



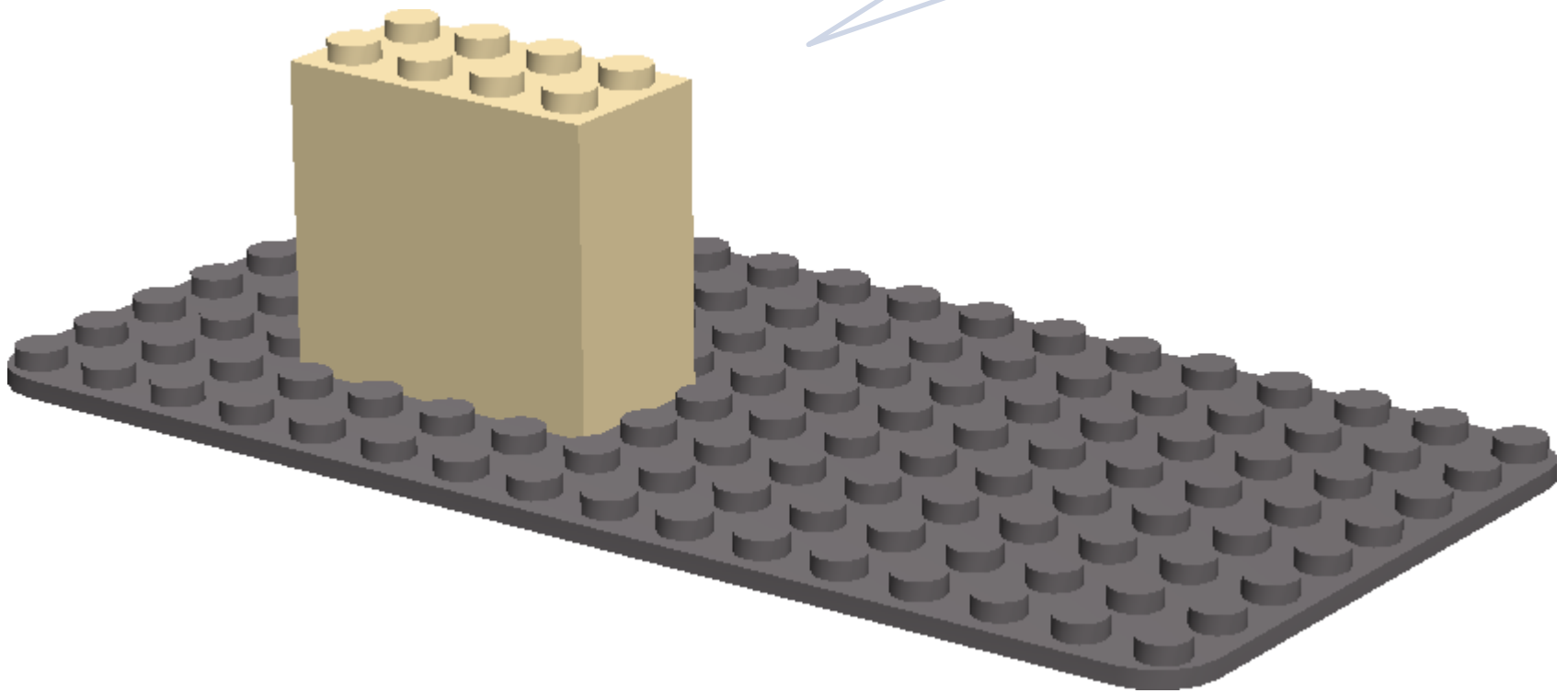
Surf, shop, bank,
browse, download
music and chat safely
online with AVG

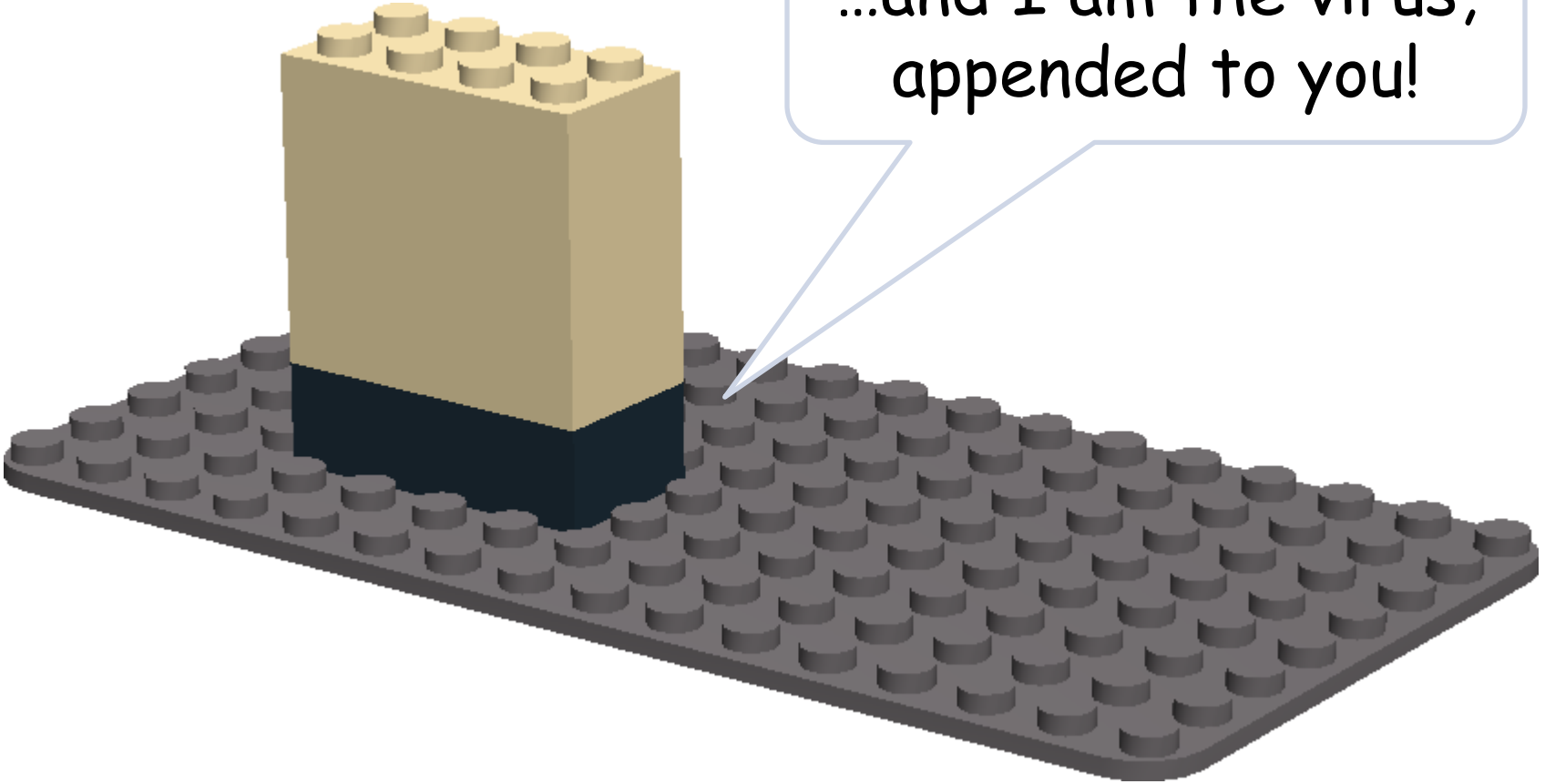
ENTROPY

the new vision

Zdeněk Breitenbacher
zdenek.breitenbacher@avg.com

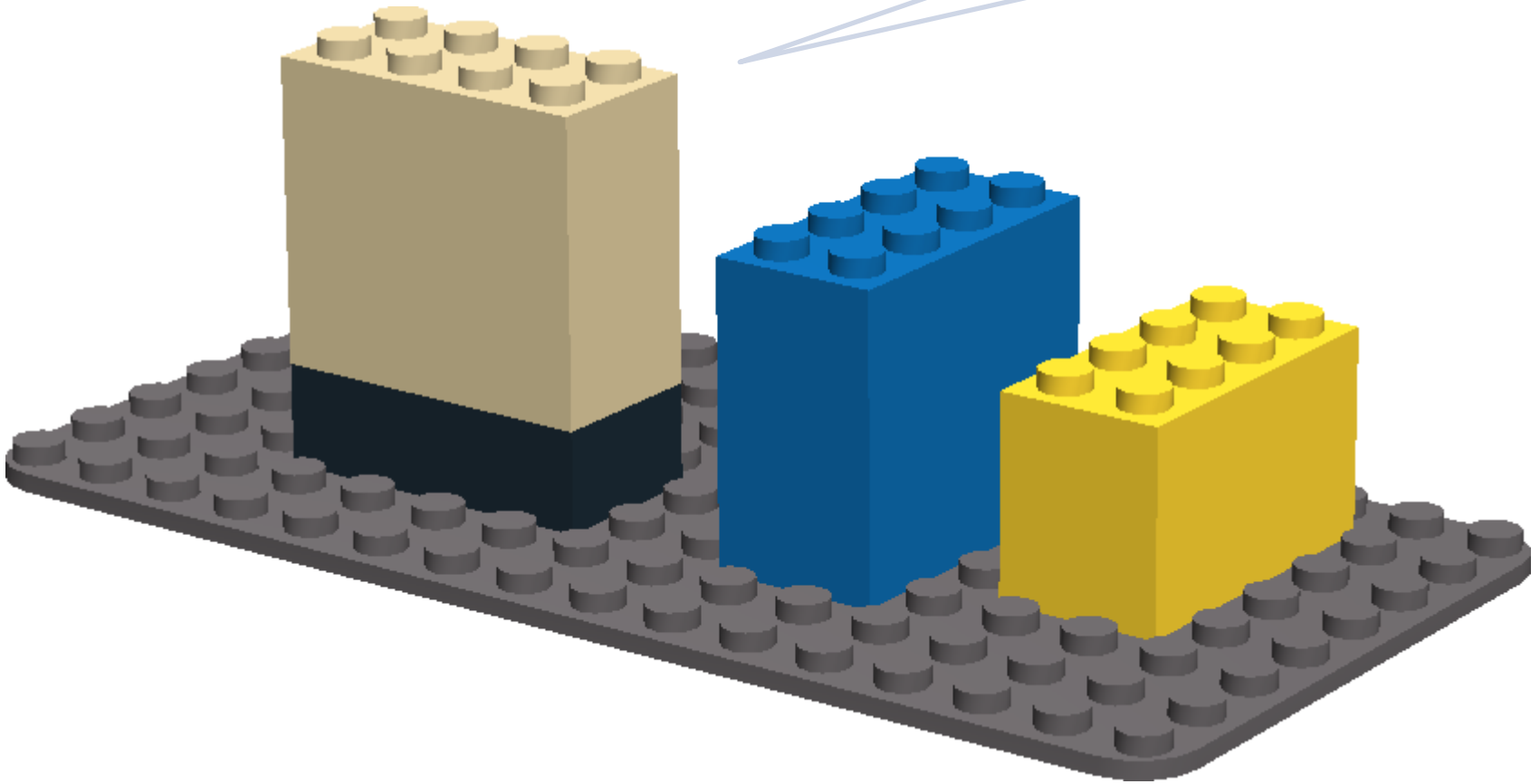
Hello,
I am a clean file!



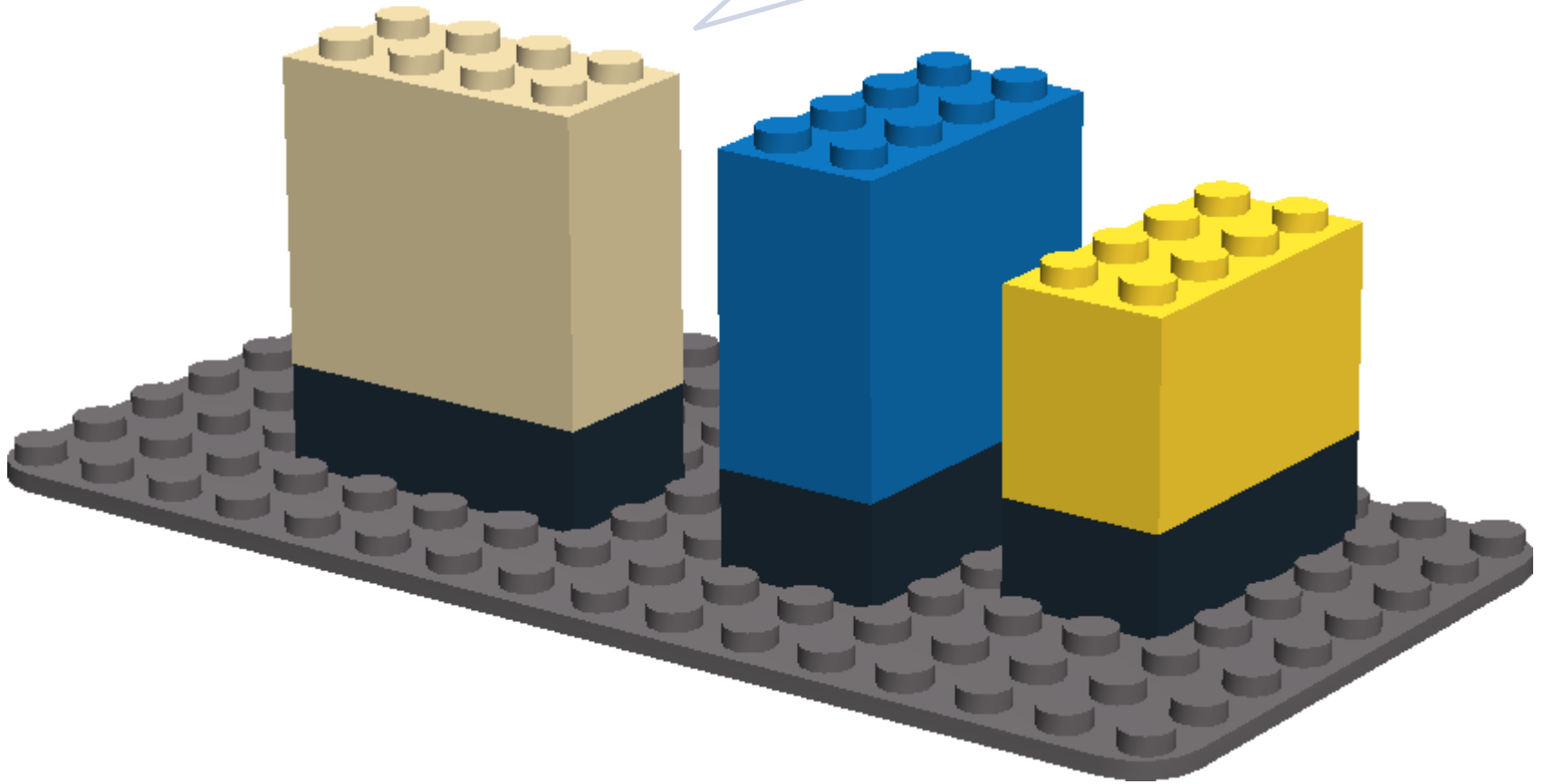


...and I am the virus,
appended to you!

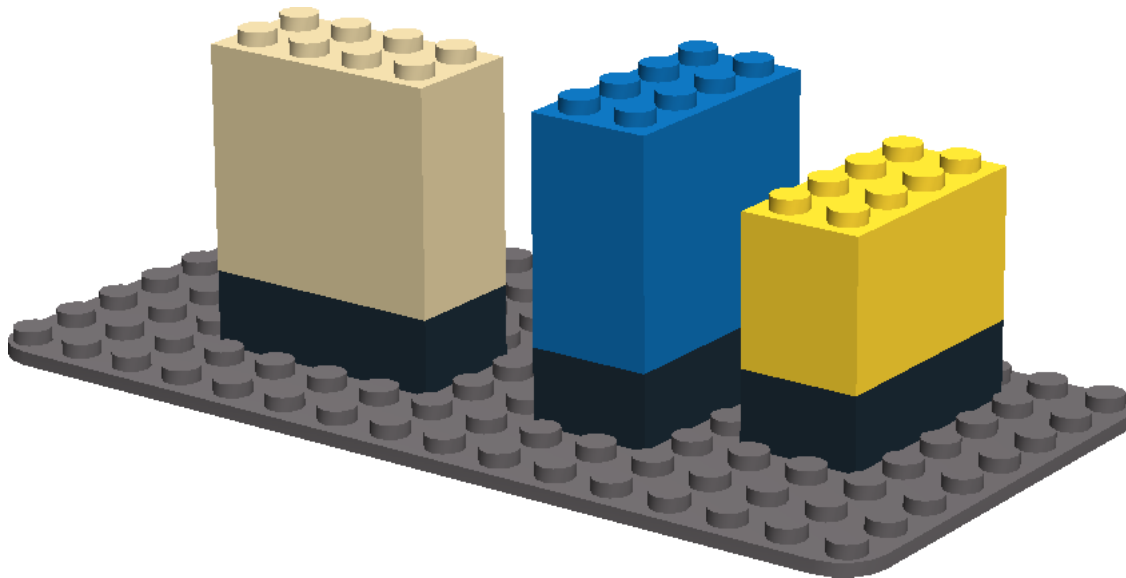
...and here are
my colleagues!



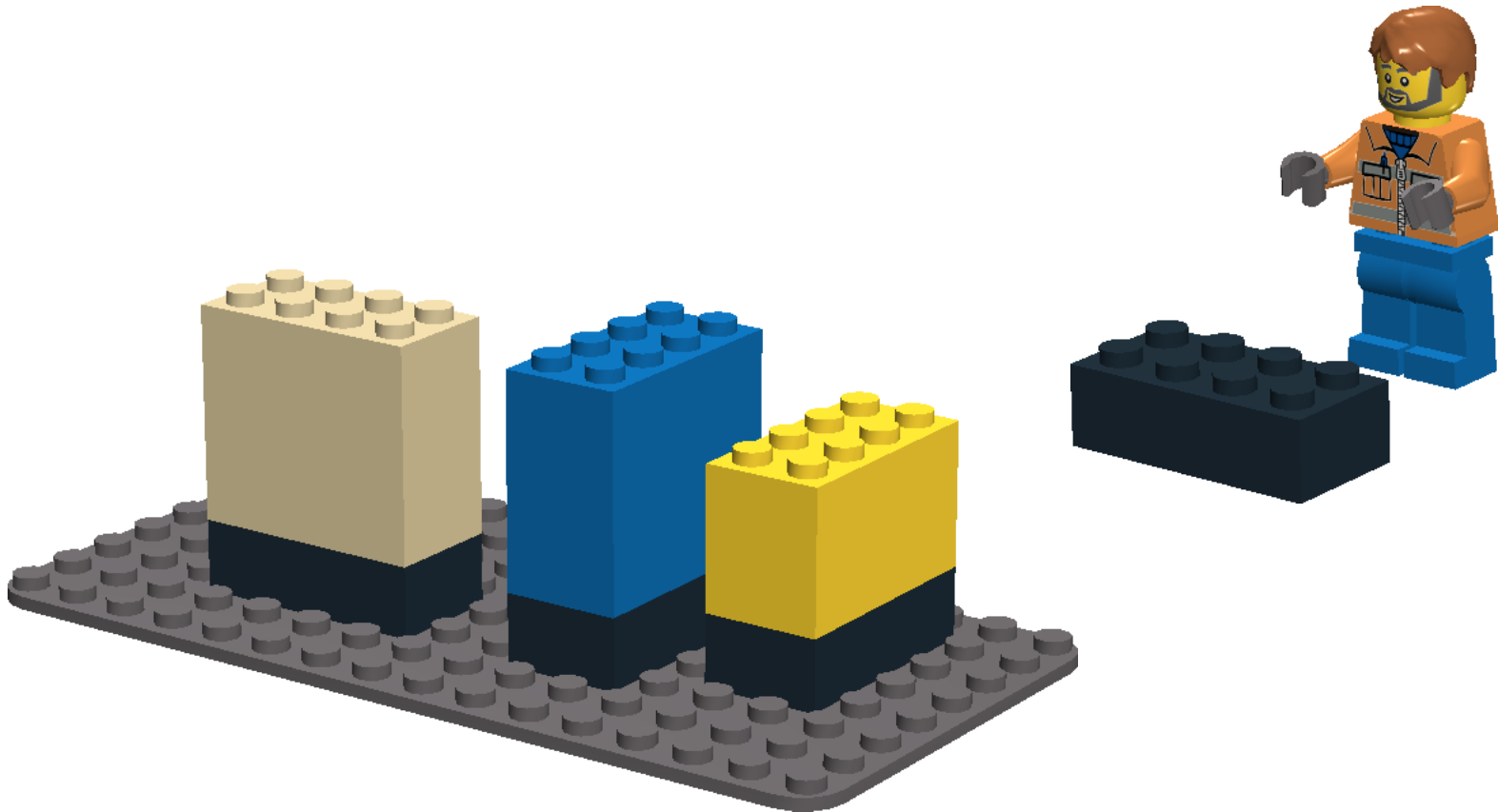
Oh no! They are
infected too!



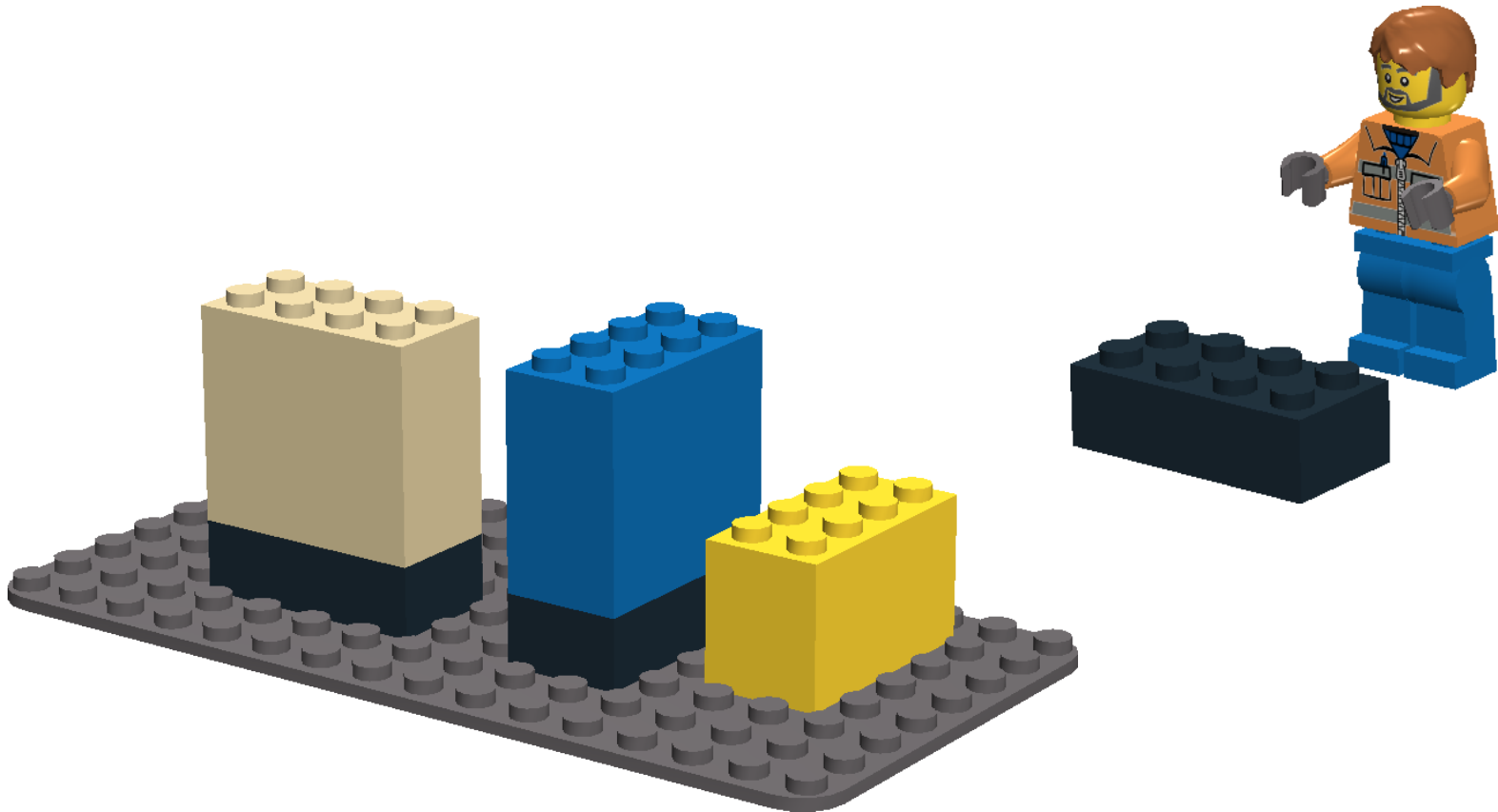
Fortunately, here is Joe,
the Virus Fighter...



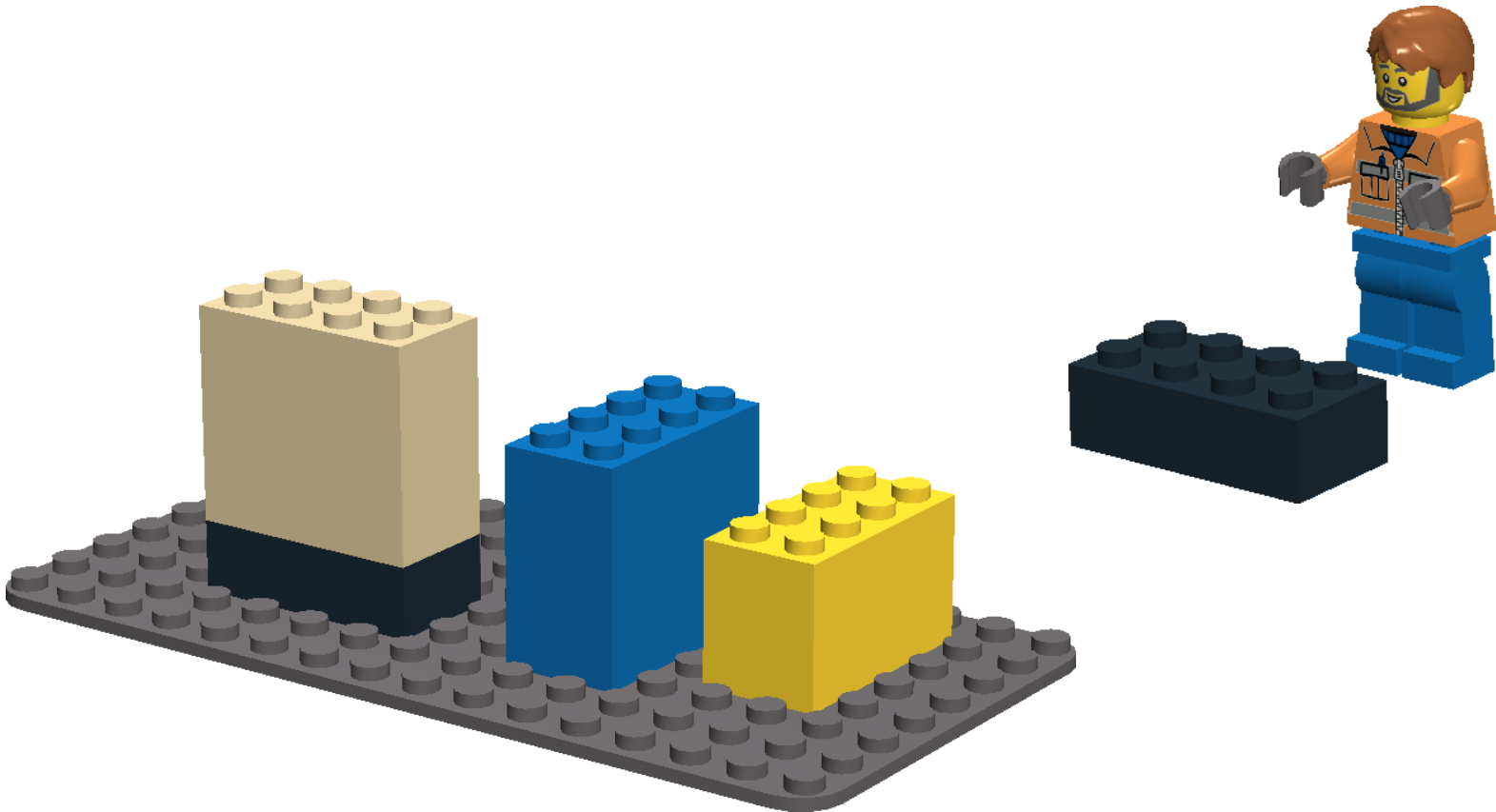
...and he has the Definition!



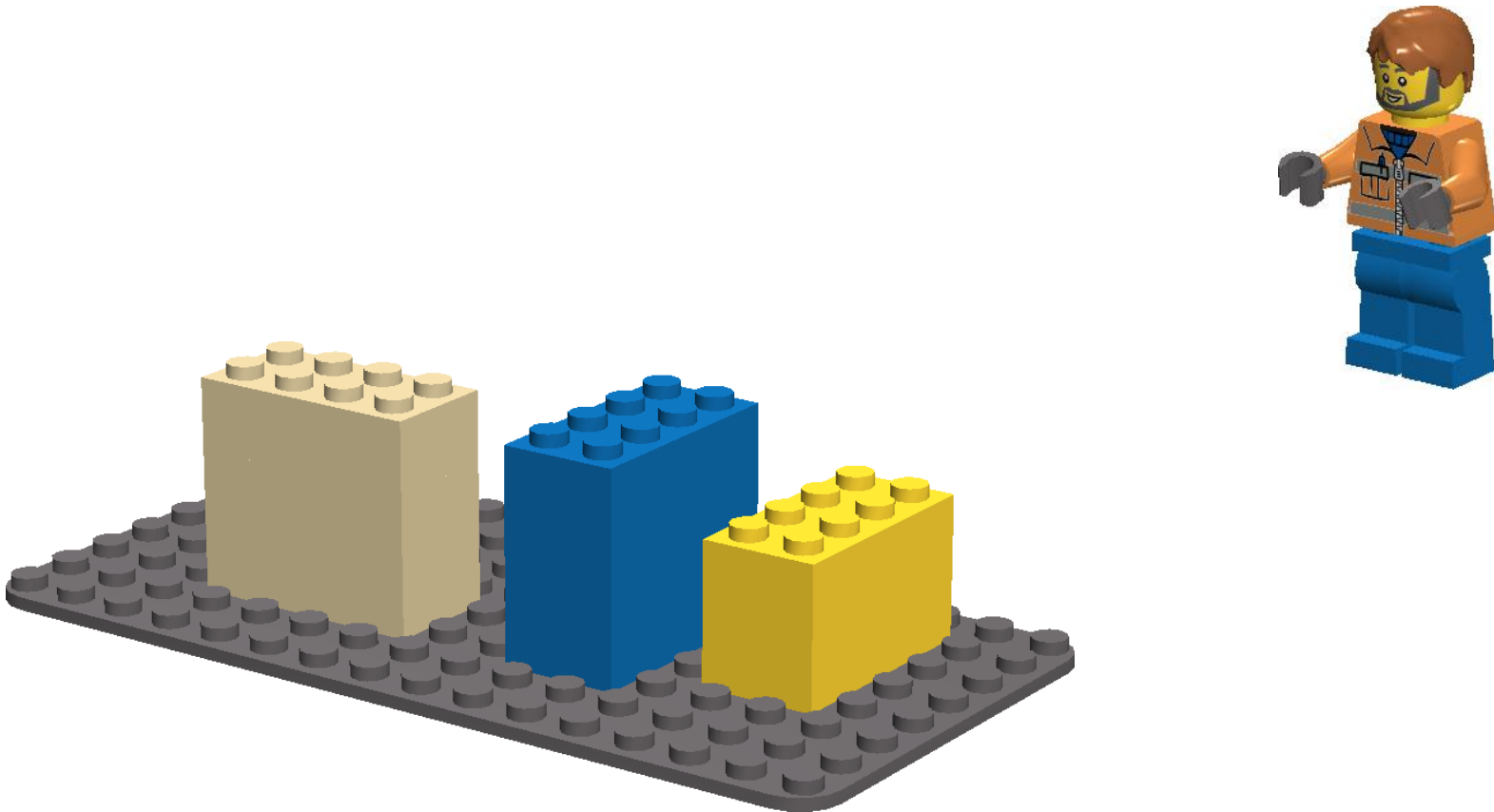
So he has done...



So he has done with the virus...

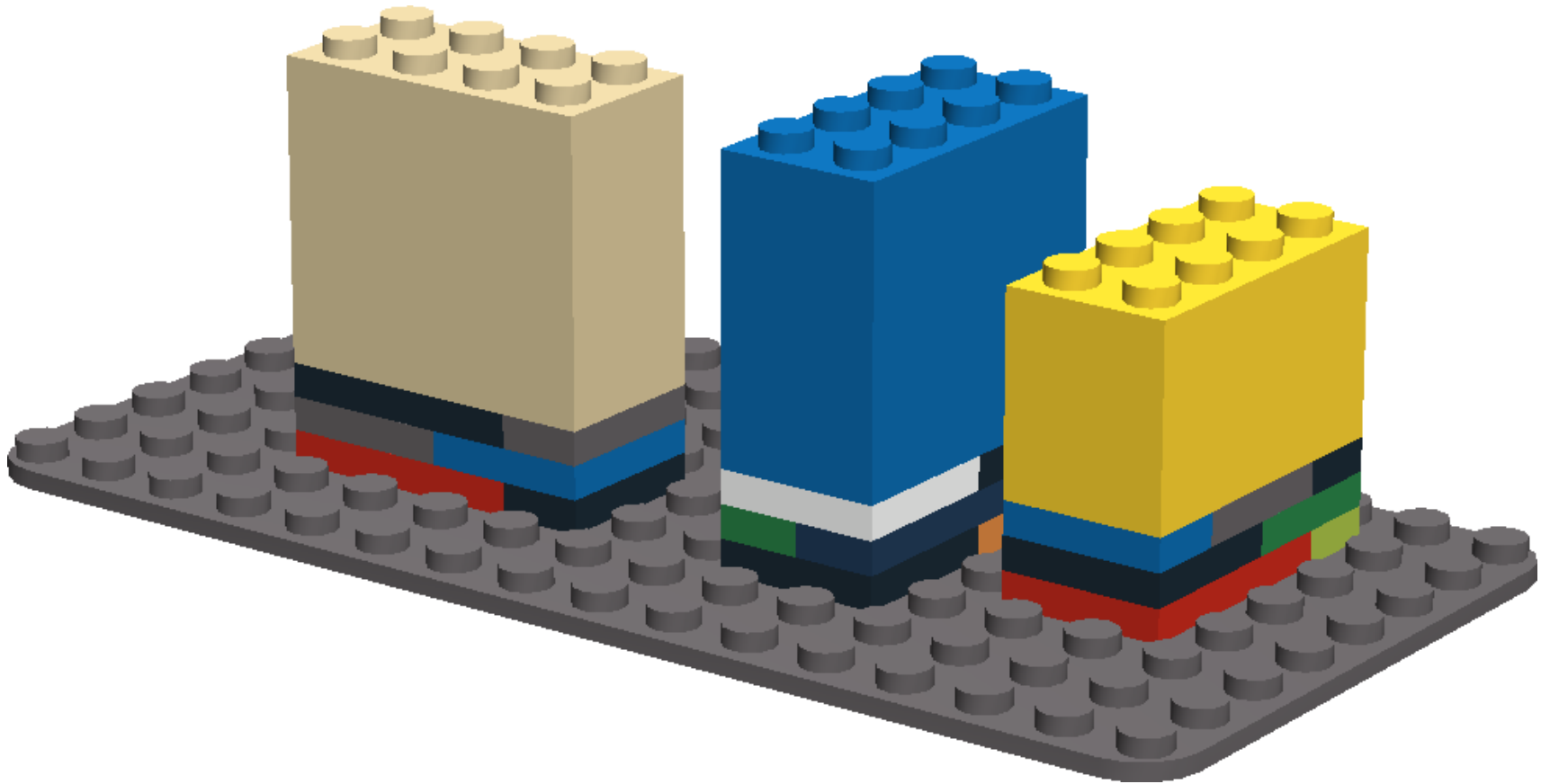


So he has done with the virus easily...

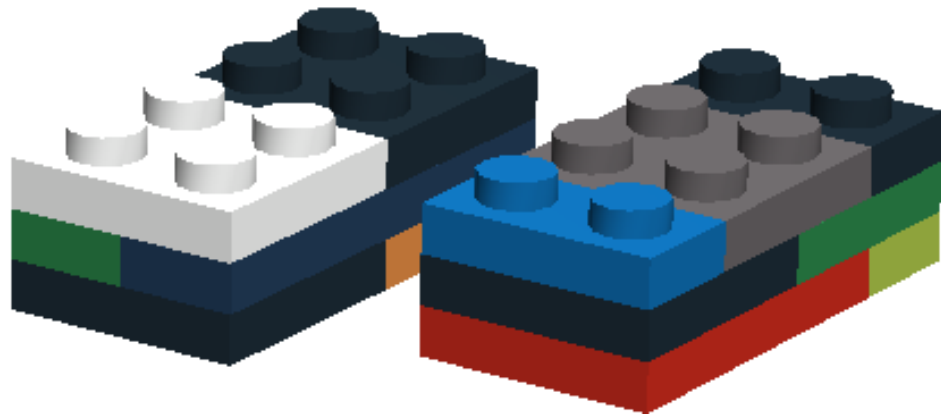
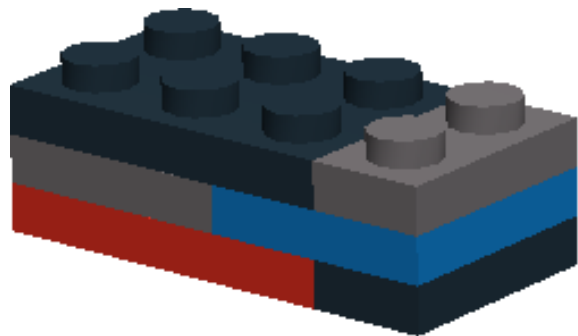


But what is ***this***???

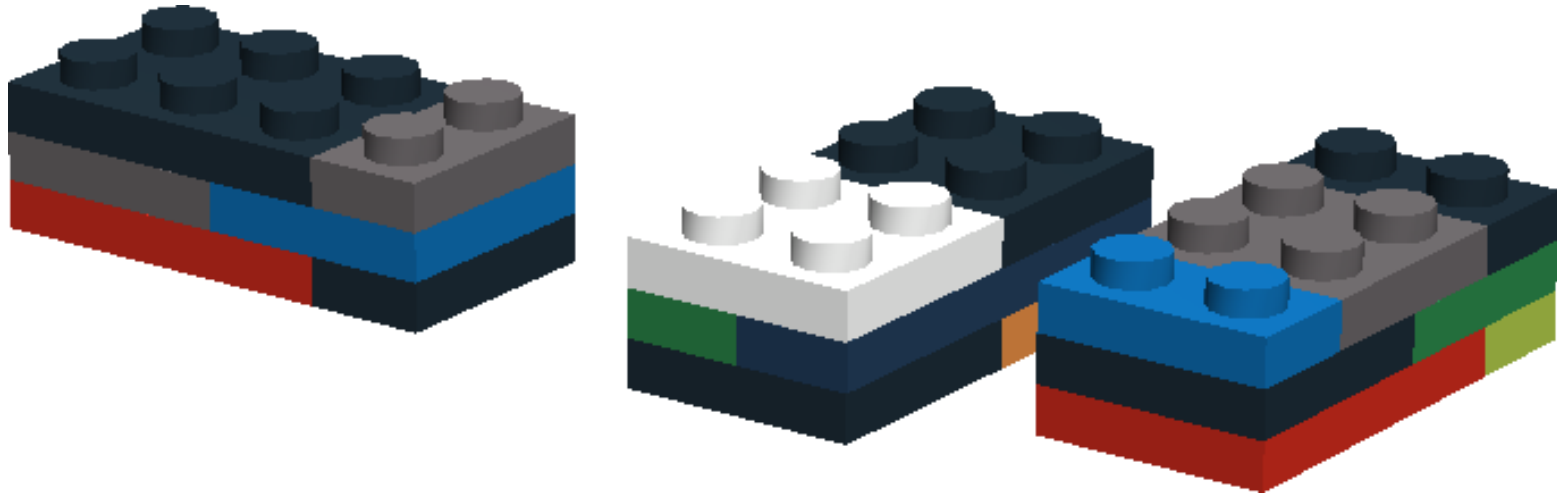
But what is *this*???



But what is *this*???

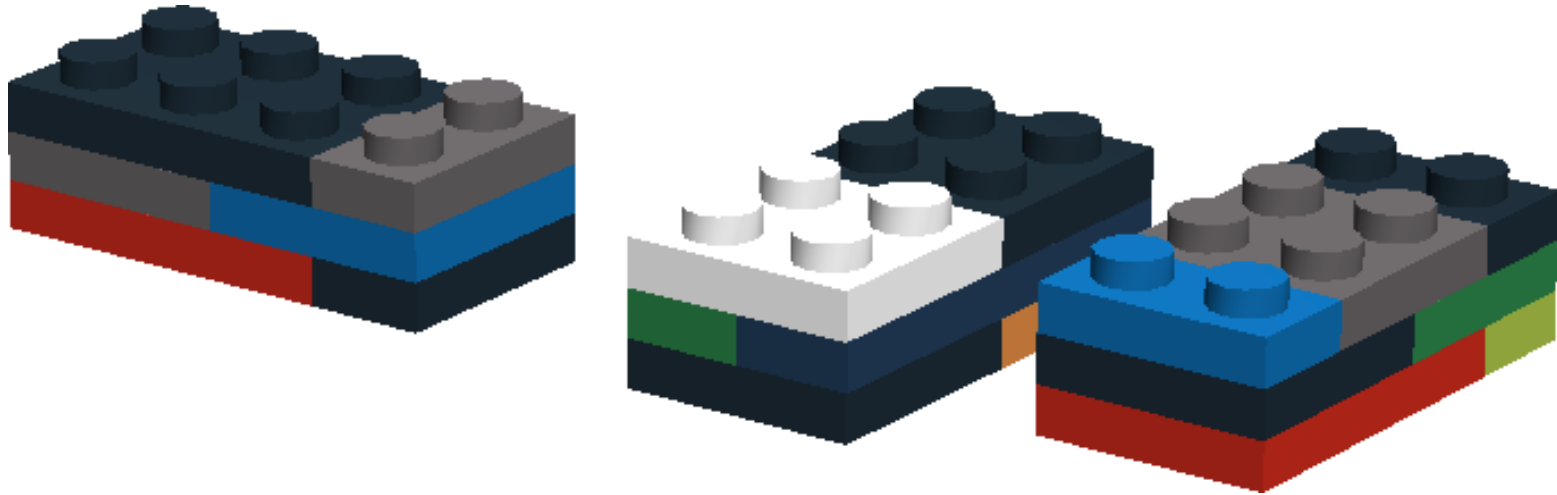


Yes, this is a ***new virus!***



Yes, this is a *new virus*!

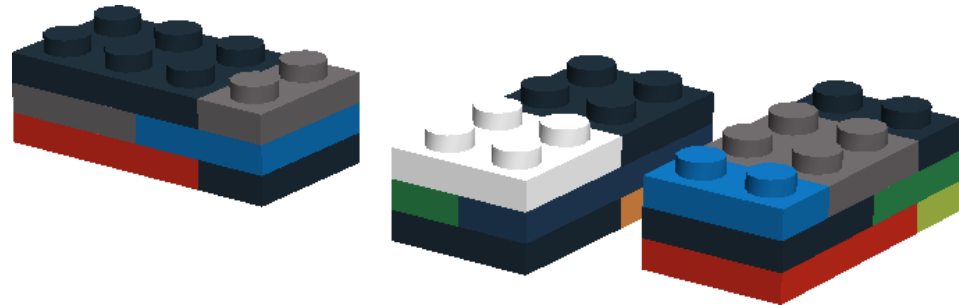
a POLYMORPHIC virus!



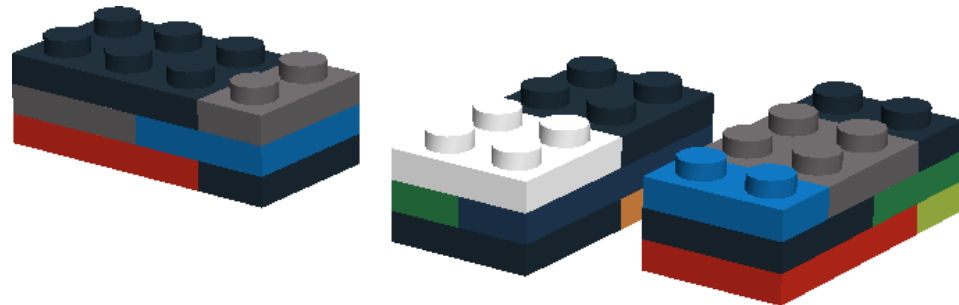


???

Which definition
is the proper one?



None of them!



Bad news!



The last year brought a lot of news in the field of malware evolution.

Polymorphic malware now becomes the standard.

The detection is getting more and more difficult.

Good news!



Each copy of polymorphic malware is ***totally different*** in a binary view, but we still can find some characteristics, which remain always the same.

We only have to ***forget all*** previous methods of detection, especially those which were based on searching for some typical signatures.

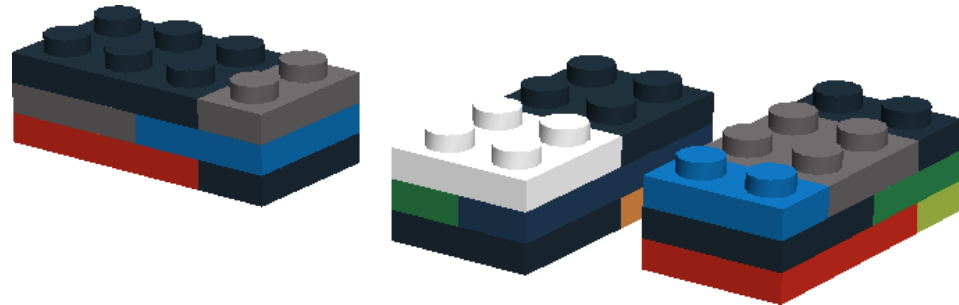


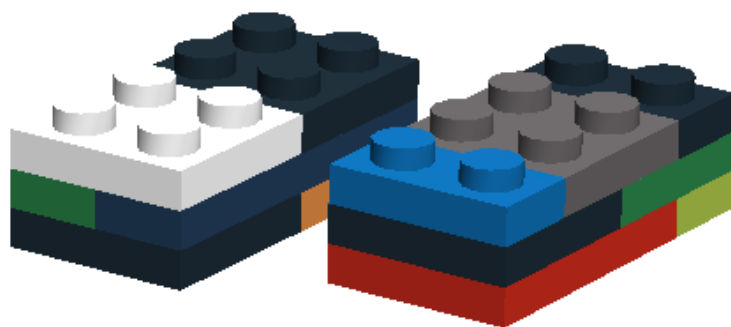
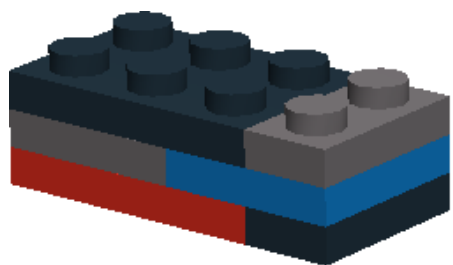
forget...

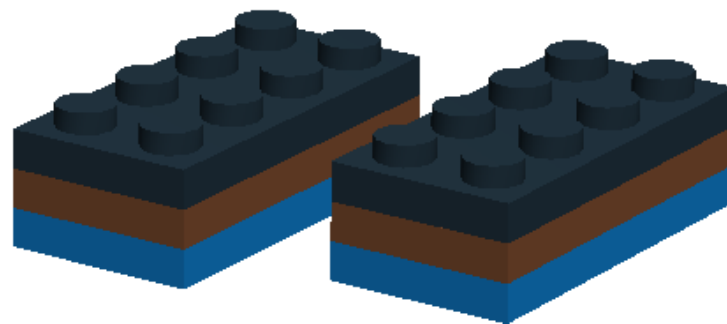
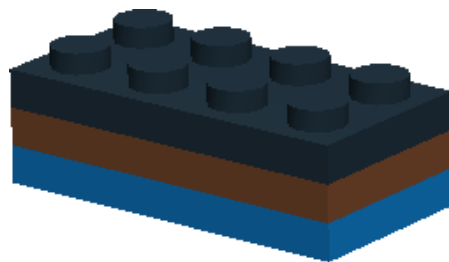
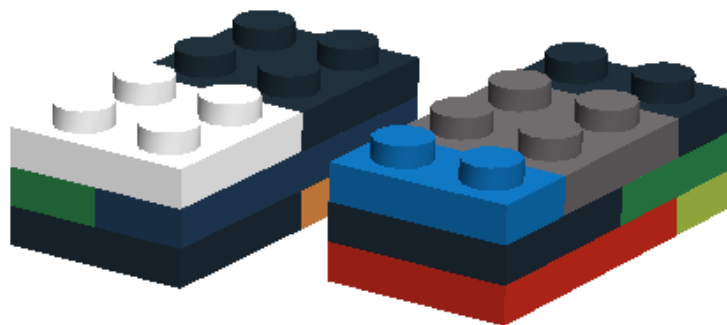
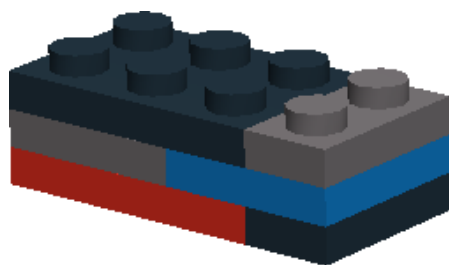
everything!



OK, then we need
a new type of definition!







- Each polymorphic virus or trojan
has been created by some ***polymorphic generator***.

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- Each polymorphic family
has its own ***specific*** generator.

- Each polymorphic virus or trojan
has been created by some ***polymorphic generator***.
- Each polymorphic family
has its own ***specific*** generator.
- Each polymorphic generator
has some ***characteristics and limitations***.



We don't need to
detect the virus



We don't need to
detect the virus

We can detect
the generator !

We can easily distinguish common ***compilers***
like Microsoft Visual C++ or Borland Delphi

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We can easily recognize various runtime ***compressors*** like UPX, PECompact or ASPack

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We can easily recognize various runtime ***compressors*** like UPX, PECompact or ASPack

We surely we will be able to detect any ***polymorphic generator...***



Which characteristics
can be used?



Which characteristics
can be used?

What about...

Which characteristics
can be used?



What about...

bugs in the
generator?



- Incorrect value in a file header
- Improper resource format
- Anything else...

- Incorrect value in a file header
 - Improper resource format
 - Anything else...
-
- **Palette of instructions used in the produced code**

- Incorrect value in a file header
 - Improper resource format
 - Anything else...
-
- Palette of instructions used in the produced code
 - Jump flow of produced code

- Incorrect value in a file header
- Improper resource format
- Anything else...

- Palette of instructions used in the produced code
- Jump flow of produced code
- Set of anti-debug and anti-disassembling tricks

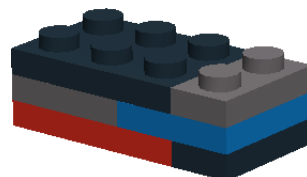
- Incorrect value in a file header
- Improper resource format
- Anything else...

- Palette of instructions used in the produced code
- Jump flow of produced code
- Set of anti-debug and anti-disassembling tricks
- Amount of various illogical instructions



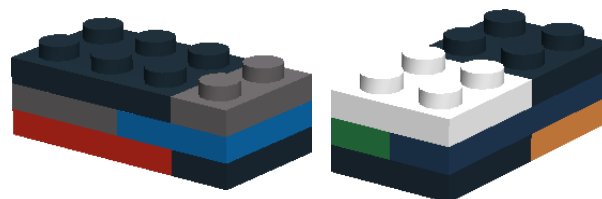
What else can we measure?
Any idea?

Virut (sample No.1)



| | | |
|----------|----------------------------------|-------------------|
| 00403200 | F6D138F280F2E2F6E1F7D6F7D7008542 | ..8.....B |
| 00403210 | BBFFFFEB549F21BF86ED33C083C1908D |T.†...3.... |
| 00403220 | 542408E905460000B9E3ECE893F9F7D1 | T\$...F..... |
| 00403230 | FF957F040000C705E4114000FF151420 |@.... |
| 00403240 | C605E81140004031CB61C38D04378B72 |@.01.a...7.r |
| 00403250 | 2487D2F7D28AD103F30FB7044EE9FC47 | \$.....N..G |
| 00403260 | 00000F8533480000C329E0FC8D8506BC |3H....>..... |
| 00403270 | FFFF83E99301EE908DB7DF3455170FB7 |4U... |
| 00403280 | 9566BBFFFFEB67ADFDDB526AFFFF957F | .f....g...Rj.... |
| 00403290 | 040000E97D460000F7D0C20400FFD68D |}F..... |
| 004032A0 | 48479080C15B50E9A40000008AE94295 | HG...[P.....B. |
| 004032B0 | 00D938C68B1D14204000F6D611E9B300 | ..8.... @..... |
| 004032C0 | F583C8FFE91C4600002BC08D0D3D3959 |F..+...=99 |
| 004032D0 | 498D5C241005E4114000874310EBCD78 | I.\\$....@..C...x |
| 004032E0 | 715A5250E8B4FFFFFFE9EF470000B103 | qZRP.....G.... |
| 004032F0 | C3240000009083EFD78D4900E9B30000 | .\$.....I..... |

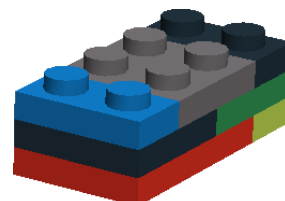
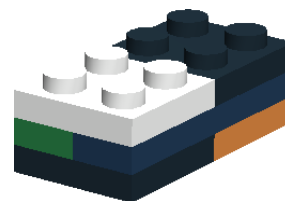
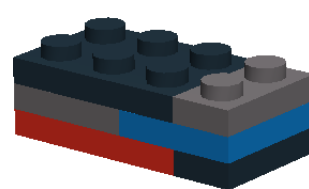
Virut (sample No.2)



```
00403200 F6D138F280F2E2F6E1F7D6F7D7008542 ..8.....B
00403210 BBFFFFEB549F21BF86ED33C083C1908D ....T.†...3....
00403220 542408E905460000B9E3ECE893F9F7D1 T$...F.....
00403230 FF957F040000C705E4114000FF151420 .....@....
00403240 C605E81140004031CB61C38D04378B72 ....@.01.a...7.r
00403250 2487D2F7D28AD103F30FB7044EE9FC47 $.....N..G
00403260 00000F8533480000C329E0FC8D8506BC ....3H....>....
```

```
01009800 2BED81EDE1E7FFFE9F4480000F6D1F6 +.....H.....
01009810 D190BFD653FFFA86FA86FA8D381B5424 ....S.....8.T$
01009820 048D1283C40CF7F1F7C636741917F7D6 .....6t....
01009830 BEE7992A5330C18D95F0FFFFFFE9F201 ...*S0.....
01009840 000086D09087F1FFD1F6D083EE4087D7 .....@..
01009850 F942908BD268C8B1A9ED80C66181C699 .B...h.....a...
01009860 AB9894FCE817460000E9B44600008D86 .....F....F....
01009870 345C32B48B72248AE78B7A1CE98B0100 4\2..r$...z....
01009880 0087F790FC8D93E9F7A1F62CB20F8459 .....9
01009890 460000E93547000083F400FC5250E98F F...5G.....RP..
010098A0 0000000F854F48000090FC8AE4356CB5 .....0H.....5l.
010098B0 9D28FC8D1BF7D4F7D49B8BFF8BFF902B .(<.....+
010098C0 4424048D3F0F856B470000EBA1478A9C D$..?..kG....G..
010098D0 8D1B909052FC9B6AFFF89090FF956701 ....R..j.....9.
010098E0 0000FF956B010000E9740100008BD2FE ....k....t.....
010098F0 CCFEC490FC4941870424FC90FEC3FECB .....IA..$.....
```

Virut (sample No.3)



```
00403200 F6D138F280F2E2F6E1F7D6F7D7008542 ..8.....B
00403210 BBFFFFEB549F21BF86ED33C083C1908D ....T.†...3....
00403220 542408E905460000B9E3ECE893F9F7D1 T$...F.....
00403230 FF957F040000C705E4114000FF151420 .....@....
00403240 C605E81140004031CB61C38D04378B72 ....@.@1.a...7.r
00403250 2487D2F7D28AD103F30FB7044EE9FC47 $.....N..G
00403260 00000F8533480000C329E0FC8D8506BC ....3H...>.....
```

```
01009800 2BED81EDE1E7FFFE9F4480000F6D1F6 +.....H.....
01009810 D190BFD653FFFA86FA86FA8D381B5424 ....S.....8.T$
01009820 048D1283C40CF7F1F7C636741917F7D6 .....6t....
01009830 BEE7992A5330C18D95F0FFFFFFFE9F201 ...*S0.....
01009840 000086D09087F1FFD1F6D083EE4087D7 .....@....
01009850 F942908BD268C8B1A9ED80C66181C699 .B...h.....a...
01009860 AB9894FCE817460000E9B44600008D86 .....F....F....
01009870 345C32B48B72248AE78 .....F.....F....
```

```
01009880 0087F790FC8D93E9F7F 00417000 8D3EBAD28A6C3ACD2E588AE881C7508E .>...1:...X....P.
01009890 460000E93547000083F 00417010 50D964FF30E9024700000F857E010000 P.d.0..G....*...
010098A0 0000000F854F4800009 00417020 C3FF733CE908010000FFD685C00F8408 ..s<.....
010098B0 9D28FC8D1BF7D4F7D49 00417030 48000086D78AD48D149AFF95D2470000 H.....G..
010098C0 4424048D3F0F856B476 00417040 E9D44700000F84D5FFFFFFF28E500E5B8 ..G.....<....
010098D0 8D1B909052FC9B6AFFF 00417050 00000000F980CC00F984F450E9FA4500 .....P..E.
010098E0 0000FF956B010000E97 00417060 0080020C51FC38DC9050EB039D5A1AFC ....Q.8..P...Z..
010098F0 CCFEC490FC494187042 00417070 524F47906AFF9EFF95D2470000FF95D6 R0G.j....G....
00417080 470000E929470000905B87D24183C8FF G...>G...[..A...
00417090 3303E9D6450000598DB88505580986D0 3...E..9....X...
004170A0 66C1E903E9C6470000FFD1F886C08D12 f.....G.....
004170B0 6896EC23FC08F4E865FFFFFFFE9764500 h..#....e....vE.
004170C0 008D5424088044240204FE04248F02EB ..T$..D$....$...
004170D0 3D23195DFEC08D34336AFFE92E460000 =#.]...43j...F..
004170E0 8D8C5824E3AFCAFEC50FB79573000000 ..*$. ....s...
004170F0 C3A40000008D4900E9660100008BC08D .....I..f.....
```

You cannot
catch me!



You cannot
catch me!



Oh, we will see...

What about to use some
mathematics ?



What about to use some
mathematics ?



| | | |
|----------|----------------------------------|-------------------|
| 00403200 | F6D138F280F2E2F6E1F7D6F7D7008542 | ..8.....B |
| 00403210 | 8BFFFFEB549F21BF86ED33C083C1908D |I.†...3..... |
| 00403220 | 542408E905460000B9E3ECE893F9F7D1 | T\$...F..... |
| 00403230 | FF957F040000C705E4114000FF151420 |@..... |
| 00403240 | C605E81140004031CB61C38D04378B72 |0.01.a...7.y |
| 00403250 | 2487D2F7D28AD103F30FB7044EE9FC47 | \$.....N..G |
| 00403260 | 00000F8533480000C329E0FC8D8506BC |3H....>..... |
| 00403270 | FFFF83E99301EE908D67DF3455170FB7 |4U... |
| 00403280 | 95668BFFFFEB67ADFDFB526AFFFF957F | .f....g...Rj).... |
| 00403290 | 040000E97D460000F7D0C20400FFD68D |}F..... |
| 004032A0 | 48479080C15B50E9A40000008AE94295 | HG...[P.....B. |
| 004032B0 | 00D938C68B1D14204000F6D611E9B300 | ..8....@..... |
| 004032C0 | F583C8FFE91C4600002BC08D0D3D3959 |F..+...=99 |
| 004032D0 | 498D5C241005E4114000874310EBCD78 | I.\\$....@..C...x |
| 004032E0 | 715A5250E8E4FFFFFFE9EF470000B103 | qZRP.....G.... |
| 004032F0 | C3240000009083EFD78D4900E9E30000 | .\$.....I..... |

We will add a new column,
an entropy level



| | | | |
|----------|----------------------------------|-------------------|---|
| 00403200 | F6D138F280F2E2F6E1F7D6F7D7008542 | ..8.....B | - |
| 00403210 | 8BFFFFEB549F21BF86ED33C083C1908D |I.!...3.... | E |
| 00403220 | 542408E905460000B9E3ECE893F9F7D1 | T\$...F..... | - |
| 00403230 | FF957F040000C705E4114000FF151420 |@.... | 1 |
| 00403240 | C605E81140004031CB61C38D04378872 |@.01.a...7.y | E |
| 00403250 | 2487D2F7D28AD103F30FB7044EE9FC47 | \$.....N..G | D |
| 00403260 | 00000F8533480000C329E0FC8D8506BC |3H....) | B |
| 00403270 | FFFF83E99301EE908D67DF3455170FB7 |4U... | E |
| 00403280 | 95668BFFFFEB67ADFDFB526AFFFF957F | .f....g...Rj.... | E |
| 00403290 | 040000E97D460000F7D0C20400FFD68D |}F..... | A |
| 004032A0 | 48479080C15B50E9A40000008AE94295 | HG...[P.....B. | C |
| 004032B0 | 00D938C68B1D14204000F6D611E9B300 | ..8....@..... | C |
| 004032C0 | F583C8FFE91C4600002BC08D0D3D3959 |F..+...=99 | C |
| 004032D0 | 498D5C241005E4114000874310EBCD78 | I.\\$....@..C...x | C |
| 004032E0 | 715A5250E8E4FFFFFFE9EF470000B103 | qZRP.....G.... | D |
| 004032F0 | C3240000009083EFD78D4900E9E30000 | .\$.....I..... | 9 |



The entropy describes
local density of data



| | | | |
|----------|----------------------------------|-------------------|---|
| 00403200 | F6D138F280F2E2F6E1F7D6F7D7008542 | ..8.....B | - |
| 00403210 | 8BFFFFEB549F21BF86ED33C083C1908D |I.!...3.... | E |
| 00403220 | 542408E905460000B9E3ECE893F9F7D1 | T\$...F..... | - |
| 00403230 | FF957F040000C705E4114000FF151420 |@.... | 1 |
| 00403240 | C605E81140004031CB61C38D04378B72 |0.01.a...7.y | E |
| 00403250 | 2487D2F7D28AD103F30FB7044EE9FC47 | \$.....N..G | D |
| 00403260 | 00000F8533480000C329E0FC8D8506BC |3H...>..... | B |
| 00403270 | FFFF83E99301EE908D67DF3455170FB7 |4U... | E |
| 00403280 | 95668BFFFFEB67ADFDFB526AFFFF957F | .f...g...Rj.... | E |
| 00403290 | 040000E97D460000F7D0C20400FFD68D |}F..... | A |
| 004032A0 | 48479080C15B50E9A40000008AE94295 | HG...[P.....B. | C |
| 004032B0 | 00D938C68B1D14204000F6D611E9B300 | ..8....@..... | C |
| 004032C0 | F583C8FFE91C4600002BC08D0D3D3959 |F..+...=99 | C |
| 004032D0 | 498D5C241005E4114000874310EB0D78 | I.\\$....@..C...x | C |
| 004032E0 | 715A5250E8E4FFFFFFE9EF470000B103 | qZRP.....G.... | D |
| 004032F0 | C3240000009083EFD78D4900E9E30000 | .\$.....I..... | 9 |



Forgot the real data, only the entropy is needed



Virut (sample No.1)

Compare to the sample
No.2



```

01009800 -DEDDEBDDAADD090DDCDEDEEDEADEDD09EDDEDDDCDDCECCCDCCCCCCCCCCCCC
01009C00 CBAABBCBCCBCCCCCBBCBCBCBCCCCDCCECCDDDECCDDA855BBBCBBCBCDCD77
0100A000 6-----
0100A400 -----D-C--CCC87E-----411
0100A800 11112252-----D5DEEDCCCCB----DDEEEEEEEEEEEEEEEEEEDDD
0100AC00 DDDDEDDDCCCCCEDEDCCBCBCCBBCCBBBCCBECBDDCCCABABABACAADD90DDCCEC
0100B000 CCCCDDDDCCCCCDDDDCDDCCCCCECCDDDDCDDCDBBCBBBDEDEDDDDDDDDEDDDDDD
0100B400 DDDDEE4DDCD-5422CCC--BBCBCCCCB8BBBCDDDDCDDCCBCBDBCBBCCCCCCCC
0100B800 CDCDDCCCCCAACAACBCBCCBAACDBCCCCCBB8BBBDDDDDDDDDDDDDDDDDDDDCDDCD
0100BC00 CDDDDDDDBBBB8CCCCDD5CDDCDDDD9999999DDCDDCC8888DEDEEEEDDDDEDEEEDDD
0100C000 EDDDEDEDDDCEDCDCEDDDDDEDDDDDECCCEEEDEDDEEEED8888BDDDECCCEDDDD
0100C400 DDDDEDDDDDDEDDDEEEEEECECDDCDDDDDDDDCDDCDDCCCB8AAACACBCBCDBBB
0100C800 CDDCCCEDDDDDEBC99998888BBBCDDDDDD888DDCEDCCCCDDDEDCCDCCAABADA
0100CC00 CAAACADDDDDDDDEDDDEDDDDDDDDDDDDDD888DCCCCCCCCCCCCDDDDCECCDDC
0100D000 CDDDDDDDCDDDEEDDDDEDDDEDCCDBCCBCBCBDBCBABD9999B9-----
0100D400 -----
0100D800 -----AB
0100DC00 AAACAAAABACDDDDDDCDDDDCDBCDABABABACACBBCECCCCCCCCDDEEDCDDADDE
0100E000 DCCDCCBDBBB86D3-----

```

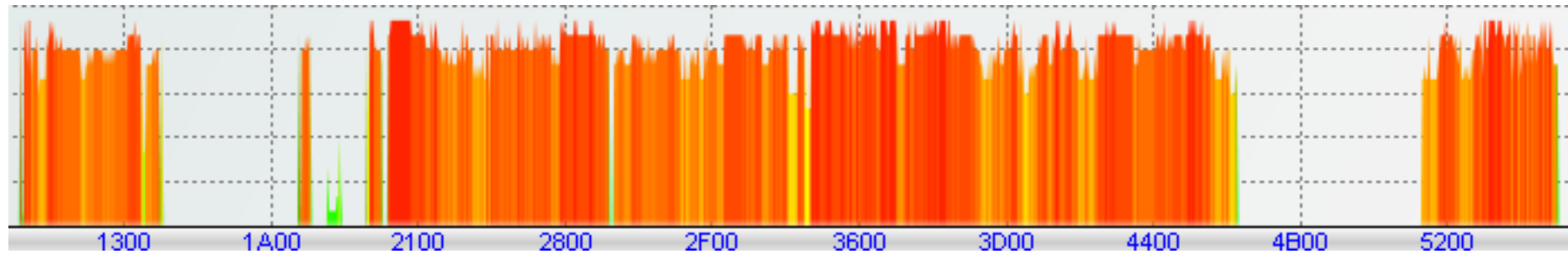
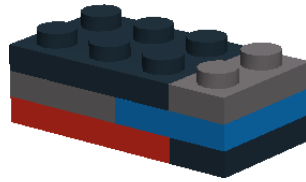
Virut (sample No.2)

And also to the sample
No.3

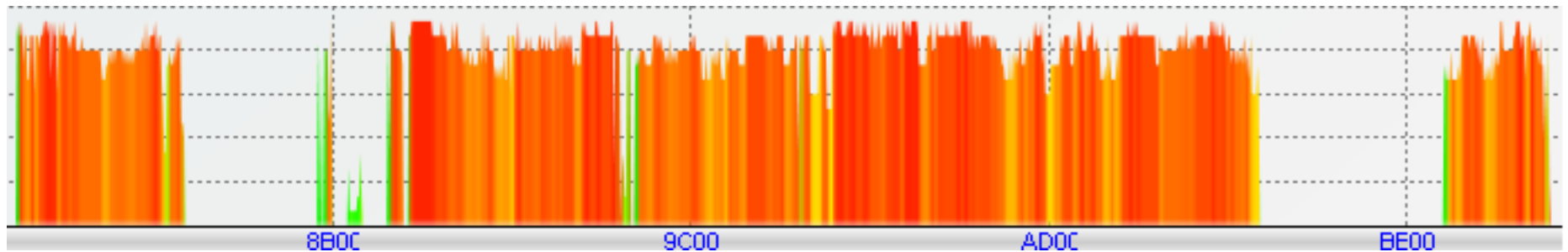
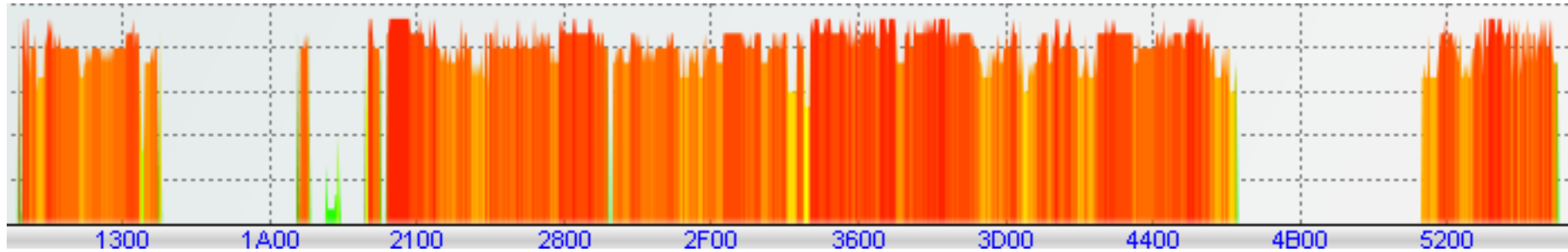
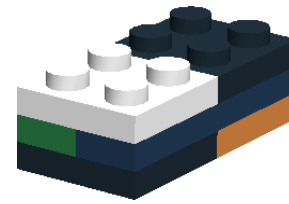
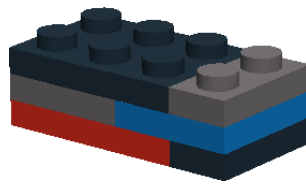
[illegible]

Virut (sample No.3)

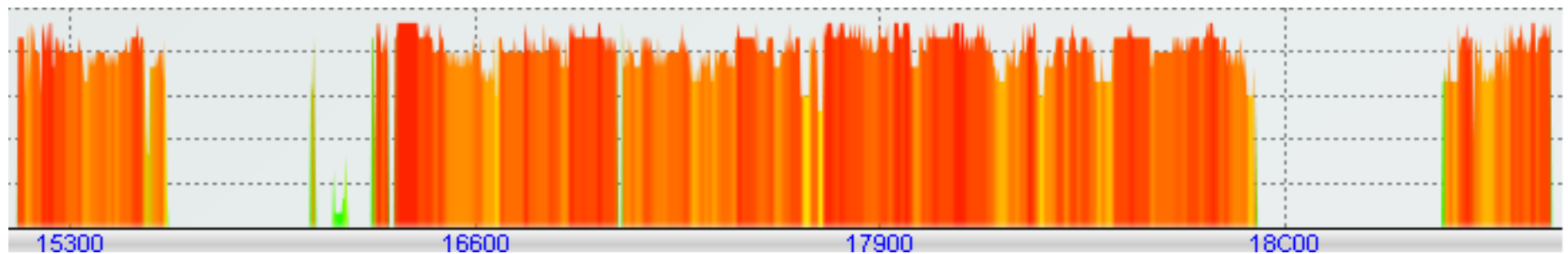
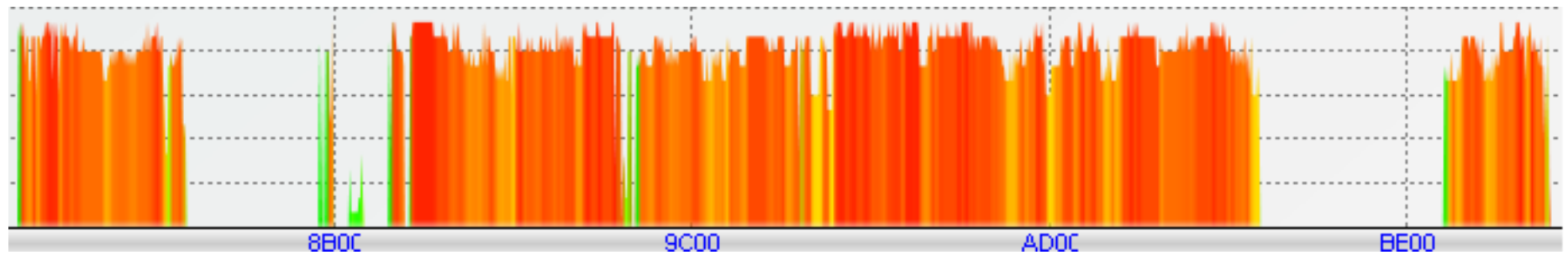
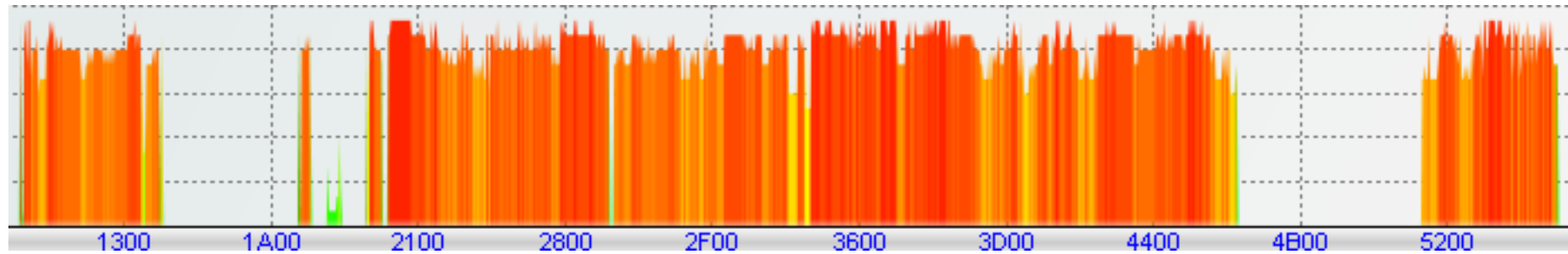
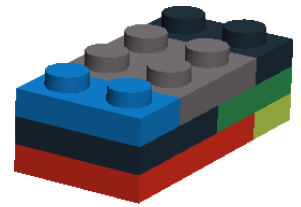
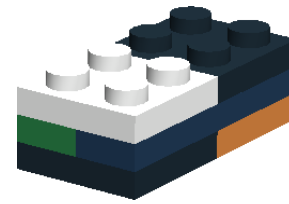
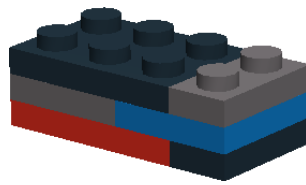
...Virus in charts



...Virut in charts



...Virut in charts





We only have to compute
an average picture and set
the allowed variance



We only have to compute
an average picture and set
the allowed variance

The detection is
easy and fast



The magic is, to find
a completely new look at data
(whatever it may be)

REGEDIT.EXE (clean)

[illegible]

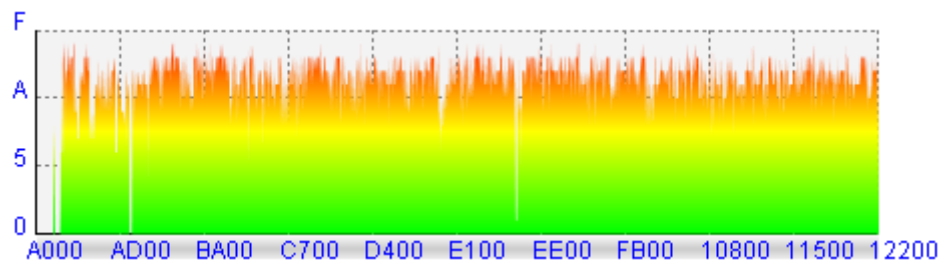
REGEDIT.EXE



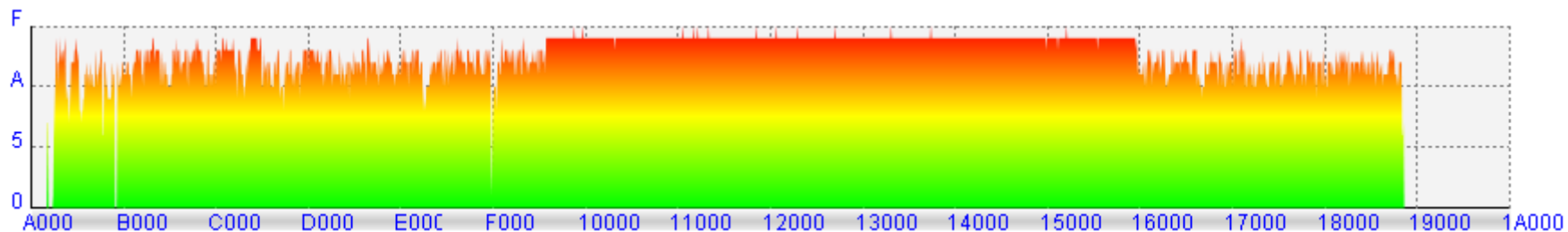
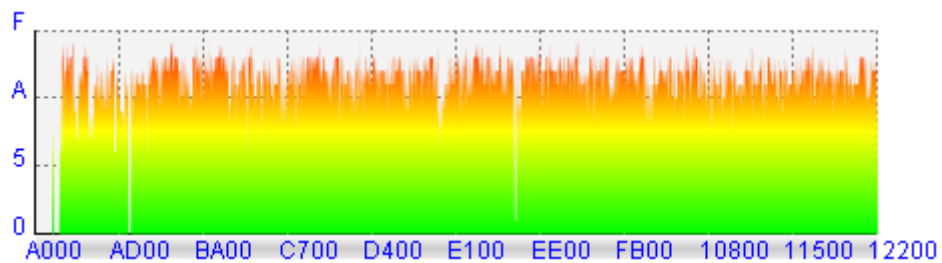
REGEDIT.EXE (infected by ZMist)

[illegible]

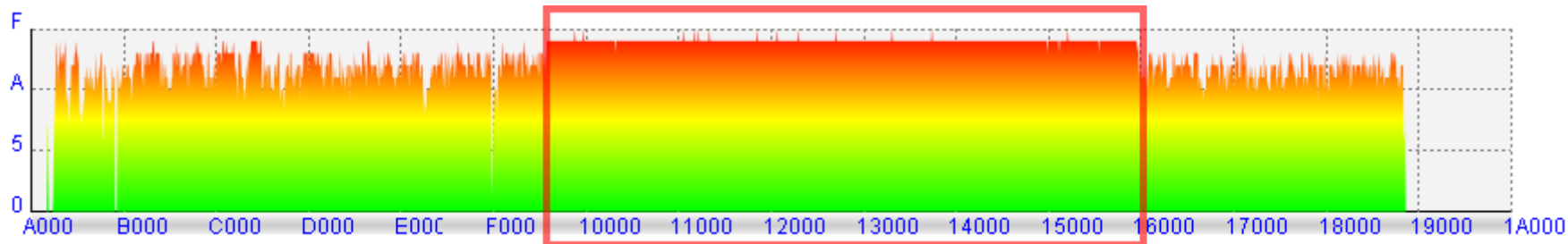
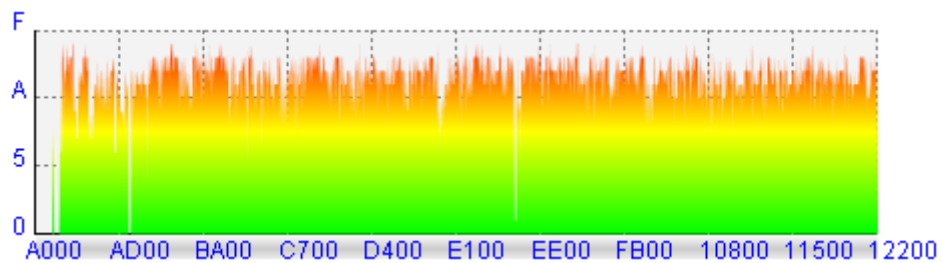
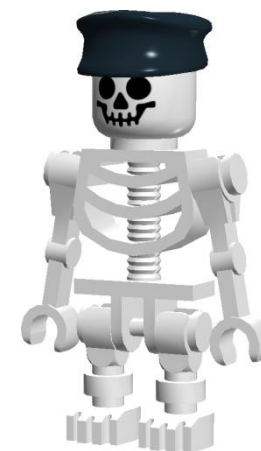
REGEDIT.EXE



REGEDIT.EXE



REGEDIT.EXE



Using entropy maps,
all of you can be
malware experts!



OK, so how can we compute
the entropy map?



1. Each sequence of 16 subsequent bytes is evaluated by local entropy value. A function which computes it, also examines larger surrounding than those 16 bytes only.
2. The entropy value is computed for each particular byte. The function starts with the value 15. Then the function is stepping in interval 1 and check adjacent bytes, whether they are the same as this reference byte. If yes, the entropy is decreased by one. On the first non-matching byte the function stops.
3. Then the function performs the same comparison, but in interval of 2 (i.e. it examines bytes in offset 2, 4, 6, 8 etc.), then in interval of 3 (offset 3, 6, 9, 12...), interval of 4 up to interval of 32. The lowest entropy, which has been found, is taken as the proper entropy value for this examined byte.
4. As the last step, we take each 16 subsequent bytes and assign the lowest value of their entropy as the entropy of this group.

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4. As the last step, we take each 16 subsequent bytes and assign the lowest value of their entropy as the entropy of this group.



Do you understand?
Not yet?



Do you understand?
Not yet?

So let us to explain the
whole algorithm in details !

Examined data (buffer of 160 Bytes)

HEX dump

16 x 10 bytes

[illegible]

[illegible]

For this row

A 10x10 grid with a blue bar across the middle row and an orange arrow pointing to a red question mark. The grid is composed of 10 columns and 10 rows. The middle row (row 5) is highlighted in blue. An orange arrow points from the right end of the blue bar to a red question mark located in the first column of the next row (row 6).

The first byte

[illegible]

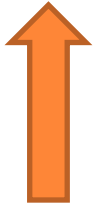
Step = 1, forward

Entropy = 15

[illegible]

Step = 1, forward

Entropy = 14

[illegible]

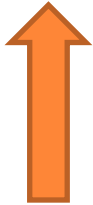
Step = 1, forward

Entropy = 14

[illegible]

Step = 1, forward

Entropy = 13

[illegible]

Step = 1, forward

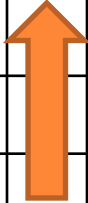
Entropy = 13

[illegible]

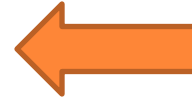
Step = 1, forward

Entropy = 13

| | | | | | | | | | | | | | | | |
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| R | = | = | X | | | | | | | | | | | | |
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Step = 1, backward



Entropy = 13

| | | | | | | | | | | | | | | | |
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| | | | | | | | | | | | | | | | |
| | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? |
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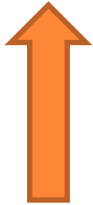
Step = 1, backward

Entropy = 13

[illegible]

Step = 1, backward

Entropy = 12

[illegible]

Step = 1, backward

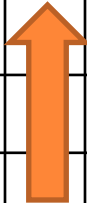
Entropy = 12

[illegible]

Step = 1, backward

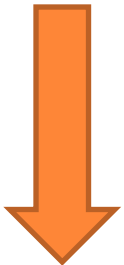
Entropy = 12

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| R | = | = | X | | | | | | | | | | | | |
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Step = 1, result

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| | | | | | | | | | | | | | | X | = |
| R | = | = | X | | | | | | | | | | | | |
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Entropy[1] = 12

Step = 2, forward 

Entropy = 15

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| R | | | | | | | | | | | | | | | |
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Entropy[1] = 12

Step = 2, forward

Entropy = 15

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| R | | ? | | ? | | ? | | ? | | ? | | ? | | ? | |
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Entropy[1] = 12

Step = 2, forward

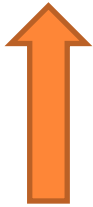
Entropy = 15

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Entropy[1] = 12

Step = 2, forward

Entropy = 14



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Entropy[1] = 12

Step = 2, forward

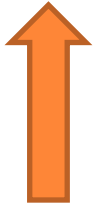
Entropy = 14

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Entropy[1] = 12

Step = 2, forward

Entropy = 13



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Entropy[1] = 12

Step = 2, forward

Entropy = 13

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Entropy[1] = 12

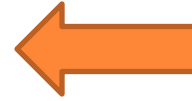
Step = 2, forward

Entropy = 13

| | | | | | | | | | | | | | | | |
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Entropy[1] = 12

Step = 2, backward



Entropy = 13

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Entropy[1] = 12

Step = 2, backward

Entropy = 13

[illegible]

Entropy[1] = 12

Step = 2, backward

Entropy = 13


[illegible]

Entropy[1] = 12

Step = 2, result

Entropy = 13

| | | | | | | | | | | | | | | | |
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Entropy[1] = 12, 13 

Step = 3, forward 

Entropy = 15

| | | | | | | | | | | | | | | | |
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| R | | | ? | | | ? | | | ? | | | ? | | | ? |
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Entropy[1] = 12, 13

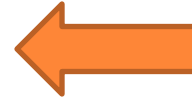
Step = 3, forward

Entropy = 15

| | | | | | | | | | | | | | | | |
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| R | | | X | | | | | | | | | | | | |
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Entropy[1] = 12, 13

Step = 3, backward



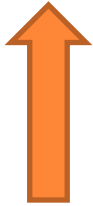
Entropy = 15

| | | | | | | | | | | | | | | | |
|---|---|---|---|---|---|--|---|---|--|---|---|--|---|---|--|
| | | ? | | | ? | | | ? | | | ? | | | ? | |
| | ? | | | ? | | | ? | | | ? | | | ? | | |
| R | | | X | | | | | | | | | | | | |
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Entropy[1] = 12, 13

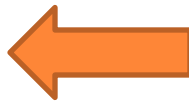
Step = 3, result

Entropy = 11



| | | | | | | | | | | | | | | | |
|---|---|--|---|---|--|--|---|--|--|---|--|--|---|--|--|
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| R | | | X | | | | | | | | | | | | |
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Entropy[1] = 12, 13, 11




Step = 4

| | | | | | | | | | | | | | | | |
|---|--|--|--|---|--|--|--|---|--|--|--|---|--|--|--|
| ? | | | | ? | | | | ? | | | | ? | | | |
| ? | | | | ? | | | | ? | | | | ? | | | |
| R | | | | ? | | | | ? | | | | ? | | | |
| ? | | | | ? | | | | ? | | | | ? | | | |
| ? | | | | ? | | | | ? | | | | ? | | | |
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Entropy[1] = 12, 13, 11

Step = 4, result

| | | | | | | | | | | | | | | | |
|---|--|--|--|---|--|--|--|---|--|--|--|---|--|--|--|
| | | | | | | | | | | | | | | | |
| | | | | X | | | | = | | | | = | | | |
| R | | | | = | | | | = | | | | = | | | |
| = | | | | = | | | | X | | | | | | | |
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Entropy[1] = 12, 13, 11, 8 

Step = 5

| | | | | | | | | | | | | | | | |
|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|
| | | ? | | | | | ? | | | | | ? | | | |
| | ? | | | | | ? | | | | | ? | | | | |
| R | | | | | ? | | | | | ? | | | | | ? |
| | | | | ? | | | | | ? | | | | | ? | |
| | | | ? | | | | | ? | | | | | ? | | |
| | | ? | | | | | ? | | | | | ? | | | |
| | ? | | | | | ? | | | | | ? | | | | |
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Entropy[1] = 12, 13, 11, 8

Step = 6

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| | | ? | | | | | | ? | | | | | | | |
| | | | | ? | | | | | | ? | | | | | |
| R | | | | | | ? | | | | | | ? | | | |
| | | ? | | | | | | ? | | | | | | ? | |
| | | | | ? | | | | | | ? | | | | | |
| ? | | | | | | ? | | | | | | ? | | | |
| | | ? | | | | | | ? | | | | | | ? | |
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Entropy[1] = 12, 13, 11, 8, 9

Step = 7

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| | | | | ? | | | | | | | ? | | | | |
| | | ? | | | | | | | ? | | | | | | |
| R | | | | | | | ? | | | | | | | ? | |
| | | | | | ? | | | | | | | ? | | | |
| | | | ? | | | | | | | ? | | | | | |
| | ? | | | | | | | ? | | | | | | | ? |
| | | | | | | ? | | | | | | | ? | | |
| | | | | ? | | | | | | | ? | | | | |
| | | ? | | | | | | | ? | | | | | | |
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Entropy[1] = 12, 13, 11, 8, 9, 11

Step = 8 .. 48 

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| R | | | | | | | | | | | | | | | |
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Entropy[1] = 12, 13, 11, 8, 9, 11, ...

For all steps...


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Entropy[1] = min(12, 13, 11, 8, 9, 11, ...)



For all steps...

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Entropy[1] = 8 

Continue: Step = 1 .. 48

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| R | R | | | | | | | | | | | | | | |
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Entropy[2] = ?

And again:

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| R | R | R | | | | | | | | | | | | | |
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Entropy[3] = ?

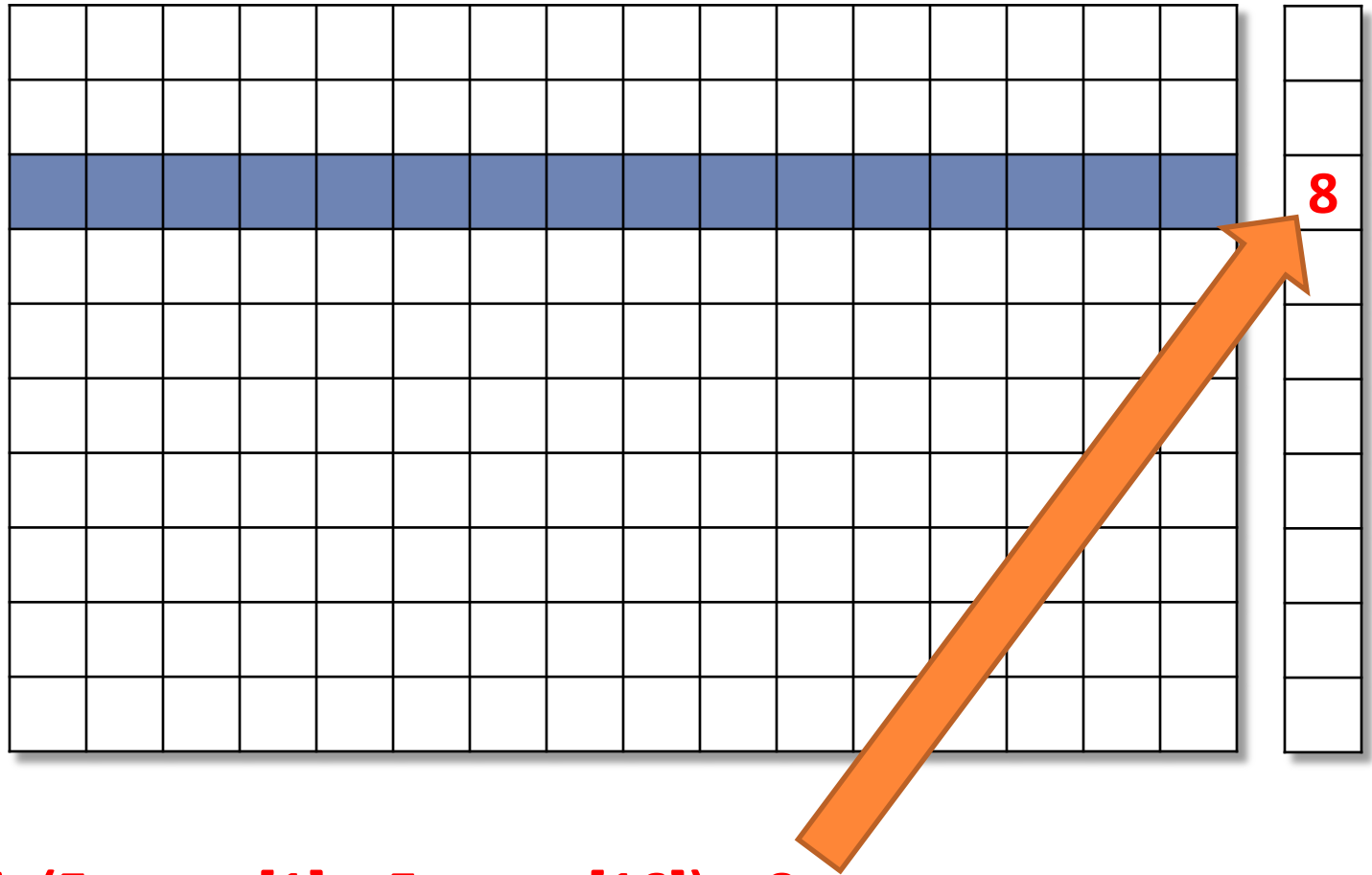
To the end of the row:

| | | | | | | | | | | | | | | | |
|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|
| | | | | | | | | | | | | | | | |
| | | | | | | | | | | | | | | | |
| R | R | R | R | R | R | R | R | R | R | R | R | R | R | R | R |
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Entropy[16] = ?

Result...

...for this row



Entropy = min(Entropy[1] .. Entropy[16]) = 8



And now some
final adjustments:

Many zeroes in data

Many zeroes in data

1. Count the **total number** of zeroes on the line

2. Compute

```
Entropy[zeroes] = 15 - count(zeroes)
```

3. Result is

```
Entropy = min(Entropy[zeroes], Entropy)
```

Many zeroes in data

1. Count the **total number** of zeroes on the line

2. Compute

```
Entropy[zeroes] = 15 - count(zeroes)
```

3. Result is

```
Entropy = min(Entropy[zeroes], Entropy)
```

Many zeroes in data

1. Count the **total number** of zeroes on the line

2. Compute

```
Entropy[zeroes] = 15 - count(zeroes)
```

3. Result is

```
Entropy = min(Entropy[zeroes], Entropy)
```

Text characters in data

Text characters in data

1. Count the longest **continuous text** on the line
(including TAB, CR, LF and zero)
2. If the text is shorter than a limit (10 chars), ignore it

3. Otherwise compute

$$\text{Entropy}[\text{text}] = 15 - \text{length}(\text{text})$$

4. Result is

$$\text{Entropy} = \min(\text{Entropy}[\text{text}], \text{Entropy})$$

Text characters in data

1. Count the longest **continuous text** on the line
(including TAB, CR, LF and zero)
2. If the text is shorter than a limit (10 chars), ignore it

3. Otherwise compute

$$\text{Entropy}[\text{text}] = 15 - \text{length}(\text{text})$$

4. Result is

$$\text{Entropy} = \min(\text{Entropy}[\text{text}], \text{Entropy})$$

Text characters in data

1. Count the longest **continuous text** on the line
(including TAB, CR, LF and zero)
2. If the text is shorter than a limit (10 chars), ignore it

3. Otherwise compute

$$\text{Entropy}[\text{text}] = 15 - \text{length}(\text{text})$$

4. Result is

$$\text{Entropy} = \min(\text{Entropy}[\text{text}], \text{Entropy})$$

Text characters in data

1. Count the longest **continuous text** on the line (including TAB, CR, LF and zero)
2. If the text is shorter than a limit (10 chars), ignore it
3. Otherwise compute

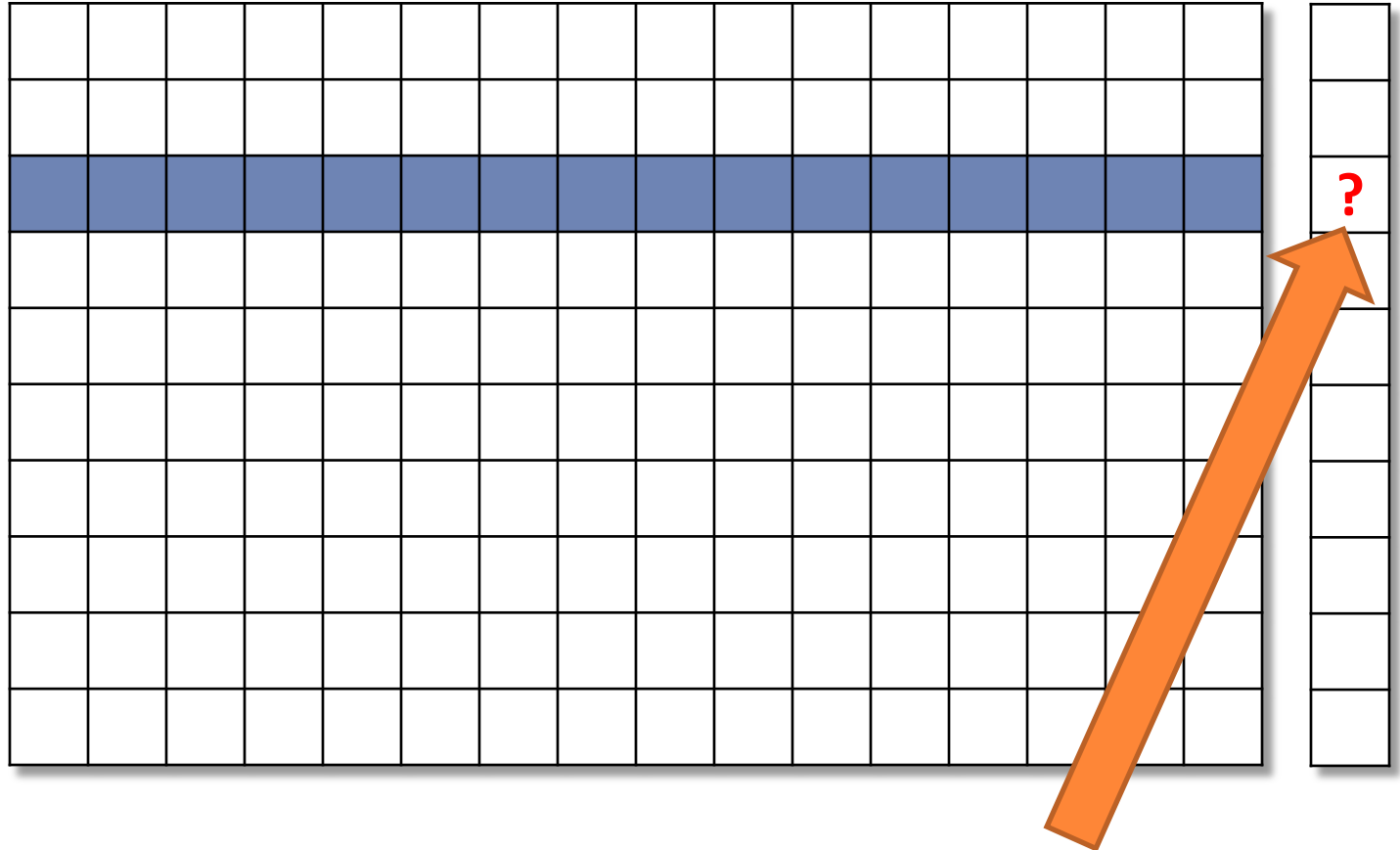
$$\text{Entropy}[\text{text}] = 15 - \text{length}(\text{text})$$

4. Result is

$$\text{Entropy} = \min(\text{Entropy}[\text{text}], \text{Entropy})$$

Result...

...for this row



Entropy = min(Entropy[1] .. Entropy[16], Entropy[zeroes], Entropy[text])

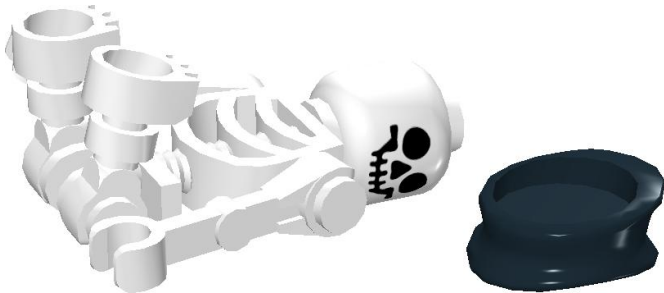


That's all, folks...



That's all, folks...

I am looking forward to
the discussion!



What will be next?
Have you heard about
a jump map ?



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