



南方科技大学  
SOUTHERN UNIVERSITY OF SCIENCE AND TECHNOLOGY

# C/C++ Program Design

CS205

Week 14

Prof. Shiqi Yu (于仕琪)

<yusq@sustech.edu.cn>

Prof. Feng Zheng(郑锋)

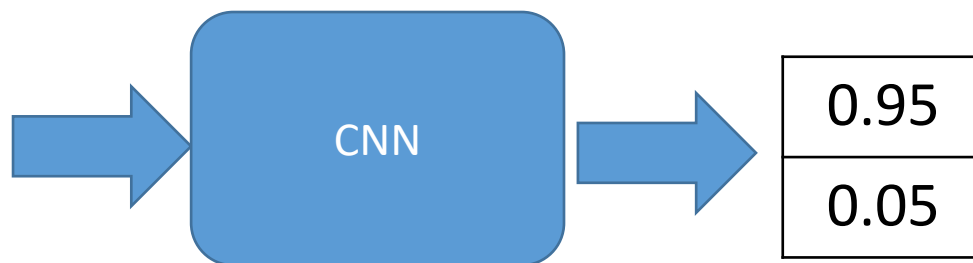
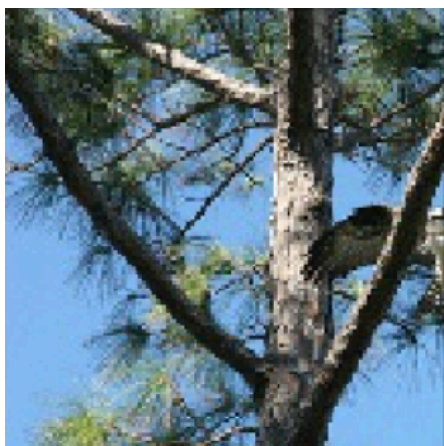
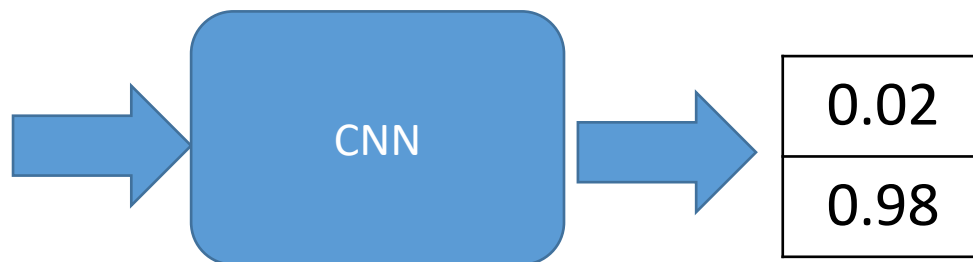
<zhengf@sustech.edu.cn>

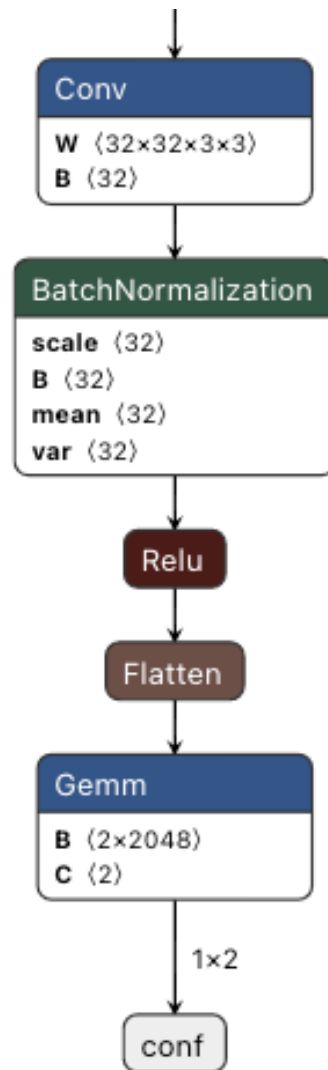
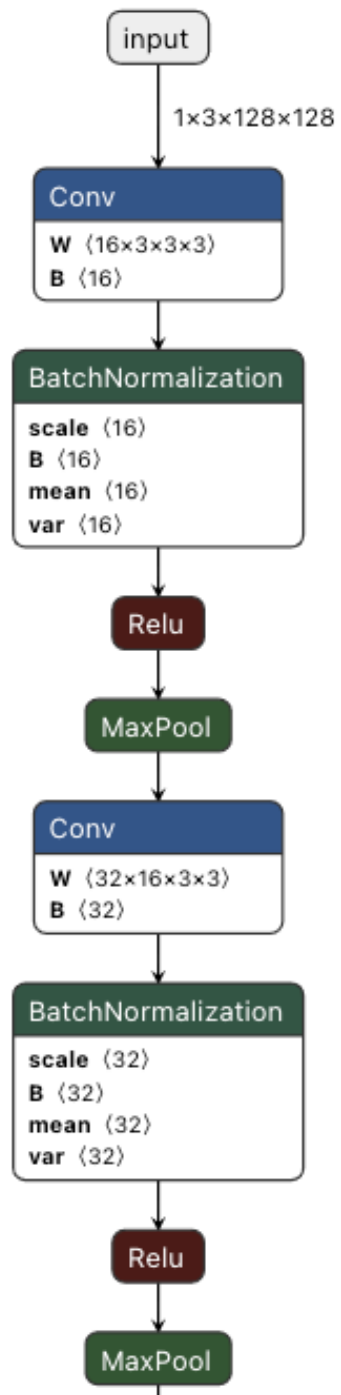
CNN for face classification



# Pre-trained model

- <https://github.com/ShiqiYu/SimpleCNNbyCPP>





# Model

- 3 Convolutional layers (Conv+BN+ReLU)
- 2 MaxPool
- 1 Full connected layer

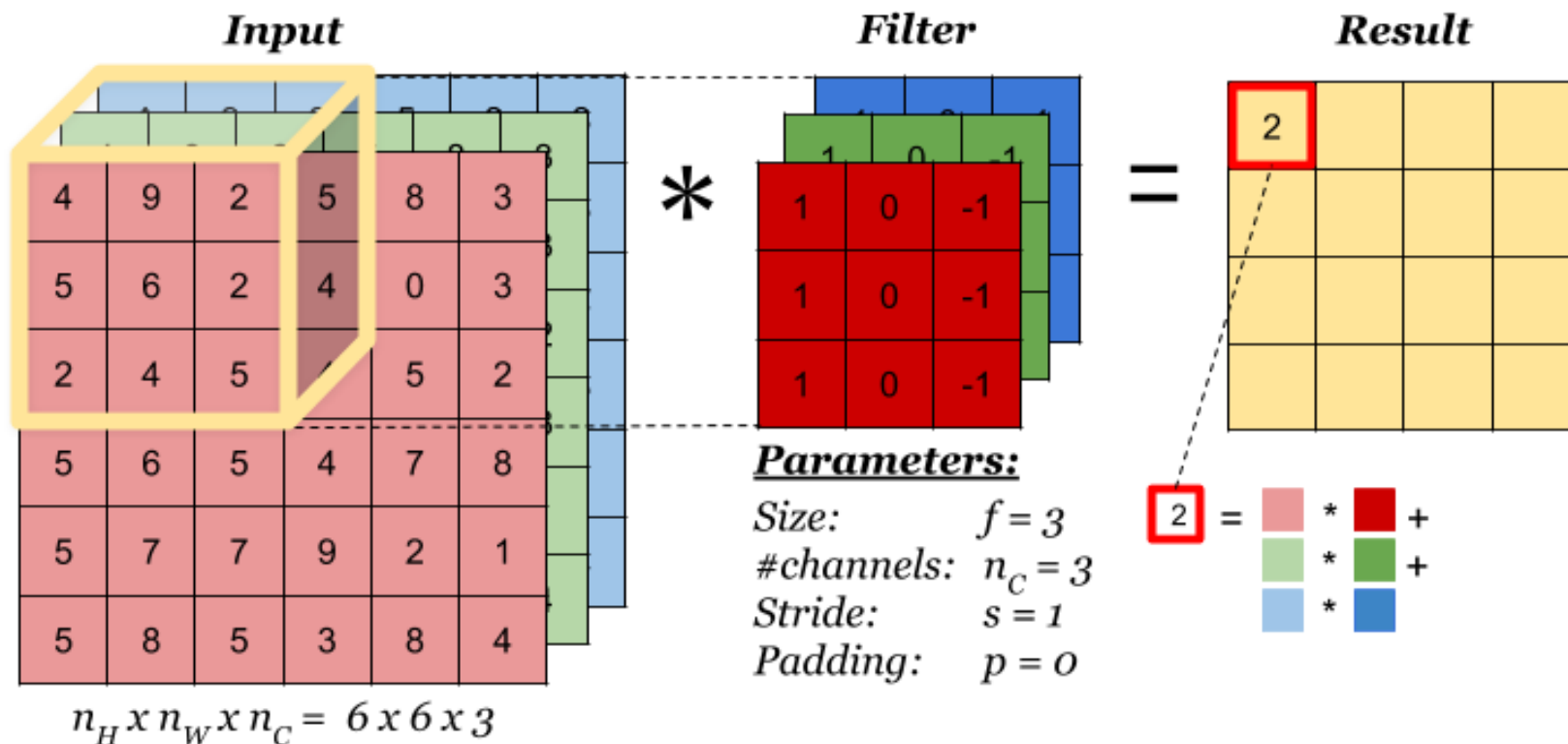
```
self.backbone = nn.Sequential(
    ConvBNReLU(3, 16, 3, 2, 1),      # downsampled by 2, 128 -> 64
    nn.MaxPool2d(2, 2),              # downsampled by 2, 64 -> 32
    ConvBNReLU(16, 32, 3, 1),        # keep
    nn.MaxPool2d(2, 2),              # downsampled by 2, 32 -> 16
    ConvBNReLU(32, 32, 3, 2, 1)      # downsampled by 2, 16 -> 8
)

self.classifier = nn.Sequential(
    nn.Linear(in_features=32*8*8,
              out_features=num_cls,
              bias=True)
)
```



# conv

- Multiple filters (kernels) can create multiple output channels





# conv

|     |     |     |     |     |     |     |
|-----|-----|-----|-----|-----|-----|-----|
| 0   | 0   | 0   | 0   | 0   | 0   | ... |
| 0   | 156 | 155 | 156 | 158 | 158 | ... |
| 0   | 153 | 154 | 157 | 159 | 159 | ... |
| 0   | 149 | 151 | 155 | 158 | 159 | ... |
| 0   | 146 | 146 | 149 | 153 | 158 | ... |
| 0   | 145 | 143 | 143 | 148 | 158 | ... |
| ... | ... | ... | ... | ... | ... | ... |

Input Channel #1 (Red)

|     |     |     |     |     |     |     |
|-----|-----|-----|-----|-----|-----|-----|
| 0   | 0   | 0   | 0   | 0   | 0   | ... |
| 0   | 167 | 166 | 167 | 169 | 169 | ... |
| 0   | 164 | 165 | 168 | 170 | 170 | ... |
| 0   | 160 | 162 | 166 | 169 | 170 | ... |
| 0   | 156 | 156 | 159 | 163 | 168 | ... |
| 0   | 155 | 153 | 153 | 158 | 168 | ... |
| ... | ... | ... | ... | ... | ... | ... |

Input Channel #2 (Green)

|     |     |     |     |     |     |     |
|-----|-----|-----|-----|-----|-----|-----|
| 0   | 0   | 0   | 0   | 0   | 0   | ... |
| 0   | 163 | 162 | 163 | 165 | 165 | ... |
| 0   | 160 | 161 | 164 | 166 | 166 | ... |
| 0   | 156 | 158 | 162 | 165 | 166 | ... |
| 0   | 155 | 155 | 158 | 162 | 167 | ... |
| 0   | 154 | 152 | 152 | 157 | 167 | ... |
| ... | ... | ... | ... | ... | ... | ... |

Input Channel #3 (Blue)

|    |    |    |
|----|----|----|
| -1 | -1 | 1  |
| 0  | 1  | -1 |
| 0  | 1  | 1  |

Kernel Channel #1



308

|   |    |    |
|---|----|----|
| 1 | 0  | 0  |
| 1 | -1 | -1 |
| 1 | 0  | -1 |

Kernel Channel #2



-498

|   |    |   |
|---|----|---|
| 0 | 1  | 1 |
| 0 | 1  | 0 |
| 1 | -1 | 1 |

Kernel Channel #3



164

+ 1 = -25



Bias = 1

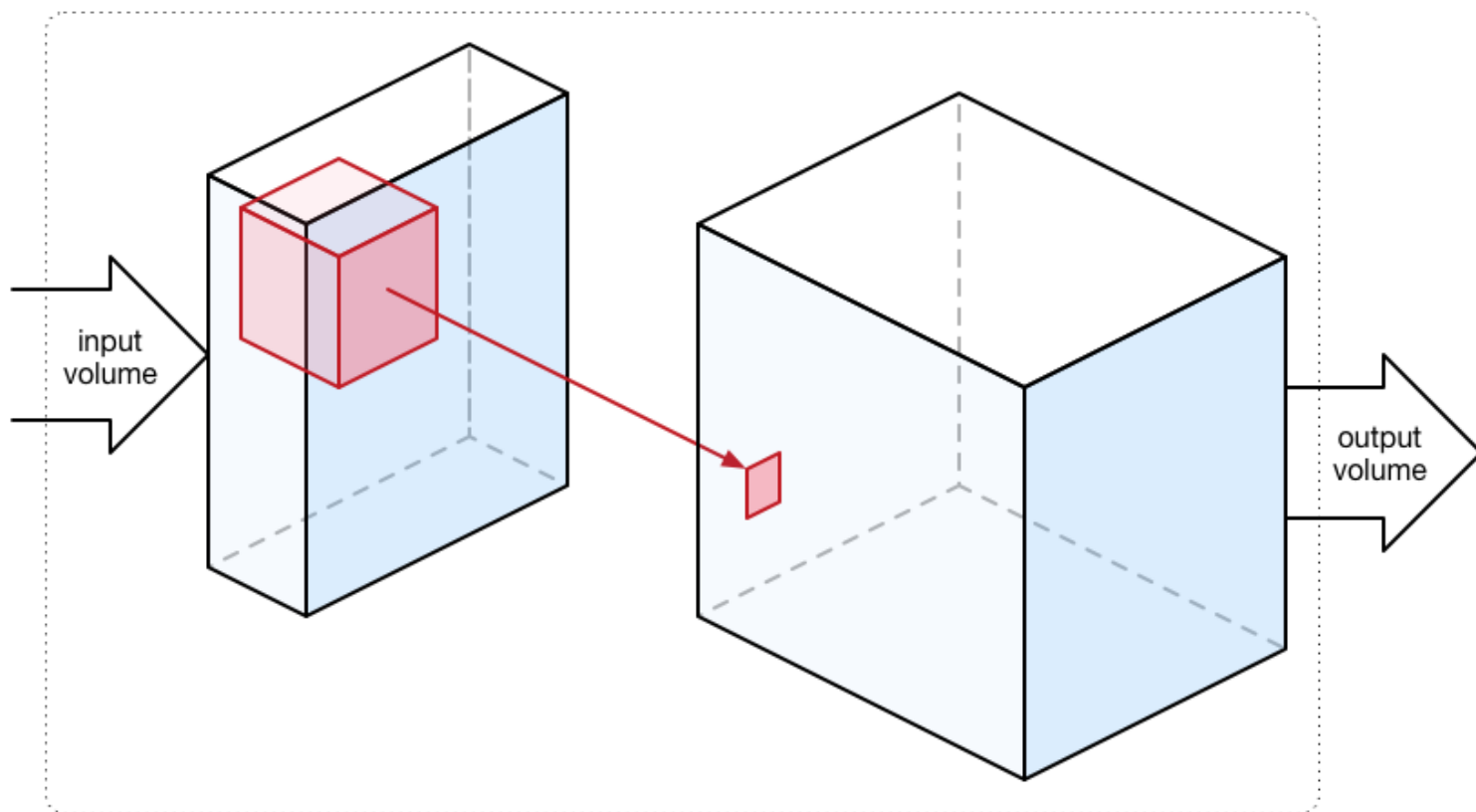
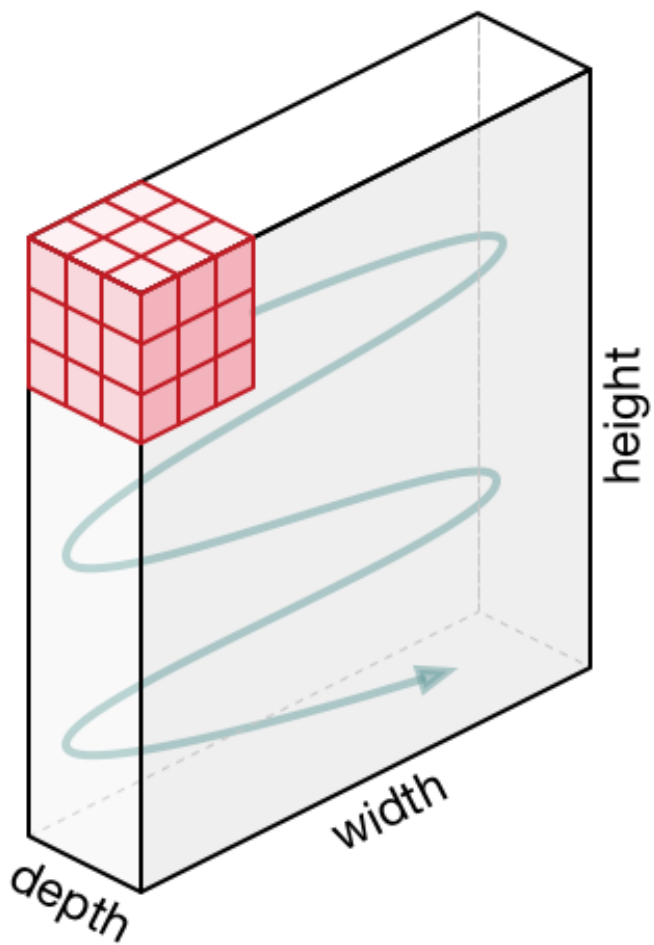
Output

|     |     |     |     |     |
|-----|-----|-----|-----|-----|
| -25 |     |     |     | ... |
|     |     |     |     | ... |
|     |     |     |     | ... |
|     |     |     |     | ... |
| ... | ... | ... | ... | ... |



# conv

- A convolutional kernel create a channel in the output data.





# Batch normalization

- The BN layers have been merged into conv layers





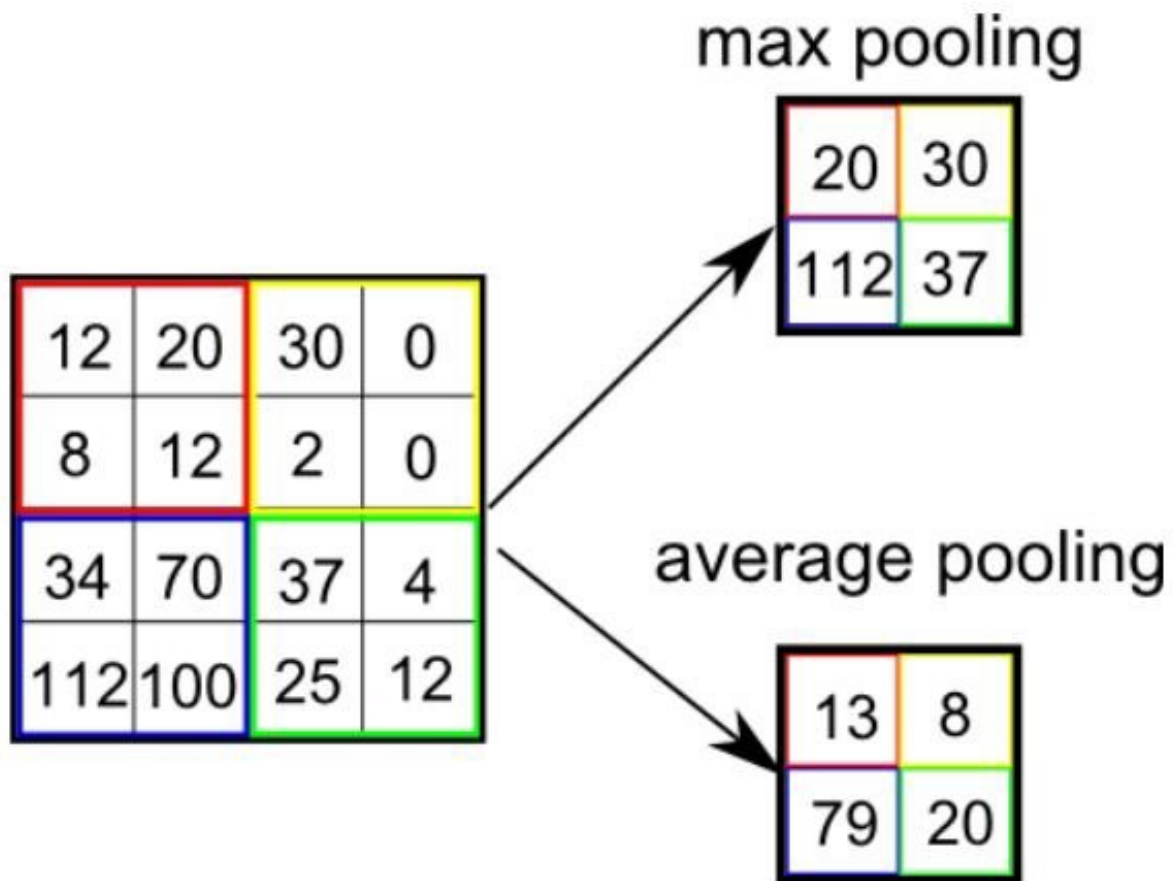
# ReLU: Rectified Linear Unit

```
if (x < 0)  
    x = 0;
```



# max pooling

- For each channel



- If the input is  $C \times H \times W$ , the output will be  $C \times H/2 \times W/2$

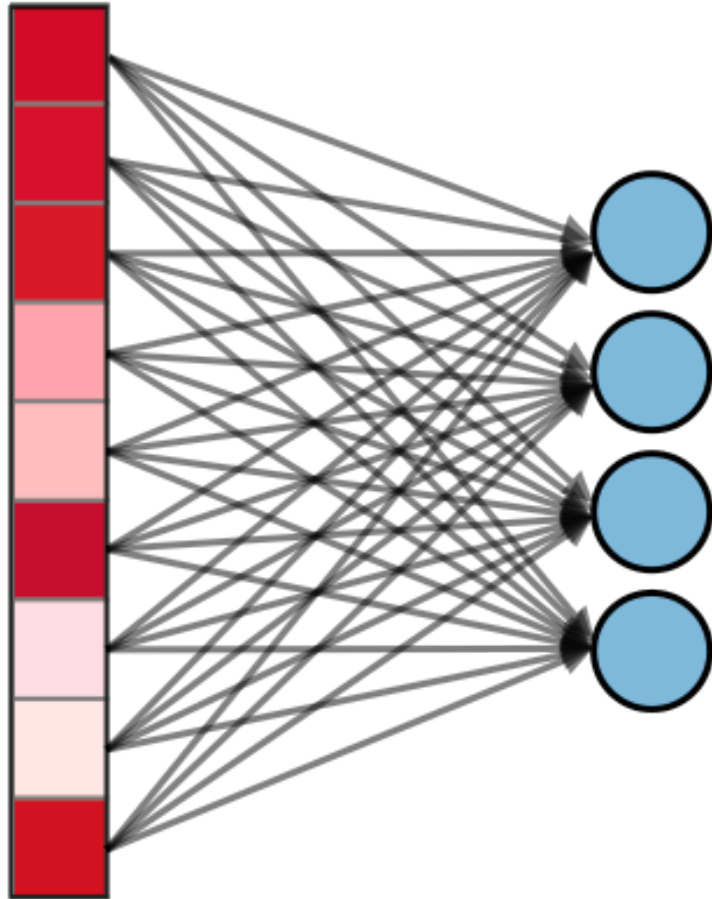


# Flatten

- The data blob is flattened into a 2048-length vector from 32x8x8



# FC: Fully-Connected Layer



- If the input is  $L$  and the output is  $N$  (2 in the model, 4 in left figure), the size of weights is  $N \times L$  ( $2 \times 2048$  in the model)

$$\text{output}_{2 \times 1} = \text{weight}_{2 \times 2048} * \text{input}_{2048 \times 1} + \text{bias}_{2 \times 1}$$



# Softmax

- To output the confidence vector (n=2 in the model)

for  $x \in \mathbb{R}^n$

$$p_i = \frac{e^{x_i}}{\sum_{j=1}^n e^{x_j}}$$

$$p = \begin{pmatrix} p_1 \\ \vdots \\ p_n \end{pmatrix}$$



# CNN Explainer

- <https://poloclub.github.io/cnn-explainer/>



The slides are based on the book <Stephen Prata, C++ Primer Plus, 6th Edition, Addison-Wesley Professional, 2011>

# Exceptions



# Rudimentary Options

- An example: **harmonic** mean of two numbers

$$2.0 \times x \times y / (x + y)$$

- Calling **abort()**: **program example error1.cpp**
  - Send a **message** such as "abnormal program termination" to the standard error stream and **terminate** the program
  - **Return** an implementation-dependent value that indicates failure to the **operating** system
- Returning an **error code**: **program error2.cpp**
  - **Return** values to **indicate** a problem
  - We have used it in the previous examples





# Throw-Catch Mechanism

- An **exceptional** circumstance arises while a program is **running**
- Exception mechanism provide a way to **transfer** control from one part of a program to another
  - Throwing an exception
    - ✓ **throw** keyword indicates the **throwing** of an exception
    - ✓ A throw statement, in essence, is a **jump** (other jump operators??)
  - Catching an exception with a handler
    - ✓ **catch** keyword indicates the **catching** of an exception
    - ✓ Followed by a **type declaration** that indicates the **type of exception**
  - Using a try block
    - ✓ A **try** block identifies a block of code for which **particular exceptions** will be activated
    - ✓ Followed by **one or more** catch blocks
- See program example `error3.cpp`



# Throw-Catch Mechanism

- Can we use more complex **types**? YES!
- Using objects as exceptions
  - Advantage: use **different exception types** to distinguish among **different functions and situations** that produce exceptions
  - An object can **carry** information with it, and you can use this information to help identify the conditions that caused the exception to be thrown
  - A catch block could use that information to **decide** which course of action to pursue
- See program example **error4.cpp**
  - Geometric and harmonic means



# More Exception Features of Throw-Catch Mechanism

- Differences to the normal function

- One difference

- ✓ A return statement: **transfer** execution to the **calling** function
    - ✓ A throw: **transfer** execution to the **first** function having a **try-catch**

- Second difference

- ✓ The compiler always creates a **copy** when throwing an exception

- The **exception** class

- Define an exception class that C++ uses as a **base** class

- One **virtual** member function is named **what()**, and it returns a string

```
#include <exception>
class bad_hmean : public std::exception
{
public:
    const char * what() { return "bad arguments to hmean()"; }
    ...
};
```

```
class problem {...};
...
void super() throw (problem)
{
    ...
    if (oh_no)
    {
        problem oops; // construct object
        throw oops;   // throw it
    }
    ...
    try {
        super();
    }
    catch(problem & p)
    {
        // statements
    }
}
```



# More Exception Features

- The **stdexcept** exception classes
  - The **stdexcept** header file defines **several** more exception classes
  - **logic\_error** and **runtime\_error** classes
    - ✓ **logic\_error family**: **domain\_error**, **invalid\_argument**, **length\_error**, **out\_of\_bounds**
    - ✓ **runtime\_error family**: **range\_error**, **overflow\_error**, **underflow\_error**

## Class **std::logic\_error**

```
namespace std {  
    class logic_error : public exception {  
    public:  
        explicit logic_error(const string& what_arg);  
        explicit logic_error(const char* what_arg);  
    };  
}
```

## Class **std::domain\_error**

```
namespace std {  
    class domain_error : public logic_error {  
    public:  
        explicit domain_error(const string& what_arg);  
        explicit domain_error(const char* what_arg);  
    };  
}
```

```
namespace std {  
    class logic_error;  
    class domain_error;  
    class invalid_argument;  
    class length_error;  
    class out_of_range;  
    class runtime_error;  
    class range_error;  
    class overflow_error;  
    class underflow_error;  
}
```



# More Exception Features

- The `bad_alloc` exception and `new`
  - Have `new` throw a `bad_alloc` exception
  - `new` returned a null pointer when it couldn't allocate the memory
- See program example `newexcp.cpp`