

```

1     import weakref
2     from abc import ABCMeta, abstractmethod
3     from collections import namedtuple
4     from operator import attrgetter
5
6     def grad(fun, argnum=0):
7         def gradfun(*args, **kwargs):
8             tape = CalculationTape(top_tape(args))
9             start_node = Node(args[argnum], tape)
10            args = args[:argnum] + (start_node,) + args[argnum+1:]
11            end_node = fun(*args, **kwargs)
12            if not tape.hasmember(end_node):
13                return start_node.sum_outgrads()
14            if not isinstance(getval(end_node), float):
15                raise TypeError("Can only take gradient of scalar-valued functions")
16            else:
17                end_node.outgrads.append(1.0)
18                for node in tape[::-1]:
19                    node.send_upstream()
20                return start_node.sum_outgrads()
21
22        return gradfun
23
24    def Differentiable(fun, forward_pass):
25        def differentiable_fun(*args, **kwargs):
26            tape = top_tape(args)
27            if tape is None:
28                return fun(*args, **kwargs)
29            else:
30                arg_vals = [arg.value if tape.hasmember(arg) else arg for arg in args]
31                result, gradfun = forward_pass(*arg_vals, **kwargs)
32                parent_ops = [(gradfun[i], parent)
33                             for i, parent in enumerate(args) if tape.hasmember(parent)]
34                return Node(result, tape, parent_ops)
35            differentiable_fun.__name__ = fun.__name__
36        return differentiable_fun
37
38    def primitive(fun, gradmaker):
39        def forward_pass(*args, **kwargs):
40            ans = differentiable_fun(*args, **kwargs)
41            return ans, gradmaker(ans, *args, **kwargs)
42        differentiable_fun = Differentiable(fun, forward_pass)
43        return differentiable_fun
44
45    class CalculationTape(list):
46        def __init__(self, prev_tape):
47            super(CalculationTape, self).__init__([])
48            self.priority = prev_tape.priority + 1 if prev_tape is not None else 1
49
50        def hasmember(self, x):
51            return isinstance(x, Node) and x.tape() is self
52
53    def top_tape(args):
54        tapes = [node.tape() for node in args if isinstance(node, Node)]
55        return max(tapes, key=attrgetter('priority')) if tapes else None
56

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57 ✓ class Node(object):
58     __slots__ = ['value', 'tape', 'parent_ops', 'outgrads']
59     __metaclass__ = ABCMeta
60 ✓ def __new__(cls, value, *args, **kwargs):
61     try:
62         node_type = node_types.type_mappings[type(value)]
63         return super(Node, cls).__new__(node_type, value, *args, **kwargs)
64     except KeyError:
65         raise TypeError("Can't differentiate wrt {0}".format(type(value)))
66
67 ✓ def __init__(self, value, tape, parent_ops=[]):
68     self.value = value
69     self.tape = weakref.ref(tape)
70     tape.append(self)
71     self.parent_ops = parent_ops
72     self.outgrads = []
73
74 ✓ def send_upstream(self):
75     if self.outgrads:
76         outgrad_sum = self.sum_outgrads()
77         for gradfun, parent in self.parent_ops:
78             parent.outgrads.append(gradfun(outgrad_sum))
79
80 ✓ def sum_outgrads(self):
81     if len(self.outgrads) is 1 and not isinstance(getval(self.outgrads[0]), Setter):
82
83         return self.outgrads[0]
84     else:
85         outgrad_sum = self.zeros()
86         for new in self.outgrads:
87             outgrad_sum = mutating_add(outgrad_sum, new)
88         return outgrad_sum
89
90 def __getitem__(self, idx):
91     return take(self, idx)
92
93 @abstractmethod
94 def zeros(self):
95     pass
96
97 def getval(x):
98     return getval(x.value) if isinstance(x, Node) else x
99
100 def zeros_like(x):
101     return Node(x, CalculationTape(None)).zeros()
102
103 Setter = namedtuple('Setter', ('idx', 'val'))
104
105 import node_types # Can only import after defining Node and Setter
106
107 ✓ def mutating_add(old, new):
108     if isinstance(new, Setter):
109         if old[new.idx] is 0:
110             old[new.idx] = new.val
111         else:
112             old[new.idx] += new.val
113     else:
114         old += new
115     return old
116
117 mutating_add = primitive(mutating_add, lambda ans, old, new: [lambda g : g] * 2)
118
119 def take(A, idx): return A[idx]
120 take = primitive(take, lambda ans, A, idx : [lambda g : untake(g, idx)])
121
122 def untake(x, idx): return Setter(idx, x)
123 untake = primitive(untake, lambda ans, x, idx : [lambda g : take(g, idx)])

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