

Gradient Descent

Consider the nonlinear error surface $E(u, v) = (ue^v - 2ve^{-u})^2$. We start at the point $(u, v) = (1, 1)$ and minimize this error using gradient descent in the uv space. Use $\eta = 0.1$ (learning rate, not step size).

Gradient Descent ($\text{err} \leq 10^{-14}$)

Let's see how many runs it takes until error drops below 10^{-14}

```
(* reset globals *)
Clear[Experiment1]
Clear[elw, elη, eli, elerr]
```

```
Experiment1[] :=
Module[{
  η = 0.1,
  w = {1, 1},
  err = 1,
  i,
  maxIters = 10 000,
  Ee
},
  Ee[u_, v_] := (u e^v - 2 v e^-u)^2;
  For[i = 0, i < maxIters, And[err > 10^-14, i++, (
    w = w - η ∇_{u,v} Ee[u, v] /. {u → w[[1]], v → w[[2]]};
    err = Ee[w[[1]], w[[2]]];
  )
];
  {w, η, i, err}
]

{elw, elη, eli, elerr} = Experiment1[];
StringForm[
  "Gradient descent results (η=``): \nw=``, i=``, err=``, elη, elw, eli, elerr]"
```

```
Gradient descent results (η=0.1`):
w={0.0447363, 0.0239587}, i=10, err=1.2086833939395977`*^-15
```

Comparison with “coordinate descent”

Compare the performance of “coordinate descent.” In each iteration, we have two steps along the 2 coordinates. Step 1 is to move only along the u coordinate to reduce the error (assume first-order approximation holds like in gradient descent), and step 2 is to reevaluate and move only along the v coordinate to reduce the error (again, assume first-order approximation holds). Use the same learning rate of $\eta = 0.1$ as we did in gradient descent. Let's check the error $E(u, v)$ after 15 full iterations (30 steps).

```

(* reset globals *)
Clear[Experiment2]
Clear[e2w, e2η, e2i, e2err]

Experiment2[] :=
Module[
{
  η = 0.1,
  w = {1, 1},
  err = 1,
  i,
  maxIters = 15,
  Ee
},
Ee[u_, v_] := (u e^v - 2 v e^-u)^2;
For[i = 0, i < maxIters /& err > 10^-14, i++, (
  w = w - η { (∇_{u}) Ee[u, v] /. {u → w[[1]], v → w[[2]]} } [[1]], 0};
  w = w - η { 0, (∇_{v}) Ee[u, v] /. {u → w[[1]], v → w[[2]]} } [[1]];
  err = Ee[w[[1]], w[[2]]];
);
];
{w, η, i, err}
]

{e2w, e2η, e2i, e2err} = Experiment2[];
StringForm[
"Coordinate descent results (η=``):\nw=``, i=``, err=``", e2η, e2w, e2i, e2err]

Coordinate descent results (η=0.1`):
w={6.29708, -2.85231}, i=15, err=0.13981379199615304`

```