

VMware 설치파일 다운로드

링크 참고: <https://foxydog.tistory.com/176>

설치파일 다운로드 이후 실행

▼ 오늘 (2)



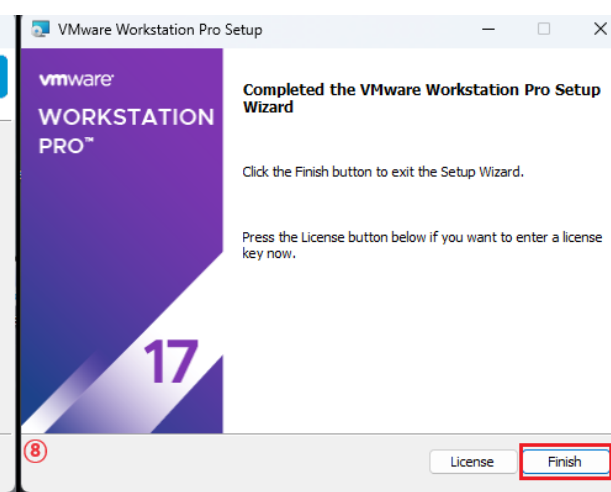
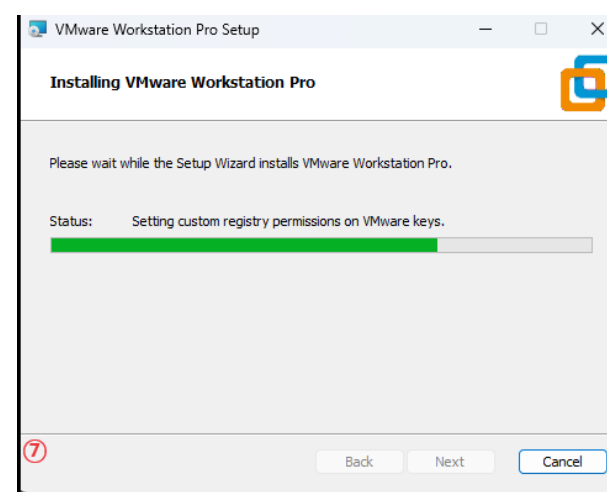
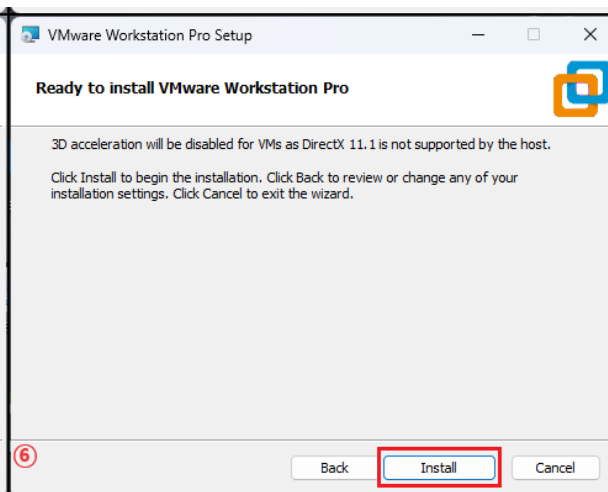
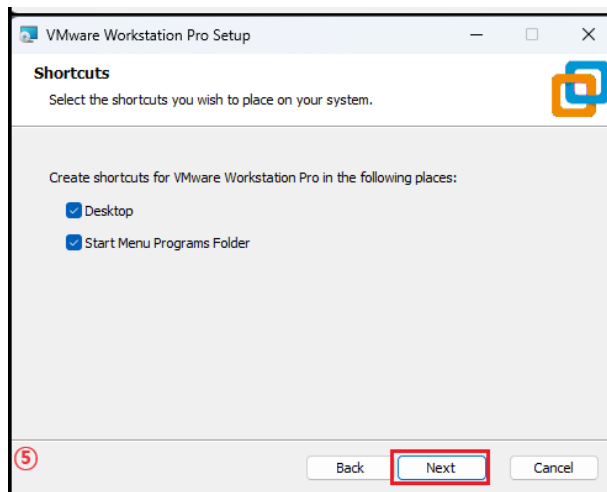
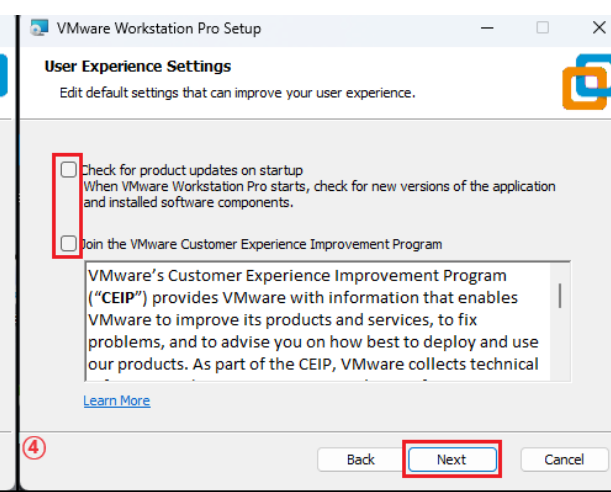
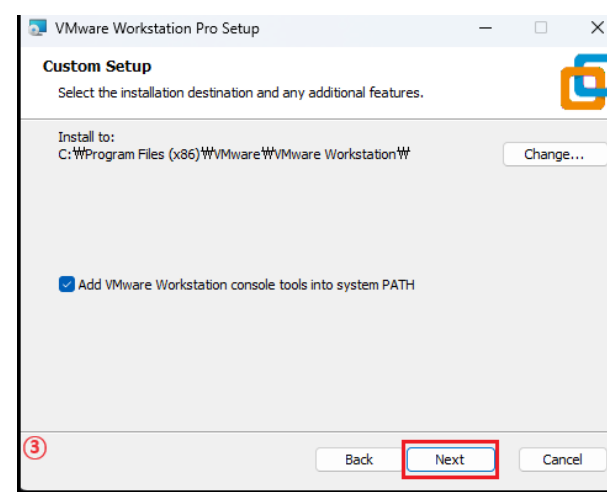
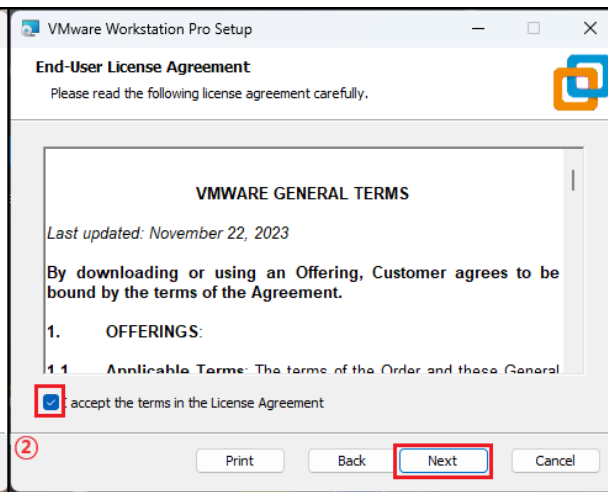
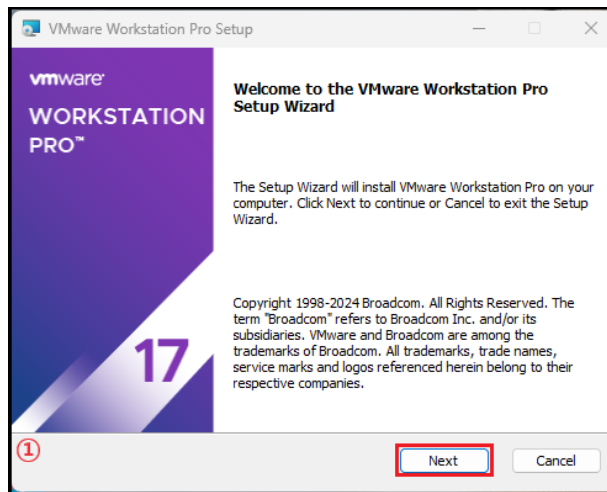
VMware-workstation-full-17.6.2-24409...

2025-09-03 오후 4:37

응용 프로그램

458,684KB

VMware 설치



Ubuntu 22.04 다운로드

링크: <https://mirror.kakao.com/ubuntu-releases/jammy/> 접속하여 Ubuntu 22.04.5 LTS 다운로드

ubuntu[®] releases

Ubuntu 22.04.5 LTS (Jammy Jellyfish)

Select an image

Ubuntu is distributed on three types of images described below.

Desktop image

The desktop image allows you to try Ubuntu without changing your computer at all, and at your option to install it permanently later. This type of image is what most people will want to use. You will need at least 1024MiB of RAM to install from this image.

64-bit PC (AMD64) desktop image

Choose this if you have a computer based on the AMD64 or EM64T architecture (e.g., Athlon64, Opteron, EM64T Xeon, Core 2). Choose this if you are at all unsure.

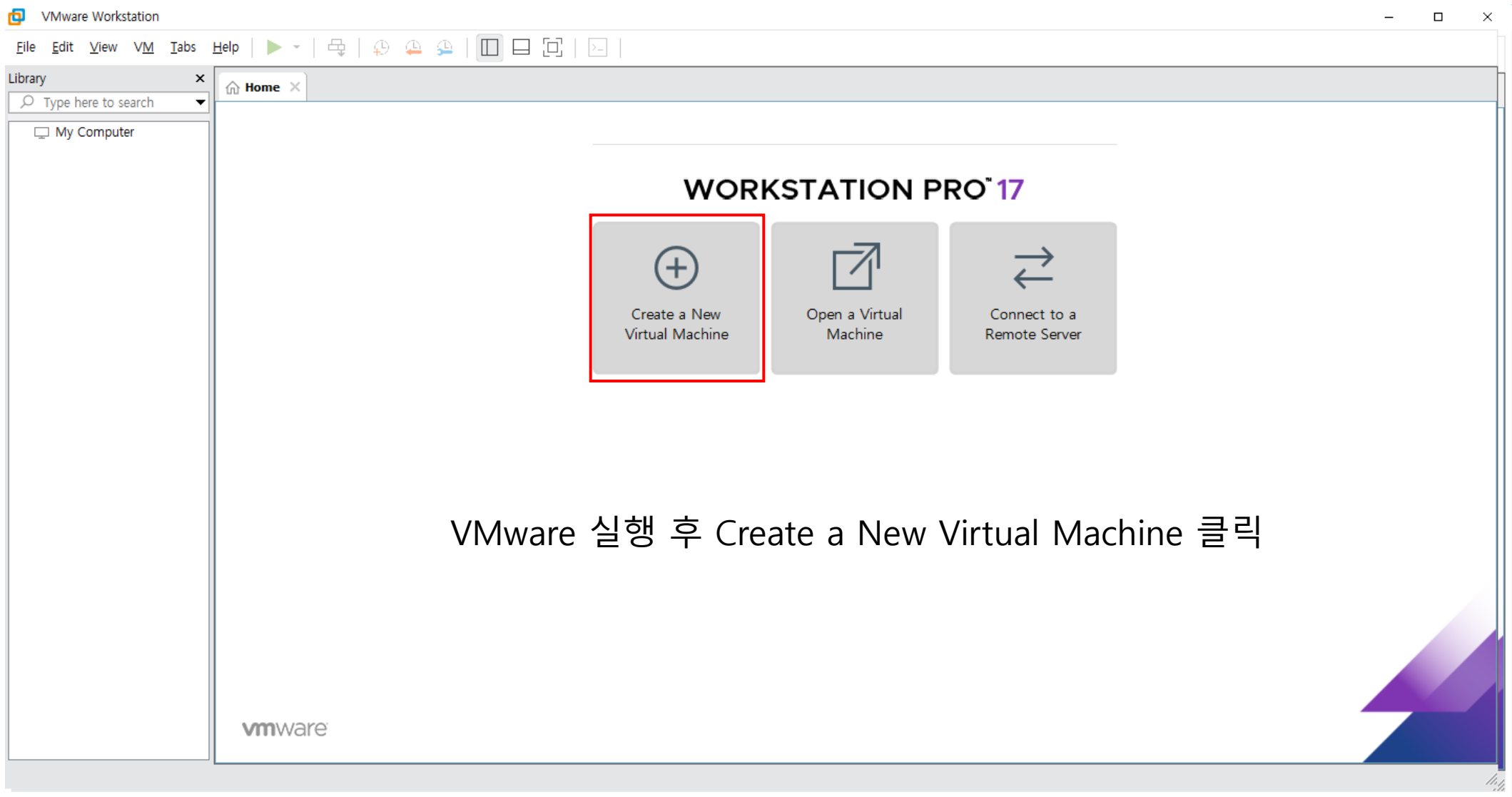
Server install image

The server install image allows you to install Ubuntu permanently on a computer for use as a server. It will not install a graphical user interface.

64-bit PC (AMD64) server install image

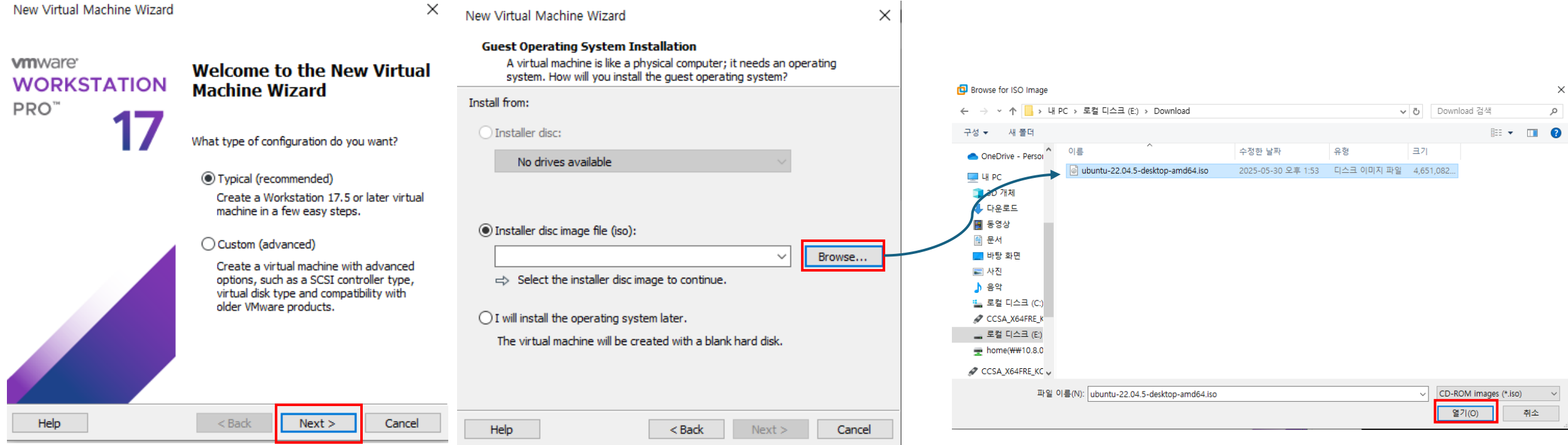
Choose this if you have a computer based on the AMD64 or EM64T architecture (e.g., Athlon64, Opteron, EM64T Xeon, Core 2). Choose this if you are at all unsure.

Ubuntu 22.04 설치 @ VMware



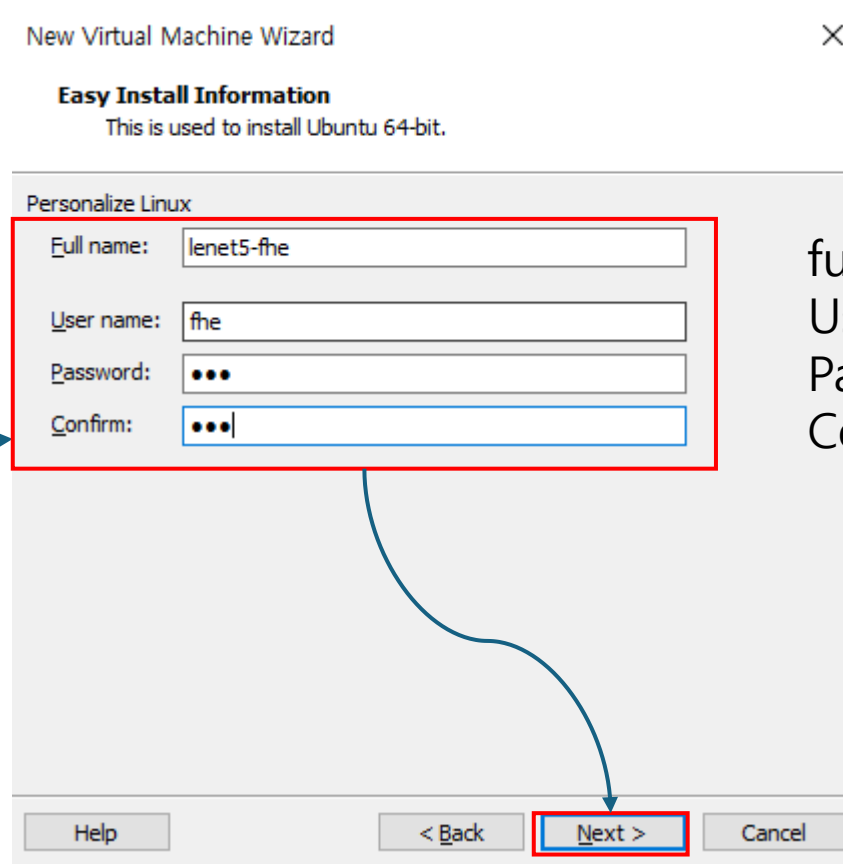
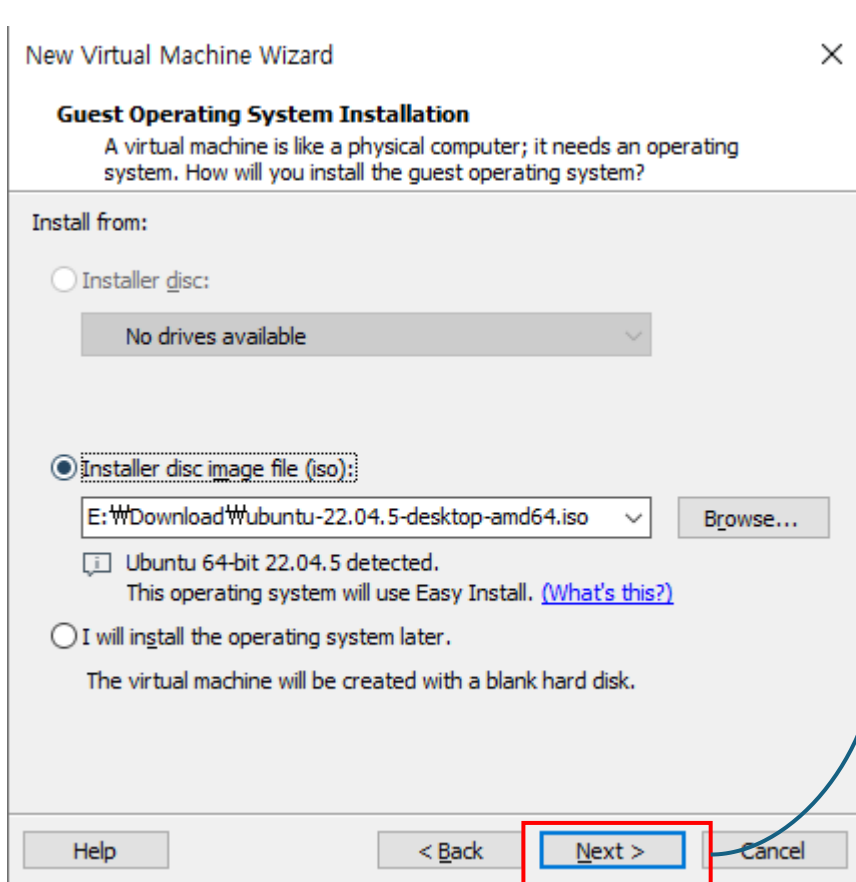
VMware 실행 후 Create a New Virtual Machine 클릭

Ubuntu 22.04 설치 @ VMware



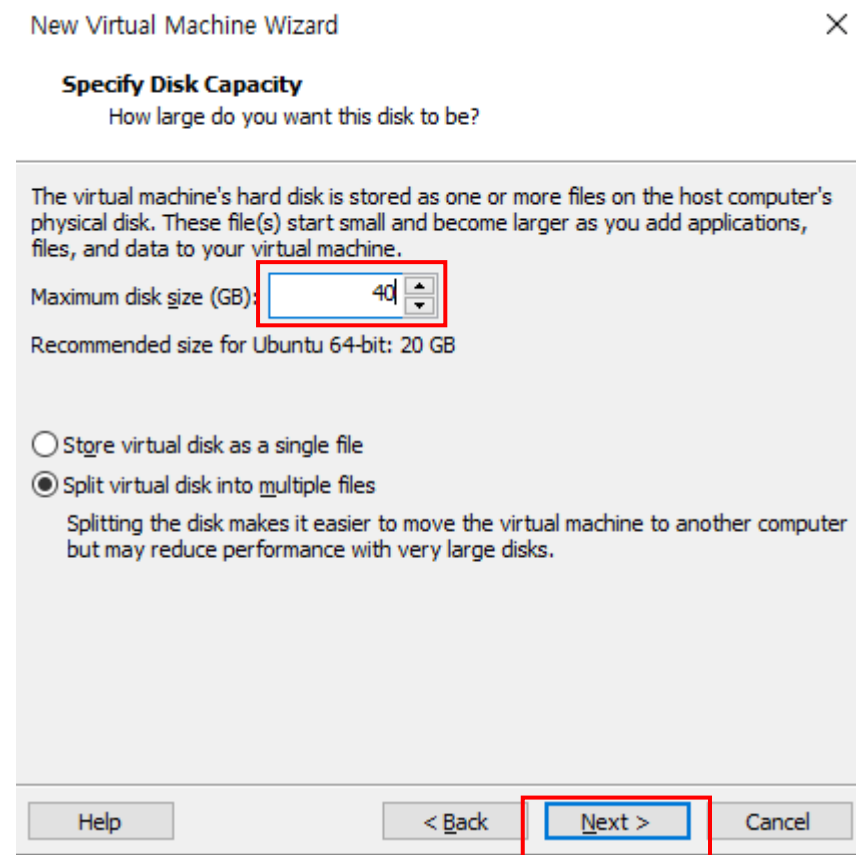
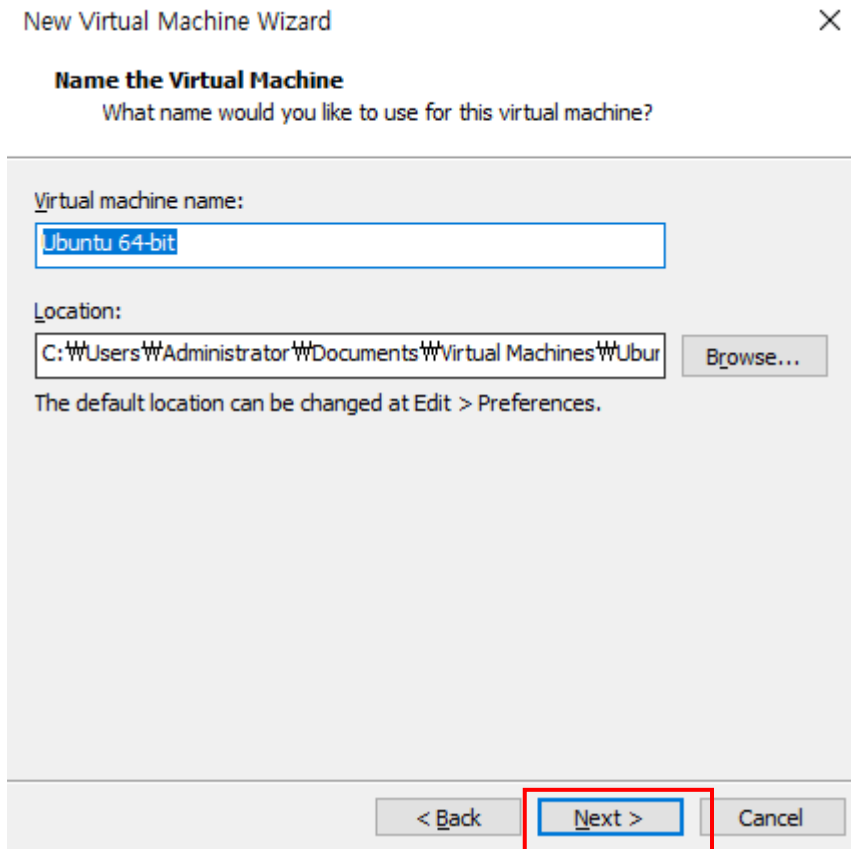
Next > Browse > 다운로드한 Ubuntu 22.04.5 desktop 선택

Ubuntu 22.04 설치 @ VMware



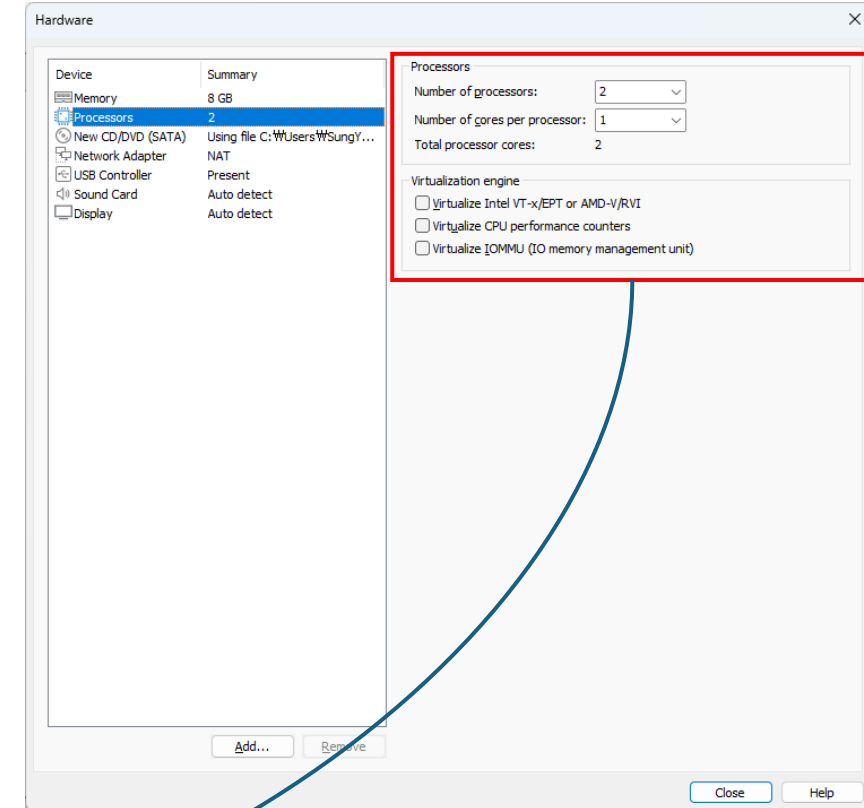
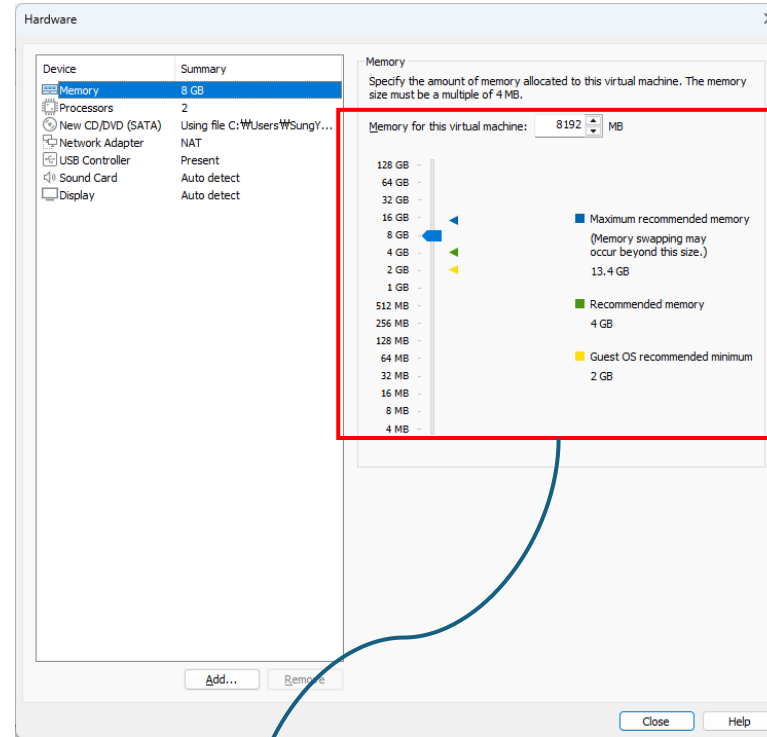
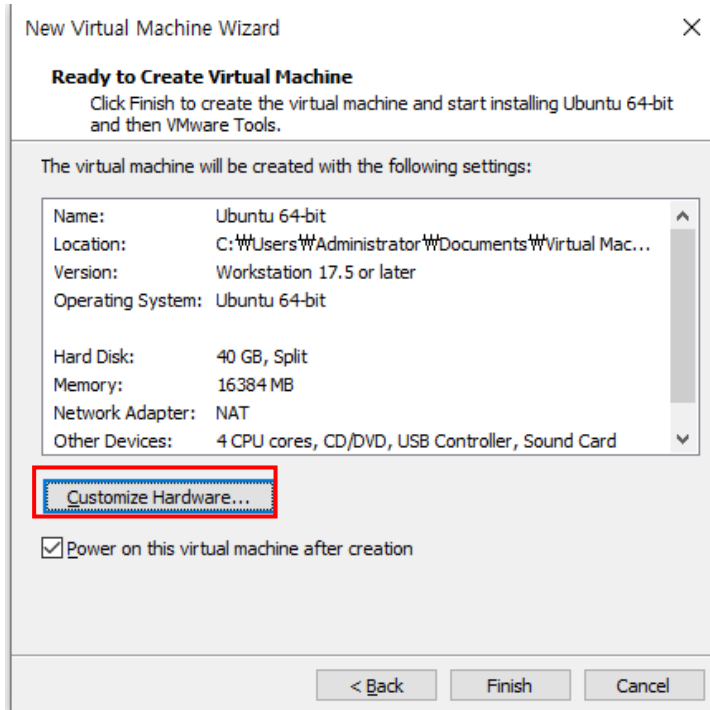
full name: lenet5-fhe
User name: fhe
Password: fhe
Confirm: fhe

Ubuntu 22.04 설치 @ VMware



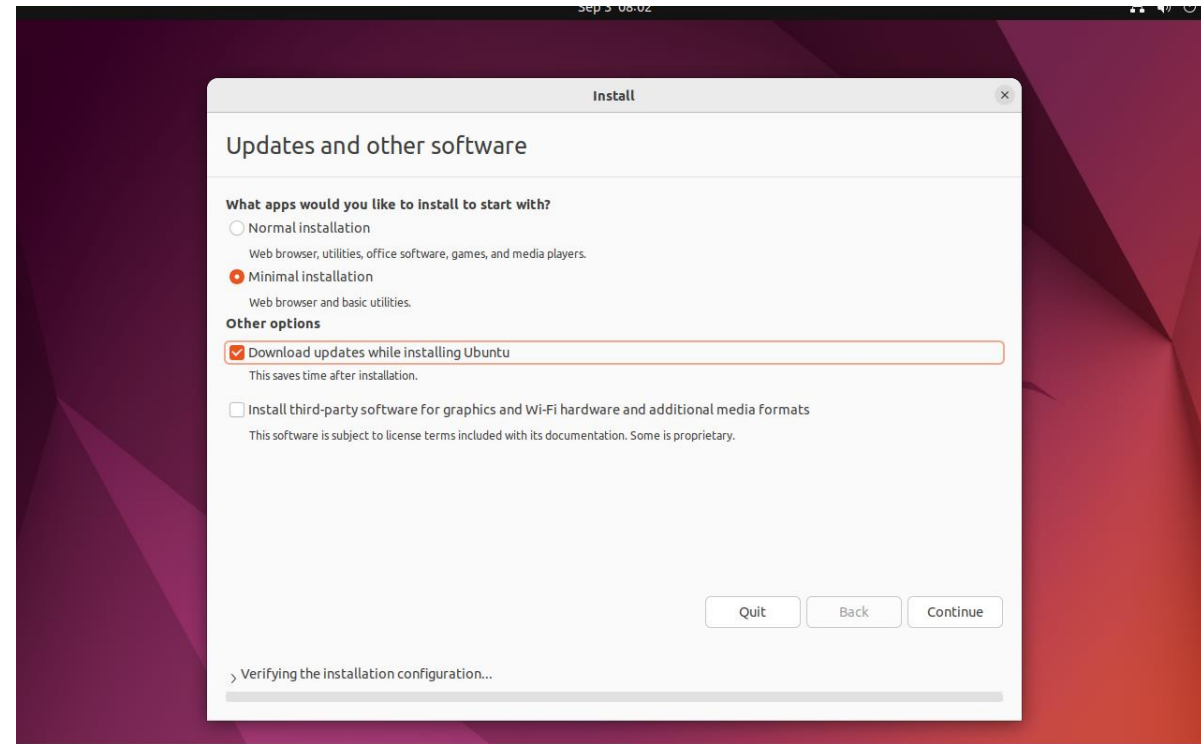
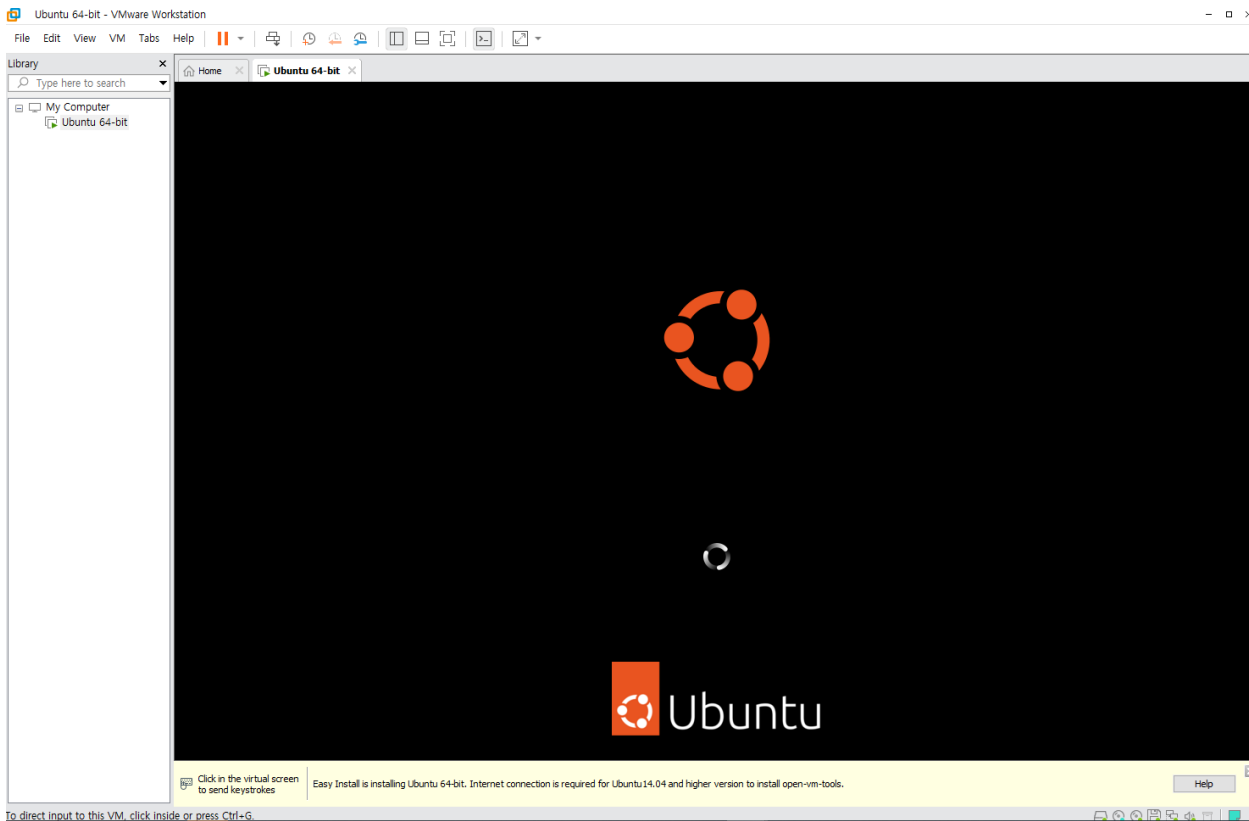
용량은 40GB로 설정

Ubuntu 22.04 설치 @ VMware

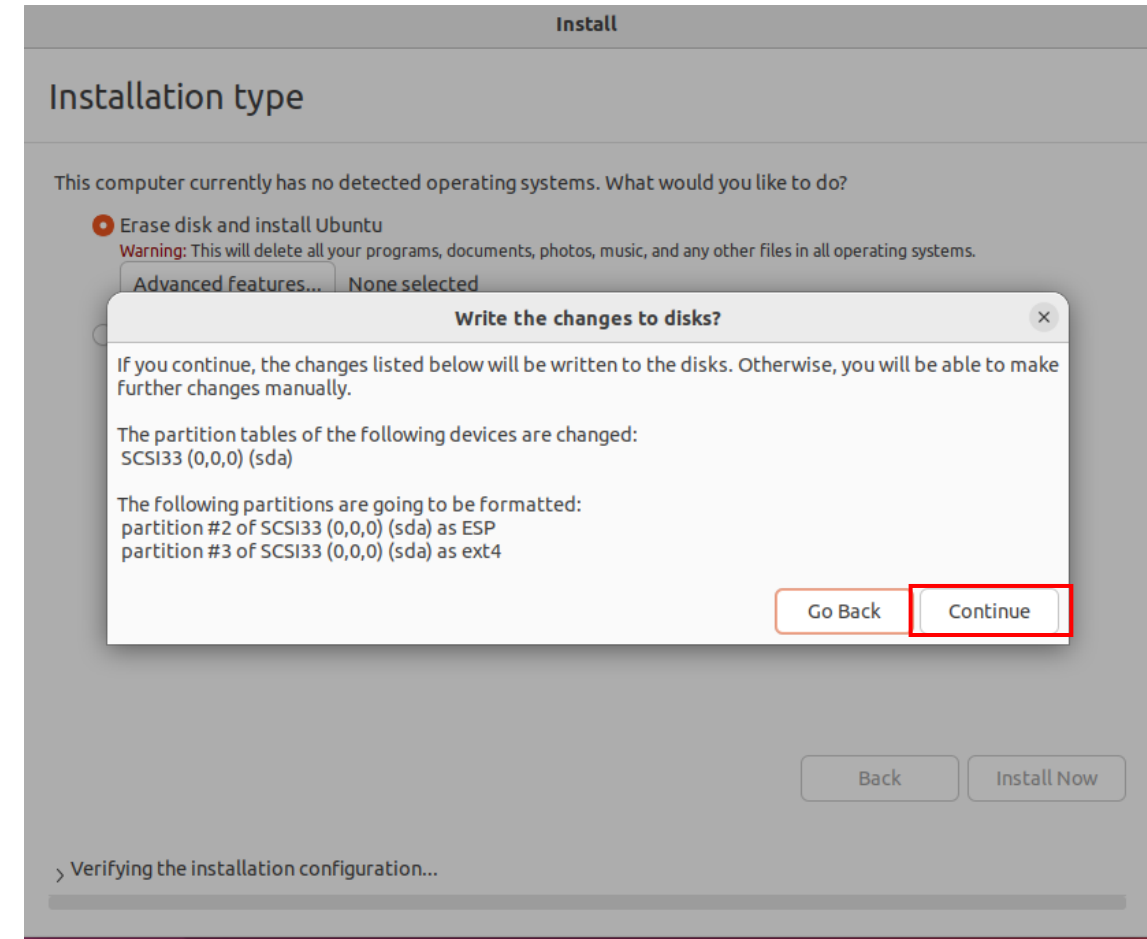
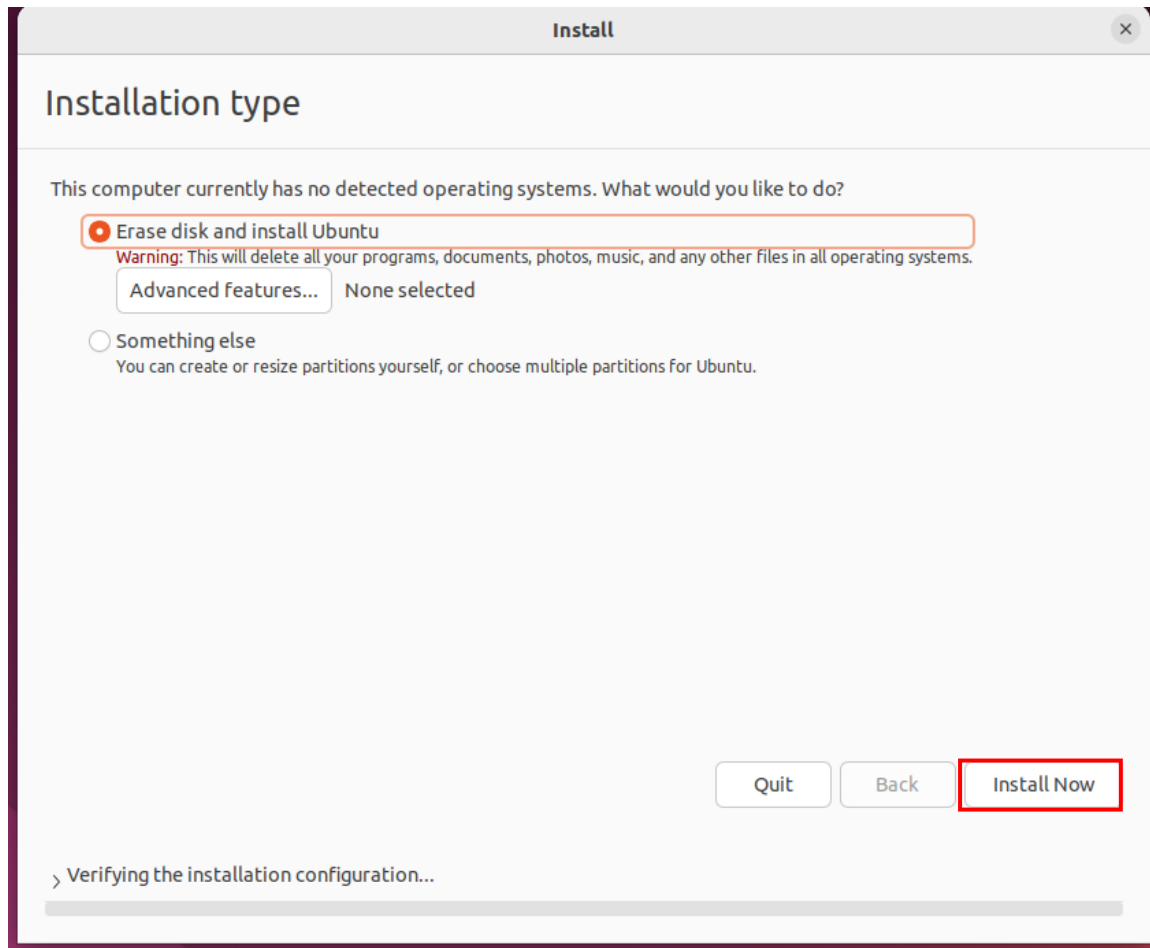


메모리는 8GB 이상, Maximum 이하로 설정
Processor는 2개로 설정

Ubuntu 22.04 설치 @ VMware




Ubuntu 22.04 설치 @ VMware



Ubuntu 22.04 설치 @ VMware

Install

Where are you?



Seoul

Back Continue

> Creating ext4 file system for / in partition #3 of SCSI33 (0,0,0) (sda)...

Install

Who are you?

Your name: fhe ✓

Your computer's name: fhe-virtual-machine ✓
The name it uses when it talks to other computers.

Pick a username: fhe ✓

Choose a password: ●●● Short password

Confirm your password: ●●● ✓

☐ Log in automatically

☒ Require my password to log in

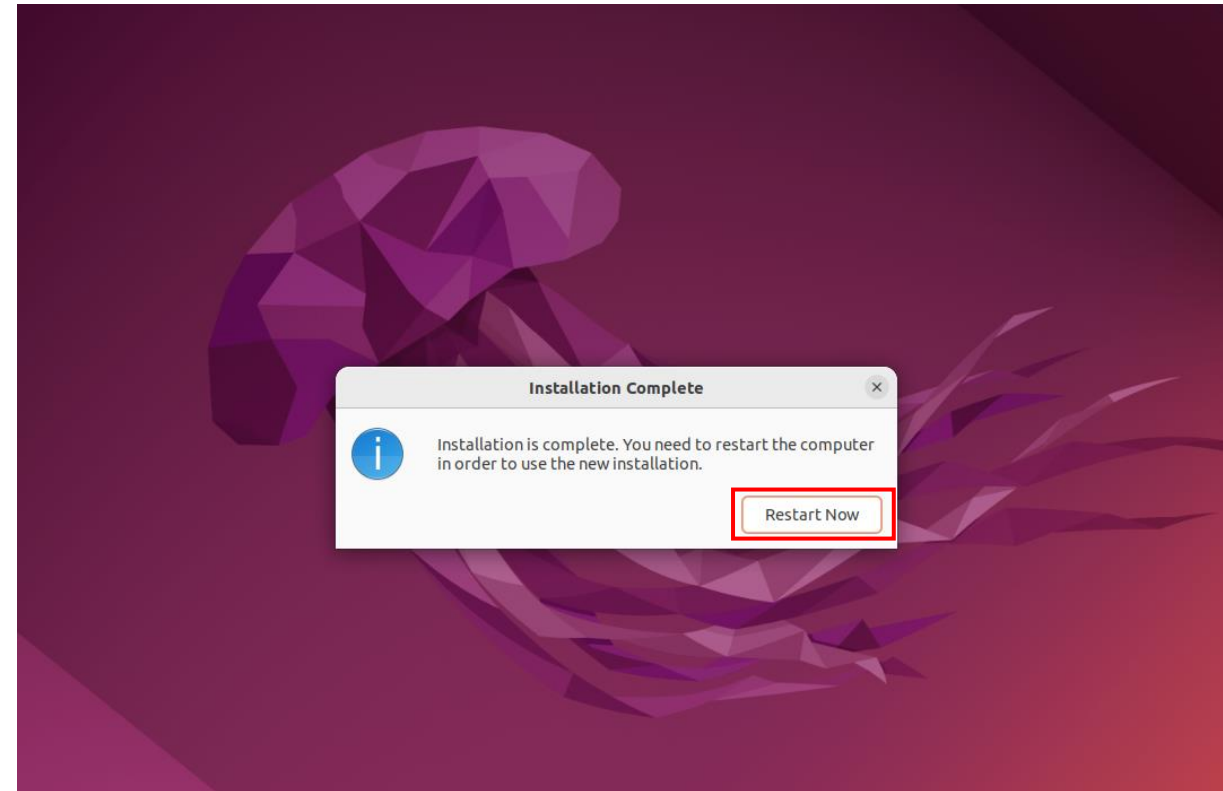
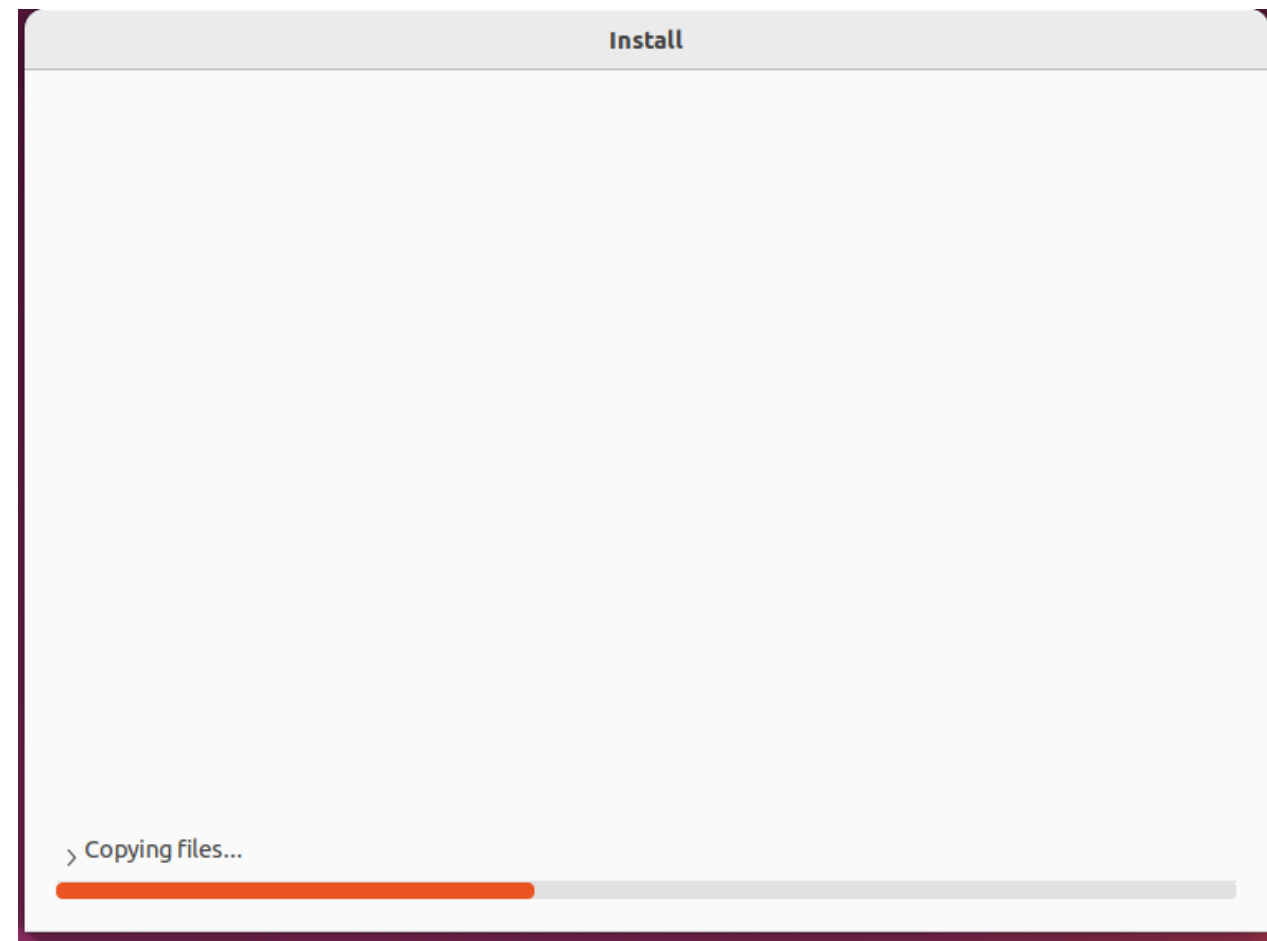
☐ Use Active Directory
You'll enter domain and other details in the next step.

Back Continue

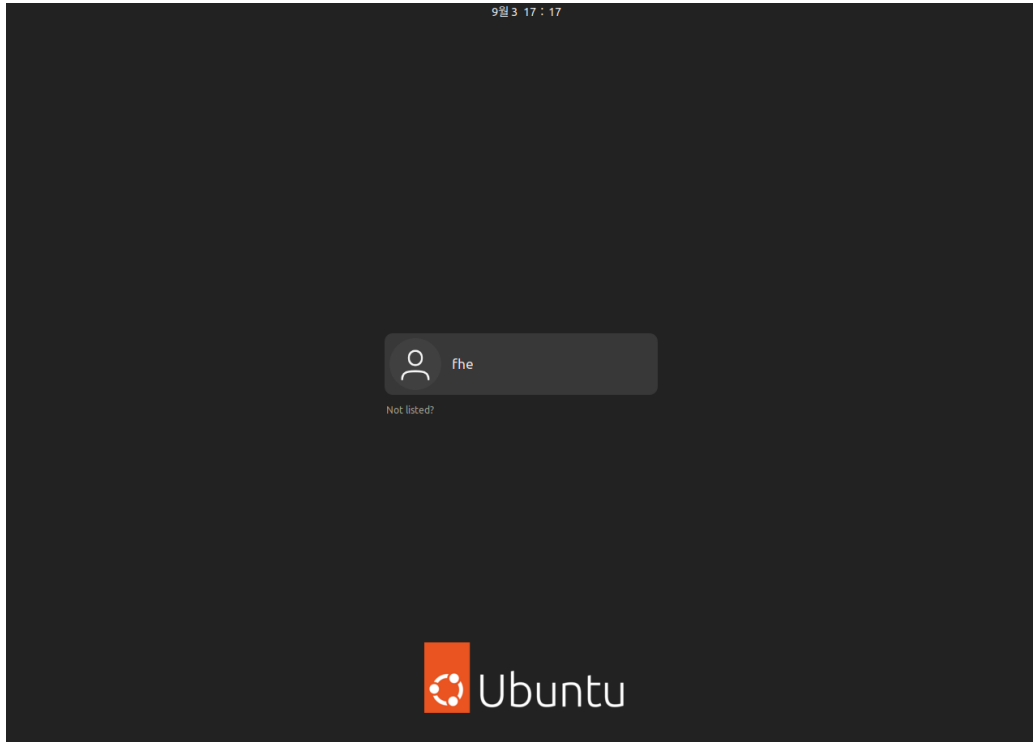
> Copying files...

User name: fhe
Password: fhe
Confirm: fhe

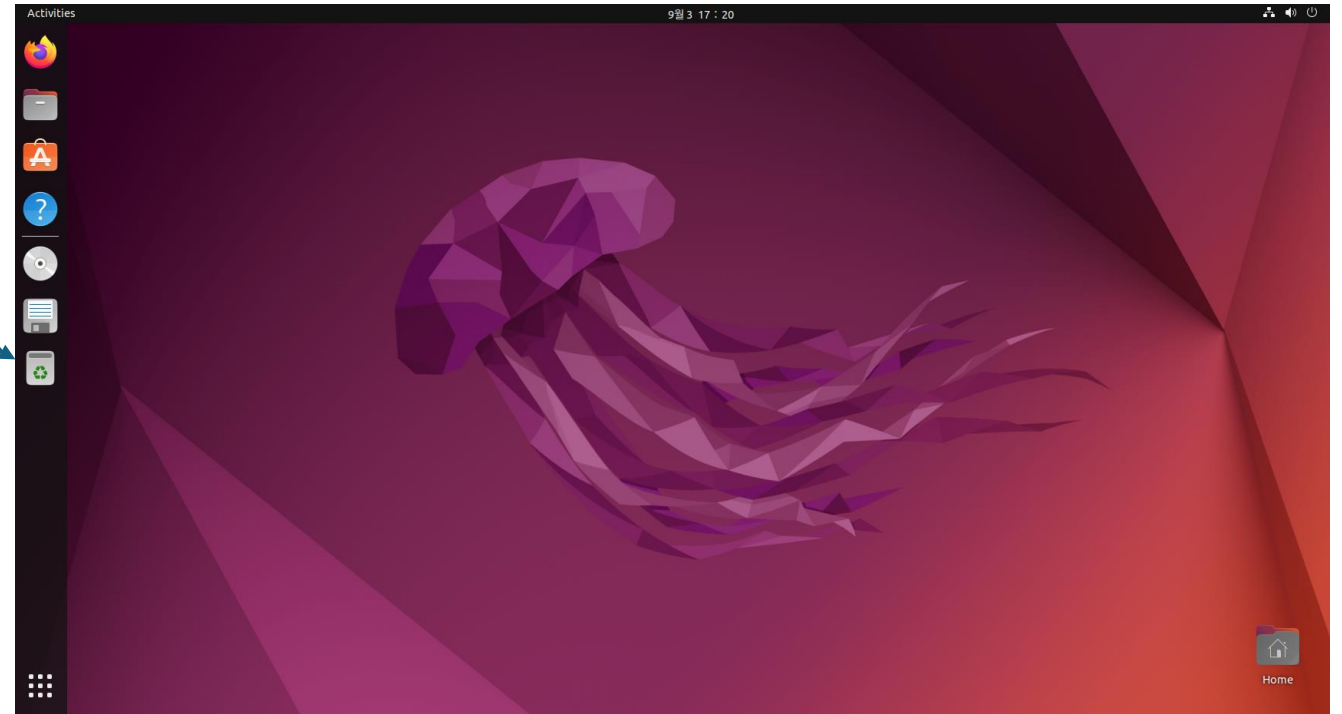
Ubuntu 22.04 설치 @ VMware



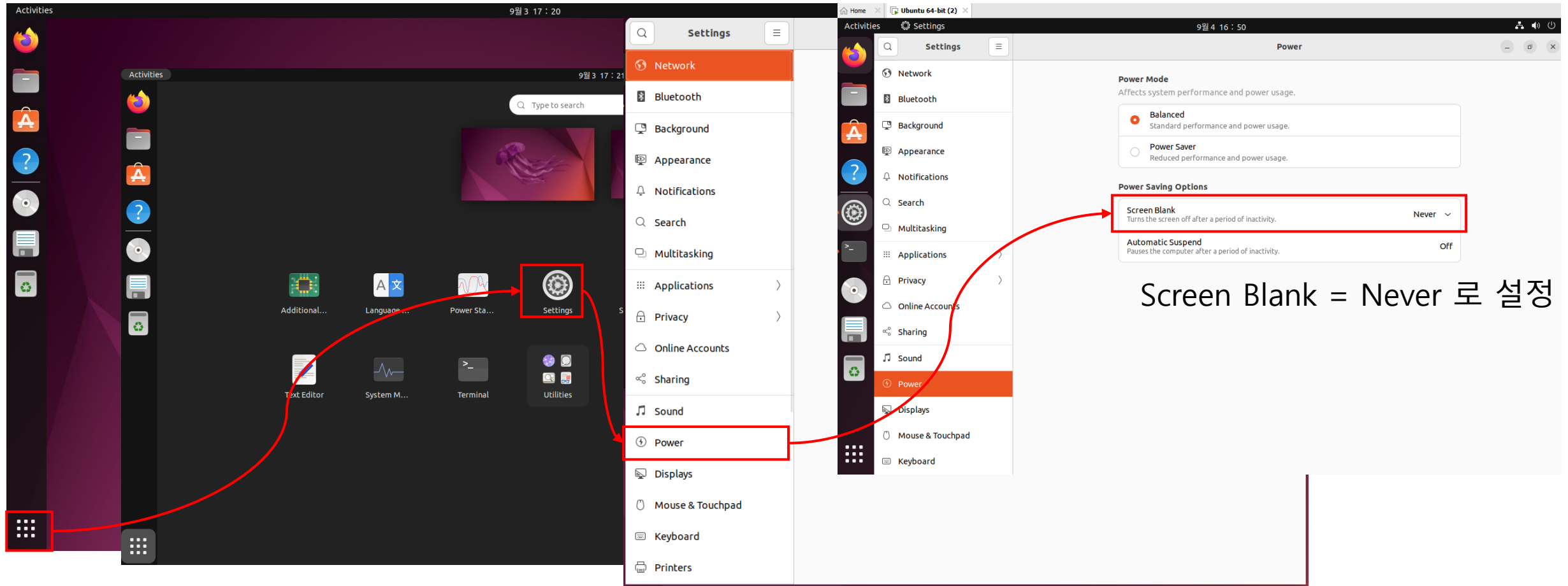
Ubuntu 22.04 Boot-up @ VMware



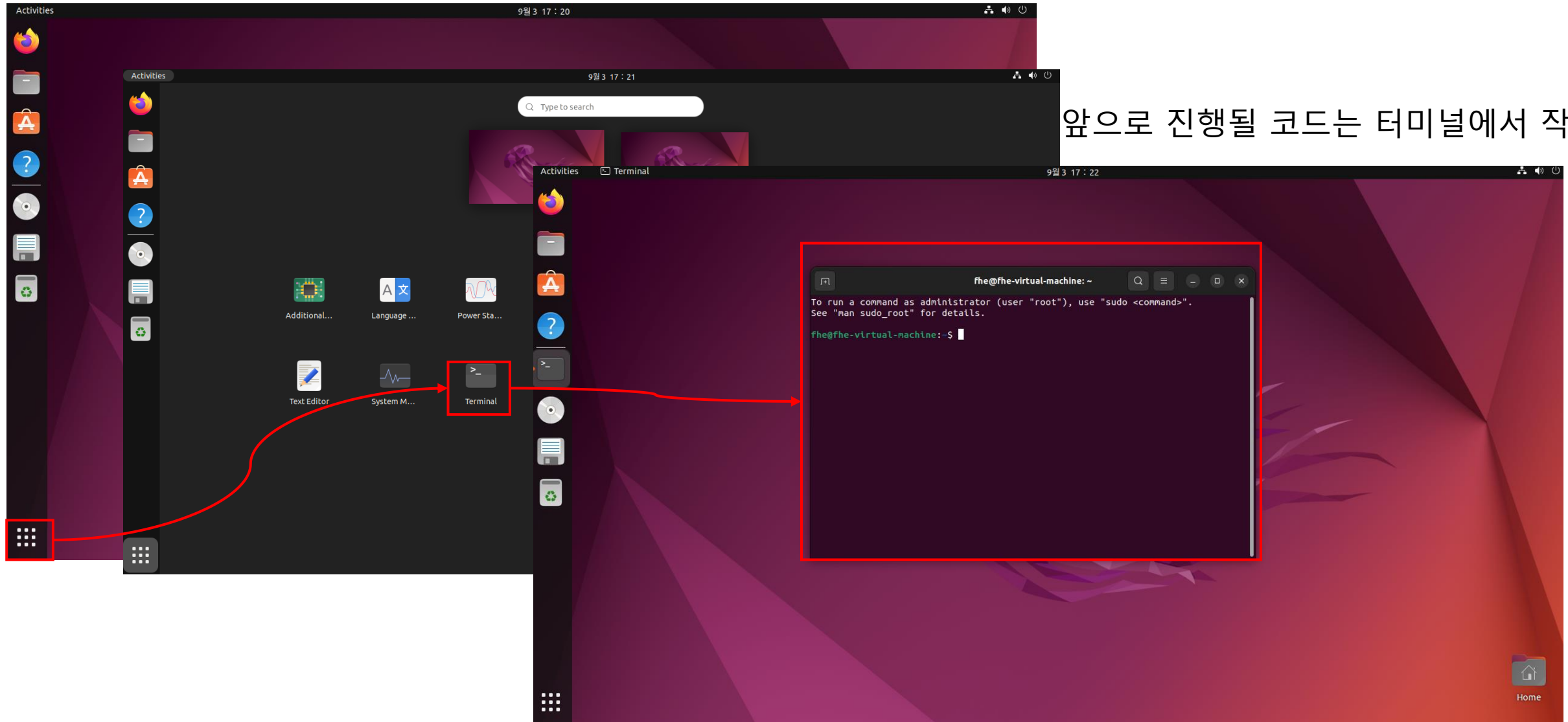
사용자 아이콘 클릭 후 비밀번호 입력



Ubuntu 초기 세팅 @ VMware



Terminal 실행 @ VMware



Ubuntu 22.04 설치 @ VMware

```
fhe@fhe-virtual-machine:~$ sudo apt install git  
[sudo] password for fhe:
```

sudo apt install git

비밀번호 입력 후 (가이드를 따라왔다면 fhe)

Do you want to continue?시 Y 입력

```
fhe@fhe-virtual-machine: ~/430.658  
fhe@fhe-virtual-machine:~$ git clone https://github.com/SNUSOR-PECT/430.658.git  
Cloning into '430.658'...  
remote: Enumerating objects: 1025, done.  
remote: Counting objects: 100% (349/349), done.  
remote: Compressing objects: 100% (117/117), done.  
remote: Total 1025 (delta 34), reused 301 (delta 15), pack-reused 676 (from 2)  
Receiving objects: 100% (1025/1025), 42.07 MiB | 11.13 MiB/s, done.  
Resolving deltas: 100% (50/50), done.  
fhe@fhe-virtual-machine:~$ cd 430.658  
fhe@fhe-virtual-machine:~/430.658$ sudo bash setup.sh  
[sudo] password for fhe:
```

git clone https://github.com/SNUSOR-PECT/430.658.git

cd 430.658

sudo bash setup.sh

Environment Setup @ VMware

```
fhe@fhe-virtual-machine: ~/LeNet5-with-OpenFHE
[ 48%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/scheme/gen-cryptocontext-params-impl.cpp.o
[ 48%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/scheme/gen-cryptocontext-params-validation.cpp.o
[ 48%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/scheme/scheme-ld-impl.cpp.o
[ 49%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/scheme/scheme-swch-params.cpp.o
[ 49%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/schemebase/base-cryptoparameters.cpp.o
[ 49%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/schemebase/base-fhe.cpp.o
[ 49%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/schemebase/base-advancedshe.cpp.o
[ 50%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/schemebase/base-leveledshe.cpp.o
[ 50%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/schemebase/base-multiparty.cpp.o
[ 50%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/schemebase/base-parametergeneration.cpp.o
[ 50%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/schemebase/base-pke.cpp.o
[ 51%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/schemebase/base-pre.cpp.o
[ 51%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/schemebase/rlwe-cryptoparameters-impl.cpp.o
[ 51%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/schemebase/base-scheme.cpp.o
[ 51%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/schemerns/rns-cryptoparameters.cpp.o
[ 52%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/schemerns/rns-leveledshe.cpp.o
[ 52%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/schemerns/rns-multiparty.cpp.o
[ 52%] Building CXX object src/pke/CMakeFiles/pkeobj.dir/lib/schemerns/rns-pke.cpp.o
[ 52%] Linking CXX executable ../../bin/examples/binfhe/boolean-ap
[ 52%] Linking CXX executable ../../bin/examples/binfhe/eval-flooring
[ 53%] Linking CXX executable ../../bin/examples/binfhe/boolean
[ 53%] Linking CXX executable ../../bin/examples/binfhe/boolean-lmkdey
[ 54%] Linking CXX executable ../../bin/examples/binfhe/pke/boolean-ap-pke
[ 54%] Linking CXX executable ../../bin/examples/binfhe/pke/boolean-pke
[ 54%] Linking CXX executable ../../bin/examples/binfhe/pke/eval-flooring-pke
[ 54%] Linking CXX executable ../../bin/examples/binfhe/eval-function
[ 54%] Built target boolean-ap
[ 54%] Linking CXX executable ../../bin/examples/binfhe/eval-sign
[ 54%] Built target boolean
[ 54%] Built target eval-flooring
[ 54%] Built target boolean-lmkdey
[ 54%] Linking CXX executable ../../bin/examples/binfhe/eval-decomp
[ 54%] Built target boolean-ap-pke
[ 54%] Linking CXX executable ../../bin/examples/binfhe/pke/eval-function-pke
[ 54%] Built target boolean-pke
[ 54%] Built target eval-flooring-pke
[ 54%] Built target eval-function
[ 54%] Built target eval-sign
[ 54%] Built target eval-decomp
[ 54%] Built target eval-function-pke
[ 54%] Linking CXX executable ../../bin/examples/binfhe/boolean-truth-tables
[ 55%] Linking CXX executable ../../bin/examples/binfhe/boolean-multi-input
[ 55%] Built target boolean-truth-tables
[ 55%] Linking CXX executable ../../bin/examples/binfhe/pke/boolean-truth-tables-pke
[ 55%] Built target boolean-multi-input
[ 55%] Built target boolean-truth-tables-pke
```

설치과정 진행 중 화면

Environment Setup @ VMware

```
fhe@fhe-virtual-machine: ~  
fhe@fhe-virtual-machine:~$ /opt/conda/bin/conda init bash
```

설치 완료 후 /opt/conda/bin/conda init bash 입력후 터미널 종료

새로운 Terminal 창에서 코드 입력 : conda activate py_3_10

```
(base) fhe@fhe-virtual-machine:~$ conda activate py_3_10  
base가 코드 입력 이후 py_3_10 으로 바뀜  
(py_3_10) fhe@fhe-virtual-machine:~$
```

```
(py_3_10) fhe@fhe-virtual-machine:~$ cd ~  
(py_3_10) fhe@fhe-virtual-machine:~$ cd 430.658  
(py_3_10) fhe@fhe-virtual-machine:~/430.658$
```

cd ~
cd 430.658

```
(py_3_10) fhe@fhe-virtual-machine:~/430.658$ python main.py  
=== Execution Mode Selection ===  
1. Python Baseline Inference  
2. CPP FHE Inference  
Enter 1 or 2: 
```

python main.py 실행

프로그램 실행

```
(py_3_10) fhe@fhe-virtual-machine:~/430.658$ python main.py
=== Execution Mode Selection ===
1. Python Baseline Inference
2. CPP FHE Inference
Enter 1 or 2: █
```

```
Enter 1 or 2: 2
Select Activation function:
0: linear (x)
1: square (x^2)
2: CryptoNet (0.25 + 0.5 * x + 0.125 * x^2)
3: quad (0.234606 + 0.5 * x + 0.204875 * x^2 - 0.0063896 * x^4)
4: student (custom polynomial)
```

- 1: Python 기반 코드 실행
- 2: FHE 기반 코드 실행

<ReLU 선택창>

0. $f(x) = x$
1. $f(x) = x^2$
2. $f(x) = 0.125x^2 + 0.5x + 0.25$
3. $f(x) = -0.0063896x^4 + 0.204875x^2 + 0.5x + 0.234606$
4. $f(x) = ?? \leftarrow$ Student's Job

선택 시 단일 추론 실행

프로그램 실행

```
+-----+
| Selected Activation Function |
+-----+
| Name: CryptoNet             |
| Formula: 0.25 + 0.5 * x + 0.125 * x**2 |
+-----+

Weights and BN parameters loaded from ./pytorch_LeNet5/parameters_standard
[INFO] Generating input image for CPP FHE...
[INFO] Image saved to input_image.txt
[INFO] FC3 output saved to fc3_output.txt
True Label: 8
Predicted Label: 8

Input image:

      .:::.. .:.
      .: -+###%= =#+.
      -*#####* +%*
      .=%#####* .%+.
      :+%%#-:-*%-.*%+
      :*##=: :*#=-#%-
      .+%#- . :+=.*%=.
      -##%+ .::*%*:
      =##- :*%*-
      =##- :*%*-
      :##%+ :+%%+
      +%#- -##%-
      :*##=,=##%-
      :*##*##%*:
      .=%#####+:
      .-#####-
      .=#####=.
      *###+-#%*-
      =%%*: +%*:
      =%%=. .=%%+.
      .##%=--*%%+:
      .%#####%+:
      .*#####*=.
      :==+++=:
```

input Image
True Label : 참값
Predicted Label : 선택한 ReLU 사용 추론값

프로그램 실행

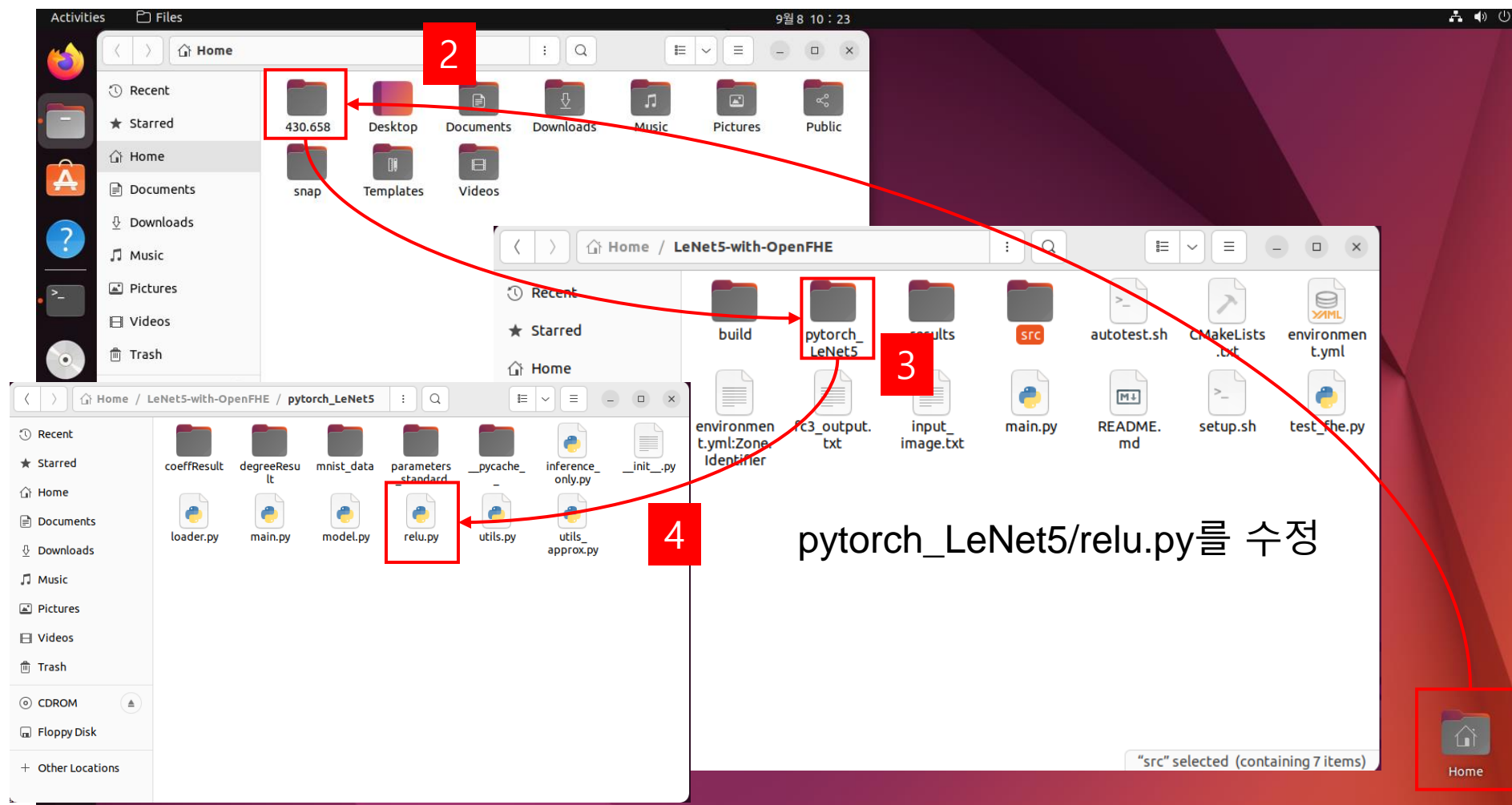
```
fhe@fhe-virtual-machine: ~/LeNet5-with-OpenFHE
Estimated total multiplicative depth: 23
[OpenFHE Info] logN (ring dimension exponent): 16
[OpenFHE Info] SlotSize (batch size): 1024
[DEBUG] GetValidSlotIndices: total valid slots = 25
[DEBUG] validIndices sample: 0 4 8 12 16 128 132 136 140 144 256 260 264 268 272 384 388 392 396 400 512 516 520 524 528
S
```

FHE 기반 추론 시작

```
[Layer 5] FC elapsed: 5.09126 sec
[INFO] FC output saved: fc3_output
[LeNet-5 with OpenFHE] Forward Pass Completed and Output Saved.
[INFO] Loaded FC3 output from ./build/fc3_output.txt
Predicted label (from FC3 output): 8
[RESULT] CPP FHE predicted label: 8
```

실행 결과 동일여부 확인

ReLU 수정 방법 - Python



ReLU 수정 방법 - Python

```
Open  relupy  Save  ~ / 430.658 / pytorch_ LeNet5
4 이 파일은 주황에서 새로운 activation을 붙잡아주세요!
5 """
6
7 from .utils_approx import ReLU_maker
8
9 # -----
10 # 학생들이 직접 수정할 수 있는 ReLU 근사 다항식 모음
11 # -----
12 quad_relu_polynomials = {
13     'linear': (lambda x: x, "x"),
14     'square': (lambda x: x ** 2, "x ** 2"),
15     'CryptoNet': (lambda x: 0.125 * x**2 + 0.5 * x + 0.25,
16                  "0.25 + 0.5 * x + 0.125 * x**2"),
17     'quad': (lambda x: 0.234606 + 0.5 * x + 0.204875 * x ** 2 - 0.0063896 * x ** 4,
18             "0.234606 + 0.5 * x + 0.204875 * x ** 2 - 0.0063896 * x ** 4"),
19
20
21 # === 여기에 자신만의 polynomial ReLU를 추가하세요! =====
22 # Example
23 # f(x) = x + x^2로 사용하고 싶은 경우 -> 'student': (lambda x: x + x**2, "x + x^2")로 수정
24
25
26
27
28
29 'student': (lambda x: x, "insert your own description")
30
31
32
33
34
35
36
37
38 #=====
```

해당 부분을 수정

ReLU 수형 후 실행결과 - Python

```
(py_3_10) fhe@fhe-virtual-machine:~/LeNet5-with-OpenFHE$ python main.py
=== Execution Mode Selection ===
1. Python Baseline Inference
2. CPP FHE Inference
Enter 1 or 2: █
```

python main.py 실행
1 입력

```

+-----+
| Selected Activation Function |
+-----+
| Name: student               |
| Formula:  $x + x^2$          |
+-----+

Weights and BN parameters loaded from ./pytorch_LeNet5/parameters_standard
=== Python Baseline: Single Sample Inference ===
[INFO] Image saved to input_image.txt
[INFO] FC3 output saved to fc3_output.txt
True Label: 4
Predicted Label: 1

```

Input image:

[illegible]

```
=== Python Baseline (F.relu): Full Validation Inference ===
Inference Accuracy: 99.17%
```

Class-wise Accuracy:

```

Class 0: 99.80% (978/980)
Class 1: 100.00% (1135/1135)
Class 2: 99.22% (1024/1032)
Class 3: 99.50% (1005/1010)
Class 4: 99.59% (978/982)
Class 5: 98.77% (881/892)
Class 6: 98.64% (945/958)
Class 7: 98.83% (1016/1028)
Class 8: 99.08% (965/974)
Class 9: 98.12% (990/1009)

```

```
[RESULT] Accuracy with F.relu: 99.17%
```

```
=== Python Baseline: Full Validation Inference ===
Inference Accuracy: 10.30%
```

Class-wise Accuracy:

```
Class 0: 0.00% (0/980)
Class 1: 90.04% (1022/1135)
Class 2: 0.10% (1/1032)
Class 3: 0.00% (0/1010)
Class 4: 0.00% (0/982)
Class 5: 0.00% (0/892)
Class 6: 0.00% (0/958)
Class 7: 0.29% (3/1028)
Class 8: 0.00% (0/974)
Class 9: 0.40% (4/1009)
```

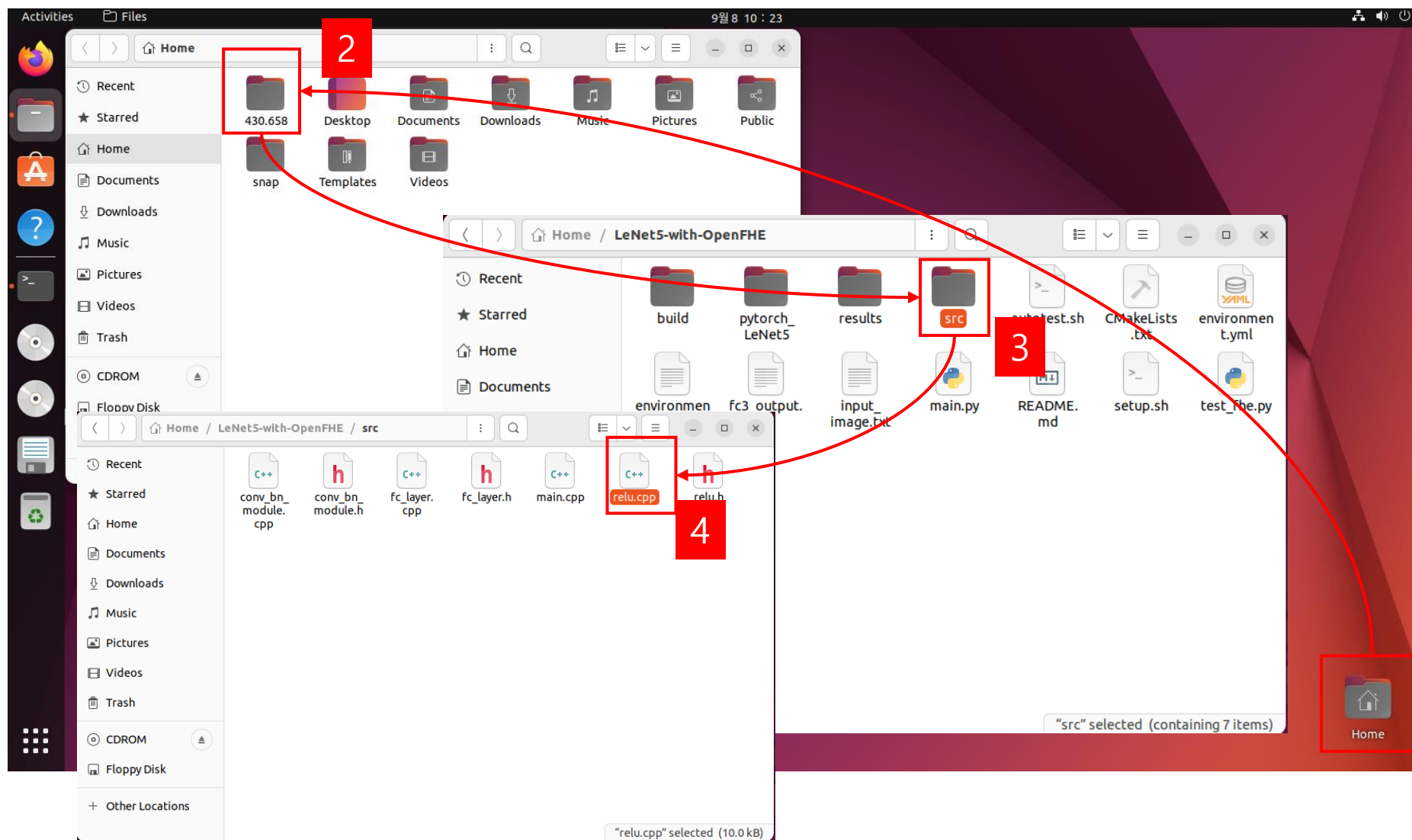
```
[RESULT] Accuracy with acc_custom: 10.30%
```

=== Accuracy Comparison ===

F.relu: 99.17% vs acc_custom: 10.30%

정확도 확인

ReLU 수정 방법 - FHE



ReLU 수정 방법 - FHE

```
Open  [icon]  relu.cpp  Save  [icon]  [icon]  [icon]  [icon]
~/430.658/src

78
79     auto result = cc->EvalAdd(sum, pt_const);
80     return result;
81 }
82
83 Ciphertext<DCRTPoly> ApproxReLU4_Student(CryptoContext<DCRTPoly> cc, const
Ciphertext<DCRTPoly>& ct_x) {
84     // size_t slotCount = cc->GetEncodingParams()->GetBatchSize();
85
86     //=====FROM HERE=====
87     // Insert your own approximation below
88
89
90
91
92
93
94
95     auto result = ct_x; // modify this when implementing your own code
96
97
98
99
100
101
102
103     // Insert your own approximation above
104     //=====TO END=====
105
106
107     return result;
108 }
109
```

해당 부분을 수정

ReLU 수정 이후 재실행

```
(py_3_10) fhe@fhe-virtual-machine:~/430.658$ python main.py
=== Execution Mode Selection ===
1. Python Baseline Inference
2. CPP FHE Inference
Enter 1 or 2: █
```

```
Enter 1 or 2: 2
Select Activation function:
0: linear (x)
1: square (x^2)
2: CryptoNet (0.25 + 0.5 * x + 0.125 * x^2)
3: quad (0.234606 + 0.5 * x + 0.204875 * x^2 - 0.0063896 * x^4)
4: student (custom polynomial)
```

- 1: Python 기반 코드 실행
- 2: FHE 기반 코드 실행

<ReLU 선택창>

0. $f(x) = x$
1. $f(x) = x^2$
2. $f(x) = 0.125x^2 + 0.5x + 0.25$
3. $f(x) = -0.0063896x^4 + 0.204875x^2 + 0.5x + 0.234606$
4. $f(x) = ?? \leftarrow \text{Student's Job}$

선택 시 단일 추론 실행