

1
2 [Internet Traffic Threat
3 Classification Using a
4 Supervised
5 Spiking Neural Network]
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11 < Felipe Castro
12 11796909 >
13
14

}

Conteúdo da 'Apresentação' {

01 Contexto geral

< Ideia geral do método e do
problema que me propus a resolver >

02 Projeto do Experimento

< Pré-processamento e hiperparâmetros >

03 Resultados

< O que foi prometido, o que foi
realizado e discussões sobre >

}

1
2 01 {
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5 [Contexto Geral]
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8 < Ideia geral do método e do problema
9 que me propus a resolver >
10

11
12 }
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14

```
1  
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4 0 que eu pretendo  
5 fazer? {  
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13  
14 }
```

< Meu objetivo é **reproduzir as técnicas** utilizadas nesse estudo e aplicá-las a um **novo conjunto de dados dentro do mesmo domínio**, explorando sua eficácia em um cenário diferente, neste caso a detecção de ameaças em tráfego de internet.>

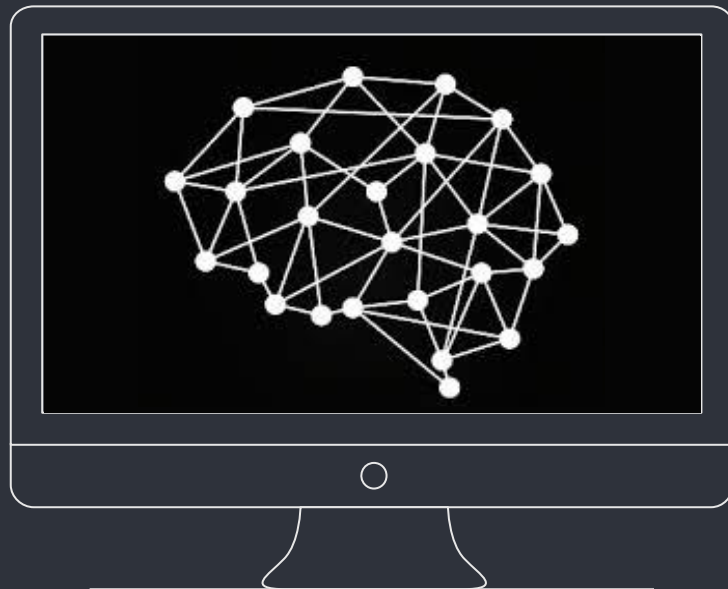


Fonte da imagem: istockphoto.com

Spiking Neural Networks {

Diferente das redes neurais convencionais, que usam operações matemáticas contínuas, as SNNs processam dados através de picos de ativação (spikes), simulando neurônios biológicos.

}



Fonte da imagem: pngtree.com

CIC-Darknet2020 {



< Conjunto de dados contendo tráfego de Internet oriundo da darknet. Não foi utilizado, pois não continha a captura de pacote trafegados na rede. >

}

Intrusion detection evaluation dataset (CIC-IDS2017) {



< Conjunto de dados focado em tipos de ataques simulados realizados contra um servidor. Foi utilizado, pois continha uma boa variedade de ataques, além da captura de pacotes preservada. >

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02 {

[Projeto do Experimento]

< Pré-processamento e hiperparâmetros >

}

Leitura dos 'PCAPs' {

	timestamp	IP_version	IP_ihl	IP_tos	IP_len	IP_id	IP_flags	IP_frag	IP_ttl	IP_proto	IP_checksum	IP_src
0	1433356821.839550	4	5	0	162	20629	DF	0	107	6	53743	205.188.12.91
1	1433356821.839658	4	5	0	40	52142	DF	0	64	6	33360	10.8.8.178
2	1433356822.479111	4	5	0	338	21179	DF	0	107	6	53017	205.188.12.91
3	1433356822.479913	4	5	0	40	52143	DF	0	64	6	33359	10.8.8.178
4	1433356822.680985	4	5	0	162	21344	DF	0	107	6	53028	205.188.12.91

IP_dst	IP_options	TCP_sport	TCP_dport	TCP_seq	TCP_ack	TCP_dataofs	TCP_reserved
10.8.8.178	[]	443.0	48911.0	3.987076e+09	2.730303e+09	5.0	0.0
205.188.12.91	[]	48911.0	443.0	2.730303e+09	3.987076e+09	5.0	0.0
10.8.8.178	[]	443.0	48911.0	3.987076e+09	2.730303e+09	5.0	0.0
205.188.12.91	[]	48911.0	443.0	2.730303e+09	3.987077e+09	5.0	0.0
10.8.8.178	[]	443.0	48911.0	3.987077e+09	2.730303e+09	5.0	0.0

Tipos de 'Ameaça' {

Botnet

Redes de computadores infectados (bots) controlados remotamente para realizar atividades maliciosas.

Exploit

Ataques direcionados a aplicações web, explorando vulnerabilidades como XSS (Cross-Site Scripting) e SQL Injection.

Infiltration

Ataques que simulam a introdução de malware na rede interna, por meio de dispositivos USB infectados ou downloads maliciosos.

}

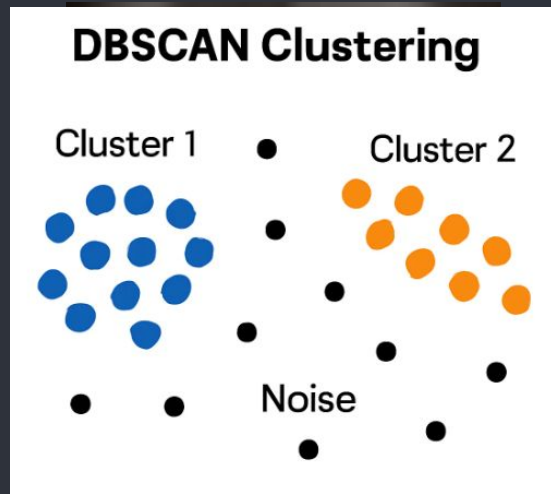
Rotulando 'Ameaças' {

```
attack_schedule = {  
    datetime(2017, 7, 3).date(): [], # Benign traffic only  
  
    datetime(2017, 7, 4).date(): [  
    ],  
  
    datetime(2017, 7, 5).date(): [  
        {"type": "Exploit", "src": "205.174.165.73", "dst": "205.174.165.66", "start": time(15, 12), "end": time(15, 32)},  
    ],  
  
    datetime(2017, 7, 6).date(): [  
        {"type": "Exploit", "src": "205.174.165.73", "dst": "192.168.10.8", "start": time(14, 19), "end": time(14, 35)},  
        {"type": "Infiltration", "src": "205.174.165.73", "dst": "192.168.10.25", "start": time(14, 53), "end": time(15, 0)},  
        {"type": "Infiltration", "src": "205.174.165.73", "dst": "192.168.10.8", "start": time(15, 4), "end": time(15, 45)},  
    ],  
  
    datetime(2017, 7, 7).date(): [  
        {"type": "Botnet", "src": "205.174.165.73", "dst": "192.168.10.8", "start": time(10, 2), "end": time(11, 2)},  
        {"type": "Infiltration", "src": "205.174.165.73", "dst": "205.174.165.68", "start": time(13, 55), "end": time(15, 29)},  
    ]  
}
```

}

Undersampling 'caso benignos' {

```
< Com o objetivo de reduzir a quantidade de  
casos de tráfego benigno, eu utilizei o  
DBScan para agrupar os casos mais semelhantes  
e eleger um representante do grupo para  
passar para a etapa de modelagem.>
```



Fonte da imagem:
upgrad.com/blog/what-is-dbscan-clustering/

Tratamento dos 'PCAPs' {

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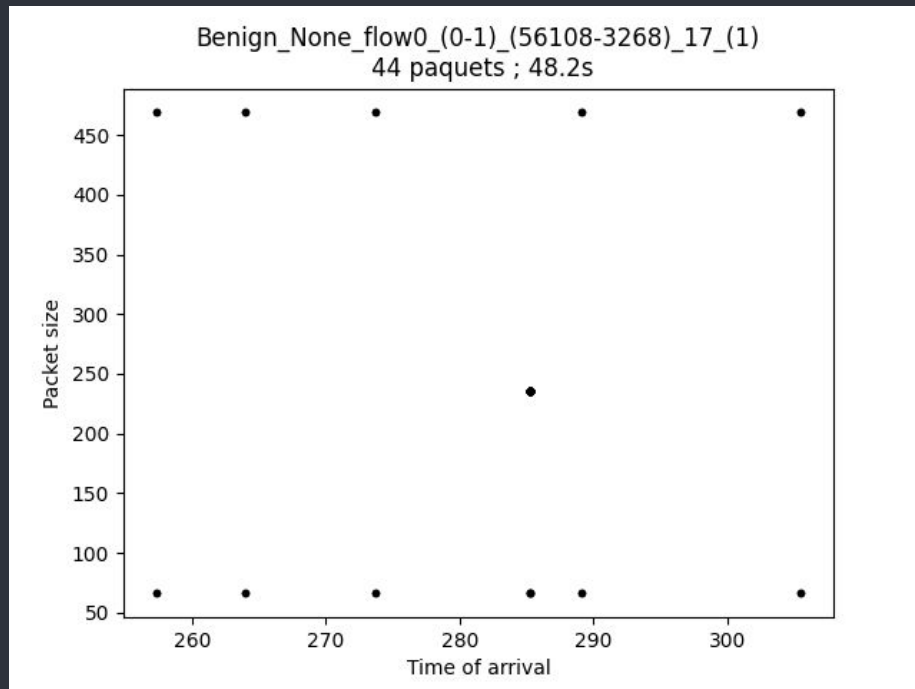
11

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}



```
Seleção de  
'Hiperparâmetros'  
{ Via Optuna  
  |  
  }
```



OPTUNA

Hiperapâmetros ajustáveis; {

```
nb_epochs: [5, 7, 10]
warmup_epochs: [1, 2, 4]
snapshot_epochs: [[2,5],[5,10]]

beta_init_method: [constant]
beta_constant_val: [0.5, 0.7, 0.9]
beta_normal_mean: [0.6, 0.7]
beta_normal_std: [0.01, 0.05]

nb_dense_layer: [25, 50, 100]
nb_outputs: [14]

w_init_mean: [0, 0.01]
w_init_std: [0.05, 0.1, 0.15, 0.2]

nb_steps: [300]
weight_decay: [0.0001, 0.001]
betas: [[0.9, 0.999], [0.85, 0.995], [0.95, 0.98]]
time_step: [0.001]
gamma: [0.85, 0.9, 0.95]
eps: 0.00000001
Max_spikes_per_run: [1, 2, 3]
```

}

Hiperapêmetros ajustados; {

```
nb_epochs: 10
warmup_epochs: 2
snapshot_epochs: [5, 10]
lateral_connections: false
Regularization_Term:
  - squared
  - max

lr: 0.0005

beta_uniform_start: 0.0
beta_uniform_end: 1.0
```

```
nb_dense_layer: 78
nb_outputs: 4
w_init_mean: 0
w_init_std: 0.15
surrogate_sigma_sigmoid: 10
surrogate_sigma_rec: 1
surrogate_a_fast_sigmoid_abs: 0.5
surrogate_a_fast_sigmoid_tanh: 0.5
surrogate_sigma_scale: 1.0
nb_steps: 300
weight_decay: 0.001
betas:
  - 0.9
  - 0.999
time_step: 0.001
gamma: 0.9
eps: 1.0e-08
```

```
}
```

```
1 03 {
```

```
2  
3  
4  
5 [Resultados]
```

```
6  
7  
8 < 0 que foi prometido, o que foi  
9 realizado e discussões sobre >
```

```
10  
11  
12 }  
13  
14
```


Avaliação; {

Acurácia



< Medida geral de quanto o modelo acerta >

Revocação



< Capacidade do modelo de não deixar de retornar a classe correta, evitando falsos negativos >

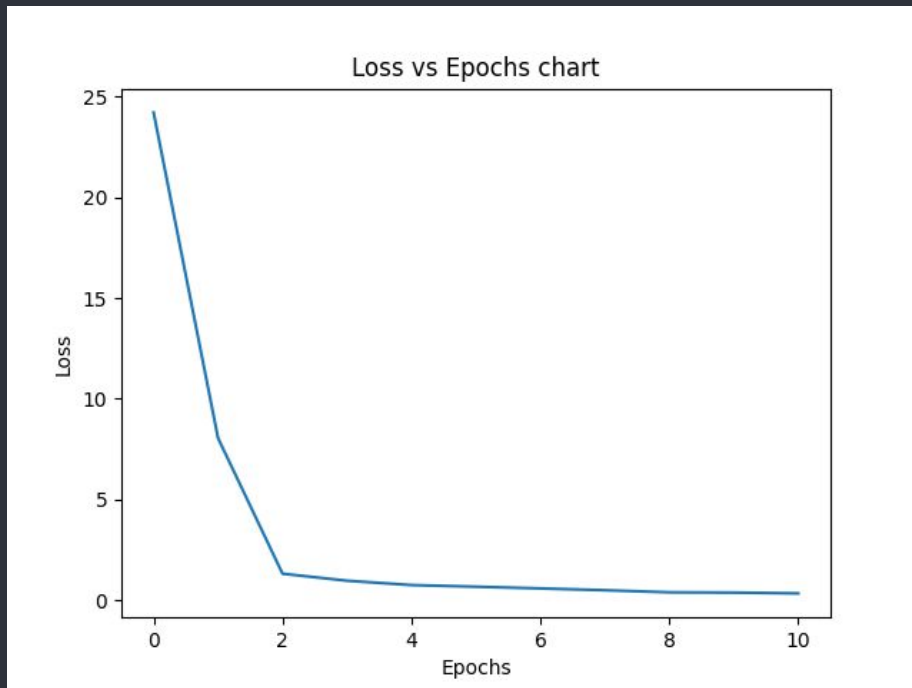
Precisão



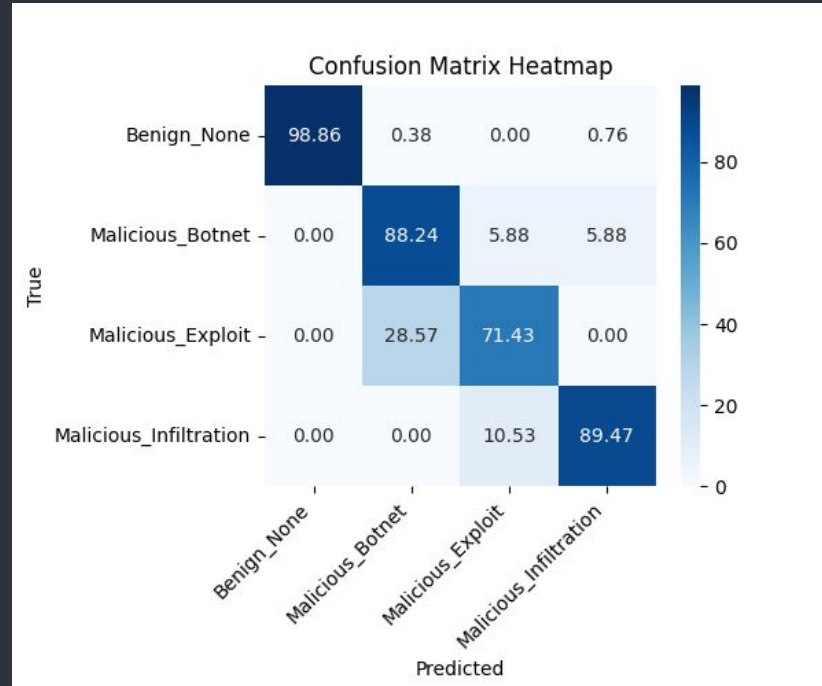
< Medida de quanto o modelo retorna a classe correta com maior especificidade, evitando falsos positivos >

}

```
1  Avaliação; {  
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14 }
```



Avaliação; {

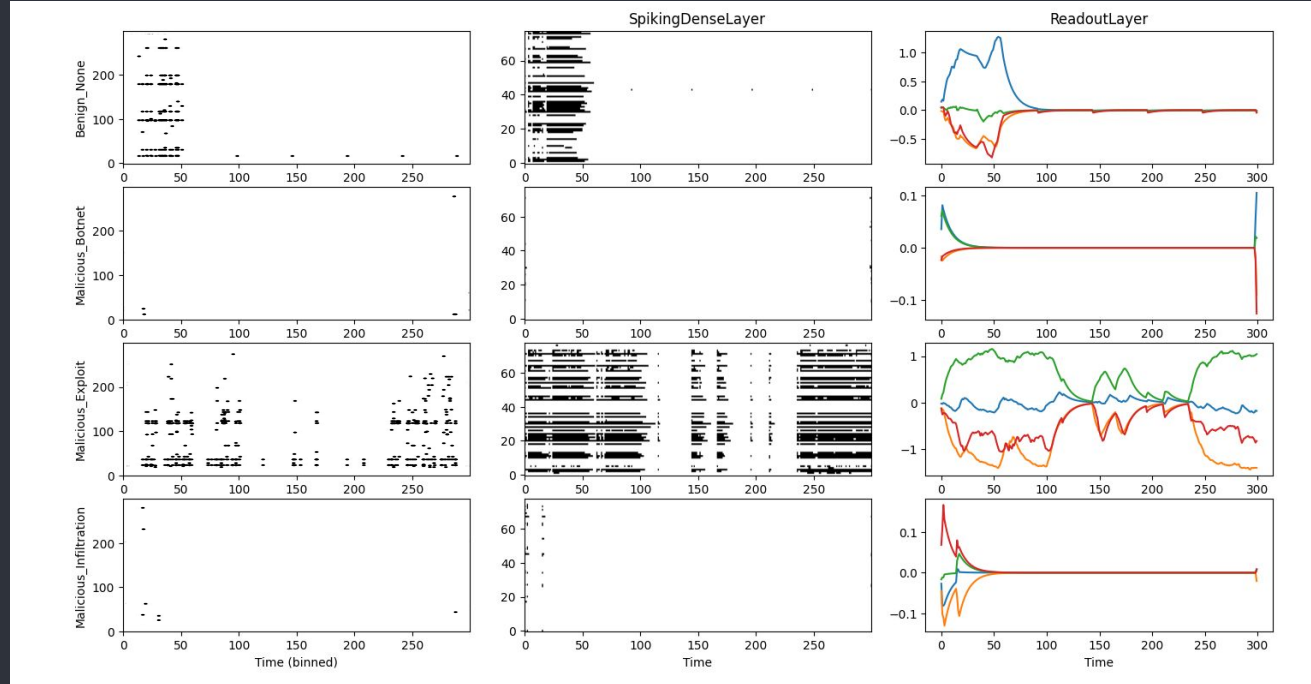


```
1  Avaliação; {
```

```
2  
3  
4  
5  Benign_None (0) : Re = 100.0% ; Pr = 98.9% ; Ac = 99.0%  
6  Malicious_Botnet (1) : Re = 83.3% ; Pr = 88.2% ; Ac = 98.4%  
7  Malicious_Exploit (2) : Re = 62.5% ; Pr = 71.4% ; Ac = 98.4%  
8  Malicious_Infiltration (3) : Re = 85.0% ; Pr = 89.5% ; Ac = 98.4%
```

```
9  
10  
11  
12  
13  
14 }
```

Avaliação; {



Referência do Artigo {

Ali Rasteh, Florian Delpech, Carlos Aguilar-Melchor, Romain Zimmer, Saeed Bagheri Shouraki, Timothée Masquelier,

Encrypted internet traffic classification using a supervised spiking neural network,

Neurocomputing:

- * Volume 503,
- * 2022,
- * Pages 272-282,
- * ISSN 0925-2312,

DOI:

- * <https://doi.org/10.1016/j.neucom.2022.06.055>.

}

thanks.c

1
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```
Muito {  
Obrigado;  
|  
}
```



Concepts < /1 > {



< Mercury is the closest planet to the Sun and the smallest one in the Solar System—it's only a bit larger than the Moon >

}

Concepts < /2 > {



< Venus has a beautiful name and is the second planet from the Sun. It's hot and has a poisonous atmosphere >

}

```
1 Introduction; {
```

```
2  
3  
4  
5 'Here you can give a brief description of the  
6 topic you want to talk about'
```

```
7 <p For example, if you want to talk about  
8 Mercury, you can say that it's the smallest  
9 planet in the entire Solar System >
```

```
10  
11  
12 </p>
```

```
13  
14 }
```

What Is this 'Topic About ?' {

Languages

Html  60%

< Mercury is the
smallest planet in the
entire Solar System >

Css  40%

< The Earth is the only
one that harbors life in
the Solar System >

Create a web page



Venus has a
nice name



Mars is a
cold place



Jupiter is
a gas giant

}

Features of 'the Topic' {

Step 01

Mercury is the closest planet to the Sun and the smallest one

Step 02

Saturn is a gas giant and has several rings

Step 03

The Earth is the only planet that harbors life

Step 04

Venus has a beautiful name and is the second planet from the Sun

}

Recommendations; {



Mercury

< Mercury is the closest planet to the Sun
and the smallest one in the Solar System >



Saturn

< It was named after the Roman god of wealth
and agriculture >





Jupiter


< Jupiter is a gas giant and the biggest
planet in the Solar System >


}

Examples About 'The Topic' {

 **Mercury**
< Mercury is the
closest planet to
the Sun >

 **Jupiter**
< Jupiter is a gas
giant and the
biggest planet >

 **Saturn**
< Saturn is a gas
giant and has
several rings >

 **Venus**
< Venus has a nice
name and high
temperatures >

}

Practical Exercise {

```
< Saturn is the fourth-largest object by diameter in  
the Solar System >
```

```
< /1 >      * Mercury is the smallest planet  
              * The Earth is the planet we live on  
              * Saturn is made of oxygen and helium
```

```
< /2 >      * Jupiter is a gas giant  
              * Venus has high temperatures  
              * Neptune is very far away from the Sun
```

```
}
```

```
1 9h 55m 23s {
2
3    < Is Jupiter's rotation period >
4
5
6    333,000.000
7
8    < Earths fit in the Sun's mass >
9
10   386,000 km
11
12   < Distance between the Moon and the Earth >
13 }
14
```


A 'Picture' Is {
Worth a Thousand
Words

|
}

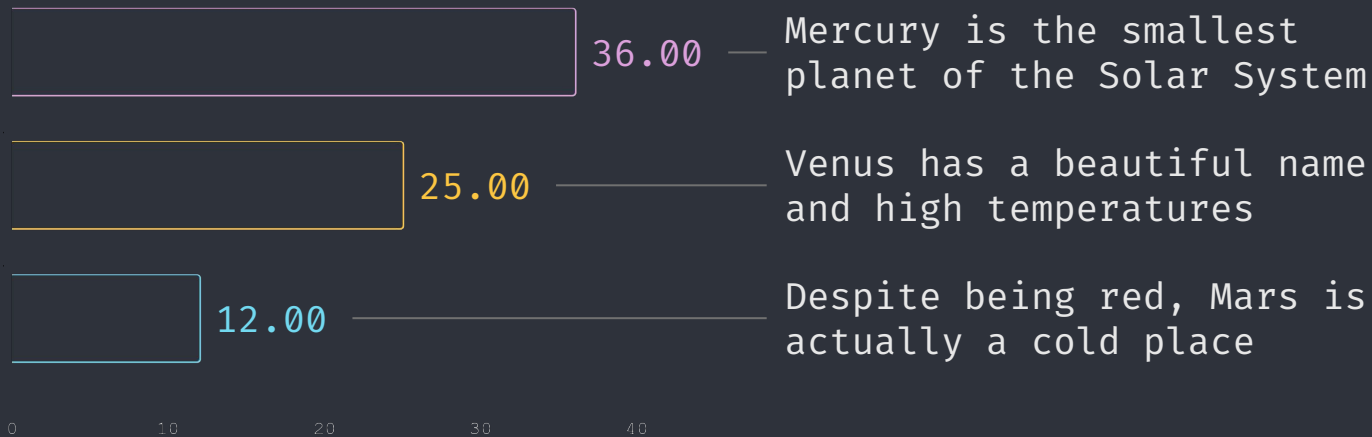


O P T U N A

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Awesome {
Words;
|
}

Did You Know 'This ?' {



}

Follow the link in the graph to modify its data and then paste the new one here. **For more info, click here**

A 'Picture' Always Reinforces The Concept {

< Images reveal large amounts of data, so remember: use an image instead of a long text. Your audience will appreciate it >

}



```
1  
2  
3  
4 150,005,630 {  
5  
6
```

```
7  
8   < Big numbers catch your audience's attention >  
9
```

```
10 }  
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```

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```
< “This is a quote, words full of  
wisdom that someone important said and  
can make the reader get inspired.” >
```

```
– Someone ‘Famous’
```

Review 'Concepts' {

< Mercury is the
closest planet to
the Sun and the
smallest one in the
Solar System >

● Venus ● Ceres ● Saturn



}

Planning of 'September' {

M	T	W	T	F	S	S	
		01	02	03	04	05	Mercury is the smallest planet
06	07	08	09	10	11	12	Venus has a beautiful name
13	14	15	16	17	18	19	The Earth is the third planet
20	21	22	23	24	25	26	Mars is actually a cold place
27	28	29	30				Jupiter is a gas giant

}

JavaScript For 'Beginners' {

Mercury

It is the closest
planet to the Sun

Mars

Despite being red,
Mars is a cold place

Jupiter

Jupiter is the
biggest planet

Venus

Venus is the second
planet from the Sun

Saturn

Saturn is a gas giant
and has several rings

Neptune

Neptune is very far
from the Earth

}

Desktop Software {

You can replace the
image on the screen
with your own work.
Just delete this one,
add yours and center
it properly

}



```
1 Thanks; {
```

```
2  
3 'Do you have any questions?'
```

```
4  
5 youremail@freepik.com
```

```
6 +91 620 421 838
```

```
7 yourcompany.com
```



```
10 CREDITS: This presentation template was  
11 created by Slidesgo, including icons by  
12 Flaticon, and infographics & images by Freepik
```

```
13 < Please keep this slide for attribution >
```

```
14 }
```

forbeginners.html

workshop.css

Web 'Design'



Programming Language

Alternative 'Resources' {

Here's an assortment of alternative resources
whose style fits the one of this template

Photos:

- * Portrait hacker I
- * Portrait hacker II

}

Resources {

Did you like the resources on this template? Get them for free at our other websites:

Photos:

- * Close up hacker
- * Medium shot woman working computer

Icons:

- * Web design

}

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(<https://fonts.google.com/specimen/Fira+Code>)

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#e7e7e7

ffffff

ff5858

fcc642

dba0db

72d9f0

a5cf27

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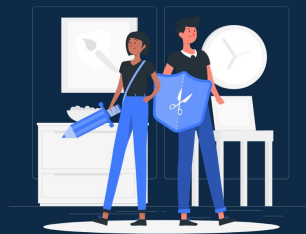
Pana



Amico



Bro



Rafiki



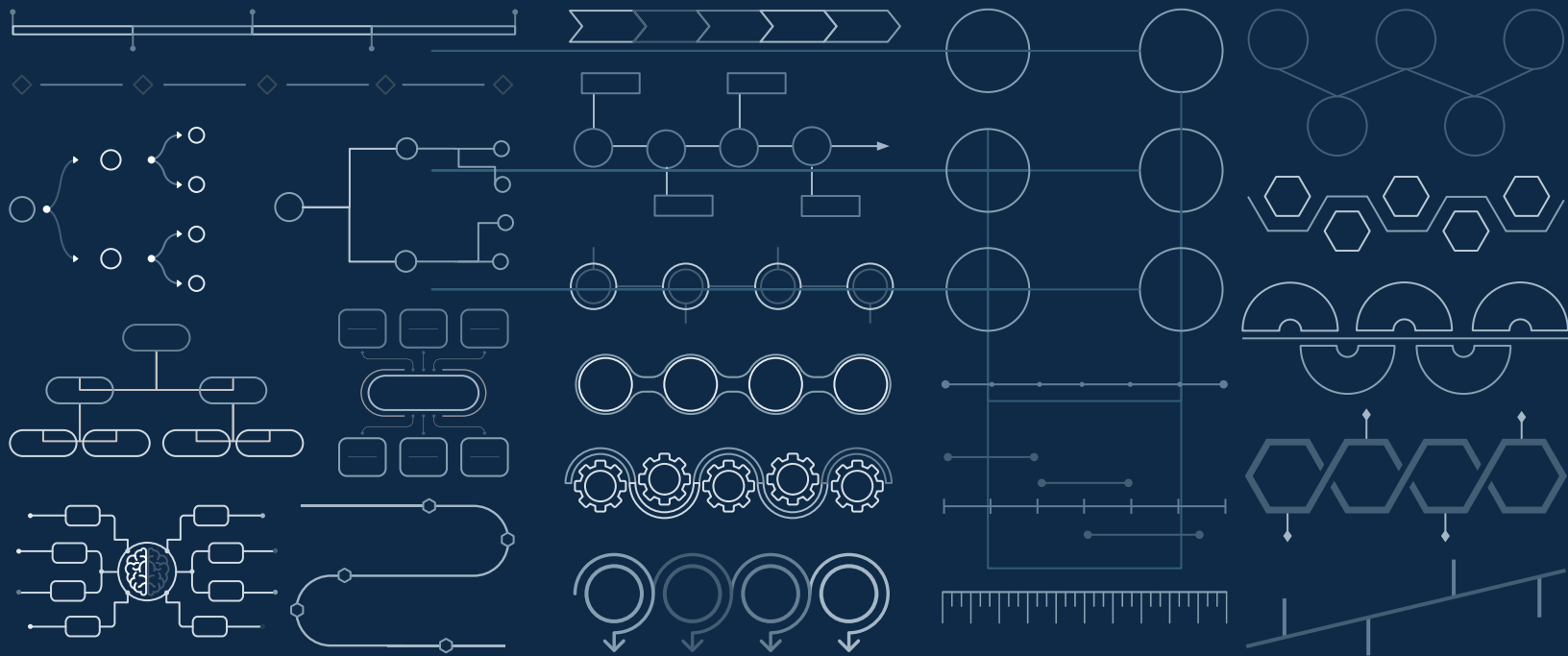
Cuate

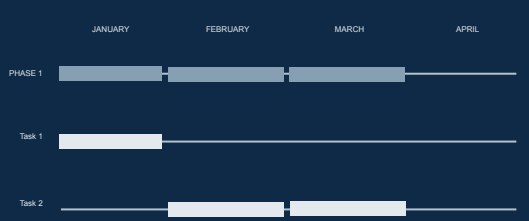
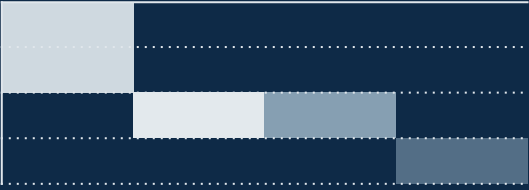
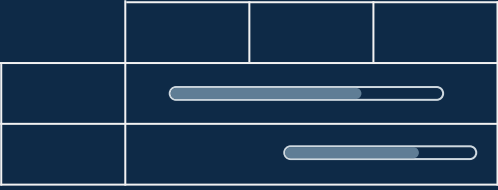
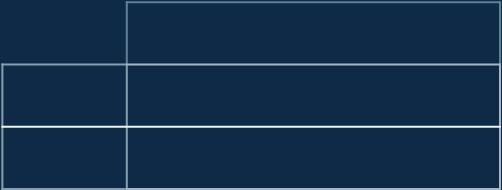
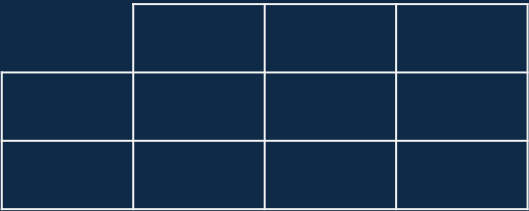
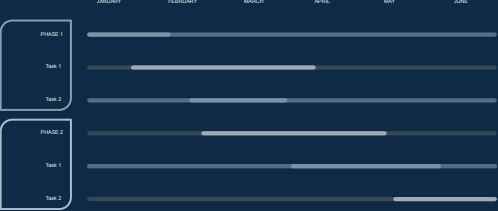
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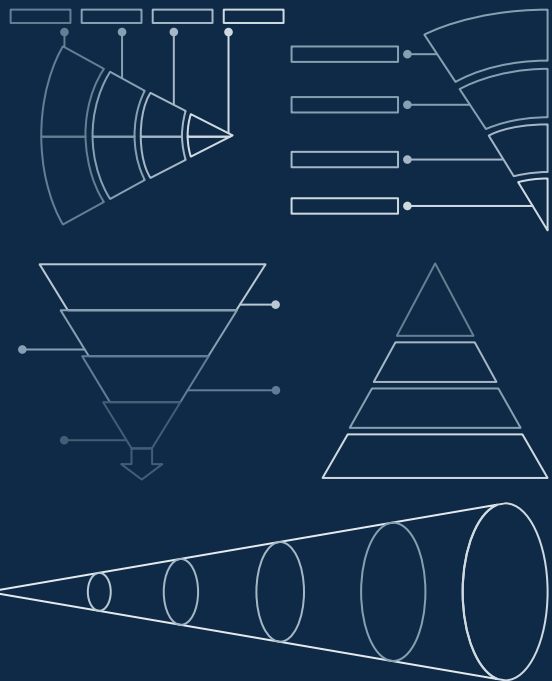
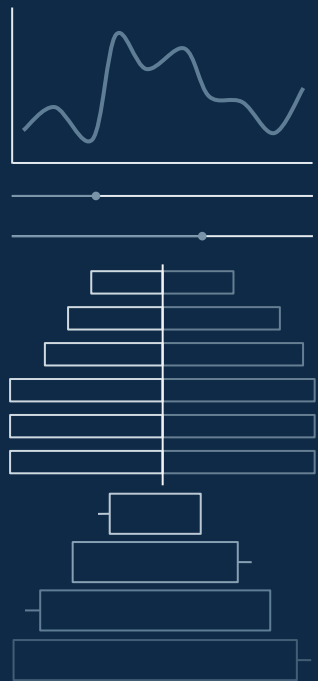
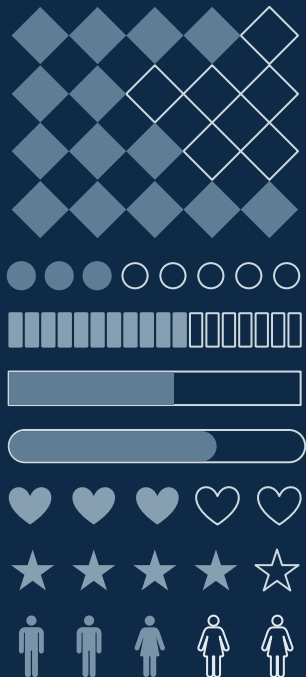
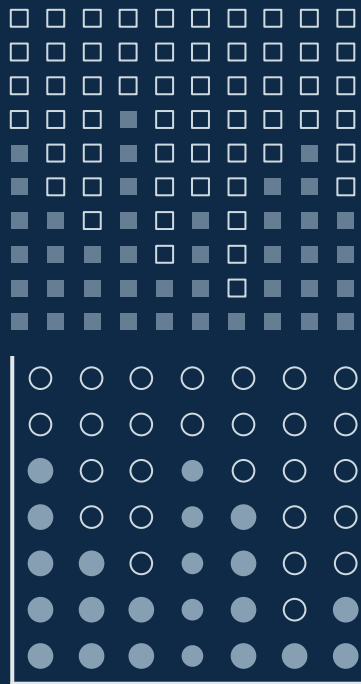












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In Google Slides, you can also use **Flaticon's extension**, allowing you to customize and add even more icons.



Educational Icons



Medical Icons



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Creative Process Icons



Performing Arts Icons



Nature Icons



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