

在 Pytorch 中一种模型保存和加载的方式如下：

```
# save
torch.save(model.state_dict(), PATH)

# load
model = MyModel(*args, **kwargs)
model.load_state_dict(torch.load(PATH))
model.eval()
```

`model.state_dict()` 其实返回的是一个 `OrderedDict`，存储了网络结构的名字和对应的参数，下面看看源代码如何实现的。

## state\_dict

```
# torch.nn.modules.module.py
class Module(object):
    def state_dict(self, destination=None, prefix="", keep_vars=False):
        if destination is None:
            destination = OrderedDict()
            destination._metadata = OrderedDict()
            destination._metadata[prefix[:-1]] = local_metadata = dict(version=self._version)
        for name, param in self._parameters.items():
            if param is not None:
                destination[prefix + name] = param if keep_vars else param.data
        for name, buf in self._buffers.items():
            if buf is not None:
                destination[prefix + name] = buf if keep_vars else buf.data
        for name, module in self._modules.items():
            if module is not None:
                module.state_dict(destination, prefix + name + '.', keep_vars=keep_vars)
        for hook in self._state_dict_hooks.values():
            hook_result = hook(self, destination, prefix, local_metadata)
            if hook_result is not None:
                destination = hook_result
        return destination
```

可以看到 `state_dict` 函数中遍历了4中元素，分别是 `_parameters`、`_buffers`、`_modules` 和 `_state_dict_hooks`，前面三者在前面的[文章](#)已经介绍区别，最后一种就是在读取 `state_dict` 时希望执行的操作，一般为空，所以不做考虑。另外有一点需要注意的是，在读取 `Module` 时采用的递归的读取方式，并且名字间使用 `.` 做分割，以方便后面 `load_state_dict` 读取参数。

```

class MyModel(nn.Module):
    def __init__(self):
        super(MyModel, self).__init__()
        self.my_tensor = torch.randn(1) # 参数直接作为模型类成员变量
        self.register_buffer('my_buffer', torch.randn(1)) # 参数注册为 buffer
        self.my_param = nn.Parameter(torch.randn(1))
        self.fc = nn.Linear(2,2,bias=False)
        self.conv = nn.Conv2d(2,1,1)
        self.fc2 = nn.Linear(2,2,bias=False)
        self.f3 = self.fc
    def forward(self, x):
        return x

model = MyModel()
print(model.state_dict())
>>>OrderedDict([('my_param', tensor([-0.3052])), ('my_buffer', tensor([0.5583])),
('fc.weight', tensor([[ 0.6322, -0.0255],
[-0.4747, -0.0530]])), ('conv.weight', tensor([[[[ 0.3346]],
[[ -0.2962]]]])), ('conv.bias', tensor([0.5205])), ('fc2.weight', tensor([[-0.4949,
0.2815],
[ 0.3006, 0.0768]])), ('f3.weight', tensor([[ 0.6322, -0.0255],
[-0.4747, -0.0530]]))])

```

## load\_state\_dict

下面的代码中我们可以分成两个部分看，

```
1. load(self)
```

这个函数会递归地对模型进行参数恢复，其中的`_load_from_state_dict`的源码附在文末。

首先我们需要明确`state_dict`这个变量表示你之前保存的模型参数序列，而

`_load_from_state_dict`函数中的`local_state`表示你的代码中定义的模型的结构。

那么`_load_from_state_dict`的作用简单理解就是假如我们现在需要对一个名为

`conv.weight`的子模块做参数恢复，那么就递归的方式先判断`conv`是否在`state_dict`和`local_state`中，如果不在就把`conv`添加到`unexpected_keys`中去，否则递归的判断`conv.weight`是否存在，如果都存在就执行`param.copy_(input_param)`，这样就完成了`conv.weight`的参数拷贝。

```
1. if strict:
```

这个部分的作用是判断上面参数拷贝过程中是否有`unexpected_keys`或者`missing_keys`，如果有就报错，代码不能继续执行。当然，如果`strict=False`，则会忽略这些细节。

```
def load_state_dict(self, state_dict, strict=True):
    missing_keys = []

```

```

unexpected_keys = []
error_msgs = []

# copy state_dict so _load_from_state_dict can modify it
metadata = getattr(state_dict, '_metadata', None)
state_dict = state_dict.copy()
if metadata is not None:
    state_dict._metadata = metadata

def load(module, prefix=""):
    local_metadata = {} if metadata is None else metadata.get(prefix[:-1], {})
    module._load_from_state_dict(
        state_dict, prefix, local_metadata, strict, missing_keys,
unexpected_keys, error_msgs)
    for name, child in module._modules.items():
        if child is not None:
            load(child, prefix + name + '.')

load(self)

if strict:
    error_msg = ""
    if len(unexpected_keys) > 0:
        error_msgs.insert(
            0, 'Unexpected key(s) in state_dict: {}. '.format(
                ', '.join("{} {}".format(k, v) for k, v in unexpected_keys)))
    if len(missing_keys) > 0:
        error_msgs.insert(
            0, 'Missing key(s) in state_dict: {}. '.format(
                ', '.join("{} {}".format(k, v) for k, v in missing_keys)))

    if len(error_msgs) > 0:
        raise RuntimeError('Error(s) in loading state_dict for {}:{}'.format(
            self.__class__.__name__, "\n\t".join(error_msgs)))

2._load_from_state_dict
def _load_from_state_dict(self, state_dict, prefix, local_metadata, strict,
                          missing_keys, unexpected_keys, error_msgs):
    for hook in self._load_state_dict_pre_hooks.values():
        hook(state_dict, prefix, local_metadata, strict, missing_keys,
unexpected_keys, error_msgs)

    local_name_params = itertools.chain(self._parameters.items(),
self._buffers.items())
    local_state = {k: v.data for k, v in local_name_params if v is not None}

    for name, param in local_state.items():

```

```

key = prefix + name
if key in state_dict:
    input_param = state_dict[key]

    # Backward compatibility: loading 1-dim tensor from 0.3.* to version
0.4+
    if len(param.shape) == 0 and len(input_param.shape) == 1:
        input_param = input_param[0]

    if input_param.shape != param.shape:
        # local shape should match the one in checkpoint
        error_msgs.append('size mismatch for {}: copying a param with
shape {} from checkpoint, '
                           'the shape in current model is {}.'
                           .format(key, input_param.shape,
param.shape))
        continue

    if isinstance(input_param, Parameter):
        # backwards compatibility for serialized parameters
        input_param = input_param.data
    try:
        param.copy_(input_param)
    except Exception:
        error_msgs.append('While copying the parameter named "{}", '
                           'whose dimensions in the model are {} and
,
                           'whose dimensions in the checkpoint are
{}. '
                           .format(key, param.size(),
input_param.size()))
        elif strict:
            missing_keys.append(key)

        if strict:
            for key, input_param in state_dict.items():
                if key.startswith(prefix):
                    input_name = key[len(prefix):]
                    input_name = input_name.split('.', 1)[0] # get the name of
param/buffer/child
                    if input_name not in self._modules and input_name not in
local_state:
                        unexpected_keys.append(key)

```