notes

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CONTENTS:

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CHAPTER

ONE

SPHINX

This page describes how this website is setup.

1.1 Setup

1. Install the dependencies in `./docs/requirements.txt`.

```
sphinx==4.3.2
sphinx-autodoc-typehints==1.12.0
sphinx_rtd_theme==1.0.0
sphinxcontrib-bibtex==2.4.1
```

2. Use `sphinx-quickstart` to generate the skeleton. When it prompts:

```
Separate source and build directories(y/n)
```

Answer yes.

3. Edit `docs/source/conf.py` and add the following lines to it:

```
import sphinx_rtd_theme
extensions = [
    'sphinx.ext.autodoc',
    'sphinx.ext.autosummary',
    'sphinx.ext.githubpages',
    'sphinx.ext.mathjax',
    'sphinx.ext.napoleon',
    'sphinx.ext.todo',
    'sphinx.ext.viewcode',
    'sphinxcontrib.bibtex',
]

html_theme = 'sphinx_rtd_theme'

master_doc = 'index'
pygments_style = 'sphinx'
html_theme_path = [sphinx_rtd_theme.get_html_theme_path()]
smartquotes = False
html_show_sourcelink = True

html_context = {
```

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```
    'display_github': True,
    'github_user': 'csu-fangjun',
    'github_repo': 'notes',
    'github_version': 'master',
    'conf_py_path': '/docs/source/',
}

html_theme_options = {
    'logo_only': False,
    'display_version': True,
    'prev_next_buttons_location': 'bottom',
    'style_external_links': True,
}
latex_engine = 'xelatex'
```

4. To generate the notes in pdf format, use `make latex`, which generates lots of `tex` files in `./build/latex`. Switch to `build/latex` and run `make`. Assume that you have installed the software to compile `tex` files. It will generate `notes.pdf`.

1.2 How to include code from a file

See https://www.sphinx-doc.org/en/master/usage/restructuredtext/directives.html#directive-literalinclude.

1. Show line number: `:linenos:`. By default, line number counts from 0. To add an offset, e.g., 10, to the line number, use `:lineno-start: 10`. Note: It still includes all the contents of the file.
2. To emphasize a line, specified lines, or specified line ranges, use: `:emphasize-lines: 10`, `:emphasize-lines: 10,12,14`, and `:emphasize-lines: 12,15-18` Note: emphasize means to change the background color.
3. Set the language, e.g., `:language: python`.
4. Set the caption, e.g., `:caption: hello world`.
5. To include a function from the python file, use `:pyobject: my_func`
6. To include specified lines, use `:lines:1,3,5-10,15-`. Note that if using this option, line number counts from 0. Use `:lineno-start: xx` to change the offset for display.

1.3 Link

See https://sublime-and-sphinx-guide.readthedocs.io/en/latest/references.html and https://www.sphinx-doc.org/en/master/usage/restructuredtext/basics.html#hyperlinks

1.3.1 hello

Here is a link to *hello*.

```
.. _Link to hello:

hello
-----

Here is a link to :ref:`Link to hello`.
```

CHAPTER

TWO

GIT

This page describes commonly used git commands.

2.1 Commands

2.1.1 rev-parse

It is quite common to get the root directory of the repository with the command:

```
git rev-parse --show-toplevel
```

For instance, the above command executed in this repository prints something like as follows:

```
/xxx/notes
```

The following shows its usage in a Python script:

```
#!/usr/bin/env python3

import subprocess

d = (
    subprocess.check_output(["git", "rev-parse", "--show-toplevel"])
    .decode("ascii")
    .strip()  # remove the trailing \n
)
print(d)  # /path/to/notes
```

It can also be used in bash script:

```
root_dir=$(git rev-parse --show-toplevel)
echo "root_dir ${root_dir}"
```

`help git-rev-parse` outputs helpful information for `git rev-parse`. In particular, it explains the differences among `HEAD~`, `HEAD~n`, `HEAD^`, and `HEAD^n`. The following shows the help information about it:

```
   <rev>^[<n>], e.g. HEAD^, v1.5.1^0
     A suffix ^ to a revision parameter means the first parent of that commit object.  ^
↪<n> means the <n>th parent
```

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```
    (i.e.  <rev>^ is equivalent to <rev>^1). As a special rule, <rev>^0 means the␣
↪commit itself and is used when
    <rev> is the object name of a tag object that refers to a commit object.

  <rev>~[<n>], e.g. HEAD~, master~3
    A suffix ~ to a revision parameter means the first parent of that commit object. A␣
↪suffix ~<n> to a revision
    parameter means the commit object that is the <n>th generation ancestor of the␣
↪named commit object, following
    only the first parents. I.e.  <rev>~3 is equivalent to <rev>^^^ which is equivalent␣
↪to <rev>^1^1^1. See below
    for an illustration of the usage of this form.

  G   H   I   J
   \ /     \ /
    D   E   F
     \  |  / \
      \ | /   |
       \|/    |
        B     C
         \   /
          \ /
           A

  A =       = A^0
  B = A^    = A^1     = A~1
  C =       = A^2
  D = A^^   = A^1^1   = A~2
  E = B^2   = A^^2
  F = B^3   = A^^3
  G = A^^^  = A^1^1^1 = A~3
  H = D^2   = B^^2    = A^^^2  = A~2^2
  I = F^    = B^3^    = A^^3^
  J = F^2   = B^3^2   = A^^3^2
```

CHAPTER

THREE

DOCKER

3.1 Installation

3.1.1 macos

Refer to https://docs.docker.com/desktop/mac/install/.

CHAPTER

FOUR

LATEX

4.1 TikZ

4.1.1 Basics

CHAPTER

FIVE

KALDI

This page describes commonly used git commands.

5.1 Decoding

```
CompactLattice compact_lat;
decoder.GetLattice(true, &compact_lat);

CompactLattice compact_best_path;
CompactLatticeShortestPath(compact_lat, &compact_best_path);

Lattice best_path;
ConvertLattice(compact_best_path, best_path);

std::vector<int32_t> tokens;
std::vector<int32_t> words;
LatticeWeight weight;
GetLinearSymbolSequence(best_path, &tokens, &words, &weight);
```

- decoder/simple-decoder.{h,cc}

CHAPTER

SIX

BASH

6.1 sort

Sort files in the folder `t`. The filename has the patter `xxx.n.txt`, where `n` is some numerical value. Also, exclude `xxx.100.txt`.

```
find ./t -name "xxx*.txt" ! -name "xxx.100.txt" -print0 | sort -z -t. -k2 -n | xargs -r0
```

6.2 echo

Generate a binary file:

```
echo -n -e '\x30\x31\x32' > a.bin
hexdump a.bin
```

CHAPTER

SEVEN

CUDA

7.1 Installation

7.1.1 CUDA 10.1.243

```
./cuda_10.1.243_418.87.00_linux.run --silent --toolkit --installpath=/ceph-data4/fangjun/
↪software/cuda-10.1.243 --no-opengl-libs --no-drm --no-man-page

# Install cuDNN
cd /ceph-data4/fangjun/software/cuda-10.1.243
tar xvf /ceph-sh0/fangjun/cudnn/cudnn-10.1-linux-x64-v8.0.4.30.tgz --strip-components=1
```

```
#!/usr/bin/env bash

export CUDA_HOME=/ceph-data4/fangjun/software/cuda-10.1.243
export PATH=$CUDA_HOME/bin:$PATH
export LD_LIBRARY_PATH=$CUDA_HOME/lib64:$LD_LIBRARY_PATH

# See /ceph-fj/fangjun/py38/lib/python3.8/site-packages/torch/share/cmake/Caffe2/Modules_
↪CUDA_fix/upstream/FindCUDA.cmake
export CUDA_TOOLKIT_ROOT_DIR=$CUDA_HOME
export CUDA_TOOLKIT_ROOT=$CUDA_HOME
export CUDA_BIN_PATH=$CUDA_HOME
export CUDA_PATH=$CUDA_HOME
export CUDA_INC_PATH=$CUDA_HOME/targets/x86_64-linux
```

7.1.2 CUDA 11.0.3

```
./cuda_11.0.3_450.51.06_linux.run --silent --toolkit --installpath=/ceph-data4/fangjun/
↪software/cuda-11.0.3 --no-opengl-libs --no-drm --no-man-page

# Install cuDNN
cd /ceph-data4/fangjun/software/cuda-11.0.3
tar xvf /ceph-sh0/fangjun/cudnn/cudnn-11.0-linux-x64-v8.0.4.30.tgz --strip-components=1
```

7.1.3 CUDA 11.3.1

```
./cuda_11.3.1_465.19.01_linux.run --silent --toolkit --installpath=/ceph-data4/fangjun/
↪software/cuda-11.3.1 --no-opengl-libs --no-drm --no-man-page
cd /ceph-data4/fangjun/software/cuda-11.3.1
tar xvf /ceph-sh0/fangjun/cudnn/cudnn-11.3-linux-x64-v8.2.1.32.tgz --strip-components=1
```

7.1.4 CUDA 11.5.2

```
./cuda_11.5.2_495.29.05_linux.run --silent --toolkit --installpath=/ceph-data4/fangjun/
↪software/cuda-11.5.2 --no-opengl-libs --no-drm --no-man-page
cd /ceph-data4/fangjun/software/cuda-11.5.2
tar xvf /ceph-sh0/fangjun/cudnn/cudnn-linux-x86_64-8.3.2.44_cuda11.5-archive.tar.xz --
↪strip-components=1
```

7.1.5 CUDA 11.6.1

```
./cuda_11.6.1_510.47.03_linux.run --silent --toolkit --installpath=/ceph-data4/fangjun/
↪software/cuda-11.6.1 --no-opengl-libs --no-drm --no-man-page
cd /ceph-data4/fangjun/software/cuda-11.6.1
tar xvf /ceph-sh0/fangjun/cudnn/cudnn-11.3-linux-x64-v8.2.1.32.tgz --strip-components=1
```

CHAPTER

EIGHT

TORCH

8.1 DDP

8.1.1 Initialization

8.2 TorchScript

8.2.1 Hello

See https://pytorch.org/tutorials/beginner/Intro_to_TorchScript_tutorial.html.

`torch.jit.script` as a decorator

Listing 1: ./code/1-ex.py

```
@torch.jit.script
def adder(x: int):
    return x + 1


def test_adder():
    assert isinstance(adder, torch.jit.ScriptFunction)
    print(adder.graph)
    print("-" * 10)
    print(adder.code)
    adder.save("adder.pt")

    my_adder = torch.jit.load("adder.pt")

    assert isinstance(my_adder, torch.jit._script.RecursiveScriptModule)
    assert isinstance(my_adder, torch.jit.ScriptModule)
    assert not isinstance(my_adder, torch.jit.ScriptFunction)
    print(my_adder(torch.tensor([3])))


"""
graph(%x.1 : int):
  %2 : int = prim::Constant[value=1]() # ./1-ex.py:8:15
```

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```
  %3 : int = aten::add(%x.1, %2) # ./1-ex.py:8:11
  return (%3)

----------
def adder(x: int) -> int:
  return torch.add(x, 1)

4
"""
```

`torch.jit.script` as a function

Listing 2: ./code/2-ex.py

```
def adder(x: int):
    return x + 2


def test_adder():
    adder_func = torch.jit.script(adder)
    assert isinstance(adder_func, torch.jit.ScriptFunction)
    print(adder_func.graph)
    print(adder_func(3))


"""
graph(%x.1 : int):
  %2 : int = prim::Constant[value=2]() # ./2-ex.py:6:15
  %3 : int = aten::add(%x.1, %2) # ./2-ex.py:6:11
  return (%3)

5
"""
```

torchscript a module

Listing 3: ./code/3-ex.py

```
class MyModel(torch.nn.Module):
    def __init__(self):
        super().__init__()
        self.p = torch.nn.Parameter(torch.tensor([2.0]))

    def forward(self, x: torch.Tensor):
        return self.p * x


def test_my_model():
    model = MyModel()
```

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```
    scripted_model = torch.jit.script(model)
    print(scripted_model.graph)
    print("-" * 10)
    print(scripted_model.code)
    print(scripted_model(torch.tensor([10])))


"""
graph(%self : __torch__.MyModel,
      %x.1 : Tensor):
  %p : Tensor = prim::GetAttr[name="p"](%self)
  %4 : Tensor = aten::mul(%p, %x.1) # ./3-ex.py:12:15
  return (%4)

----------
def forward(self,
    x: Tensor) -> Tensor:
  p = self.p
  return torch.mul(p, x)
"""
```

Export and ignore methods

1. Use `@torch.jit.export` decorator to export a method.
2. Use `torch.jit.export` function call to export a method.
3. Use `@torch.jit.ignore` decorator to ignore a method.
4. Use `torch.jit.ignore` function call to ignore a method.
5. Use `@torch.jit.unused` or `torch.jit.unused` to ignore a method.

See *Load in C++* to load the saved file.

Listing 4: ./code/4-ex.py

```
class MyModel(torch.nn.Module):
    def __init__(self):
        super().__init__()
        self.p = torch.nn.Parameter(torch.tensor([2.0]))

    def foobar(self, x: torch.Tensor):
        return x + 3

    def foo(self, x: torch.Tensor):
        return self.foobar(x)

    def bar(self, x: torch.Tensor):
        return self.p - x

    @torch.jit.export
    def baz(self, x: torch.Tensor):
```

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```
        return self.p + x + 2

    def forward(self, x: torch.Tensor):
        return self.p * x


def test_my_model():
    MyModel.foo = torch.jit.export(MyModel.foo)  # manually export

    # Note: forward is exported by default. We ignore it here manually
    MyModel.forward = torch.jit.ignore(MyModel.forward)

    model = MyModel()
    scripted_model = torch.jit.script(model)
    assert hasattr(scripted_model, "foo")
    assert hasattr(scripted_model, "baz")
    assert hasattr(scripted_model, "foobar")  # because it is called by `foo`
    assert not hasattr(scripted_model, "bar")

    scripted_model.save("foo.pt")

    m = torch.jit.load("foo.pt")
    print(m.foo(torch.tensor([1])))
    print(m.baz(torch.tensor([1])))


"""
graph(%self : __torch__.MyModel,
      %x.1 : Tensor):
  %p : Tensor = prim::GetAttr[name="p"](%self)
  %4 : Tensor = aten::mul(%p, %x.1) # ./3-ex.py:12:15
  return (%4)

----------
def forward(self,
    x: Tensor) -> Tensor:
  p = self.p
  return torch.mul(p, x)
"""
```

8.2.2 Load in C++

See https://pytorch.org/tutorials/advanced/cpp_export.html.

Load the saved `foo.pt` in C++ from *Export and ignore methods*.

Listing 5: ./code/load-in-cpp/Makefile

```
USE_CXX11_ABI := $(shell python3 -c 'import torch; print(int(torch.compiled_with_cxx11_
↪abi()))')
TORCH_INSTALL_DIR := $(shell python3 -c 'import os; import torch; print(os.path.
↪dirname(torch.__file__))')
```

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```
$(info USE_CXX11_ABI $(USE_CXX11_ABI))
$(info TORCH_INSTALL_DIR $(TORCH_INSTALL_DIR))

CXXFLAGS := -I$(TORCH_INSTALL_DIR)/include
CXXFLAGS += -I$(TORCH_INSTALL_DIR)/include/torch/csrc/api/include
CXXFLAGS += -I$(TORCH_INSTALL_DIR)/include/TH
CXXFLAGS += -I$(TORCH_INSTALL_DIR)/include/THC
CXXFLAGS += -std=c++14
CXXFLAGS += -D_GLIBCXX_USE_CXX11_ABI=$(USE_CXX11_ABI)

CXXFLAGS += -Wno-unknown-pragmas # disable omp warnings

LDFLAGS := -L$(TORCH_INSTALL_DIR)/lib
LDFLAGS += -lc10 -ltorch -ltorch_cpu
# LDFLAGS += -lc10 -ltorch
LDFLAGS += -Wl,-rpath,$(TORCH_INSTALL_DIR)/lib

HAS_CUDA := $(shell python3 -c 'import torch; print("yes" if torch.cuda.is_available()␣
↪else "no")')
$(info has cuda $(HAS_CUDA))

ifeq ($(HAS_CUDA),yes)
CUDA_HOME := $(shell which nvcc | xargs dirname | xargs dirname)
CXXFLAGS += -I$(CUDA_HOME)/include
LDFLAGS += -L$(CUDA_HOME)/lib64
LDFLAGS += -lcudart -lc10_cuda -ltorch_cuda
LDFLAGS += -Wl,-rpath,$(CUDA_HOME)/lib64
endif

.PHONY: clean

main: main.o
        $(CXX) -o $@ $< $(LDFLAGS)

main.o: main.cc
        $(CXX) $(CXXFLAGS) -c -o $@ $<

clean:
        $(RM) main.o main
```

Note: `torch::jit::script::Module` is deprecated, use `torch::jit::Module` instead.

Listing 6: ./code/load-in-cpp/main.cc

```
#include "torch/script.h"

int main() {
  // see torch/csrc/jit/module.h
  torch::jit::Module m = torch::jit::load("../foo.pt");
```

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```
  std::cout << "is training: " << m.is_training() << "\n";
  m.eval();
  std::cout << "after m.eval(): is training: " << m.is_training() << "\n";
  torch::Tensor x = torch::tensor({1, 2, 3}, torch::kFloat);
  torch::Tensor y = m.run_method("baz", x).toTensor();
  std::cout << y << "\n";

  return 0;
}
```

The output of `make` is:

```
USE_CXX11_ABI 0
TORCH_INSTALL_DIR /ceph-fj/fangjun/software/py38/lib/python3.8/site-packages/torch
has cuda yes
g++ -I/ceph-fj/fangjun/software/py38/lib/python3.8/site-packages/torch/include \
    -I/ceph-fj/fangjun/software/py38/lib/python3.8/site-packages/torch/include/torch/
↪csrc/api/include \
    -I/ceph-fj/fangjun/software/py38/lib/python3.8/site-packages/torch/include/TH \
    -I/ceph-fj/fangjun/software/py38/lib/python3.8/site-packages/torch/include/THC \
    -std=c++14 \
    -D_GLIBCXX_USE_CXX11_ABI=0 \
    -Wno-unknown-pragmas \
    -I/ceph-sh1/fangjun/software/cuda-10.2.89/include \
    -c -o main.o main.cc
g++ -o main main.o \
    -L/ceph-fj/fangjun/software/py38/lib/python3.8/site-packages/torch/lib \
    -lc10 -ltorch -ltorch_cpu \
    -Wl,-rpath,/ceph-fj/fangjun/software/py38/lib/python3.8/site-packages/torch/lib \
    -L/ceph-sh1/fangjun/software/cuda-10.2.89/lib64 \
    -lcudart -lc10_cuda -ltorch_cuda \
    -Wl,-rpath,/ceph-sh1/fangjun/software/cuda-10.2.89/lib64
```

The output of `./main` is:

```
is training: 1
after m.eval(): is training: 0
 5
 6
 7
[ CPUFloatType{3} ]
```

8.2.3 ArrayRef

See c10/utils/ArrayRef.h.

> **Caution:** `IntArrayRef` is an alias to `ArrayRef<int64_t>`.

`ArrayRef<T>` contains only two members: A const data pointer and a size. It is trivially copyable and assignable.

It has similar methods like `std::vector`. It also has two methods to get the front and back: `front()` and `back()`; both return a const reference.

Its method `vec()` converts itself to a `std::vector` by **copying** the underlying data.

Constructors

Data members

Listing 7: ./code/array_ref/main.cc (Check size)

```
struct Foo {
  const int32_t *p;
  size_t len;
};

static void TestSize() {
  // Note: The data pointer in ArrayRef is const!
  static_assert(sizeof(torch::ArrayRef<int32_t>) == sizeof(Foo), "");
}
```

Default constructed

Listing 8: ./code/array_ref/main.cc (Default constructor)

```
static void TestDefaultConstructor() {
  torch::ArrayRef<int32_t> a;
  TORCH_CHECK(a.data() == nullptr);
  TORCH_CHECK(a.size() == 0);
  TORCH_CHECK(a.empty() == true);

  TORCH_CHECK(a.begin() == nullptr);
  TORCH_CHECK(a.end() == nullptr);
}
```

From a single element

Listing 9: ./code/array_ref/main.cc (From a single element)

```
static void TestFromSingleElement() {
  int32_t a = 10;
  torch::ArrayRef<int32_t> b(a);
  TORCH_CHECK(b[0] == a);
  TORCH_CHECK(b.data() == &a);
  TORCH_CHECK(b.size() == 1);
}
```

From an initializer list

Listing 10: ./code/array_ref/main.cc (From an initializer list)

```
static void TestFromInitializerList() {
  torch::ArrayRef<int32_t> a = {1, 2, 3};
  TORCH_CHECK(a.size() == 3);
  TORCH_CHECK(a[0] == 1);
  TORCH_CHECK(a[1] == 2);
  TORCH_CHECK(a[2] == 3);
}
```

Other types of constructors

- From two pointers: begin and end
- From a pointer and a length
- From a *std::vector*
- From a container that has `data()` and `size()` methods
- From a C array
- From a `std::array`

8.2.4 ScalarType

See c10/core/ScalarType.h. and https://github.com/pytorch/pytorch/blob/master/torch/csrc/api/include/torch/types.h.

`ScalarType` is an `enum class`, i.e., `enum class ScalarType : int8_t { ... }`.

Members

It has the following members:

Listing 11: ./code/scalar-type/members.cc

```
#define AT_FORALL_SCALAR_TYPES_WITH_COMPLEX_EXCEPT_COMPLEX_HALF(_) \
  _(uint8_t, Byte)                                                 \
  _(int8_t, Char)                                                  \
  _(int16_t, Short)                                                \
  _(int, Int)                                                      \
  _(int64_t, Long)                                                 \
  _(at::Half, Half)                                                \
  _(float, Float)                                                  \
  _(double, Double)                                                \
  _(c10::complex<float>, ComplexFloat)                             \
  _(c10::complex<double>, ComplexDouble)                           \
  _(bool, Bool)                                                    \
  _(at::BFloat16, BFloat16)
```

Some aliases

Listing 12: ./code/scalar-type/main.cc (alias)

```cpp
static void TestAlias() {
  static_assert(c10::ScalarType::Int == c10::kInt, "");
  static_assert(c10::ScalarType::Byte == c10::kByte, "");
}
```

Listing 13: ./code/scalar-type/alias.cc

```cpp
// See torch/csrc/api/include/torch/types.h
using Dtype = at::ScalarType;

/// Fixed width dtypes.
constexpr auto kUInt8 = at::kByte;
constexpr auto kInt8 = at::kChar;
constexpr auto kInt16 = at::kShort;
constexpr auto kInt32 = at::kInt;
constexpr auto kInt64 = at::kLong;
constexpr auto kFloat16 = at::kHalf;
constexpr auto kFloat32 = at::kFloat;
constexpr auto kFloat64 = at::kDouble;

/// Rust-style short dtypes.
constexpr auto kU8 = kUInt8;
constexpr auto kI8 = kInt8;
constexpr auto kI16 = kInt16;
constexpr auto kI32 = kInt32;
constexpr auto kI64 = kInt64;
constexpr auto kF16 = kFloat16;
constexpr auto kF32 = kFloat32;
constexpr auto kF64 = kFloat64;
```

ScalarType to CPP type

Listing 14: ./code/scalar-type/main.cc

```cpp
static void TestScalarTypeToCppType() {
  static_assert(
      std::is_same<
          int32_t, //
          c10::impl::ScalarTypeToCPPType<c10 ::ScalarType::Int>::type>::value,
      "");
}
```

CPP type to ScalarType

Listing 15: ./code/scalar-type/main.cc

```cpp
static void TestCppTypeToScalarType() {
  static_assert(
      c10::CppTypeToScalarType<float>::value == c10::ScalarType::Float, "");
}
```

Note: It is `c10::impl::ScalarTypeToCPPType`, but it is `c10::CppTypeToScalarType`.

8.2.5 TypeMeta

See

- https://github.com/pytorch/pytorch/blob/master/c10/util/typeid.h
- https://github.com/pytorch/pytorch/blob/master/c10/core/ScalarTypeToTypeMeta.h

`struct TypeMeta` contains only a single `int16_t` data member:

Listing 16: ./code/type-meta/main.cc (Check size)

```cpp
static void TestSize() {
  static_assert(sizeof(caffe2::TypeMeta) == sizeof(int16_t), "");
}
```

Constructors

Listing 17: ./code/type-meta/main.cc (Make)

```cpp
static void TestConstructor() {
  caffe2::TypeMeta t = caffe2::TypeMeta::Make<int32_t>();
  TORCH_CHECK(t.Match<int32_t>());

  TORCH_CHECK(t.isScalarType());

  TORCH_CHECK(t.isScalarType(torch::kInt));
  TORCH_CHECK(t.isScalarType(torch::kFloat) == false);
```

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```

  TORCH_CHECK(t.name() == "int");
}
```

Operations with ScalarType

Listing 18: ./code/type-meta/main.cc (Operations with ScalarType)

```
static void TestFromScalarType() {
  caffe2::TypeMeta t = caffe2::TypeMeta::fromScalarType(torch::kDouble);

  TORCH_CHECK(t.isScalarType(torch::kDouble));
  TORCH_CHECK(t.name() == "double");

  TORCH_CHECK(t.toScalarType() == torch::kDouble);
  TORCH_CHECK(t == torch::kDouble);
  TORCH_CHECK(t != torch::kFloat);
  TORCH_CHECK(torch::kInt != t);
```

8.2.6 torch::Device

See

- https://github.com/pytorch/pytorch/blob/master/c10/core/DeviceType.h
- https://github.com/pytorch/pytorch/blob/master/c10/core/Device.h

DeviceType

`torch::DeviceType` is defined as `enum class Device: int8_t {...}`. The most commonly used types are `torch::DeviceType::CPU` and `torch::DeviceType::CUDA`, which are aliased to `torch::kCPU` and `torch::kCUDA`.

Listing 19: ./code/device/main.cc

```
void TestDeviceType() {
  torch::DeviceType d = torch::kCPU;
  std::ostringstream os;
  os << d;
  TORCH_CHECK(os.str() == "cpu");

  TORCH_CHECK(DeviceTypeName(d /*,lower_case=false*/) == "CPU");
  TORCH_CHECK(DeviceTypeName(d, /*lower_case*/ true) == "cpu");
```

Device

A `torch::Device` class has two members: a `torch::DeviceType` and an `int8_t index`.

Listing 20: ./code/device/main.cc (Constructors)

```
void TestDeviceConstructorCPU() {
  torch::Device d(torch::kCPU);
  TORCH_CHECK(d.is_cpu() == true);
  TORCH_CHECK(d.is_cuda() == false);
  TORCH_CHECK(d.type() == torch::kCPU);
  TORCH_CHECK(d.has_index() == false);
  TORCH_CHECK(d.index() == -1);
  TORCH_CHECK(d.str() == "cpu");
}

void TestDeviceConstructorCUDA() {
  torch::Device d(torch::kCUDA, 3);
  TORCH_CHECK(d.is_cpu() == false);
  TORCH_CHECK(d.is_cuda() == true);
  TORCH_CHECK(d.type() == torch::kCUDA);
  TORCH_CHECK(d.has_index() == true);
  TORCH_CHECK(d.index() == 3);
  TORCH_CHECK(d.str() == "cuda:3");

  d.set_index(2);
  TORCH_CHECK(d.index() == 2);
  TORCH_CHECK(d.str() == "cuda:2");

  d = torch::Device("cpu");
  TORCH_CHECK(d.is_cpu() == true);

  d = torch::Device("CPU");
  TORCH_CHECK(d.is_cpu() == true);

  d = torch::Device("cuda:1");
  TORCH_CHECK(d.is_cuda() == true);
  TORCH_CHECK(d.index() == 1);

  d = torch::Device("CUDA:1");
  TORCH_CHECK(d.is_cuda() == true);
```

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```
  TORCH_CHECK(d.index() == 1);
}
```

8.2.7 TensorOptions

See https://github.com/pytorch/pytorch/blob/master/c10/core/TensorOptions.h

Constructors (not recommended)

Listing 21: ./code/tensor-options/main.cc (Not recommended constructors)

```
void TestConstructor() {
  // not recommended
  torch::TensorOptions opt1(torch::kCPU);
  torch::TensorOptions opt2(torch::Device(torch::kCPU));
  torch::TensorOptions opt3(torch::Device({torch::kCUDA, 1}));
  torch::TensorOptions opt4("cpu");
  // torch::TensorOptions opt5("CPU") // error;
  torch::TensorOptions opt6("cuda:1");
  // torch::TensorOptions opt7("CUDA:1"); // error

  // not recommended, from a scalar type (implicit)
  torch::TensorOptions opt8(torch::kInt32);
}
```

Constructors (Recommended)

Listing 22: ./code/tensor-options/main.cc (Recommended constructors)

```
void TestConstructor2() {
  // recommended
  torch::TensorOptions opt1 = torch::dtype(torch::kFloat);
  torch::TensorOptions opt2 = torch::dtype(caffe2::TypeMeta::Make<float>());
  torch::TensorOptions opt3 = torch::device(torch::kCPU);
  torch::TensorOptions opt4 = torch::device({torch::kCUDA, 1});
  // Note: torch::device() returns a TensorOptions
  // while torch::Device() is the constructor of a class

  torch::TensorOptions opt5 = torch::requires_grad(true);
  std::cout << opt5 << "\n";
  // TensorOptions(dtype=float (default), device=cpu (default), layout=Strided
  // (default), requires_grad=true, pinned_memory=false (default),
  // memory_format=(nullopt))

  torch::TensorOptions opt6 = torch::dtype<float>();
  std::cout << torch::toString(opt6) << "\n";
  // TensorOptions(dtype=float, device=cpu (default), layout=Strided (default),
```

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```
  // requires_grad=false (default), pinned_memory=false (default),
  // memory_format=(nullopt))

  std::cout << "default:" << torch::TensorOptions() << "\n";
  // default:TensorOptions(dtype=float (default), device=cpu (default),
  // layout=Strided (default), requires_grad=false (default),
  // pinned_memory=false (default), memory_format=(nullopt))
}
```

Methods

Listing 23: ./code/tensor-options/main.cc (Methods)

```
void TestMethods() {
  torch::TensorOptions opts = torch::dtype<float>();
  TORCH_CHECK(opts.device() == torch::Device(torch::kCPU));
  // It has not device_type()!
  TORCH_CHECK(opts.device() == torch::kCPU);
  TORCH_CHECK(opts.device().type() == torch::kCPU);
  TORCH_CHECK(opts.requires_grad() == false);

  torch::TensorOptions opts2 =
      opts.device("cuda:2").dtype(torch::kInt).requires_grad(false);

  TORCH_CHECK(opts2.dtype() == caffe2::TypeMeta::Make<int32_t>());
  TORCH_CHECK(opts2.dtype() == torch::kInt32);
  TORCH_CHECK(opts2.requires_grad() == false);
}
```

8.2.8 Tensor Creation

See

TensorDataContainer

Note: data is **copied** to the returned tensor!

See

- https://github.com/pytorch/pytorch/blob/master/torch/csrc/api/include/torch/detail/TensorDataContainer.h
- https://github.com/pytorch/pytorch/blob/master/tools/autograd/templates/variable_factories.h
- https://github.com/pytorch/pytorch/blob/master/aten/src/ATen/Utils.cpp

Support the following data types:

- From a `std::vector<T>`
- From a scalar

- From an initializer list
- From an `ArrayRef<T>`.

From std::vector

Listing 24: ./code/tensor-creation/main.cc

```cpp
static void FromStdVecotr() {
  torch::Tensor t1 = torch::tensor(std::vector<int32_t>{1, 2, 3});
  TORCH_CHECK(t1.scalar_type() == torch::kLong);
  t1 = t1.to(torch::kInt);
  const int32_t *p1 = t1.data_ptr<int32_t>();
  TORCH_CHECK(p1[0] == 1);
  TORCH_CHECK(p1[1] == 2);
  TORCH_CHECK(p1[2] == 3);

  torch::Tensor t2 = torch::tensor(std::vector<float>{1, 2, 3});
  TORCH_CHECK(t2.scalar_type() == torch::kFloat);

  torch::Tensor t3 =
      torch::tensor(std::vector<double>{1, 2, 3}, torch::kDouble);
  TORCH_CHECK(t3.scalar_type() == torch::kDouble);

  torch::Tensor t4 =
      torch::tensor(std::vector<double>{1, 2, 3},
                    torch::dtype(torch::kDouble).device("cuda:0"));
  TORCH_CHECK(t4.is_cuda());
}
```

From scalar

Listing 25: ./code/tensor-creation/main.cc

```cpp
static void FromScalar() {
  torch::Tensor t = torch::tensor(3);
  TORCH_CHECK(t.item<int64_t>() == 3);

  torch::Tensor t2 = torch::tensor(0.5);
  TORCH_CHECK(t2.scalar_type() == torch::kFloat);
}
```

From initializer list

Listing 26: ./code/tensor-creation/main.cc

```cpp
static void FromInitializerList() {
  torch::Tensor t1 = torch::tensor({1, 2, 3});
  torch::Tensor t2 = torch::tensor(std::vector<int32_t>{1, 2, 3});
  TORCH_CHECK(torch::allclose(t1, t2));

  torch::Tensor t3 = torch::tensor({{1, 2, 3}, {4, 5, 6}});
  TORCH_CHECK(t3.dim() == 2);

  torch::Tensor t4 = torch::tensor({1, 2, 3});
  torch::Tensor t5 = torch::tensor({4, 5, 6});
  TORCH_CHECK(torch::allclose(t3[0], t4));
  TORCH_CHECK(torch::allclose(t3[1], t5));
}
```

From ArrayRef

Listing 27: ./code/tensor-creation/main.cc

```cpp
static void FromArrayRef() {
  int32_t i[] = {1, 2, 3};
  torch::ArrayRef<int32_t> a(i);
  torch::Tensor t = torch::tensor(a);
  // Data is copied to t

  TORCH_CHECK(t[0].item<int64_t>(), 1);
  TORCH_CHECK(t[1].item<int64_t>(), 2);
  TORCH_CHECK(t[2].item<int64_t>(), 3);
}
```

8.2.9 Tensor

See

- https://github.com/pytorch/pytorch/blob/master/aten/src/ATen/core/TensorBase.h
- https://github.com/pytorch/pytorch/blob/master/aten/src/ATen/templates/TensorBody.h
- https://github.com/pytorch/pytorch/blob/master/c10/core/TensorImpl.h

Common methods

Listing 28: ./code/tensor/main.cc (Not recommended constructors)

```cpp
static void TestCommonMethods() {
  torch::Tensor t = torch::rand({2, 3, 4});

  TORCH_CHECK(t.dim() == 3);              // 3-d tensor
  TORCH_CHECK(t.ndimension() == t.dim()); // same
  TORCH_CHECK(t.numel() == 2 * 3 * 4);
  TORCH_CHECK(t.is_contiguous() == true);
  TORCH_CHECK(t.contiguous().is_contiguous() == true);

  t.fill_(10); // fill all entries to 0
  t.zero_();   // zero out all entries

  t = t.to(torch::kInt);
  TORCH_CHECK(t.is_floating_point() == false);
  TORCH_CHECK(t.is_signed() == true);

  TORCH_CHECK(t.size(0) == 2);
  TORCH_CHECK(t.size(1) == 3);
  TORCH_CHECK(t.size(2) == 4);
  TORCH_CHECK(t.sizes() == torch::ArrayRef<int64_t>({2, 3, 4}));

  t = t.contiguous();
  TORCH_CHECK(t.stride(0) == 3 * 4);
  TORCH_CHECK(t.stride(1) == 4);
  TORCH_CHECK(t.stride(2) == 1);
```

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```
  TORCH_CHECK(t.strides() == torch::ArrayRef<int64_t>({12, 4, 1}));

  TORCH_CHECK(t.defined() == true);
  {
    torch::Tensor a;
    TORCH_CHECK(a.defined() == false);
    a = t;
    TORCH_CHECK(a.defined() == true);
    a.reset();
    TORCH_CHECK(a.defined() == false);
  }

  t = t.to(torch::kShort);
  TORCH_CHECK(t.itemsize() == sizeof(int16_t));
  TORCH_CHECK(t.nbytes() == t.numel() * t.itemsize());
  TORCH_CHECK(t.itemsize() == t.element_size()); // same

  TORCH_CHECK(t.scalar_type() == torch::kShort);
  TORCH_CHECK(t.dtype() == caffe2::TypeMeta::Make<int16_t>());
  TORCH_CHECK(t.dtype().toScalarType() == torch::kShort);

  TORCH_CHECK(t.device() == torch::Device("cpu"));
  TORCH_CHECK(t.device() == torch::Device(torch::kCPU));

  // Note: t.device() return an instance of torch::Device
  // t.get_device() returns the device index.
  TORCH_CHECK(t.get_device() == t.device().index());

  TORCH_CHECK(t.is_cpu() == true);
  TORCH_CHECK(t.is_cuda() == false);

  t = t.to(torch::kInt);
  int32_t *p = t.data_ptr<int32_t>();
  p[0] = 100;

  torch::TensorAccessor<int32_t, 3> acc = t.accessor<int32_t, 3>();
  TORCH_CHECK(acc[0][0][0] == p[0]);
  p[12] = -2;
  TORCH_CHECK(acc[1][0][0] == -2);

  acc[1][1][2] = 3;
  TORCH_CHECK(*(p + 12 + 4 + 2) == 3);

  t = t.to(torch::kFloat);
  t.set_requires_grad(true);
  TORCH_CHECK(t.requires_grad() == true);

  t.set_requires_grad(false);
  TORCH_CHECK(t.requires_grad() == false);

  t = t.cuda();
  TORCH_CHECK(t.device().type() == torch::kCUDA);
```

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```
  t = t.cpu();

  torch::TensorOptions opts = t.options();
  TORCH_CHECK(opts.device() == t.device());
}
```

8.2.10 intrusive_ptr

8.2.11 optional

8.2.12 PackedSequence

See

- https://github.com/pytorch/pytorch/blob/master/torch/csrc/api/include/torch/nn/utils/rnn.h
- https://github.com/pytorch/pytorch/blob/master/torch/nn/utils/rnn.py

pack_padded_sequence

Listing 29: ./code/packed-sequence/main.cc

```
static void TestPadPackedSequence() {
  torch::Tensor t = torch::tensor({
      {{10, 20, 30}, {0, 0, 0}},
      {{1, 2, 3}, {4, 5, 6}},
  });
  torch::Tensor lengths = torch::tensor({1, 2});
  torch::nn::utils::rnn::PackedSequence packed_seq =
      torch::nn::utils::rnn::pack_padded_sequence(
          t, lengths, /*batch_first*/ true, /*enforce_sorted*/ false);
  std::cout << "data: " << packed_seq.data() << "\n";
  std::cout << "batch_sizes: " << packed_seq.batch_sizes() << "\n";
  std::cout << "sorted_indices: " << packed_seq.sorted_indices() << "\n";
  std::cout << "unsorted_indices: " << packed_seq.unsorted_indices() << "\n";
}
```

The output is

Listing 30: ./code/packed-sequence/main.cc

```
/*
data:   1   2   3
 10  20  30
  4   5   6
[ CPULongType{3,3} ]
batch_sizes:  2
 1
[ CPULongType{2} ]
sorted_indices:  1
 0
```

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```
[ CPULongType{2} ]
unsorted_indices:  1
 0
[ CPULongType{2} ]
 */
```

8.2.13 ivalue

CHAPTER

NINE

PYTHON

9.1 asyncio

9.1.1 Hello World

Exercise 1

Listing 1: ./code/hello_world/ex1.py

```
import asyncio


async def hello():
    print("hello world")


asyncio.run(hello())
```

Exercise 2

Listing 2: ./code/hello_world/ex2.py

```
import asyncio
import time


loop = asyncio.get_event_loop()


@asyncio.coroutine
def hello():
    print(f"hello {time.strftime('%X')}")
    yield from asyncio.sleep(1)
    print(f"world {time.strftime('%X')}")


if __name__ == "__main__":
    loop.run_until_complete(hello())
```

9.1.2 References

- PEP 234 – Iterators

  https://peps.python.org/pep-0234/

- Why does defining __getitem__ on a class make it iterable in python?

  https://localcoder.org/why-does-defining-getitem-on-a-class-make-it-iterable-in-python

- PEP 255 – Simple Generators

  https://peps.python.org/pep-0255/

- Curious Course on Coroutines and Concurrency

  https://www.youtube.com/watch?v=Z_OAlIhXziw&ab_channel=DavidBeazley

  By David Beazley.

- Generator Tricks for Systems Programmers

  https://www.dabeaz.com/generators2/

- Generators: The Final Frontier

  <https://www.youtube.com/watch?v=5-qadlG7tWo&ab_channel=DavidBeazley>

  By David Beazley.

9.1.3 TODOs

`asyncio.to_thread()` runs the function in an executor, where the default executor is a threadpool executor, which invokes `loop.run_in_executor()` indirectly.

How to set the executor of a loop? Maybe something related to *set_default_executor*?

If we want to schedule a callback to run in the loop from the C++ code, we can use *loop.call_soon_safe()* method.

9.2 argv

From the doc https://docs.python.org/3/library/sys.html:

```
The list of command line arguments passed to a Python script.
argv[0] is the script name (it is operating system dependent whether
this is a full pathname or not). If the command was executed using the
-c command line option to the interpreter, argv[0] is set to the string
'-c'. If no script name was passed to the Python interpreter,
argv[0] is the empty string.
```

Note that `argv` is at least of size 1, though `argv[0]` may be an empty string.

```
import sys
print(sys.argv)
```

Python with zeroMQ (c extension)

9.3 time

```
import time
print(f'Started at {time.strftime("%X")}')
# do something
print(f'Finished at {time.strftime("%X")}')
```

9.4 Numbers

9.4.1 binary representation

Listing 3: ./code/numbers/representations.py

```
print(bin(1))  # 0b1
print(bin(3))  # 0b11
print(bin(255))  # 0b11111111
print(bin(256))  # 0b100000000
assert isinstance(bin(1), str)
assert int("11", base=2) == 3
assert int("0b11", base=0) == 3
assert hex(2) == "0x2"
assert hex(10) == "0xa"

assert oct(10) == "0o12"
assert int("12", base=8) == 10
assert int("0o12", base=0) == 10

assert 1_000 == 1000
assert 1_000_000 == 1000000
```

9.5 str

9.5.1 format

See https://docs.python.org/3/library/string.html#formatspec and https://peps.python.org/pep-3101/

Listing 4: ./code/str/format.py

```
a = 1
b = 2
c = 3
assert "{}".format(a) == "1"
assert "{}".format(b) == "2"
assert "{0} {1} {foo}".format(a, b, foo=c) == "1 2 3"

# 1 - the first positional argument (counting from 0)
# foo - it is a keyword argument
# 0 - the zeros positional
```

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```
assert "{1} {foo} {0}".format(a, b, foo=c) == "2 3 1"

assert "{0} {1} {0} {0}".format(a, b) == "1 2 1 1"

assert "skip braces {0} {{}}".format(a) == "skip braces 1 {}"
print("{}")  # {}
try:
    print("{} {}".format(a))
except IndexError as e:
    assert str(e) == "Replacement index 1 out of range for positional args tuple"

assert "{0:2}".format(a) == " 1"
assert "{0:02}".format(a) == "01"
assert "{0:03}".format(a) == "001"
assert "{0:1}".format(-1) == "-1"
assert "{0:2}".format(-1) == "-1"
assert "{0:3}".format(-1) == " -1"
assert "{0:03}".format(-1) == "-01"

assert "{0:.2f}".format(0.5) == "0.50"
assert "{0:.3f}".format(0.5) == "0.500"
```

CHAPTER

TEN

JAVA

10.1 Install

10.1.1 formatter

Install https://github.com/google/google-java-format

```
wget https://github.com/google/google-java-format/releases/download/v1.15.0/google-java-
↪format-1.15.0-all-deps.jar
```

Create a script with filename `google-java-format`:

```
#!/usr/bin/env bash

java -jar /ceph-sh0/fangjun/download/google-java-format-1.15.0-all-deps.jar $@
```

`chmod +x google-java-format` and add the path to `PATH`.

10.1.2 JDK

Go to https://www.oracle.com/java/technologies/downloads/#java17 and download

```
wget https://download.oracle.com/java/17/latest/jdk-17_linux-x64_bin.tar.gz
mkdir /ceph-fj/fangjun/software/
tar xvf jdk-17_linux-x64_bin.tar.gz -C /ceph-fj/fangjun/software
```

And then set the following environment variables:

```
export JAVA_HOME=/ceph-fj/fangjun/software/jdk-17.0.3
export PATH=$JAVA_HOME/bin:$JAVA_HOME
```

10.2 Hello world

Listing 1: Hello.java

```java
// Usage 1:
//   java Hello.java
// Usage 2:
//   javac Hello.java
//   java Hello
//
//  Note:
//   - "javac Hello.java" generates a file "Hello.class"
//   - "java Hello" takes as input "Hello.class" and executes it
//
class Hello {
  public static void main(String[] args) {
    System.out.println("hello world");
  }
} // There is no ';' here
```

Listing 2: EqualTest.java

```java
class EqualTest {
  public int i;

  public EqualTest(int a) {
    this.i = a;
  }

  public boolean equals(Object anObject) {
    if (this == anObject) {
      return true;
    }
    if (anObject instanceof EqualTest) {
      return this.i == ((EqualTest) anObject).i;
    }
    return false;
  }

  public static void main(String[] args) {
    EqualTest e1 = new EqualTest(10);
    EqualTest e2 = new EqualTest(10);

    System.out.println(e1 == e2); // false, compare the reference
    System.out.println(e1 != e2); // true
    System.out.println(e1.equals(e2)); // true, compare the contained value
  }
}
```

10.3 Reference

- https://docs.oracle.com/javase/tutorial/
- https://docs.oracle.com/en/java/javase/17/docs/api/index.html
- https://github.com/openjdk/jdk.git

  Clone it and you can find the source code in `src/java.base/share/classes/java/lang/System.java` for `java.lang.System`.

CHAPTER

ELEVEN

JAVASCRIPT

11.1 Hello world

```
console.log('hello world')
console.log(eval('3 + 5'))
```

To write multi-line javascript, use shift + Enter for a new line.

```
(function(){
  "use strict";
  /* Start of your code */
  function greetMe(yourName) {
    alert('Hello ' + yourName);
  }

  greetMe('World');
  /* End of your code */
})();
```

It is case sensitive. Statements are separated by `;`. Comments are the same as in C/C++.

11.2 TODOs

1. This page https://developer.mozilla.org/en-US/docs/Learn/Getting_started_with_the_web/Installing_basic_software lists some tools to minify code:
   - WebPack: https://webpack.js.org/
   - Grunt: https://gruntjs.com/
   - Gulp: https://gulpjs.com/
2. Color picker tool: https://developer.mozilla.org/en-US/docs/Web/CSS/CSS_Colors/Color_picker_tool
3. Google font: https://fonts.google.com/ and https://developers.google.com/fonts/docs/getting_started

CHAPTER

TWELVE

HTML

12.1 Hello world

Listing 1: hello_world.html

```
<!DOCTYPE html>
<html>
  <head>
    <meta charset="utf-8">
    <title>Hello World</title>
  </head>
  <body>
    <p>Hello world</p>
  </body>
</html>
```

12.1.1 comments

```
<!-- this is a comment -->
```

12.1.2 images

```
<img src="a.png" alt="yyy"></img>
<img src="foo/bar/b.png" alt="yyy"></img>
<img src="../../c.png" alt="yyy"></img>
```

12.1.3 ordered lists

```
<p> The following points </p>

<ol>
  <li> First </li>
  <li> Second </li>
</ol>
```

12.1.4 unordered lists

```
<p> The following points </p>

<ul>
  <li> foo </li>
  <li> bar </li>
</ul>
```

12.1.5 links

```
<a href="https://www.google.com">some text</a>
```

12.2 References

- Structuring the web with HTML

  https://developer.mozilla.org/en-US/docs/Learn/HTML

CHAPTER

THIRTEEN

CSS

13.1 Hello world

13.1.1 comment

```
/* this is a comment */
```

```
p { color: red; }
```

Then, in some html file, use:

```
<link href="abc/foo.css" rel="stylesheet">
```

13.1.2 Selector

- tag name or element name: e.g., `p` selects <p>; `h1` selects <h1>.
- ID:, e.g., `#my-id` selects <a id="my-id"> or <p id="my-id">
- class: e.g., `.my-class` selects <a class="my-class"> and <p class="my-class">
- attribute: e.g., `img[src]` selects <img src="a.png"> but not <img>

See https://developer.mozilla.org/en-US/docs/Learn/Getting_started_with_the_web/CSS_basics#different_types_of_selectors and https://developer.mozilla.org/en-US/docs/Learn/CSS/Building_blocks/Selectors for more.

Example with multiple rules:

Listing 1: Example with multiple rules

```
p {
  color: red;
  width: 500px;
  border: 1px solid black;
}
```

Example with multiple selectors:

13.2 References

- CSS basics

  https://developer.mozilla.org/en-US/docs/Learn/Getting_started_with_the_web/CSS_basics

CHAPTER

FOURTEEN

PYBIND11