) appear in all 80 open-source projects and are prevalent in practice;
- We identified the most common names across projects.

The Top-3 recurrent names are: value; result; and name. Many single-letter names are also commonly used in projects (e.g., i, e, s, c). We also observed that the majority of common names are associated with integer or string values;

- We perceived that programmers naming practices are context-specific. Single-letter names (*Index* and *Shorten*) seem to be more present in conditional or loops statements (IF, FOR, WHILE). In contrast, identifiers with the same name as her *Types* tend to appear in large-scope contexts (e.g., ATTRIBUTE);
- We noted that, in general, the project's characteristics might not impact the prevalence of one particular naming category practice: there is no representative correlation between size, number of contributors, or number of commits and the predominance of some naming category practice;
- We also noted that, in general, the project's characteristics might not impact the prevalence of one particular naming category practice: there is no representative.
- Finally, we observed that *Diminutive* is the most adopted naming category practice by survey respondents and *Median* is the least one. This result seems to align well with our observation about the prevalence of the naming practices in 80 open-source object-oriented programs.

The remainder of this paper is organized as follows. The Section 2 presents the background and related work on naming practices. Section 3 details how we carried out our study.

Table 2. C++ programs used in our experiment.

Project	LoC	Contributors	Commits	Kir	igs	Med	ian	Dit	to	Cogn	iome	Dimir	utive	Sho	orten	Ind	ex	Total
				Total	%	Total.	%	Total.	%	Total.	%	Total.	%	Total.	%	Total.	%	
asio	196,656	53	3,034	135	3.65	27	0.73	1,664	44.99	32	0.87	657	17.76	220	5.95	964	26.06	3699
assimp	614,926	462	10,934	78	6.76	74	6.41	739	64.04	10	0.87	94	8.15	13	1.13	146	12.65	1,154
bitcoin	541,474	853	32,661	46	4.58	27	2.69	621	61.79	8	0.80	11	1.09	39	3.88	253	25.17	1,005
bluematter	812,822	2	5	3,972	29.20	1,350	9.92	1,893	13.91	1,560	11.47	506	3.72	685	5.03	3,639	26.75	13,605
calligra	1,602,456	263	101,573	47	3.41	2	0.15	743	53.92	137	9.94	267	19.38	14	1.02	168	12.19	1,378
chaste	587,473	25	5,384	2,954	40.46	882	12.08	673	9.22	667	9.14	470	6.44	14	0.19	1,641	22.48	7,301
citra	428,966	222	9,141	27	5.11	19	3.60	255	48.30	4	0.76	36	6.82	27	5.11	160	30.30	528
clickhouse	1,422,903	921	83,445	114	4.13	40	1.45	2,228	80.78	66	2.39	108	3.92	14	0.51	188	6.82	2,758
core	9,262,610	25	3,058	4,044	5.29	1,516	1.98	45,465	59.47	10,741	14.05	10,799	14.13	420	0.55	3,459	4.52	76,444
freecad	4,842,675	383	27,647	528	6.94	210	2.76	4,705	61.83	100	1.31	513	6.74	181	2.38	1,372	18.03	7,609
gacui	504,062	3	2,238	8	0.62	50	3.91	576	45.00	44	3.44	294	22.97	15	1.17	293	22.89	1,280
gecko-dev	28,303,180	4,910	785,724	1,116	4.57	1,548	6.34	11,737	48.11	2,567	10.52	4,805	19.69	311	1.27	2,314	9.48	24,398
godot	4,976,013	1,590	41,538	525	9.87	270	5.08	1,711	32.17	128	2.41	1,934	36.36	107	2.01	644	12.11	5,319
gromacs	1,680,900	74	20,825	89	5.03	104	5.88	994	56.16	38	2.15	250	14.12	54	3.05	241	13.62	1,770
grpc	717,441	708	50,493	76	3.40	49	2.19	799	35.75	68	3.04	842	37.67	44	1.97	357	15.97	2,235
kdenlive	205,469	94	15,645	4	0.43	0	0.00	671	72.93	66	7.17	36	3.91	34	3.70	109	11.85	920
kdevelop	338,648	245	42,650	52	4.70	3	0.27	723	65.37	61	5.52	93	8.41	10	0.90	164	14.83	1,106
krita	983,754	336	57,706	80	5.93	12	0.89	573	42.48	109	8.08	216	16.01	44	3.26	315	23.35	1,349
lammps	1,626,808	185	29,307	281	11.35	56	2.26	1,272	51.37	199	8.04	169	6.83	85	3.43	414	16.72	2,476
mediapipe	235,825	2	111	11	1.54	47	6.58	511	71.57	13	1.82	1	0.14	26	3.64	105	14.71	714
mlir	75,845	2,285	415,644	9	5.70	18	11.39	83	52.53	24	15.19	8	5.06	2	1.27	14	8.86	158
mongo	5,015,374	571	63,227	917	3.17	381	1.32	14,644	50.66	761	2.63	2,770	9.58	2,019	6.99	7,412	25.64	28,904
mysql-server	3,733,193	88	170,220	803	6.94	124	1.07	7,941	68.60	713	6.16	949	8.20	141	1.22	904	7.81	11,575
obs-studio	482,886	477	10,466	22	3.42	9	1.40	429	66.72	57	8.86	59	9.18	5	0.78	62	9.64	643
opencv	2,166,493	1,360	31,603	1,598	11.96	859	6.43	5,672	42.45	367	2.75	376	2.81	730	5.46	3,761	28.14	13,363
openoffice	6,894,647	21	7,657	3,977	5.82	1,703	2.49	39,683	58.06	9,796	14.33	9,453	13.83	335	0.49	3,397	4.97	68,344
percona-server	3,777,210	238	185,334	849	7.35	127	1.10	7,887	68.32	712	6.17	913	7.91	142	1.23	914	7.92	11,544
proxysql	121,989	90	4,680	7	1.38	12	2.37	219	43.20	10	1.97	46	9.07	37	7.30	176	34.71	507
pytorch	1,792,819	2,155	43,944	56	2.10	111	4.15	1,472	55.07	35	1.31	164	6.14	115	4.30	720	26.94	2,673
qtbase	2,714,097	783	55,238	185	4.51	89	2.17	2,403	58.54	258	6.29	229	5.58	132	3.22	809	19.71	4,105
rocksdb	497,140	628	10,766	41	1.66	52	2.10	1,494	60.36	21	0.85	34	1.37	59	2.38	774	31.27	2,475
server	1,967,124	300	195,145	22	1.59	2	0.14	874	63.01	40	2.88	172	12.40	33	2.38	244	17.59	1,387
tensorflow	3,284,592	3,068	125,560	778	5.67	747	5.45	8,108	59.13	235	1.71	279	2.03	499	3.64	3,067	22.37	13,713
terminal	360,717	313	2,855	159	3.69	49	1.14	2,640	61.20	118	2.74	311	7.21	124	2.87	913	21.16	4,314
vtk	3,690,369	352	81,218	500	7.78	216	3.36	2,167	33.74	147	2.29	1,137	17.70	503	7.83	1,753	27.29	6,423
winget-cli	305,116	317	539	64	2.56	62	2.48	1,252	50.00	65	2.60	111	4.43	312	12.46	638	25.48	2,504
xbmc	1,094,954	785	59,641	42	9.77	2	0.47	208	48.37	29	6.74	83	19.30	20	4.65	46	10.70	430
yarp	1,029,531	77	17,416	45	2.25	18	0.90	1,021	51.13	91	4.56	352	17.63	65	3.25	405	20.28	1,997
yuzu	488,099	203	20,860	30	19.61	7	4.58	76	49.67	0	0.00	6	3.92	3	1.96	31	20.26	153
zerotierone	137,784	58	5,409	34	2.05	64	3.85	975	58.70	12	0.72	62	3.73	56	3.37	458	27.57	1,661
Total	99,515,040	25,525	2,830,541	24,325	7.28	10,938	3.27	177,801	53.24	30,109	9.01	39,615	11.86	7,689	2.30	43,444	13.01	333,921

The Section 4 outlines the results of our empirical study and provides a general discussion. Section 5 describes the threats to the validity. Finally, Section 6 presents some concluding remarks.

2 Background and Related Work

This section presents some background about names and related studies on naming identifiers. We introduce this section by presenting an overview of the role of names in software development.

2.1 Naming

Names identify classes, attributes, methods, variables, and parameters (Lawrie et al., 2006). They were originally designed to be pieces of code used to represent values in memory (Tofte and Talpin, 1997) and now they have become the primary source of information in software development (Lawrie et al., 2006; Ratiu and Deissenboeck, 2006): programmers rely on existing names in their code comprehension journey (Takang et al., 1996). Indeed, high-quality names have a significant influence on the comprehension of source code (Avidan and Feitelson, 2017). Arnaoudova et al. (2016) have acknowledged the critical role that the source code lexicon plays in the psychological complexity of software systems and coined the contradictory expression "Linguistic Antipatterns" (LAs) to denote poor practices in the naming, documentation, and choice of identifiers that might hinder program understanding. They argue that poor practices might lead programmers to make wrong assumptions and waste time understanding source code (Arnaoudova et al., 2016).

Deissenboeck and Pizka (2006) characterized a name as being a fully spelled word or even an abbreviation. Names can also be composed of two or more words, might include words that do not exist, or even be single alphabetical characters. However, the proper use of words in names is a significant issue in software development (Feitelson et al., 2020). In Martin's book (Martin, 2008), Tim Ottinger drew a series of simple rules to guide programmers on naming identifiers. According to Ottinger, programmers have to focus on creating intention-revealing names (the name by itself should be capable of informing what it does). They also have to avoid using non-informative words (e.g., words with multiple meanings, words with little differentiation between themselves or number series). Ottinger also advocates that names should be pronounceable and searchable. For instance, it is impractical to discuss any source code composed of words that programmers cannot pronounce in a code review session.

Coding style guides and conventions also aim to address the naming identifiers' challenges (dos Santos and Gerosa, 2018). However, they are usually hard to enforce rules, as others discussed in Martin's book (Clean Code) Martin (2008). Caprile and Tonella (2000) proposed an approach for improving the meaningfulness of identifier names. The approach entails the following steps: (i) extracting identifier names; (ii) normalizing identifier names; and (iii) applying the changes to the source code. The proposed rules for creating meaningful names aim to guarantee that each word composing a name must belong to a dictionary of standard words and be compliant with existing grammar. Deissenboeck and Pizka (2006) proposed a set of precise rules for constructing concise and consistent names. In the interest of preserving consistency, the authors advocate that a single name must represent only one concept. The rules, therefore, ensure that one concept will not be taken into consideration in multiple identifier names. In order to preserve conciseness, the rules ensure that names chosen by programmers stand for the concepts they are indeed trying to convey.

More recently, Feitelson et al. (2020) suggested a threestep method to help programmers to systematically come up with meaningful names. The model encompasses the following steps: (i) selecting the concepts to include in the name; (ii) choosing the words to represent each concept; and (iii) creating a name from these words. The authors demonstrated that programmers could use the model to guide choosing names that are superior (in terms of meaningfulness) over randomly chosen names.

2.2 Names in Software Quality

There have been many studies that examine how names affect comprehension and programmer's efficiency. Avidan and Feitelson (2017) conducted an experiment involving ten programmers in hopes of understanding the impact of identifier names in program comprehension. They observed that, when changing identifiers names from fully spelled words to single-letter ones, the fully spelled version was perceived as more understandable. Hofmeister et al. (2017) also concluded that abbreviations and single-letter names decrease code comprehension and could indicate low-quality code as observed by Butler et al. (2010) and Kawamoto and Mizuno (2012). Butler et al. (2010) showed that source code containing poor quality identifiers names were associated with Find-Bugs warnings. Kawamoto and Mizuno (2012) also observed that concise identifier names have a substantial effect on the fault-proneness in NetBeans.

Takang et al. (1996), based on a survey conducted with 89 computer science students, concluded that the combination between identifier names and comments in the code provides a minor improvement in code comprehension. Hence, improving identifier names seem to be a better option than including comments in the code. Spending more time choosing meaningful identifier names can result in less work during software maintenance (Lawrie et al., 2007a). Lowquality names can affect code negatively by causing confusion and misinformation. The study conducted by Lawrie et al. (2007a) found that the quality of identifier names improves over time and is also related to the software license. Modern software systems contain more high-quality names, and proprietary ones include more abbreviations than opensource projects. Moreover, a study investigating the semantic nature of identifier names in four large-scale open-source projects showed that the number of commits and contributors tended to influence the quality of names. Projects with a high number of commits and contributors tend to have more identifier names presenting a large text-corpora of existing

words (Gresta and Cirilo, 2020).

3 Empirical Study Setup

This section describes the empirical study design. We conducted an empirical study to characterize how C++ and Java programmers name attributes, parameters, and variables. Specifically, we analyzed 1,421,607 identifier names (i.e., attributes, parameters, and variables names) from 40 Java projects and categorized these names into eight naming practice categories. Afterwards, we expanded our analysis by selecting a sample of 40 C++ projects. Upon analyzing this sample, we found 1,181,774 identifier names, which we then categorized according to the aforementioned eight naming practice categories. We used the results of categorizing identifier names from these two samples to provide answers to the research questions discussed in the next subsection.

3.1 Goal and Research Questions

We set out to probe into how common eight naming practices are "in the wild" (i.e., in real world software systems) – see Section 3.2. More specifically, our goal is to contribute towards a better understanding of their prevalence in attributes, parameters, and variables naming in Java. We believe a more insightful interpretation of the results of our study can be obtained from the standpoint of a researcher interested in helping programmers by defining naming guidelines for educational material and code review. Our main goal is to provide answers to the following research questions (RQs):

- **RQ**₁: *How prevalent are the eight naming practice categories?* We set out to investigate whether identifier names in open-source projects can be categorized according to eight naming practices categories and how common these naming practices are across C++ and Java projects;
- **RQ**₂: *Are there context-specific naming practices categories*? We set out to examine if specific naming practice categories tend to occur more often in certain contexts (e.g., ATTRIBUTE, PARAMETER, METHOD, IF, FOR, WHILE, SWITCH);
- **RQ**₃: *Do the naming practice categories carry over across different C++ and Java projects*? We attempt to explore the prevalence of the categories spanning multiple C++ and Java projects and identify any correlation between software metrics and programmer's naming practices;
- **RQ**₄: What is the perception of software developers about the investigated naming categories? We set out to probe into programmers' perceptions regarding the use and occurrence of the eight investigated naming practices.

3.2 Naming Practice Categories

The categories presented in this subsection are a compilation of programmers' practices reported in several studies (Arnaoudova et al., 2016; Beniamini et al., 2017; Alsuhaibani et al., 2021) and books (Martin, 2008; DiLeo, 2019). Inspired by antipattern templates (Brown et al., 1998), in order to explain the naming practice categories, we frame the discussion of each category in terms of the following elements: category name, examples, motivation (why), consequences of the naming practice, and recommendations.

3.2.1 Kings

This category represents identifier names composed by numbers at the end. **Example**: String name1 and String name2 or Integer arg1 and Integer arg2 represent arbitrary distinctions as number series. **Why**: programmers often opt to employ names that fall into this category to distinguish between identifiers that appear in the same scope. **Consequences**: names with numbers at the end, however, are not very informative and do not represent intentional naming (Martin, 2008; DiLeo, 2019). **Recommendation**: usually, identifiers represent different things; whenever that is the case, they should be named accordingly (Martin, 2008).

3.2.2 Median

This category is a variation of the *Kings* category and comprises identifier names composed of numbers in the middle. **Example**: the names fastUInt64ToBuffer and base64Bytes contain numbers that might be representing 64 bits values. **Why**: numbers in the middle, in general, are used to denote the value stored in the attribute/variable or even to provide some distinction among similar identifier names. **Consequences**: names with numbers in the middle can potentially be harder to search for in the source code, hard to pronounce, and also can be very similar to other names that differ only in terms of the numbers that appear somewhere in the middle (Martin, 2008). **Recommendations**: programmers should use numbers only when necessary and surround numbers with pronounceable words (Martin, 2008).

3.2.3 Ditto

The category *Ditto* consists of identifier names spelled in the same way as their *Types*. **Example**: timeZone is spelled as its *Type* TimeZone in the same way that the name object has the same name as its *Type* (Object). **Why**: naming identifiers according to the respective type is an easy option to avoid mental mapping (which usually are associated with the problem domain concepts). **Consequences**: this naming practice might result in names that are harder to map to their purposes when used in larger scopes, and tend to cause misinformation when the type name changes but the identifier names do not (Martin, 2008; Alsuhaibani et al., 2021). **Recommendations**: avoid using *Ditto* based names in very large scopes and/or in contexts in which other names can conflict with them (Martin, 2008).

3.2.4 Diminutive

This category encompasses identifier names that are a chunk of their respective *Type* name. **Example**: listener is an example of a name in this category when its associated

Type is named *EngineTestListener*. The name NFRuleSet ruleSet is also considered as a chunk of its *Type*. Why: developers usually rely on short names to avoid overloading the reader with many concepts. **Consequences**: when used in large-scope contexts, names that fall into this category might impair code comprehension (Martin, 2008). **Recommendations**: programmers should use names that properly convey the identifier's purpose within the local context and scope (Martin, 2008).

3.2.5 Cognome

Identifier names in this category contain as an additional suffix or prefix the name of the respective *Type*. **Example**: an identifier nameString includes in its name the the respective *Type* name (String). **Why**: usually programmers resort to adding suffixes in names to help them remember the *Types*. **Consequences**: encoding *Type* into names might place an extraneous cognitive load on the programmer Martin (2008); DiLeo (2019). **Recommendations**: give identifiers names that are meaningful without having to resort to adding its *Type* information to the names Martin (2008).

3.2.6 Index and Shorten

These categories represent similar naming practices: naming an identifier with a single-letter word. The *Index* category represents names with one arbitrary letter. Names in the *Shorten* category are the starting letters that correspond to their respective *Types*. **Example**: the names Integer i and Integer j falls into the *Index* category and Person p and String s are examples of *Shorten* names. **Why**: singleletter names are traditionally used to identify counters in loops. **Consequences**: single-letter names usually are not easy to locate in the source code (unsearchable) and, when employed in large scopes, can be hard to be understood (Martin, 2008; DiLeo, 2019; Beniamini et al., 2017). **Recommendations**: use single-letter names only in local and small scopes; otherwise, intent-revealing names are better (Martin, 2008).

3.2.7 Famed

This category includes very common names; that is, when naming become arbitrary and programmers need to come up convenient defaults. *Famed* names appear in almost every source code, potentially, in similar contexts, such as in loop statements (e.g., FOR). **Example**: the word *i* is a recurrent identifier name used in loops to denote counters. **Why**: very popular identifiers are part of the programmer mindset and can be quickly remembered and understood. **Implications**: when used in an indiscriminate fashion, they may cause misinformation Martin (2008); Alsuhaibani et al. (2021). **Recommendations**: use intent-revealing names even in shortscope contexts Martin (2008); Alsuhaibani et al. (2021).

3.3 Data Extraction and Analysis

Projects selection Our sample comprises 40 open-source Java projects and 40 C++ projects hosted on GitHub. These

projects are listed in Tables 1 and 2. We included widely used projects, most of which have been under development for at least five years (e.g., fastjson, jenkins, junit4, mockito, retrofit, spring-boot, tomcat, pytorch, and tensorflow). Also, some projects were taken into account because they appear in a curated list of "awesome" projects.⁴ Table 1 and 2 give an overview of the examined projects. As shown in these tables, our Java and C++ samples cover somewhat small codebases (with less than 10K LoC) and large-scale ones (with over 100K LoC). Overall, we selected heterogeneous Java and C++ projects from a broad range of domains: e.g., software testing, game design, web applications development, image manipulation, and natural language processing. The selected projects also have a reasonable number of attributes, parameters, and variables names and were developed collaboratively by a diverse group of programmers. Therefore, we consider that we have selected a somewhat representative set of Java and C++ projects.

The Java projects were collected in July 2021 from GitHub by cloning and storing their respective repositories. In a similar fashion, we extracted the information from the selected C++ projects in January 2022. After storing the repositories, we extracted three common software metrics: (i) the total lines of code (we excluded non-functional code such as comments and white-spaces); (ii) the number of commits; and (iii) the number of contributors. To answer RQ₃, we correlated these metrics with the prevalence of the categories in projects.

Names Extraction In order to extract identifier names from each project, we created a parser based on the SrcML tool Collard et al. (2013). SrcML is a multi-language parsing tool for the analysis and manipulation of source code. SrcML turns source code into a document-oriented XML format (srcML⁵), which allows for queries using XPath. For example, the srcML format contains structural information (markup tags) about identifier declarations (<decl_stmt>), associated types (<type>), and context (<block>).

We extracted 2,603,381 names from the 80 collected projects. After applying the naming categorization (see Section 3.2), we get a total of 753,811 identifier names distributed across the categories (*Kings, Median, Ditto, Diminutive, Cognome, Index, Shorten*) as shown in Tables 1 and 2. The experimental package is available in Github ⁶.

To investigate and get an overview of the elements in the *Famed* category, we used the entire dataset extracted from both programming languages. We examined the name of each extracted identifier and the associated *Type* to answer RQ_1 and RQ_3 . Therefore, for each naming category practice we report the occurrences in the studied projects and across them. To answer RQ_2 we analyzed the context where identifiers were declared.

Survey Design and Sampling To answer RQ_4 we designed an online questionnaire containing fifteen closed-

ended questions related to naming practices. A brief description (in Portuguese) and an example accompanied these questions (see Appendix A). We also included two initial questions to collect the demographic information of the respondents. The respondents had to point out their experience in software development as a single choice from four options: under two, two to five, six to 10, or over ten years; and also their education level (undergraduate, graduate, postgraduate).

We selected the web-based questionnaire to conduct our survey because it maximizes the number of possible respondents. The Google Forms⁷ was chosen to host the questionnaire and enable data collection and pre-processing. The questionnaire was first trialed within the authors' organizations, with one of the authors registering possible observed issues. Some minor adjustments were made to ensure the consistency and clarity of the questions. Finally, the questionnaire link was posted to multiple websites (e.g., forums) and online groups (e.g., discord, whatsapp).

4 Experimental Results

In this section, we present the results of our empirical study around the RQs described in the previous sections.

4.1 RQ₁: How prevalent are the naming practice categories?

To answer RQ_1 , we analyzed the categories *Kings*, *Median*, *Ditto*, *Diminutive*, *Cognome*, *Shorten*, and *Index* regarding how commonly they appear in the projects in our samples. Tables 1 and 2 list how common each of these categories are

Table 3. The top 10 names in *Ditto* category

Names	Num. Repetitions	Num. Projects
Ditto in Java programs		
url	2,421	24
list	1,464	32
file	1,444	32
method	1,044	29
context	1,042	25
object	991	29
uri	968	25
node	844	21
type	593	30
date	526	25
Ditto in C++ programs		
Т	1,227	34
string	1,134	18
uint8_t	564	15
args	247	22
t	231	20
std	143	19
type	141	19
handle	96	17
mode	45	16

⁷www.google.com/forms

⁴java-lang.github.io/awesome-java

⁵srcml.org

⁶github.com/rng-lab/naming-practices-analysis

across the 80 investigated projects. Considering the identifier names in the chosen Java projects, 20.79% are composed by numbers at the end (*Kings*), 7.65% have numbers in their middle (*Median*), 26.24% are spelled the same as their *Types* (*Ditto*), 7.50% contain the hole *Types* as a sub-part (*Cognome*), 4.51% have in their spelling a sub-part of their respective *Types* (*Diminutive*), 3.35% are single-letter names composed of the first letter of their *Types* (*Shorten*), and 29.93% are arbitrary single-letter names (*Index*). As for the C++ projects in our sample, only approximately 7.28% of the identifier names fall into the *Kings* category, 53.24% of the identifiers are named according to their respective types (*Ditto*), around 9% follow the *Cognome* naming practice, 11.86% of the C++ identifier names are *Diminutive*, only 2.3% belong to the *Shorten* category, and approximately 13% of the C++ identifier names are single-letter names (*Index*).

These results indicate that the use of single-letter names (*Index*) is a widespread naming practice adopted in objectoriented programming. Indeed, Beniamini et al. (2017) have observed that single-letter names account for 9–20% of names in Java programs. As stated by them, the most commonly occurring single-letter name is i, and in some cases, j is also highly used. In addition, we observed that single-letter names representing contractions of their respective *Type* are not so common (*Shorten*), but are prevalent across projects (see Section 4.3). Programmers seem to be conscious about single-letter names implications (Hofmeister et al., 2017), and thus avoid choosing such naming practice: this category

NamesNum. RepetitionNum. ProjectsCommonNum. DecurrenceNum. Different TypesEaned in Java programsvalue16,94040String3,345Sysresult12,97539int1,024887name11,17239int9,794119e10,22540Throwable1,181888index8,22438int7,184838key7,69635String2,7713185c7,337355int1,4684441t6,97034float739355b6,51138int1,8333486type6,61240Class1,5233155input6,00837String765263source5,02537String765263neguest4,71932Request1,849212context4,43737Context1,642244id5,01034int849212context4,31737Context1,642244id5,11934Gottext2,6434id5,12137String9502,65neguest4,17137String1,622,64nut5,01034Gottext2,6434344id5,1214,63Gottext2,6435 <tr< th=""><th></th><th>['</th><th>Table 4. The most</th><th>common names (Famed)</th><th></th><th></th></tr<>		['	Table 4. The most	common names (Famed)		
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source 5.025 37 String 765 263 n 5.010 34 int 2.930 165 request 4.719 32 Request 1.489 212 context 4.437 37 Context 1.042 241 id 4.216 36 String 1.523 104 Famed in C++ programsi 5.421 40 int 2.362 151 value 3.912 40 double 427 268 x 3.856 36 double 858 250 result 3.771 40 T 448 231 index 3.106 38 int 869 88 n 3.027 37 int 729 159 ctx 2.964 22 $0pKernelConstruction$ 622 105 name 2.545 37 string 950 187 type 2.534 40 int 306 426 b 2.370 39 bool 386 219 p 2.351 37 $void*$ 190 412 size 2.285 39 $size_t$ 619 119 context 2.79 34 $0pKernelConstruction$ 501 133 s 2.254 35 Status 427 243 len 2.101 34 $Uint32$ 463 47 node 2.093 30 Node 154 286		5,256	35	int	381	443
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	-	5,025	37	String	765	263
$\begin{array}{ccc} {\rm context} & 4,437 & 37 & {\rm Context} & 1,042 & 241 \\ {\rm id} & 4,216 & 36 & {\rm String} & 1,523 & 104 \\ \hline \\ $	n	5,010	34	int	2,930	165
$\begin{array}{cccc} {\rm context} & 4,437 & 37 & {\rm Context} & 1,042 & 241 \\ {\rm id} & 4,216 & 36 & {\rm String} & 1,523 & 104 \\ \hline \\ \hline Famed {\rm in} C++ {\rm programs} \\ \hline \\ {\rm value} & 3,912 & 40 & {\rm ouble} & 427 & 268 \\ {\tt x} & 3,856 & 36 & {\rm double} & 858 & 250 \\ {\tt result} & 3,771 & 40 & {\tt T} & 448 & 231 \\ {\tt index} & 3,106 & 38 & {\tt int} & 869 & 88 \\ {\tt n} & 3,027 & 37 & {\tt int} & 729 & 159 \\ {\tt ctx} & 2,964 & 22 & {\tt OpKernelConstruction} & 622 & 105 \\ {\tt name} & 2,545 & 37 & {\tt string} & 950 & 187 \\ {\tt type} & 2,534 & 40 & {\tt int} & 306 & 426 \\ {\tt b} & 2,370 & 39 & {\tt bool} & 386 & 219 \\ {\tt p} & 2,351 & 37 & {\tt void*} & 190 & 412 \\ {\tt size} & 2,285 & 39 & {\tt size_t} & 619 & 119 \\ {\tt context} & 2,279 & 34 & {\tt OpKernelConstruction} & 501 & 133 \\ {\tt s} & 2,254 & 35 & {\tt Status} & 427 & 243 \\ {\tt len} & 2,101 & 34 & {\tt Uint32} & 463 & 47 \\ {\tt node} & 2,093 & 30 & {\tt Node} & 154 & 286 \\ {\tt v} & 1,983 & 38 & {\tt double} & 118 & 253 \\ {\tt data} & 1,832 & 37 & {\tt void*} & 441 & 211 \\ {\tt val} & 1,821 & 35 & {\tt int} & 192 & 199 \\ \end{array}$	request	4,719	32	Request	1,489	212
id4,21636String1,523104Famed in C++ programsi5,42140int2,362151value3,91240double427268x3,85636double858250result3,77140T448231index3,10638int86988n3,02737int729159ctx2,96422OpKernelConstruction622105name2,54537string950187type2,53440int306426b2,37039bool386219p2,35137void*190412size2,28539size_t619119context2,27934OpKernelConstruction501133s2,25435Status427243len2,10134Uint3246347node2,09330Node154286v1,98338double118253data1,82237void*441211val1,82135int192199	-	4,437	37	_	1,042	241
i $5,421$ 40int $2,362$ 151value $3,912$ 40double 427 268x $3,856$ 36double858250result $3,771$ 40T448231index $3,106$ 38int86988n $3,027$ 37int729159ctx $2,964$ 22DpKernelConstruction622105name $2,545$ 37string950187type $2,534$ 40int306426b $2,370$ 39bool386219p $2,351$ 37void*190412size $2,285$ 39size_t619119context $2,279$ 34OpKernelConstruction501133s $2,254$ 35Status427243len $2,101$ 34Uint3246347node $2,093$ 30Node154286v $1,983$ 38double118253val $1,821$ 35int192199	id		36	String		104
value $3,912$ 40double 427 268 x $3,856$ 36 double 858 250 result $3,771$ 40T 448 231 index $3,106$ 38 int 869 88 n $3,027$ 37 int 729 159 ctx $2,964$ 22 $0pKernelConstruction$ 622 105 name $2,545$ 37 string 950 187 type $2,534$ 40 int 306 426 b $2,370$ 39 bool 386 219 p $2,351$ 37 void* 190 412 size $2,285$ 39 size_t 619 119 context $2,279$ 34 $0pKernelConstruction$ 501 133 s $2,254$ 35 Status 427 243 len $2,101$ 34 $Uint32$ 463 47 node $2,093$ 30 Node 154 286 v $1,983$ 38 double 118 253 data $1,821$ 35 int 192 199	<i>Famed</i> in C++ pro	grams				
x $3,856$ 36 double 858 250 result $3,771$ 40 T 448 231 index $3,106$ 38 int 869 88 n $3,027$ 37 int 729 159 ctx $2,964$ 22 $0pKernelConstruction$ 622 105 name $2,545$ 37 string 950 187 type $2,534$ 40 int 306 426 b $2,370$ 39 bool 386 219 p $2,351$ 37 void* 190 412 size $2,285$ 39 size_t 619 119 context $2,279$ 34 $0pKernelConstruction$ 501 133 s $2,254$ 35 Status 427 243 len $2,101$ 34 Uint32 463 47 node $2,093$ 30 Node 154 286 v $1,983$ 38 double 118 253 data $1,821$ 35 int 192 199	i	5,421	40	int	2,362	151
result $3,71$ 40 T 448 231 index $3,106$ 38 int 869 88 n $3,027$ 37 int 729 159 ctx $2,964$ 22 OpKernelConstruction 622 105 name $2,545$ 37 string 950 187 type $2,534$ 40 int 306 426 b $2,370$ 39 bool 386 219 p $2,351$ 37 void* 190 412 size $2,285$ 39 size_t 619 119 context $2,279$ 34 OpKernelConstruction 501 133 s $2,254$ 35 Status 427 243 len $2,101$ 34 Uint 32 463 47 node $2,093$ 30 Node 154 286 v $1,983$ 38 double 118 253 data $1,832$ 37 void* 441 211 val $1,821$ 35 int 192 199	value	3,912	40	double	427	268
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	x	3,856	36	double	858	250
n $3,027$ 37 int 729 159 ctx $2,964$ 22 DpKernelConstruction 622 105 name $2,545$ 37 string 950 187 type $2,534$ 40 int 306 426 b $2,370$ 39 bool 386 219 p $2,351$ 37 void* 190 412 size $2,285$ 39 size_t 619 119 context $2,279$ 34 OpKernelConstruction 501 133 s $2,254$ 35 Status 427 243 len $2,101$ 34 Uint32 463 47 node $2,093$ 30 Node 154 286 v $1,983$ 38 double 118 253 data $1,822$ 37 void* 441 211 val $1,821$ 35 int 192 199	result	3,771	40	Т	448	231
ctx2,96422OpKernelConstruction622105name2,54537string950187type2,53440int306426b2,37039bool386219p2,35137void*190412size2,28539size_t619119context2,27934OpKernelConstruction501133s2,25435Status427243len2,10134Uint3246347node2,09330Node154286v1,98338double118253data1,83237void*441211val1,82135int192199	index	3,106	38	int	869	88
name $2,545$ 37 string 950 187 type $2,534$ 40 int 306 426 b $2,370$ 39 bool 386 219 p $2,351$ 37 $void*$ 190 412 size $2,285$ 39 $size_t$ 619 119 context $2,279$ 34 $OpKernelConstruction$ 501 133 s $2,254$ 35 $Status$ 427 243 len $2,101$ 34 Uint 32 463 47 node $2,093$ 30 Node 154 286 v $1,983$ 38 double 118 253 data $1,832$ 37 $void*$ 441 211 val $1,821$ 35 int 192 199	n	3,027	37	int	729	159
type2,53440int 306 426 b2,37039bool 386 219p2,35137void*190412size2,28539size_t619119context2,27934OpKernelConstruction501133s2,25435Status427243len2,10134Uint3246347node2,09330Node154286v1,98338double118253data1,83237void*441211val1,82135int192199	ctx	2,964	22	OpKernelConstruction	622	105
b2,37039bool386219p2,35137void*190412size2,28539size_t619119context2,27934OpKernelConstruction501133s2,25435Status427243len2,10134Uint3246347node2,09330Node154286v1,98338double118253data1,83237void*441211val1,82135int192199	name	2,545	37	string	950	187
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	type	2,534	40	int	306	426
size2,28539size_t619119context2,27934OpKernelConstruction501133s2,25435Status427243len2,10134Uint3246347node2,09330Node154286v1,98338double118253data1,83237void*441211val1,82135int192199	b	2,370	39	bool	386	219
context2,27934OpKernelConstruction501133s2,25435Status427243len2,10134Uint3246347node2,09330Node154286v1,98338double118253data1,83237void*441211val1,82135int192199	р	2,351	37	void*	190	412
s2,25435Status427243len2,10134Uint3246347node2,09330Node154286v1,98338double118253data1,83237void*441211val1,82135int192199	size	2,285	39	size_t	619	119
len2,10134Uint3246347node2,09330Node154286v1,98338double118253data1,83237void*441211val1,82135int192199	context	2,279	34	OpKernelConstruction	501	133
node2,09330Node154286v1,98338double118253data1,83237void*441211val1,82135int192199	S	2,254	35	Status	427	243
v1,98338double118253data1,83237void*441211val1,82135int192199	len	2,101	34	Uint32	463	47
data1,83237void*441211val1,82135int192199	node	2,093	30	Node	154	286
data1,83237void*441211val1,82135int192199	v	1,983	38	double	118	253
val 1,821 35 int 192 199	data		37			
c 1,776 38 char 246 199	val	1,821	35	int	192	199
	с	1,776	38	char	246	199

Table 4.	The most	common	names	(Famed)
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Diminutive

Shorten Cognome Index Percentage 0 Attr For lf Method Param Switch While Kings 30.84% 17.49% 7.98% 18.64% 19.53% 12.16% 9.51% 13.56% 10.60% 2.07% 3.46% 8.90% 0.91% Median 2.11% 29.01% 13.28% 27.31% 29.10% 14.32% Ditto 13.15% 13.43% Diminutive 6.20% 2.38% 2.84% 5.43% 2.95% 8.59% 2.11% Cognome 9.01% 6.32% 6.31% 9.36% 4.81% 4.62% 5.98% 10.63% 45.70% 52.99% 32.78% 32.46% 44.77% 55.79% Index 0.76% 4.36% 14.53% 3.04% 2.24% 13.42% 12.27% Shorten

Figure 1. Naming practices distribution over Java programming statements

Median Ditto

Diminutive

Kings

Statements

represents only 3.35% (14,088) of the examined Java names and 2.3% (7,689) of the identifier names in C++ projects.

Names that fall into the *Ditto* naming practice category make up the lion's share of all identifier names in C++ (53.24%) projects and are the second most common naming practice in Java (26.24%) programs. Even though it might be argued that *Ditto* is a sound naming practice given that it leads to pronounceable names and many IDEs suggest names that include the identifier *Type*, in most cases, the practice does not lead to the creation of intention-revealing names.

Table 3 lists the five most reoccurring names in such a category for Java and C++ projects. According to Table 3, the use of identifier names as list, object, args, unit8_t and t are common, but these names do not reveal intentions. When the context is not explicit or broad, programmers have to trace back what kinds of data are in an identifier named as list or t. These names are generic and hurt the reader's understanding. Moreover, whether the *Type* name changes, then the identifier names will be misleading as in cases such as string and type. According to Avidan and Feitelson (2017), the evil face of names is misleading names.

The habit of choosing names that represent arbitrary sequential distinctions also revealed a common practice among Java and C++ programmers (*Kings*). However, numberseries is considered a bad practice in object-oriented programming when creating meaningful names. Number-series naming is a non-informative option, which might disturb code comprehension and maintainability. The use of numbers in the middle of names, although prevailing in the studFigure 2. Naming practices distribution over C++ programming statements

Median Ditto

Shorten

Kings

Cognome Index

Percentage					ĺ		ļ
0	Attr	For	lf	Method	Param	Switch	While
Kings	9.34%	21.98%	13.31%	22.64%	3.98%	9.59%	8.71%
Median	9.16%	6.39%	3.75%	6.14%	1.68%	1.26%	3.42%
Ditto	20.75%	26.81%	17.01%	25.17%	65.86%	20.25%	17.17%
Diminutive	24.27%	4.96%	6.42%	8.44%	10.54%	5.33%	7.49%
Cognome	32.68%	4.78%	2.97%	5.18%	5.65%	1.26%	4.88%
Index	3.41%	32.42%	44.80%	28.61%	10.32%	51.74%	48.90%
Shorten	0.38%	2.65%	11.75%	3.81%	1.97%	10.56%	9.44%

Statements

ied names, does not appear to be a recurrent naming practice. We observed that the most common numbers used in the middle of names are: (i) 0, 1, 2, 3, 4, 5, and 6 – as well as meaning some distinction; and (ii) 8, 16, 32 and 64 – meaning identifiers which might be representing 8, 16, 32 or 64 bits values, respectively.

The scenarios in which programmers choose names that are variants of their *Type* are also common. For example, names that contain sub-parts of their *Type* (*Cognome*) account for 7.50% of the identifier names in Java projects and around 9% in C++ programs. Often, these identifier names represent prefix/suffix (noise words) conventions, such as: streetString; listPersons; floatArg. Noise words are redundant and should never appear in names. In general, streetString is not better than street. Short names are in general easier to comprehend and one of the first things a programmer can do to keep identifier names short is to avoid adding unnecessary information. In contrast, names that are part of their *Type* are not so common. These names are hard to search for and are not very meaningful in most contexts.

4.1.1 Very Common Names

In Feitelson et al. (2020), the authors observed that the probability of two programmers choosing the same name is low: the median probability was only 6.9%. At the same time, when a specific name is chosen, it is usually understood and often used by most programmers (Avidan and Feitelson, 2017; Swidan et al., 2017). In fact, we observed that there are some frequently used names. The Top-3 most common names in Java programs are (see Table 4): (i) value (16,940 occurrences); (ii) result (12,975 occurrences); and (iii) name (11,374 occurrences). It might be expected that i is a widespread name (Beniamini et al., 2017), but many other single letter names are also commonly used across Java projects (e.g., e, s, c, t, a, b, p, n). Most of them are in the Top-10 most common names. Another interesting observation is index and key as part of the Top-10 most common names in Table 4 are popular in programmer's vocabulary: value, result, name, index, key, type, input, source, request, context, id.

As for C++ programs, the three most common identifier names are (i) i (5,421 occurrences), (ii) value (3,912 occurrences), and (iii) x (3,856 occurrences). According to our results, many of the identifier names shown in Table 4 are widely common in programs written in Java and C++: value, result, name, index, type, context, i, b, n, p, and s. It turns out that value appears among the top three most used identifier names both in Java and C++. Java programmers seem to have a slight preference for the names result and name in comparison to C++ programmers. As mentioned, some single-letter names are widely used by programmers in both languages, being i the most commonly used single-letter name in Java and C++.

Further analysis of the names in Table 4 and their corresponding most common *Types* led to interesting results about programmers' rationale when programming in Java and C++. As noted by Beniamini et al. (2017), analyzing this link yields interesting results because it is possible to understand the meaning related to names frequently used by programmers, especially single-letter names. We can observe most identifier names are associated with int variables (e.g., result, i, index, c, b, p, n) or String *Types* (e.g., value, name, key, s, input, source, id). As shown in a survey conducted by Beniamini et al. (2017), single-letter names such as i and j are understood as counter variables (integer values) and most of the time used as loop control variables.

There are other interesting findings. For example, in Java programs the single-letter name e, is usually correlated with error and exception (Beniamini et al., 2017). Our results show that e is mainly associated with the Throwable *Type*. In the same way, s is a single-letter name essentially associated with String (see Table 4). However, we also found some counter-intuitive results. For instance, contrary to our expectations, we observed that in programs written in Java the

single-letter name b is not linked with boolean values (Beniamini et al., 2017) but with integer values. Additionally, the identifier name t is mainly associated with Throwable; which is somewhat counter-intuitive because t is also often used to name and convey the idea of time-related constant values and variables or variables that hold temporary values (Beniamini et al., 2017).

Other names that seem to have meaningful associations are the following: type, which is generally associated with the Class *Type*; context and request, which are often associated with the Context and Request *Types*.

Our results would seem to suggest that the underlying meaning of the identifier names vary a lot. For example, the name result was associated with 855 different *Types*. The name i, which intuitively is associated with index (int), also assumes other 139 different *Types*. Nevertheless, in most cases (9,794 out of 11,172), this name is associated with integer values. The name name seems to be usually associated with the String *Type*: 10,208 out of 11,374 occurrences are associated with String.

4.2 RQ₂: Are there context-specific naming practices categories?

To answer the RQ_2 , we investigated the predominance of the naming practice categories over particular contexts (ATTRIBUTE, PARAMETER, METHOD, FOR, WHILE, IF, and SWITCH). The results are present in Figure 1 and 2.

We found that while some naming conventions (Allamanis et al., 2014) acknowledge the use of single-letter words (Index and Shorten) to name a local, temporary or loop variable, this practice is much more pervasive than any other. Except for naming attributes Java and C++, in which case Java programmers prioritize the use of Ditto and Kings naming practices while C++ programmers tend to use Cognome, Ditto, and Diminutive. Surprisingly, names with numbers at the end appear 30,655 times in our study as Java attributes and only 4,066 in class attributes in C++ projects. Especially in largescope contexts, Kings names should always be avoided by programmers. In contrast, using Ditto names in such a case seems to be a reasonable choice. IDEs (e.g., Eclipse and Intellij IDEA) usually analyze the scope and generate suggestions from the current context and these suggestions often include information regarding the respective Type.

Focusing on particular contexts, we might see that programmer's practices are context-specific. For example, the

Table 5	. Spearman	correlation
---------	------------	-------------

		Lo	ъC			Com	mits			Comr	niters	
Category	Ja	iva	C·	++	Ja	iva	C	++	Ja	iva	C	++
	Corr	p-value										
Kings	0.337	0.038	0.391	0.014	0.150	0.365	0.199	0.222	0.053	0.748	0.090	0.583
Median	0.254	0.123	0.004	0.978	0.054	0.743	-0.197	0.226	-0.081	0.627	0.070	0.668
Ditto	-0.517	0.001	-0.049	0.763	-0.216	0.191	0.074	0.649	0.101	0.545	-0.041	0.801
Diminutive	-0.021	0.898	0.335	0.037	0.008	0.959	0.225	0.166	-0.171	0.304	-0.025	0.875
Cognome	-0.227	0.169	0.268	0.098	-0.300	0.066	0.188	0.250	-0.178	0.283	-0.103	0.532
Index	0.341	0.036	-0.330	0.040	0.133	0.421	-0.311	0.054	-0.098	0.554	0.010	0.950
Shorten	0.387	0.016	-0.196	0.229	0.124	0.453	-0.110	0.501	-0.068	0.681	0.128	0.435

use of practices that might result in meaningful names (e.g., *Ditto*) is more common in long-scope contexts (ATTRIBUTE and METHOD) than in short-scope ones (IF, FOR, WHILE, SWITCH). Especially in C++ projects, *Ditto* makes up for the lion's share of the parameters names. Java and C++ programmers seem to adopt less descriptive names in the context of switch and while statements. As shown in Figures 1 and 2, *Index* names appear more often inside contexts surrounded by if, for, switch, and while statements, where their occurrence is widely and accepted (Kernighan and Pike, 1999; Beniamini et al., 2017). However, as observed by Avidan and Feitelson (2017), hiding the plural names using single-letter words may camouflage the meaning of the respective identifier. It might not be a natural interpretation that the identifier stores more than one object.

The predominance of *Kings* and *Index* as parameter names do not agree with the findings of Avidan and Feitelson (2017). Their experiment indicated that parameter names contribute more to code comprehension than any other names (e.g., attributes or local variables). Since parameters are part of the method header and the starting point of the comprehension task, programmers pay special attention to parameter names in order to better understand the method behavior (Avidan and Feitelson, 2017). However, every naming practice category we studied are used to name parameters, although, as observed by Avidan and Feitelson (2017), parameter names are often more carefully chosen by programmers.

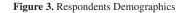
4.3 RQ₃: Do the naming practice categories carry over across different Java and C++ projects?

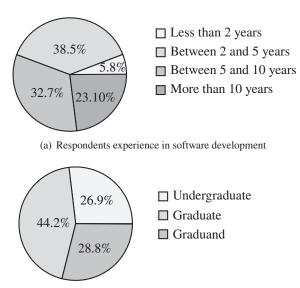
In hopes of answering the RQ_3 , we analyzed the prevalence of naming practice spanning multiple projects. Tables 1 and 2 list the categories by projects. All selected projects turned out to have problematic names, which suggests that the investigated naming category practices are probably not uncommon. Even the most popular projects have naming practices which might result in meaningfulness names (e.g., fastjson, jenkins, junit4, mockito, retrofit, spring-boot, tomcat, tensorflow, and pytorch).

As highlighted in Tables 1 and 2, Ditto and Index are very common naming practices. Especially, these practices are dominant (representing more than 50% of analyzed identifiers) in some projects. For example, Ditto names are widely used in Java and C++ programs, accounting for 85.08% in riptide (Java), 80.78% of the identifier names in clickhouse (C++), 78.26% in webmagic (Java), 72.93% of the names in kdenlive (C++), 68.60% in mysql-server (C++), 68.32% in percona-server (C++), 65.99% in keywhiz, and 54.46% in aeron. The problem with Ditto is that when the Type changes, the identifier name might lose its meaning (Scalabrino et al., 2017). Index names appear to be more common in Java programs. For instance, these identifier names account for 58.93% of all identifiers in boofcv (Java) and 66.53% in rx java (Java). It would seem that Index names are not very common in C++: proxysql which is the program in which Index names are most common, has around 34.7% of the identifier names following this naming practice. rocksdb and citra also include a substantial amount of identifiers named according to the *Index* naming practice: 34.71% and 30.30%, respectively.

In some isolated cases, some name practice seems to be dominant, as *Kings* in fastjson (49.88%) and libgdx (47.83%). On the other hand, the naming practices *Cognome*, *Diminutive* and *Shorten* are not dominant in any specific project. Specifically, *Shorten* seems to be a naming practice that most programmers try to avoid: programmers avoid naming identifiers using the first letter of the *Type*. As mentioned, *Shorten* names usually are not easy to search for in the source code and, when employed in large-scope contexts, they tend to be hard to understand.

To better comprehend whether the project's characteristics may influence the prevalence of one practice, we looked at the correlation between common software metrics (e.g., lines of code, number of contributors, and number of commits) and the predominance of the naming practice categories. Table 5 summarizes the Spearman test results. The results show no representative correlation between the investigated project characteristics and the categories of naming practices. Overall, we can observe a low correlation between the number of contributors and the prevalence of any category. One might surmise that an increase in the number of programmers might be beneficial towards removing bad naming practices. However, this does not seems to be the case. The same rationale might be employed to the number of commits: whether the project evolves, the quality of the identifiers names might evolve or decay. Though, in contrast to Deissenboeck and Pizka (2006), which stated that identifiers names are subject to decay during software evolution, the results show that it might not seem to be the case. Especially observing LoC, we might observe some compelling correlations. For example, there is a negative correlation (rho -0.517) between size and the category Ditto (for Java programs). Therefore, names spelled in the same way as their respective Types tend to be way more common in small projects. On the other hand, large Java projects might tend to contain names involving practices such as Index (rho 0.341) and Shorten (rho 0.387).





(b) Respondents education level

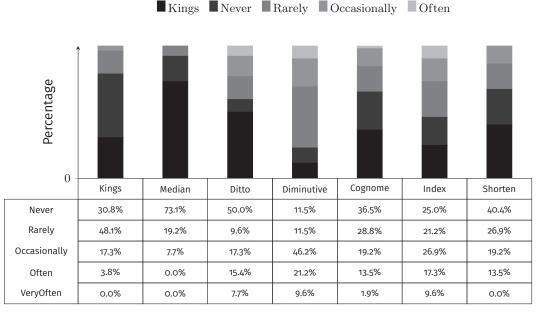


Figure 4. Naming practices distribution over programming statements

Frequency

As shown in Table 1, Ditto and Index are the most dominant practice across Java projects. Considering only the two categories, they account for 235,886 identifier names, representing 56.17% of all analyzed names in Java projects. These results are consistent with the findings of Beniamini et al. (2017). Although code conventions and style guides may constrain identifier naming practices, programmers seem to be heavily influenced by IDEs content assist capabilities. As programmers work in the editor, content assist analyzes their code and recommended elements to complete partially entered statements. Therefore, it is indispensable to provide more sophisticated and context-aware capabilities to assist programmers in naming and renaming identifiers Jiang et al. (2019); Isobe and Tamada (2018); Peruma et al. (2018, 2019). Finally, programmers would seem to prioritize single-letters names in contexts where they are widely accepted (see Section 4.2).

4.4 RQ₄: What is the perception of software developers about the investigated naming categories?

This section presents the results of our survey with 52 programmers. We start by characterizing the respondents (Section 4.4.1). Next, we assess the relevance of the naming practice categories by how often they are used by programmers (Section 4.4.2). We then analyze how naming practice categories adoption varies according to programming statements (Section 4.4.3).

4.4.1 Respondents' Demographics

Figure 3 depicts the respondents' experience in software development and the corresponding frequencies and percentages. A total of 5.8% of the respondents have less than two years of experience, while 55.8% have more than five years of experience, suggesting that most survey respondents are experienced programmers. Moreover, we seem to have collected a reasonably balanced distribution of programmers in

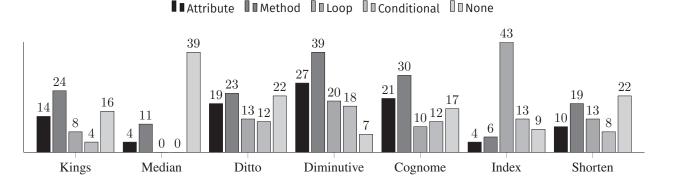


Figure 5. Naming practices distribution over programming statements

terms of education level. Figure 3 shows the respondents' education level. As the majority of the respondents (73%) have a graduate degree, we claim that it increases our confidence in the validity of the responses.

4.4.2 Most Commonly Used Naming Practices

The respondents were queried about how often they choose identifier names conforming to the naming practice categories. A five-point Likert scale was used to capture respondent opinions ranging from "Never" to "Very Often". Figure 4 shows how frequently respondents have been using each naming practice category. In our sample, *Diminutive* is the most frequently used naming practice category (i.e., used "Often" or "Very Often"), followed by *Index* and *Ditto*. This result seems to align well with our observation about the prevalence of the naming practices in open-source object-oriented programming (see Section 4.1).

Notably, from the survey, we can make the following observations:

- All the respondents adopt at least one naming practice category "Occasionally" or "Often", with 26% (13) of the respondents claiming to adopt at least one naming practice "Very Often".
- *Diminutive* is the most adopted naming category practice by respondent. However, as we could observe, this naming practice category is not so prevalent in the analyzed object-oriented projects (see Section 4.1) as claimed by the survey programmers.
- *Median* is the least adopted naming practice category (see Figure 4), with just 26% (14) of the respondents using it "Rarely" or "Occasionally". The lower use of this naming practice corroborates our observation that programmers seem to be conscious of this harmful practice in object-oriented programming.
- *Ditto* is not a widespread naming practice among the survey respondents. Only 12 out of 52 programmers (23%) indicated a tendency to write identifier names spelled in the same way as their *Types*; which do not ratify our previous observations about the prevalence of *Ditto* across Java and C++ projects (see Section 4.3). This contrasting result suggests that programmers might be not aware of their general use of naming practices. Moreover, this might also be a sign that naming assistant features present in modern IDEs do not influence the respondents.

4.4.3 Most Commonly Used Naming Practices According to Context

In order to specify the location in which programmers mainly observe the occurrences of the naming practice categories, the respondents were allowed to select multiple locations (ATTRIBUTE, METHOD, LOOP, CONDITIONAL, and NONE). This is expected to be done by remembering instances of naming practice categories encountered by respondents in their software development works.

The two most common answers from the respondents were: ATTRIBUTE and METHOD (see Figure 5). These findings share similarities with those presented in Section 4.2, wherein 56% of the names occur as ATTRIBUTE or are declared in the context of METHOD. One notary exception is *Index*, in which case, 43 out of 52 respondents indicated that this naming practice occurs mainly inside contexts surrounded by LOOP statements (FOR or WHILE). Indeed, as observed by Beniamini et al. (2017), single-letter names can be used safely in a short-scope context. Finally, as expected, the majority of respondents (39 out of 52) indicated that they usually do not observe *Median* in their day-life (see Figure 5).

5 Threats to Validity

As with most empirical studies, our study also has some practical limitations, i.e., it is also subject to some threats to its validity. In this section, we present potential threats and how we tried to mitigate some of those issues.

Conclusion & External Validity One potential threat is that the samples we used in our study might not be representative of the target population: our analysis took into account 40 open-source Java projects and 40 C++ projects. To mitigate this threat concerning the conclusion and generalization of the study results, we tried to select a heterogeneous sample. We think the impact of this threat is minimal for three reasons: (i) Java and C++ are two popular programming languages;⁸ (ii) our sample covers somewhat small code-bases (with less than 10K LoC) and large-scale ones (with over 100K LoC), and (iii) we selected projects from a broad range of domains. Thus, we argue that our study can be seen as an initial step towards identifying trends Java and C++ programmers follow when picking identifier names. However, given the sizes of our samples, we cannot rule out the possibility that our results do not reflect how Java and C++ programmers name identifiers. That is, the results might not be generalizable beyond the study samples and the participants that took part in our survey.

To understand the prevalence of naming categories across Java and C++ projects, we employed a set of metrics: program size (LoC), number of commits, and number of contributors. Nevertheless, as with many software metrics, one potential threat is that these measurements might not be sophisticated enough for our investigation. Thus, our findings might not carry over to other settings and similar programming languages.

It is also worth emphasizing that context and scope would seem to play an important role in determining identifier names. For instance, some of the most common identifier names listed in Table 3 would seem to be context-dependent, e.g., node. We surmise that is the case because programmers might want to include relevant domain information when turning concepts into names. Although we tried our best to maximize the sample heterogeneity during sample selection, we cannot rule out the fact that the most common domains (e.g., XML file parsing) from which the programs in our sample were extracted might have an impact on variable naming.

Finally, the representativeness of the survey respondents cannot be guaranteed. Our target population was programmers, but we did not take any measures to verify the identity

⁸www.tiobe.com/tiobe-index/

of the respondents. However, we have included two initial questions, which might have permitted us to filter out individuals not belonging to our target population. There might also exist some other factors that bias our conclusions. One example is the environment in which the respondents worked. Another one is whether or not respondents have a correct understanding of each category. To mitigate the latter, we included in the questionnaire a brief description and an example of the categories. Future studies can ask respondents to consider this factor and evaluate how it impacts the naming practice category adoption.

Construct & Internal Validity A threat to the construct validity of our study comes from the number of identifier names we analyzed in our study. It might be argued that a more significant amount of names may lead to better and more conclusive results. To mitigate this threat we analyzed 2,603,381 identifier names in highly diverse sets of Java and C++ projects. Additionally, another potential threat has to do with how well the naming practices we identified reflect extant research and current industry practices. We tried to mitigate this threat by drawing from previous research, which helped us to get a better understanding regarding whether or not some of the naming practices we identified are indeed recurring practices. We also conducted a survey with 52 participants in order to gather programmers' perceptions about the use and occurrence of the investigated naming practices.

We tried to minimize possible construct and internal validity associated with the survey by disseminating it online through multiple websites and online groups; and introducing a brief description and an example of each question.

6 Conclusion

Coming up with proper identifier names is challenging (Brooks, 1983). As stated by Host and Ostvold (2007), even though programmers have to name identifiers on a daily basis, it still entails a great deal of time and thought. To make matters more challenging, identifier names are pivotal for program comprehension: developers have to go over identifier names to comprehend the code that they need to update and poorly chosen names might hinder source code comprehension (Avidan and Feitelson, 2017). Given that it has been estimated that identifiers contribute to about 70% of a software system's codebase (Deissenboeck and Pizka, 2006), it cannot be disputed that there is a need to define what makes up a good identifier as well as to assist developers in naming identifiers. Similarly, identifying practices that result in poor identifier names might enhance programmers' awareness and contribute to improving educational materials and code review methods. As an initial foray into creating an approach to optimal identifier naming (i.e., how to assign the proper words to an identifier), we investigated eight naming practices categories "in the wild". The categories provide examples of naming practices from real-world software projects. We illustrated their possible consequences and also outlined their prevalence across projects and code contexts (i.e., ATTRIBUTE, PARAMETER, METHOD, FOR, WHILE, IF, and SWITCH).

Our results based on 2,603,381 identifier names extracted from 80 real-world Java and C++ projects and on a survey, would seem to suggest the following:

- The eight categories are recurrently found in practice, but two are more common in Java and C++ projects: naming identifiers with the same name as her Type (Ditto) and use single-letter names denoting counters (Index). Specifically, Index and Ditto are by far the most frequently occurring naming practices across Java projects: Index occurrences account for approximately 30% of all naming practice occurrences in the examined Java projects, while Ditto occurrences amounted to roughly 27%. As for C++ programs, Ditto is the most widely used naming practice, which accounts for around 54% of all naming practice occurrences. Index and Diminutive are also popular among C++ coders, accounting for 13% and 11% of all naming practice occurrences. Shorten seems to be the least used naming practice both by Java and C++ programmers. Additionally, programmers seem to be hardly influenced by IDE-like features that help them to choose identifier names, although only 12 out of 52 surveyed programmers (23%) acknowledged a tendency to write identifier names spelled in the same way as their Types;
- There are several very common names (e.g., value; result; and name) and recurrent single-letter names (e.g., i, e, s, c) used in practice. The lion's share of these names are used to denote identifiers that store either integer or string values. According to our results, single-letter identifiers are more commonly used by Java programmers: i, e, s, c, t, a, b, p, and n would seem to be widely used by programmers. In C++ (in contrast to Java), coders tend to prefer a smaller set of single-letter names: i, e, s, s, c, t, a, b, p, and n. Thus, differently from Java, in C++ e, c, t, and a do not rank among the most common single-letter identifier names;
- The programmers naming practices are context-specific: single-letters names (*Index* and *Shorten*) seem to be more common in short-scope contexts (IF, FOR, WHILE), although they can also be found in large-scope contexts (e.g., ATTRIBUTE). Results from our survey questionnaire showed that programmers acknowledge that the *Index* naming practice occurs mainly inside contexts surrounded;
- *Diminutive* is the most adopted naming category practice by survey respondents and *Median* is the least used naming practice. All the respondents adopt at least one naming practice category "Occasionally" or "Often".
- We could benefit from including poor naming practices in code reviews. The current practices follow extensive checklists, but no one addresses naming issues. A more nuanced take is to consider variable names that depart from commonly used naming practices as elements that can lead to a source of problems.

We believe our results have the potential to inspire several future research directions. Our work highlights the need for further research on how naming practices are prevalent in source code and how better names can be chosen. In this

direction, an aspiring goal would be to devise tools capable of automatically evaluating and suggesting renaming opportunities during code review. Similarly, code generation tools can capitalize on commonly used naming practice to generate names automatically. Additionally, since our results would seem to suggest that some identifier names are contextdependent, we believe that tools (e.g., IDE-based identifier name recommendation system) can take advantage of context information during software development by constantly monitoring how programmers name identifiers so that it can help developers new to a given project through the automated recognition of context- and project-specific naming conventions. Therefore, this automated identifier naming assistant can support developers by identifying inappropriate naming choices and making recommendations. As a result, our longterm goal is to support the identification of opportunities to rename identifiers and understand more about programmers naming practices. Finally, as future work, we plan to perform a qualitative study on commits, code changes, and review discussions. Another possible future research avenue would be to account for the role of human factors in choosing identifier names by exploring how programmer experience, team size, and mood influence naming practices throughout different software projects.

Although our results give practitioners and researchers alike a good glimpse into the most common options for naming identifiers in C++ and Java, we did not investigate how each naming practice contributes, if at all, to improving code comprehension. Therefore, future research efforts should aim to better understand how these commonly used naming practices influence readability during code comprehension.

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Appendix A Survey Questionnaire

-				
o Undergraduate	• Graduate	• Graduand		
Experience in software d	evelopment			
• Under two years	• Two to five years	• Six to ten years	• Over ten years	
1. How often do you choo Examples: People people1	ose identifier names with number ; People people2	s at the end?		
• Never	• Rarely	• Occasionally	• Often	• Very often
Where do you usually see	e identifier names with numbers	at the end?		
Attributes	□ Methods	□ Loops	Conditionals	□ None
2. How often do you choo Example: Char int2char	ose identifier names with number	s in the middle?		
• Never	• Rarely	• Occasionally	• Often	• Very often
Where do you usually see	e identifier names with numbers	in the middle??		
Attributes	□ Methods	\Box Loops	□ Conditionals	□ None
3. How often do you nam Examples: String string, P	e identifiers after their Type name eople people	ies?		
0 Never	• Rarely	• Occasionally	• Often	 Very often
Where do you usually see	e identifier names spelled in the s	ame way as their Types?		
\Box Attributes	□ Methods	□ Loops	Conditionals	□ None
4. How often do you nam Examples: EngineExecutio	e identifiers as chunk of their rest onTestListener listener	spective <i>Type</i> name?		
• Never	• Rarely	• Occasionally	• Often	• Very often
Where do you usually see	e identifier names as chunk of the	eir respective <i>Type</i> name?		
Attributes	□ Methods	\Box Loops	Conditionals	□ None
	udes in identifier names an addit	ional suffix or prefix that is the n	ame of	
the respective Type?	ing			
the respective <i>Type</i> ? Examples: String nameStr	• Rarely	• Occasionally	0 Often	• Very often
the respective Type? Examples: String nameStr • Never Where do you usually see	-	5	U	• Very often
the respective Type? Examples: String nameStr • Never	• Rarely	5	U	∘ Very often □ None
the respective Type? Examples: String nameStr • Never Where do you usually see the respective Type? — Attributes	• <i>Rarely</i> e identifier names containing an a	additional suffix or prefix that is	the name of	
the respective Type? Examples: String nameStr • Never Where do you usually see the respective Type? Attributes 6. How often do you choo Examples: Integer j	• Rarely e identifier names containing an a	additional suffix or prefix that is	the name of	
the respective Type? Examples: String nameStr • Never Where do you usually see the respective Type? Attributes 6. How often do you choo Examples: Integer j • Never	• Rarely e identifier names containing an a	additional suffix or prefix that is	the name of	□ None
the respective Type? Examples: String nameStr • Never Where do you usually see the respective Type? Attributes 6. How often do you choo Examples: Integer j • Never Where do you usually see	 Rarely e identifier names containing an a □ Methods >se single-letter identifier names? o Rarely 	additional suffix or prefix that is	the name of	□ None
the respective Type? Examples: String nameStr • Never Where do you usually see the respective Type? Attributes 6. How often do you choo Examples: Integer j • Never Where do you usually see Attributes	 o Rarely e identifier names containing an a □ Methods osse single-letter identifier names? o Rarely e single-letter identifier names? 	additional suffix or prefix that is Loops Occasionally Loops	the name of Conditionals • Often Conditionals	□ None
the respective Type? Examples: String nameStr • Never Where do you usually see the respective Type? Attributes 6. How often do you choo Examples: Integer j • Never Where do you usually see Attributes 7. How often do you nam Examples: People p		additional suffix or prefix that is Loops Occasionally Loops	the name of Conditionals • Often Conditionals	□ None
the respective Type? Examples: String nameStr • Never Where do you usually see the respective Type? Attributes 6. How often do you choo Examples: Integer j • Never Where do you usually see Attributes 7. How often do you nam Examples: People p • Never	 <i>Rarely</i> <i>identifier names containing an a</i> <i>Methods</i> <i>See single-letter identifier names?</i> <i>Rarely</i> <i>single-letter identifier names?</i> <i>Methods</i> <i>Methods</i> 	additional suffix or prefix that is □ Loops • Occasionally □ Loops ters that correspond to their respond to their respond to their respond to their responded to their re	the name of Conditionals • Often pective Types? • Often	