

The not-so-silent type

Vulnerabilities in Chinese IME Keyboards' Network Security Protocols

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What's a Chinese IME?

26 keys, 26 letters



What's a Chinese IME?

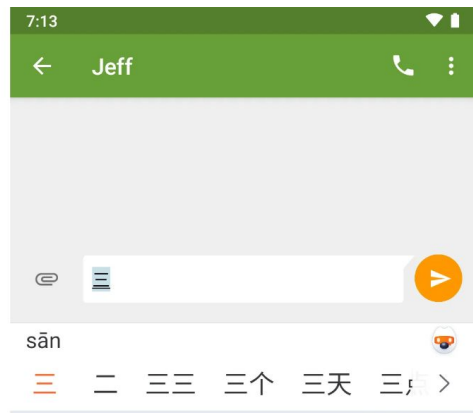
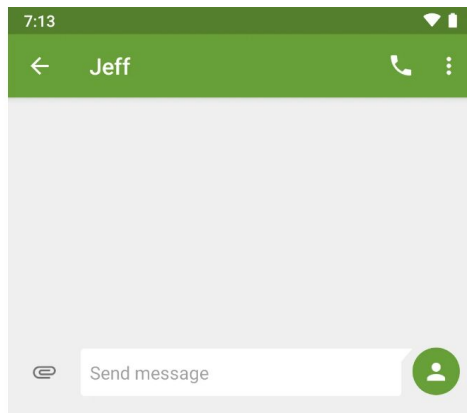
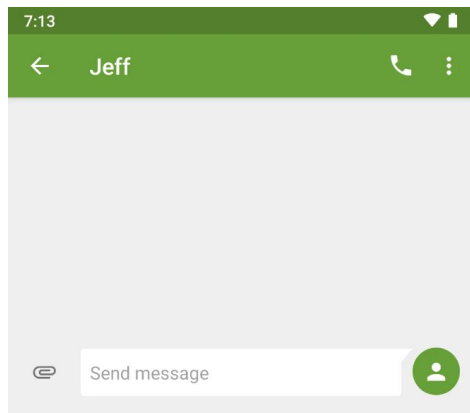
1,000s of characters?

想做几回正身每视法元块解弟指狗响科品案境拌消云列续责堂特响寄材遂勇糙饱想里太工真气快吧兴孩北信算游玩历连级介唱血征紧零整整究附章宜坚骗桥厉购擦惜下要西行字候报放色之送特丰船刻保挨树及阳漂乱街流喂判例适搬艺宾邻针渴悉都就再最外动识六热声花千汉除克害怕首迎社划式嘴引暗户广戴祝松括尤穷符歇她到先所新公找理百教求忙段客各利妻活遇改国即弄脱泰农预授彩松糖芸斤冻去面还进吃手非重准买客九市通悠脸票演网闻晴功笔姓检察辆族困著签付序藏巧梯程好没国爱道件常离头岁病乐饭餐馆护受确担床较制抱牙母招招遍翻拒释邮宽页酸悔赚和么女叫丰把体喜夫始备试记清拉管管终达海断草丈专租择冰严乌禁惯江搜奋克允羞那现儿也它服员妈应主世亮变音阿跳脚柔停导争况质律速竟吸膏既硬忽扬申虎吵抗会子前果觉因完服务然喝总足讲跑往舞组贵破超持忘费怀织努效值稍碍尊踢熊扔篮肚个生高可四向又成者力七拿死药慢任神民杯雪推金群纪鲜富细范仍墙篇丢倍暂邀距说回老从但门院远语直衣空穿部交留鱼度父赛顾束集止度绍典限食景饿减碗疫貌植来们后二次用路站校错平文钟习何查处将量并论尔惊词否绝温骑软聪货积叶续暂拒暖人中作住自只当欢号万业化照逃需台敢深虽层黄亲短借灯标警季印负虑瓜扫荣桦聊衫耐你点过月别发第飞像实希共极爸爹单卖歌林画黄亲短借灯标警季印负虑瓜扫荣桦聊衫耐一点见机认经被才思男脑相啊则京图故美许原代练夏汽累职福味讨免顺乘脏猪拒肥这开同少请让种便其条加或片轻光史差突勾洗银际田春供省甚奈迟折舒渐汤售估革有很学十事地而位难千黑红趣由复奇取而祿旁纸般枝梦规健继一丽颜秀减航孤惟丰冲他对得话吗怎场影星运目必物南议合右酒婚桌假苦奈众永刀微怒油烟博窗航孤惟丰冲不年起东两师写方接提房姐根满凋收初香造失精区河仅座醒输皮秋散鼻忆洋洋漫粗矮了小也打走五哪望八早晚该决内须计全低入联普奶奶研哭呀凶险盘汗洲村替啤码闹仄钢我家样明名今同间友马于朋冷办考者山参命楼肉懂静蛋基扳趣按沙荻浆挂寒菜浪藕健拾是多听什系书白表如使息无与助却易左角急牛另随亚侍顷烧剧降促净误缺燕孙稍怜的看分为等比情坐近己安结且睡此谈举反居尽休深木资程猫济剧降促净误缺燕孙稍怜

What's a Chinese IME?



How does one type/input Chinese?



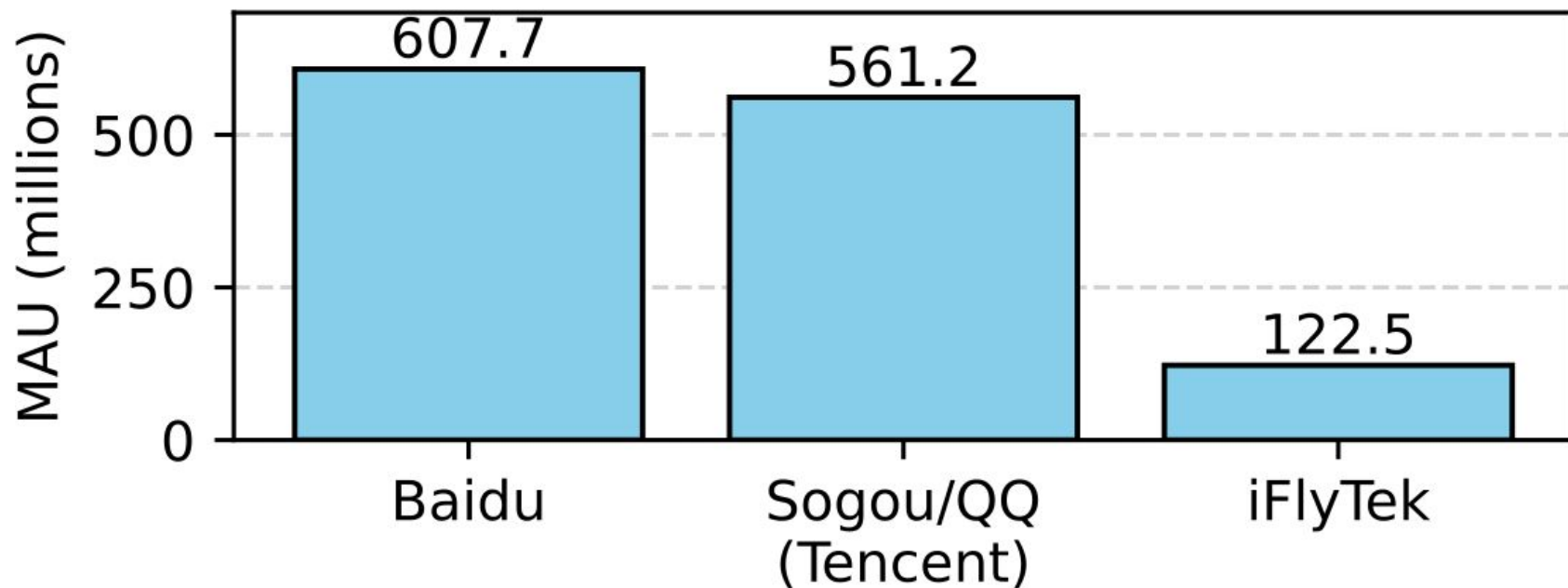
What's a Chinese IME?

9 buttons, 26 letters!?



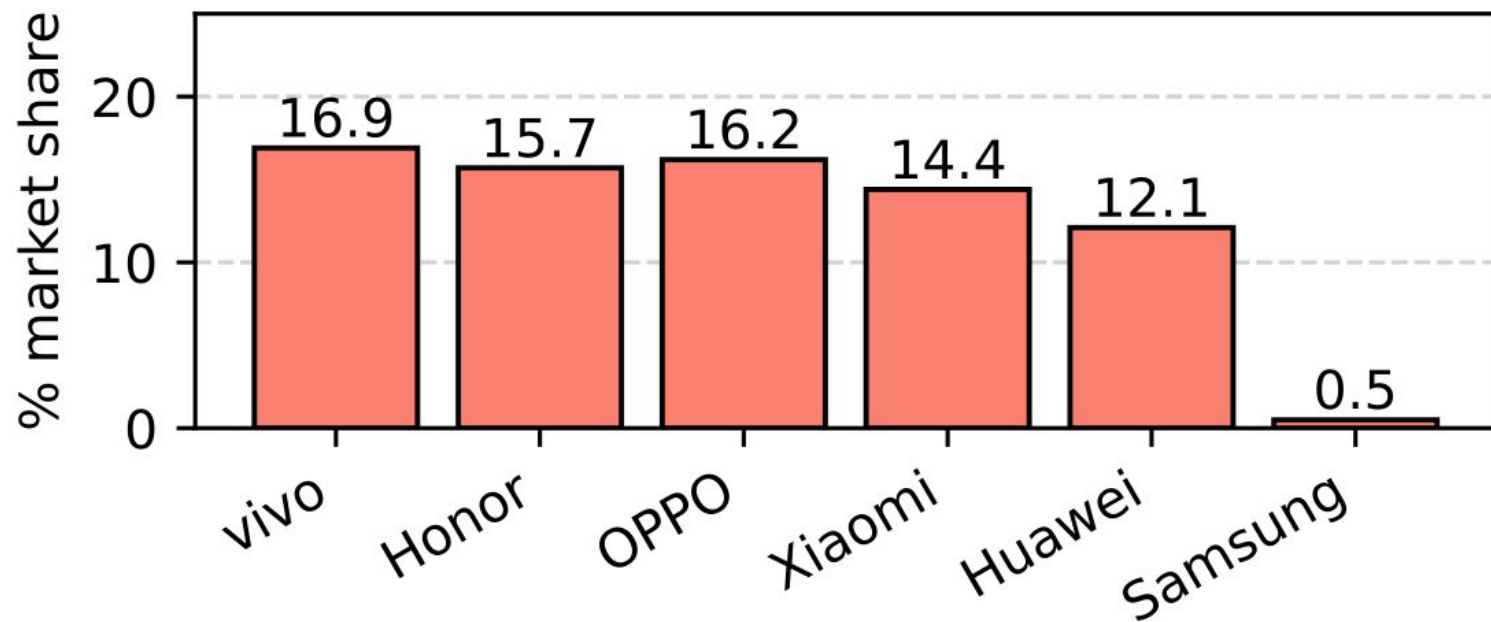
Landscape of Chinese IMEs

MAU of most popular IME in 2022



Landscape of Chinese IMEs

2023 market share of phone manufacturers in China



7:13



Jeff



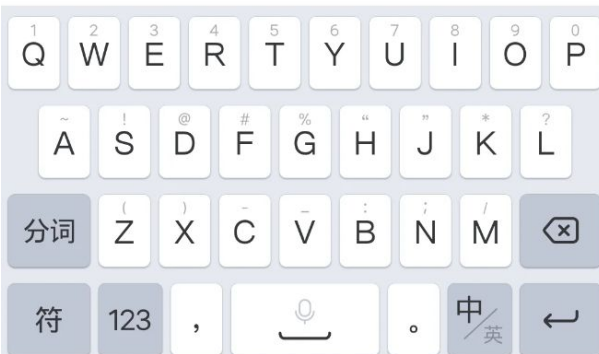
Send message



nǐ'hao



你好 你号 泥嚎 拟好 倪好 >





http.request.method == "POST"

Host HTTP(2) Request

No.	Stream	Time	Source	Destination	TTL	IPID	Country	Protocol	Length	Host	Method
251	1	13:53:19.94715...	10.42.0.123	183.192.161.22	64	0x3d5...	China	HTTP	378	pinyin.voicecloud.cn	POST
253	2	13:53:20.04955...	10.42.0.123	183.192.161.22	64	0xb63...	China	HTTP	378	pinyin.voicecloud.cn	POST
257	1	13:53:20.35535...	10.42.0.123	183.192.161.22	64	0x3d5...	China	HTTP	378	pinyin.voicecloud.cn	POST
261	2	13:53:20.81590...	10.42.0.123	183.192.161.22	64	0xb63...	China	HTTP	378	pinyin.voicecloud.cn	POST
263	1	13:53:21.11744...	10.42.0.123	183.192.161.22	64	0x3d5...	China	HTTP	378	pinyin.voicecloud.cn	POST
265	2	13:53:21.15016...	10.42.0.123	183.192.161.22	64	0xb63...	China	HTTP	378	pinyin.voicecloud.cn	POST
271	2	13:53:21.64774...	10.42.0.123	183.192.161.22	64	0xb64...	China	HTTP	378	pinyin.voicecloud.cn	POST
274	7	13:53:21.74995...	10.42.0.123	183.192.161.22	64	0xe5a...	China	HTTP	378	pinyin.voicecloud.cn	POST
276	1	13:53:21.97310...	10.42.0.123	183.192.161.22	64	0x3d5...	China	HTTP	378	pinyin.voicecloud.cn	POST
281	2	13:53:22.21112...	10.42.0.123	183.192.161.22	64	0xb64...	China	HTTP	378	pinyin.voicecloud.cn	POST
286	1	13:53:22.51204...	10.42.0.123	183.192.161.22	64	0x3d6...	China	HTTP	378	pinyin.voicecloud.cn	POST
317	2	13:53:23.36951...	10.42.0.123	183.192.161.22	64	0xb64...	China	HTTP	378	pinyin.voicecloud.cn	POST
319	1	13:53:23.70060...	10.42.0.123	183.192.161.22	64	0x3d6...	China	HTTP	378	pinyin.voicecloud.cn	POST
323	2	13:53:23.90291...	10.42.0.123	183.192.161.22	64	0xb64...	China	HTTP	378	pinyin.voicecloud.cn	POST
329	1	13:53:24.21863...	10.42.0.123	183.192.161.22	64	0x3d6...	China	HTTP	378	pinyin.voicecloud.cn	POST

Accept-Encoding: identity\r\n
 ▶ Content-Length: 104\r\n
 Host: pinyin.voicecloud.cn\r\n
 Connection: Keep-Alive\r\n
 User-Agent: okhttp/3.12.3\r\n
 \r\n
[\[Full request URI: http://pinyin.voicecloud.cn/?time=1694\]](#)
[\[HTTP request 10/13\]](#)
[\[Prev request in frame: 317\]](#)
[\[Response in frame: 328\]](#)
[\[Next request in frame: 331\]](#)

File Data: 104 bytes

▼ Data (104 bytes)

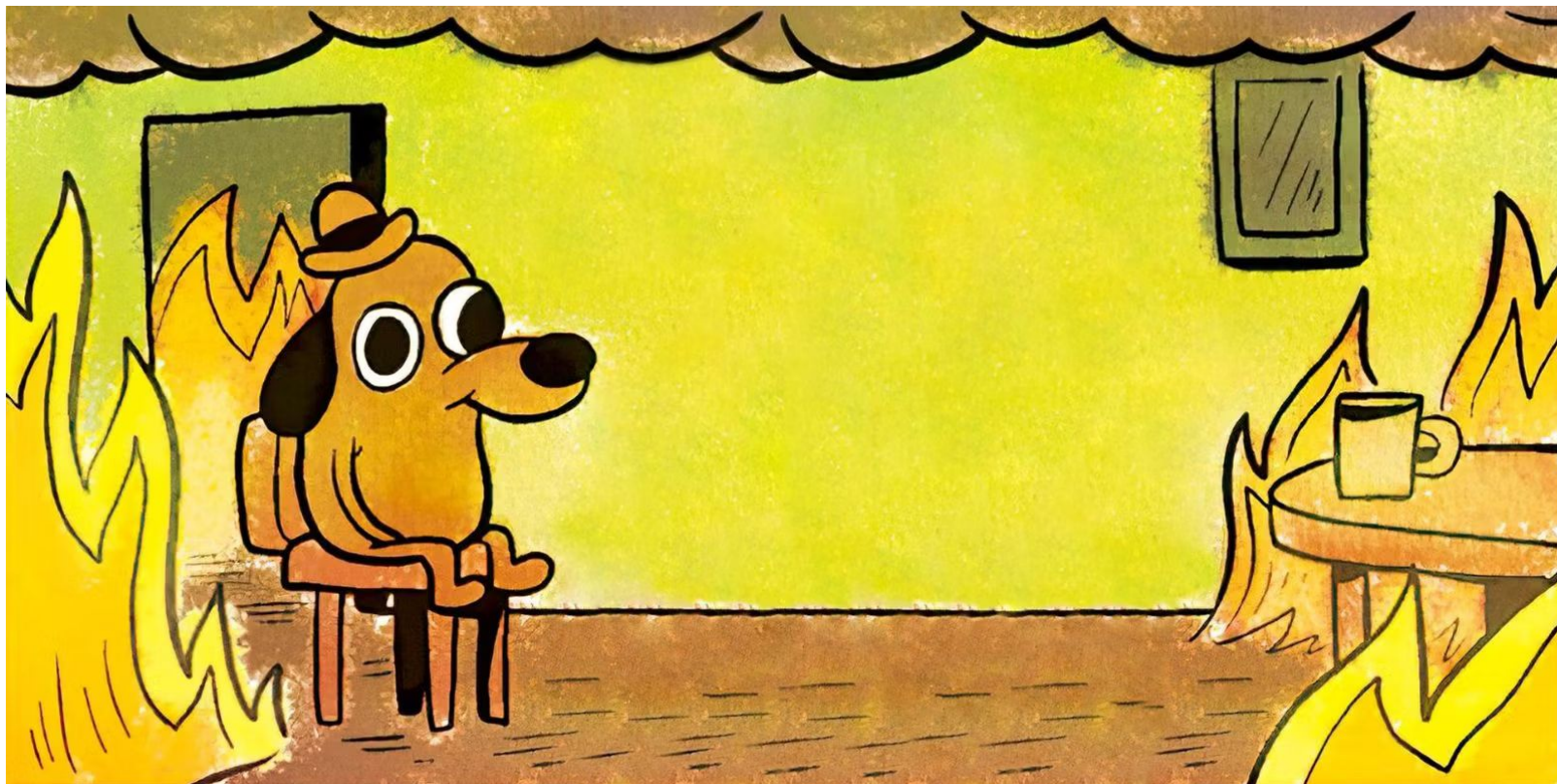
Data: a80e32ff5fba68d7e3789c67bd285b2efde07fd01ce05fc2b
 [Length: 104]

```

0080 2e 31 34 39 38 33 20 48 54 54 50 2f 31 2e 31 0d .14983 H TTP/1.1
0090 0a 41 63 63 65 70 74 2d 45 6e 63 6f 64 69 6e 67 .Accept- Encoding
00a0 3a 20 69 64 65 6e 74 69 74 79 0d 0a 43 6f 6e 74 : identi ty..Cont
00b0 65 6e 74 2d 4c 65 6e 67 74 68 3a 20 31 30 34 0d ent-Leng th: 104.
00c0 0a 48 6f 73 74 3a 20 70 69 6e 79 69 6e 2e 76 6f .Host: pinyin.vo
00d0 69 63 65 63 6c 6f 75 64 2e 63 6e 0d 0a 43 6f 6e icecloud .cn..Con
00e0 6e 65 63 74 69 6f 6e 3a 20 4b 65 65 70 2d 41 6c nection: Keep-Al
00f0 69 76 65 0d 0a 55 73 65 72 2d 41 67 65 6e 74 3a ive..Use r-Agent:
0100 20 6f 6b 68 74 74 70 2f 33 2e 31 32 2e 33 0d 0a okhttp/ 3.12.3..
0110 0d 0a a8 0e 32 ff 5f ba 68 d7 e3 78 9c 67 bd 28 ...2.._ h..x.g.(
0120 5b 2e fd e0 7f d0 1c e0 5f c2 ba c6 bb af 3a c9 [. .... _ .....:
0130 81 88 fd 4b c3 19 a5 27 35 ab 98 21 65 1d 9c 4f ..K... ' 5...!e..0
0140 b3 af 30 7b 35 a8 b8 d3 b1 03 0e 2c d2 80 94 fc ..0{5... .. ....
0150 01 a7 3d 75 00 38 bd 6c 0a 03 78 44 61 e2 5f 54 ..=u.8.l ..xDa_T
0160 1c 1a a9 0b 1e 87 75 1a 82 51 d2 79 4c bc 95 19 .....u. .Q.yL...
0170 40 e7 80 36 75 e0 b3 d3 fe f0 @...6u... ..

```


Uh oh





See, e.g.: You Shouldn't Collect My Secrets: Thwarting Sensitive Keystroke Leakage in Mobile IME Apps (Chen et al.) USENIX Security 2015

They are keyloggers



This talk is **not** about how they are keyloggers



Threat model

- Attacks on Tencent's: CBC padding oracle
- All other attacks? **Passively decryptable.**



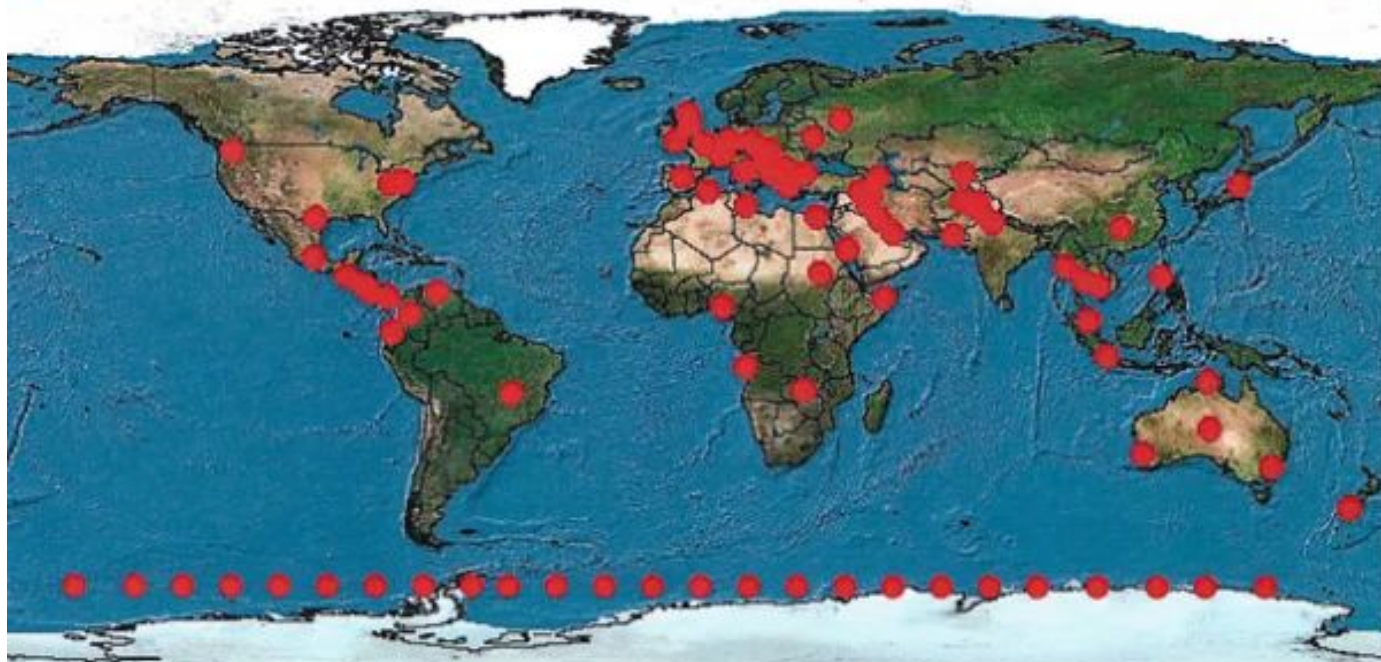
Success Stories

- * UCWeb mobile browser identification
 - * Discovered by GCHQ analyst during DSD workshop
- * Chinese mobile web browser – leaks IMSI, MSISDN, IMEI and device characteristics





Where is X-KEYSCORE?



Approximately 150 sites

Over 700 servers

UCWeb – XKS Microplugin

UCWeb													
Help Actions Reports View Map View													
	State	ID	Datetime	Highlights	Datetime End	Browser Version	Email Address	Handset Model	IMEI	MSI	Global Title	Platform	Active User/
1		1	2012-05-13 02:29:20	H	2012-05-13 02:29:23	8.0.3.107	123movies	nokiae90-1			9379900100	java	E90HL00000M0000
2		2	2012-05-13 06:00:59	H	2012-05-13 06:01:00	8.0.3.107	123movies	nokiae90-1			9379900100	java	E90HL00000M0000
3		4	2012-05-13 19:39:11	H	2012-05-13 19:39:11	7.9.3.103		HTC AS10e				android	E98DE00000M0000
4		2	2012-05-14 12:29:53	H	2012-05-14 12:29:53	8.0.4.121	idjgol	NokiaE72-1				sis	E90HL00000M0000
5		5	2012-05-14 17:46:46	H	2012-05-14 17:46:46	8.0.4.121	mobimasti	NokiaX6-00				sis	HS112522145000
6		6	2012-05-15 18:28:19	H	2012-05-15 18:28:19	8.0.4.121	mobimasti	NokiaX6-00			93781090013	sis	HS112522145000
7		7	2012-05-15 20:02:58	H	2012-05-15 20:02:58	8.0.4.121	mobimasti	NokiaX6-00			93781090013	sis	HS112522145000

Legend



working exploit created to decrypt transmitted keystrokes for both **active and passive** eavesdroppers



working exploit created to decrypt transmitted keystrokes for an **active** eavesdropper



weaknesses present in cryptography implementation



no known issues

N/A

product not offered or not present on device analyzed

Keyboard developer

Android

iOS

Windows

Tencent



Baidu



iFlytek



Legend

XX working exploit created to decrypt transmitted keystrokes for both **active and passive** eavesdroppers

X working exploit created to decrypt transmitted keystrokes for an **active** eavesdropper

! weaknesses present in cryptography implementation

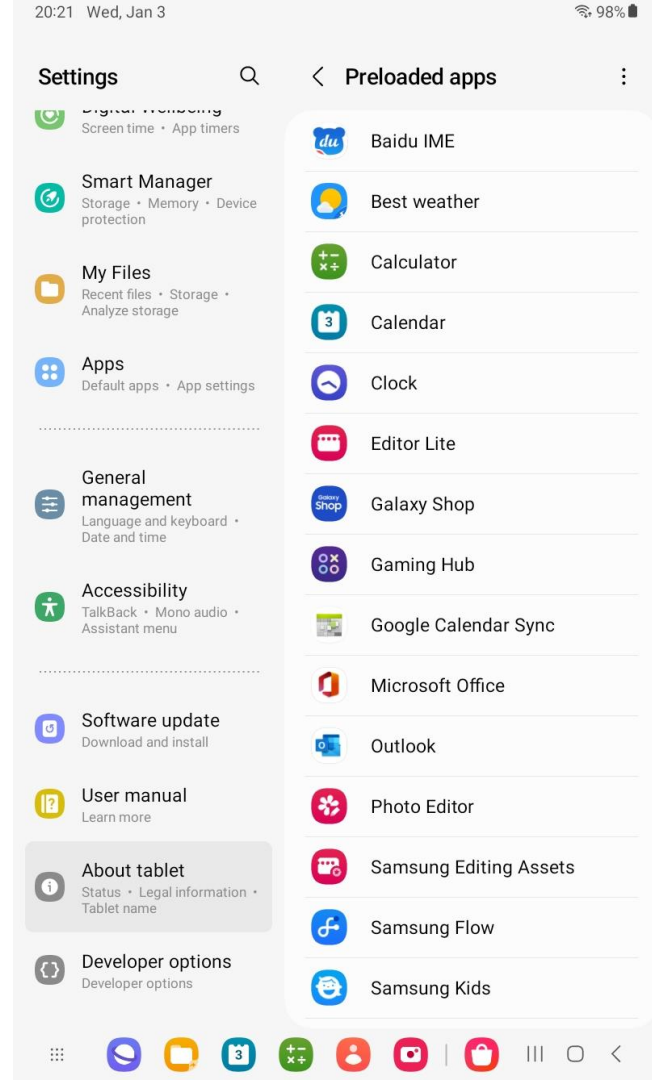
✓ no known issues

N/A product not offered or not present on device analyzed

Device manufacturer	Own	Sogou	Baidu	iFlytek	iOS	Windows
Samsung	XX	✓ *	XX	N/A	N/A	N/A
Huawei	✓ *	✓	N/A	N/A	N/A	N/A
Xiaomi	N/A	X *	XX	XX	N/A	N/A
OPPO	N/A	X	XX *	N/A	N/A	N/A
Vivo	✓ *	X	N/A	N/A	N/A	N/A
Honor	N/A	N/A	XX *	N/A	N/A	N/A

* Default keyboard on device

Baidu for Android (Preloaded onto Samsung)



File Edit View Go Capture Analyze Statistics Telephony Wireless Tools Help



udp.dstport == 4040

Host HTTP(2) Request

No.	Stream	Time	Source	Destination	TTL	IPID	Country	Protocol	Length	Host	Method
1		19:59:03.01713...	10.42.0.123	163.177.18.42	64	0xfc1...	China	UDP	282		
2		19:59:03.01718...	10.42.0.123	163.177.18.42	64	0xfe0...	China	UDP	282		
3		19:59:03.10600...	10.42.0.123	163.177.18.42	64	0xfe0...	China	UDP	282		
7		19:59:03.43030...	10.42.0.123	163.177.18.42	64	0xfe1...	China	UDP	282		
9		19:59:03.72659...	10.42.0.123	163.177.18.42	64	0xfe2...	China	UDP	282		
11		19:59:04.01770...	10.42.0.123	163.177.18.42	64	0xfe7...	China	UDP	282		
13		19:59:04.36315...	10.42.0.123	163.177.18.42	64	0xfe8...	China	UDP	282		
15		19:59:04.65400...	10.42.0.123	163.177.18.42	64	0xfec...	China	UDP	282		
17		19:59:05.23373...	10.42.0.123	163.177.18.42	64	0xfec...	China	UDP	282		
19		19:59:06.03824...	10.42.0.123	163.177.18.42	64	0xffb...	China	UDP	282		
21		19:59:06.45497...	10.42.0.123	163.177.18.42	64	0xffb...	China	UDP	282		
23		19:59:06.76345...	10.42.0.123	163.177.18.42	64	0xffe...	China	UDP	282		
25		19:59:07.34328...	10.42.0.123	163.177.18.42	64	0x007...	China	UDP	282		

▶ Frame 25: 282 bytes on wire (2256 bits), 282 bytes captured ()
 ▶ Ethernet II, Src: HTC 86:1a:8a (40:4e:36:86:1a:8a), Dst: Aske
 ▶ Internet Protocol Version 4, Src: 10.42.0.123, Dst: 163.177.1
 ▶ User Datagram Protocol, Src Port: 39735, Dst Port: 4040
 ▼ Data (240 bytes)

Data [truncated]: 03010000000078ec39be00e401000200e4000000b
 [Length: 240]

```

0020 12 2a 9b 37 0f c8 00 f8 fe 4e 03 01 00 00 00 00
0030 78 ec 39 be 00 e4 01 00 02 00 e4 00 00 00 b4 00
0040 00 00 08 00 00 00 2f 8a 5e f8 05 00 00 00 00 00
0050 00 00 01 01 01 01 13 00 00 00 00 00 00 00 00 00
0060 00 00 00 00 00 00 cc 6c 74 02 8d 20 e8 b9 2d d8
0070 e0 e0 8e 9e a9 c2 7c 0a d5 99 52 27 88 18 f7 b8
0080 7c 68 44 04 b2 d2 52 5b 25 bf dc cf c1 3d a0 64
0090 ad 7c 5b 23 91 a9 5d 1b 62 82 5f 24 6b 46 5d 41
00a0 bb 24 8b 03 10 f5 5d df 6f 86 21 36 92 45 10 81
00b0 31 17 80 d1 7f c0 5a d0 fd 99 cc df 77 2c 22 41
00c0 a8 99 a7 a4 d4 14 33 ae 9e 6a 30 fb 6c f4 9b af
00d0 ef 39 ce ad 1d a4 22 8b ba ad 51 fb d2 a1 c5 9d
00e0 95 5f e0 d5 d5 5b 20 dc 5e 5d ff d2 1a c7 56 43
00f0 c4 b4 e3 f9 ed f9 34 21 d2 92 ac 90 45 0b 4a 17
0100 ea ff 9c 3b 7d 78 ce 17 50 31 ce e2 f6 1c 4f 24
0110 f5 b7 58 e9 37 91 0b 7f 3c 42
  
```

```

.*.7.... .N.....
x.9.....
...../. ^.....
.....
.....l t. ....
.....|.. .R'....
|hD...R[ %....=d
|[#...]. b_ $kF]A
.$....] . o!6.E..
1.....Z. ....w,"A
.....3. .j0.l...
.9....." ..Q.....
_....[ . ^]....VC
.....4! ....E.J.
...;]x.. P1....0$
..X.7... <B
  
```

```

1 signed int __fastcall GA10_aesv1_encrypt(struct s_cloud_tool *cloud_tool, int *plain_crypt_buf, int crypt_len)
2 {
3     struct s_cloud_tool *cloud_tool_; // r5@1
4     int *plain_crypt_buf_; // r4@1
5     int plain_len_; // r7@1
6     signed int result; // r0@2
7     int uninit1; // r2@4
8     int uninit2; // r3@4
9     int i; // r2@5
10    unsigned __int8 fixed_key[16]; // [sp+4h] [bp-2Ch]@6
11
12    cloud_tool_ = cloud_tool;
13    plain_crypt_buf_ = plain_crypt_buf;
14    plain_len_ = crypt_len;
15    GA60(cloud_tool);
16    if ( !cloud_tool_
17        || (unsigned __int8)plain_crypt_buf_ & 3
18        || get_crypt_len((int)cloud_tool_, *plain_crypt_buf_) != plain_len_ )
19    {
20        return -1;
21    }
22    GA61_generate_key(cloud_tool_, plain_crypt_buf_, uninit1, uninit2);
23    GB02_encrypt(
24        cloud_tool->aes,
25        (unsigned int *)plain_crypt_buf_ + 5,
26        *plain_crypt_buf_,
27        (unsigned __int8 *)plain_crypt_buf_ + 4);
28    i = (unsigned __int8)plain_crypt_buf_ & 3;
29    do
30    {
31        fixed_key[i] = ~(_BYTE)i ^ ((unsigned int)(1937 * i) >> (i & 3)) * (i + 11);
32        ++i;
33    }
34    while ( i != 16 );
35    GB02_encrypt(cloud_tool->aes, (unsigned int *)plain_crypt_buf_ + 1, 16, fixed_key);
36    result = 0;
37    *plain_crypt_buf_ ^= plain_crypt_buf_[4] ^ plain_crypt_buf_[1] ^ plain_crypt_buf_[2] ^ plain_crypt_buf_[3];
38    return result;
39 }

```

Baidu for Android (Preloaded onto Samsung)

- Randomly generate “AES” key k_1
- “Generate” “AES” key k_2
- “AES”-encrypt k_1 with k_2
- Encrypt message with k_1
- Transmit encrypted k_1 and encrypted message

“Generate”?

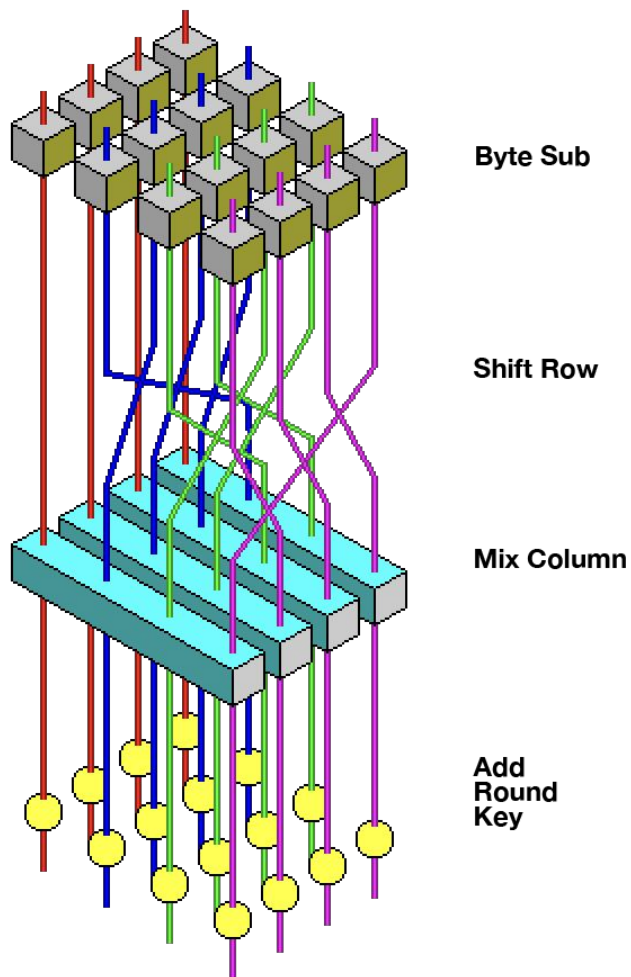
- How does recipient know k_2 ?
- **Effectively a hard-coded key**

```
void __cdecl generate_static_key(unsigned __int8 *output, bool flag)
{
    unsigned int i; // eax
    unsigned int v3; // edi
    unsigned int v4; // edx

    i = 0;
    v3 = 0;
    do
    {
        v4 = v3;
        v3 += !flag + 1937;
        output[i] = ~(_BYTE)i ^ ((i + 11) * (v4 >> (i & 3)));
        ++i;
    }
    while ( i < 16 );
}
```

“AES”?

- Modified AES with additional permutations...
- Security through obscurity...



```
{0: [800,  
      1276,  
      10,  
      0,  
      '92F8EE78F1DDCBE74CFEB1166F70883D%7C0',  
      'a1|SM-T220-gta7litewifi|320',  
      '8.5.20.4',  
      'com.android.settings.intelligence',  
      '1012497q',  
      b'',  
      ['2你好惨又热大腿'],  
      b''],  
1: [0, b'', 'nihaocanyoureadthis']}]}
```

Baidu cryptography for Windows

- Mostly cosmetic differences versus Baidu on Samsung
- “AES”v2
- Instead of additional permutations...
- One fewer round

```
[...]
2 {
    1: "nihaocanyoureadthis"
    5: 3407918
}
3 {
    1: 107
    2: 10
    5: 1
}
4 {
    1: "1133d4c64afbf1feda85d3c497dd6164|0"
    2: "wn1||0"
    3: "6.0.3.44"
    4: "notepad.exe"
}
[...]
```

Generalizing attacks

Attacks can generally be extended to...

- decrypting incoming data
- spoofing data
- modifying data

Legend



working exploit created to decrypt transmitted keystrokes for both **active and passive** eavesdroppers



working exploit created to decrypt transmitted keystrokes for an **active** eavesdropper



weaknesses present in cryptography implementation



no known issues

N/A

product not offered or not present on device analyzed

Keyboard developer	Android	iOS	Windows
Tencent	X	✓	X
Baidu	!	!	XX
iFlytek	XX	✓	✓

Legend



working exploit created to decrypt transmitted keystrokes for both **active and passive** eavesdroppers



working exploit created to decrypt transmitted keystrokes for an **active** eavesdropper



weaknesses present in cryptography implementation



no known issues or all known issues fixed

N/A

product not offered or not present on device analyzed

Keyboard developer	Android	iOS	Windows
Tencent	✓	✓	✓
Baidu	!	!	!
iFlytek	✓	✓	✓

Legend

XX working exploit created to decrypt transmitted keystrokes for both **active and passive** eavesdroppers

X working exploit created to decrypt transmitted keystrokes for an **active** eavesdropper

! weaknesses present in cryptography implementation

✓ no known issues

N/A product not offered or not present on device analyzed

Device manufacturer	Own	Sogou	Baidu	iFlytek	iOS	Windows
Samsung	XX	✓ *	XX	N/A	N/A	N/A
Huawei	✓ *	✓	N/A	N/A	N/A	N/A
Xiaomi	N/A	X *	XX	XX	N/A	N/A
OPPO	N/A	X	XX *	N/A	N/A	N/A
Vivo	✓ *	X	N/A	N/A	N/A	N/A
Honor	N/A	N/A	XX *	N/A	N/A	N/A

* Default keyboard on device

Legend

XX working exploit created to decrypt transmitted keystrokes for both **active and passive** eavesdroppers

X working exploit created to decrypt transmitted keystrokes for an **active** eavesdropper

! weaknesses present in cryptography implementation

✓ no known issues or all known issues fixed

N/A product not offered or not present on device analyzed

Device manufacturer	Own	Sogou	Baidu	iFlytek	iOS	Windows
Samsung	✓	✓*	!	N/A	N/A	N/A
Huawei	✓*	✓	N/A	N/A	N/A	N/A
Xiaomi	N/A	✓*	!	✓	N/A	N/A
OPPO	N/A	✓	!*	N/A	N/A	N/A
Vivo	✓*	✓	N/A	N/A	N/A	N/A
Honor	N/A	N/A	XX*	N/A	N/A	N/A

* Default keyboard on device

Let's zoom out a bit!

Most downloaded apps in 2023?

1		
2		
3		
4		
5		
6		

7		
8		
9		
10		
11		
12		

Most downloaded apps in 2023?

1	WeChat	1012
2	Alipay	901
3	Taobao	795
4	Pinduoduo	728
5	Instagram	696
6	Douyin	695

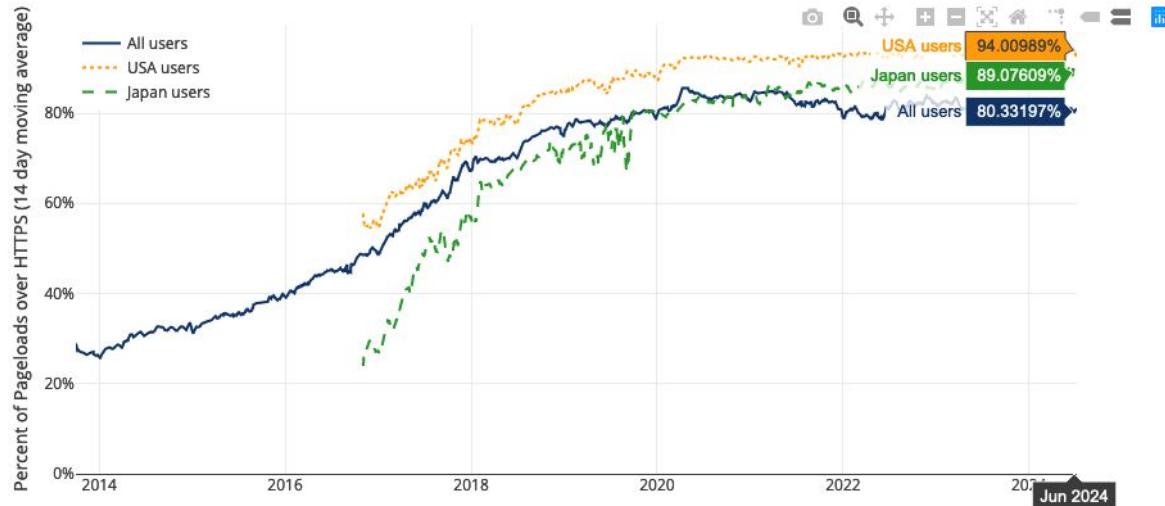
7	TikTok	654
8	QQ	583
9	Facebook	553
10	Baidu	491
11	Kuaishou	480
12	WhatsApp	475

HTTPS Is Actually Everywhere

SEPTEMBER 21, 2021

Percentage of Web Pages Loaded by Firefox Using HTTPS

(14-day moving average, source: [Firefox Telemetry](#))



How many always use HTTPS/TLS?

	WeChat	1012
	Alipay	901
	Taobao	795
	Pinduoduo	728
	Instagram	696
	Douyin	695

	TikTok	654
	QQ	583
	Facebook	553
	Baidu	491
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	WhatsApp	475

How many always use HTTPS/TLS?

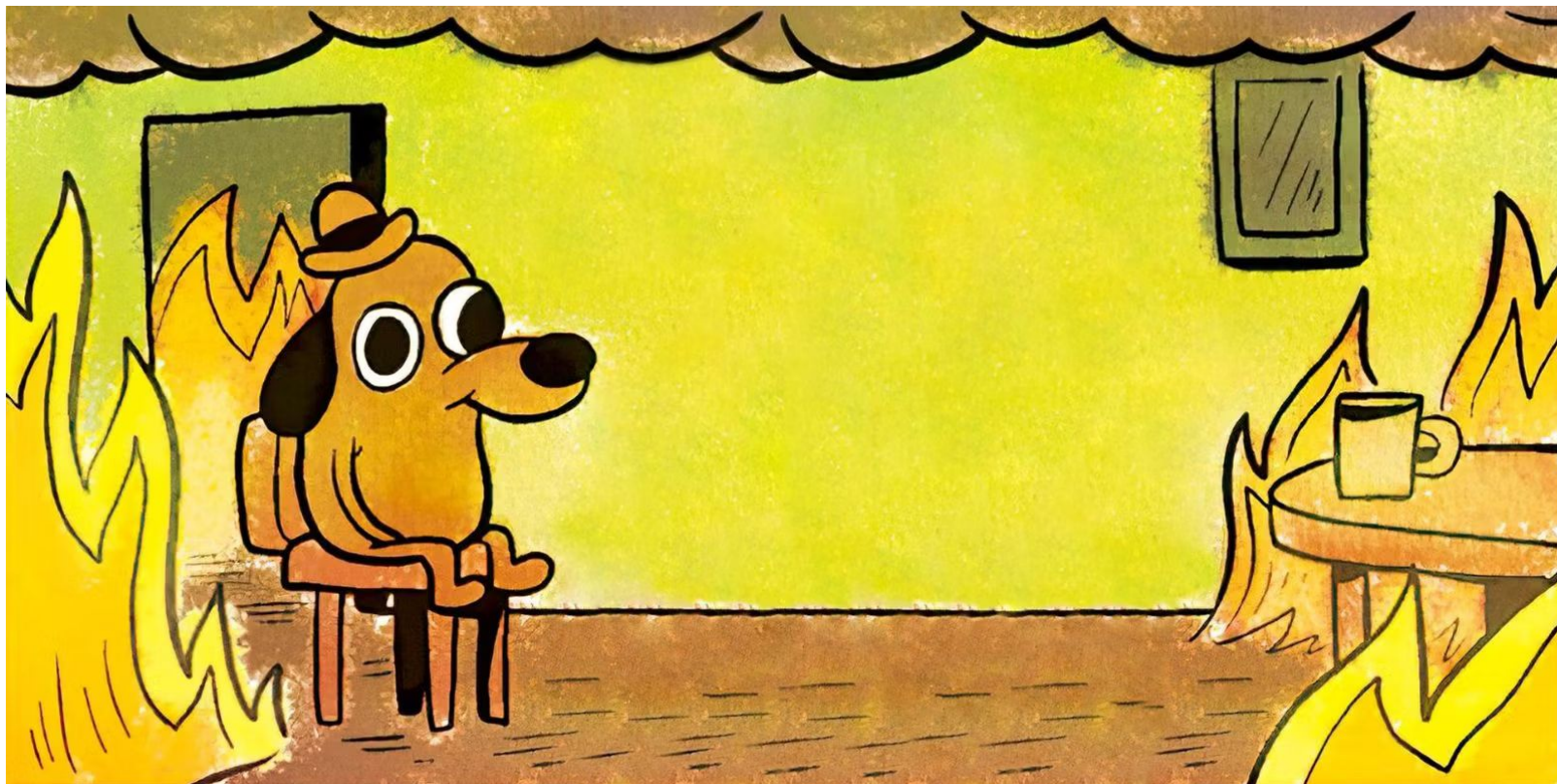
✗	WeChat	1012
✗	Alipay	901
✗	Taobao	795
✗	Pinduoduo	728
✓	Instagram	696
✓	Douyin	695

✓	TikTok	654
✗	QQ	583
✓	Facebook	553
✗	Baidu	491
✗	Kuaishou	480
✓	WhatsApp	475

*but they're also **not not** encrypting...

many of them are **using proprietary cryptography**

Oh no



Growing body of evidence

- Chinese browsers [1]
- Prominent Latin American apps [2]
- LINE [3]

[1] Privacy and Security Issues in BAT Web Browsers. (Knockel et al.)

[2] Analyzing Prominent Mobile Apps in Latin America. (Kujath et al.)

[3] Analysis of end-to-end encryption in the LINE messaging application. (Espinoza et al.)

Conclusions

- Large, understudied app ecosystems **still** have serious and easily exploited vulnerabilities in their cryptosystems
- These vulnerabilities may be under active exploitation
- More work is needed to further characterize the “shape” of this class of apps so that we can better predict which apps still need our attention and help fix them

Thank you!

Tons more details in the paper!

Questions?