



链滴

优化版 JAVA 最大熵模型 (GIS 训练)

作者: [bestjimmy](#)

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<p>网上现有的最大熵模型，如：https://blog.csdn.net/nwpuwyk/article/details/37500371

该代码在训练环节性能较差，特征函数存储的结构也涉及较简单。

我在该版本基础上进行了改进，优化了特征函数的数据结构和训练代码。</p>

```
<pre><code class="highlight-chroma"><span class="highlight-line"><span class="highlight-cl">  /**
```

```
</span></span><span class="highlight-line"><span class="highlight-cl"> * 样本数据集
```

```
</span></span><span class="highlight-line"><span class="highlight-cl"> */
```

```
</span></span><span class="highlight-line"><span class="highlight-cl"> List<Instance>; instanceList = new ArrayList<Instance>();
```

```
</span></span><span class="highlight-line"><span class="highlight-cl"> /**
```

```
</span></span><span class="highlight-line"><span class="highlight-cl"> * 特征列表，来  
所有事件的统计结果
```

```
</span></span><span class="highlight-line"><span class="highlight-cl"> */
```

```
</span></span></code></pre>
```

```
<p>/** Map<String,Feature>; featureMap=new HashMap<>();<br>
```

```
*/<br>
```

```
* 每个特征的出现次数<br>
```

```
*/<br>
```

```
//Map<String,Integer>; featureCountMap=new HashMap<>();<br>
```

```
*/<br>
```

```
* 事件（类别）集<br>
```

```
*/<br>
```

```
List labels = new ArrayList();<br>
```

```
/**<br>
```

```
* 每个特征函数的权重<br>
```

```
*/<br>
```

```
// double[] weight;<br>
```

```
Map<String,Weight>; weightMap=new HashMap<>();<br>
```

```
*/<br>
```

```
* 一个事件最多一共有多少种特征<br>
```

```
*/<br>
```

```
double learningRate=10;<br>
```

```
int C;<br>
```

```
Map<String,List>; testInstance;<br>
```

```
/**<br>
```

```
* 样本数据集 */ List instanceList = new ArrayList();<br>
```

```
/**<br>
```

```
* 特征列表，来自所有事件的统计结果 */ Map featureMap=new HashMap<>();<br>
```

```
/**<br>
```

```
* 每个特征的出现次数 */ Map featureCountMap=new HashMap<>();<br>
```

```
/**<br>
```

```
* 事件（类别）集 */ List labels = new ArrayList();<br>
```

```
/**<br>
```

```
* 每个特征函数的权重 */ double[] weight;<br>
```

```
Map<String,Weight>; weightMap=new HashMap<>();<br>
```

```
/**<br>
```

```
* 一个事件最多一共有多少种特征 */ double learningRate=10;<br>
```

```
int C;</p>
```

```
<pre><code class="highlight-chroma"><span class="highlight-line"><span class="highlight-cl"> * 训练模型 * @param maxIt 最大迭代次数
```

```
</span></span><span class="highlight-line"><span class="highlight-cl"> */public void train(int maxIt,String savePath) throws IOException {
```

```

</span></span><span class="highlight-line"><span class="highlight-cl"> Map,Double&
t; empiricalE = new HashMap<&&>(); // 经验期望
</span></span><span class="highlight-line"><span class="highlight-cl"> Map,Double&&t
modelE = new HashMap<&&>(); // 模型期望
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl"> for (Map.Entry
Weight&&t; e:weightMap.entrySet())
</span></span><span class="highlight-line"><span class="highlight-cl"> {
</span></span><span class="highlight-line"><span class="highlight-cl"> double rati
=(double) e.getValue().getCnt() / instanceList.size();
</span></span><span class="highlight-line"><span class="highlight-cl"> empiricalE.put(e
getKey(),ratio);
</span></span><span class="highlight-line"><span class="highlight-cl"> }
</span></span><span class="highlight-line"><span class="highlight-cl"> Map,Double&
t; lastWeight=new HashMap<&&>();
</span></span><span class="highlight-line"><span class="highlight-cl"> for (int i = 0; i &l
; maxI; ++i)
</span></span><span class="highlight-line"><span class="highlight-cl"> {
</span></span><span class="highlight-line"><span class="highlight-cl"> System.out.
rintln("iter:" +i);
</span></span><span class="highlight-line"><span class="highlight-cl"> computeModeE
modelE);//计算模型期望
</span></span><span class="highlight-line"><span class="highlight-cl"> System.out.print
n("model finish.updating...");
</span></span><span class="highlight-line"><span class="highlight-cl"> for (Map.Entry,
eight&&t; e:weightMap.entrySet())
</span></span><span class="highlight-line"><span class="highlight-cl"> {
</span></span><span class="highlight-line"><span class="highlight-cl"> //lastWei
ht[w] = weight[w];
</span></span><span class="highlight-line"><span class="highlight-cl"> lastWeight.put(
.getKey(),e.getValue().getWeight());
</span></span><span class="highlight-line"><span class="highlight-cl"> String f=e.getK
y());
</span></span><span class="highlight-line"><span class="highlight-cl"> double delta=le
arningRate / C * Math.log(empiricalE.get(f)/ modelE.get(f));
</span></span><span class="highlight-line"><span class="highlight-cl"> weightMap.get(
).addWeight(delta);
</span></span><span class="highlight-line"><span class="highlight-cl"> }
</span></span><span class="highlight-line"><span class="highlight-cl"> System.out.
rintln("saving iter:" +i);
</span></span><span class="highlight-line"><span class="highlight-cl"> learningRate*=0
99;
</span></span><span class="highlight-line"><span class="highlight-cl"> learningRate=l
arningRate&&t;10?10:learningRate;
</span></span><span class="highlight-line"><span class="highlight-cl"> saveParam(sav
Path+ "ent_insopt.par" +i);
</span></span><span class="highlight-line"><span class="highlight-cl"> if (checkConver
ence(lastWeight, weightMap)) break;
</span></span><span class="highlight-line"><span class="highlight-cl"> }
</span></span><span class="highlight-line"><span class="highlight-cl"> }
</span></span><span class="highlight-line"><span class="highlight-cl"> }
</span></span><span class="highlight-line"><span class="highlight-cl"> /**

```

```

</span></span><span class="highlight-line"><span class="highlight-cl"> * 预测类别 * @p
ram fieldList
</span></span><span class="highlight-line"><span class="highlight-cl"> * @return
</span></span><span class="highlight-line"><span class="highlight-cl"> */
</span></span><span class="highlight-line"><span class="highlight-cl"> public Pair, Doub
e&gt;[] predict(Map,Integer&gt; fieldList)
</span></span><span class="highlight-line"><span class="highlight-cl"> {
</span></span><span class="highlight-line"><span class="highlight-cl">     double[] prob
= calProb(fieldList);
</span></span><span class="highlight-line"><span class="highlight-cl">     Pair, Double&gt;
[] pairResult = new Pair[prob.length];
</span></span><span class="highlight-line"><span class="highlight-cl">     for (int i = 0; i &
; prob.length; ++i)
</span></span><span class="highlight-line"><span class="highlight-cl">     {
</span></span><span class="highlight-line"><span class="highlight-cl">         pairResult[i]
= new Pair, Double&gt;(labels.get(i), prob[i]);
</span></span><span class="highlight-line"><span class="highlight-cl">     }
</span></span><span class="highlight-line"><span class="highlight-cl">     return pairRes
lt;
</span></span><span class="highlight-line"><span class="highlight-cl"> }
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl"> /**
</span></span><span class="highlight-line"><span class="highlight-cl"> * 检查是否收敛 *
@param w1
</span></span><span class="highlight-line"><span class="highlight-cl"> * @param w2
</span></span><span class="highlight-line"><span class="highlight-cl"> * @return 是否
收敛
</span></span><span class="highlight-line"><span class="highlight-cl"> */public boolean
checkConvergence(Map,Double&gt; w1, Map,Weight&gt; w2)
</span></span><span class="highlight-line"><span class="highlight-cl"> {
</span></span><span class="highlight-line"><span class="highlight-cl">     System.out.pri
tln("w1 size:" +w1.size());
</span></span><span class="highlight-line"><span class="highlight-cl">     boolean flag=tr
e;
</span></span><span class="highlight-line"><span class="highlight-cl">     for (Map.Entry,
ouble&gt; e1:w1.entrySet())
</span></span><span class="highlight-line"><span class="highlight-cl">     {
</span></span><span class="highlight-line"><span class="highlight-cl">         //System.ou
.println("thread:" +Math.abs(e1.getValue() - w2.get(e1.getKey())) );
</span></span><span class="highlight-line"><span class="highlight-cl">         if (Math.abs(e1.
etValue() - w2.get(e1.getKey()).getWeight()) &gt;= 1e-4) // 收敛阈值0.01可自行调整
</span></span><span class="highlight-line"><span class="highlight-cl">             flag=false;
</span></span><span class="highlight-line"><span class="highlight-cl">         }
</span></span><span class="highlight-line"><span class="highlight-cl">         return flag;
</span></span><span class="highlight-line"><span class="highlight-cl">     }
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl"> /**
</span></span><span class="highlight-line"><span class="highlight-cl"> * 计算模型期望
即在当前的特征函数的权重下，计算特征函数的模型期望值。 * @param modelE 储存空间，应当事
分配好内存（之所以不return一个modelE是为了避免重复分配内存）
</span></span><span class="highlight-line"><span class="highlight-cl"> */public void c
mputeModeE(Map,Double&gt; modelE)
</span></span><span class="highlight-line"><span class="highlight-cl"> {

```

```

</span></span><span class="highlight-line"><span class="highlight-cl">    modelE.clear();
</span></span><span class="highlight-line"><span class="highlight-cl">    double rate=1.0
/ instanceList.size();
</span></span><span class="highlight-line"><span class="highlight-cl">    for (int i = 0; i &l
; instanceList.size(); ++i)
</span></span><span class="highlight-line"><span class="highlight-cl">        {
</span></span><span class="highlight-line"><span class="highlight-cl">            Map,Intege
</span></span><span class="highlight-line"><span class="highlight-cl">                Map,Intege
&gt; fieldMap = instanceList.get(i).fieldList;//no labels
</span></span><span class="highlight-line"><span class="highlight-cl">        //计算当前样本
对应所有类别的概率 double[] pro = calProb(fieldMap);
</span></span><span class="highlight-line"><span class="highlight-cl">        for (Map.Entry,In
eger&gt; e:fieldMap.entrySet())
</span></span><span class="highlight-line"><span class="highlight-cl">            {
</span></span><span class="highlight-line"><span class="highlight-cl">                String ins
eature=e.getKey();//**
</span></span><span class="highlight-line"><span class="highlight-cl">                * 训练模型
</span></span><span class="highlight-line"><span class="highlight-cl">                * @param maxI
最大迭代次数
</span></span><span class="highlight-line"><span class="highlight-cl">                */
</span></span><span class="highlight-line"><span class="highlight-cl">                public void train
(int maxIt,String savePath) throws IOException {
</span></span><span class="highlight-line"><span class="highlight-cl">                    Map&lt;&Strin
,Double&gt; empiricalE = new HashMap&lt;&&gt;(); // 经验期望
</span></span><span class="highlight-line"><span class="highlight-cl">                    Map&lt;&Strin
,Double&gt; modelE = new HashMap&lt;&&gt;(); // 模型期望
</span></span><span class="highlight-line"><span class="highlight-cl">                    for (Map.Entr
&lt;&String,Weight&gt; e:weightMap.entrySet())
</span></span><span class="highlight-line"><span class="highlight-cl">                        {
</span></span><span class="highlight-line"><span class="highlight-cl">                            double rat
o=(double) e.getValue().getCnt() / instanceList.size();
</span></span><span class="highlight-line"><span class="highlight-cl">                            empiricalE
.put(e.getKey(),ratio);
</span></span><span class="highlight-line"><span class="highlight-cl">                        }
</span></span><span class="highlight-line"><span class="highlight-cl">                    Map&lt;&Strin
,Double&gt; lastWeight=new HashMap&lt;&&gt;();
</span></span><span class="highlight-line"><span class="highlight-cl">                    for (int i = 0; i
&lt;& maxIt; ++i)
</span></span><span class="highlight-line"><span class="highlight-cl">                        {
</span></span><span class="highlight-line"><span class="highlight-cl">                            System.out
.println("iter:"+i);
</span></span><span class="highlight-line"><span class="highlight-cl">                            compute
odeE(modelE);//计算模型期望
</span></span><span class="highlight-line"><span class="highlight-cl">                            System.out
.println("model finish.updating...");
</span></span><span class="highlight-line"><span class="highlight-cl">                            for (Map.E
try&lt;&String,Weight&gt; e:weightMap.entrySet())
</span></span><span class="highlight-line"><span class="highlight-cl">                                {
</span></span><span class="highlight-line"><span class="highlight-cl">                                    //lastWe
ght[w] = weight[w];
</span></span><span class="highlight-line"><span class="highlight-cl">                                    lastWei
ht.put(e.getKey(),e.getValue().getWeight());
</span></span><span class="highlight-line"><span class="highlight-cl">                                }
</span></span><span class="highlight-line"><span class="highlight-cl">                            String f

```

```

e.getKey());
</span></span><span class="highlight-line"><span class="highlight-cl">                double
elta=learningRate / C * Math.log(empiricalE.get(f)/ modelE.get(f));
</span></span><span class="highlight-line"><span class="highlight-cl">                weight
ap.get(f).addWeight(delta);
</span></span><span class="highlight-line"><span class="highlight-cl">            }
</span></span><span class="highlight-line"><span class="highlight-cl">            System.out
println("saving iter:"+i);
</span></span><span class="highlight-line"><span class="highlight-cl">            learningRa
e*=0.99;
</span></span><span class="highlight-line"><span class="highlight-cl">            learningRa
e=learningRate&lt;10?10:learningRate;
</span></span><span class="highlight-line"><span class="highlight-cl">            saveParam
savePath+"ent_insopt.par"+i);
</span></span><span class="highlight-line"><span class="highlight-cl">            if (checkC
nvergence(lastWeight, weightMap)) break;
</span></span><span class="highlight-line"><span class="highlight-cl">        }
</span></span><span class="highlight-line"><span class="highlight-cl">    }
</span></span><span class="highlight-line"><span class="highlight-cl">    }
</span></span><span class="highlight-line"><span class="highlight-cl">    }
</span></span><span class="highlight-line"><span class="highlight-cl">    /**
</span></span><span class="highlight-line"><span class="highlight-cl">    * 预测类别
</span></span><span class="highlight-line"><span class="highlight-cl">    * @param field
ist
</span></span><span class="highlight-line"><span class="highlight-cl">    * @return
</span></span><span class="highlight-line"><span class="highlight-cl">    */
</span></span><span class="highlight-line"><span class="highlight-cl">    public Pair&lt;S
ring, Double&gt;[] predict(Map&lt;String,Integer&gt; fieldList)
{
</span></span><span class="highlight-line"><span class="highlight-cl">    {
</span></span><span class="highlight-line"><span class="highlight-cl">        double[] prob
= calProb(fieldList);
</span></span><span class="highlight-line"><span class="highlight-cl">        Pair&lt;String
Double&gt;[] pairResult = new Pair[prob.length];
</span></span><span class="highlight-line"><span class="highlight-cl">        for (int i = 0; i
&lt; prob.length; ++i)
</span></span><span class="highlight-line"><span class="highlight-cl">        {
</span></span><span class="highlight-line"><span class="highlight-cl">            pairResult[i]
= new Pair&lt;String, Double&gt;(labels.get(i), prob[i]);
</span></span><span class="highlight-line"><span class="highlight-cl">        }
</span></span><span class="highlight-line"><span class="highlight-cl">        return pairRe
ult;
</span></span><span class="highlight-line"><span class="highlight-cl">    }
</span></span><span class="highlight-line"><span class="highlight-cl">    }
</span></span><span class="highlight-line"><span class="highlight-cl">    /**
</span></span><span class="highlight-line"><span class="highlight-cl">    * 检查是否收敛
</span></span><span class="highlight-line"><span class="highlight-cl">    * @param w1
</span></span><span class="highlight-line"><span class="highlight-cl">    * @param w2
</span></span><span class="highlight-line"><span class="highlight-cl">    * @return 是
收敛
</span></span><span class="highlight-line"><span class="highlight-cl">    */
</span></span><span class="highlight-line"><span class="highlight-cl">    public boolean
heckConvergence(Map&lt;String,Double&gt; w1, Map&lt;String,Weight&gt; w2)

```



```

</span></span><span class="highlight-line"><span class="highlight-cl">        double we
ghtSum = 0;
</span></span><span class="highlight-line"><span class="highlight-cl">        String labe
=labels.get(i);
</span></span><span class="highlight-line"><span class="highlight-cl">        for (String
ield : fieldList.keySet())
</span></span><span class="highlight-line"><span class="highlight-cl">        {
</span></span><span class="highlight-line"><span class="highlight-cl">            String f
ature=label+":"+field;
</span></span><span class="highlight-line"><span class="highlight-cl">            if (weig
tMap.containsKey(feature)) {
</span></span><span class="highlight-line"><span class="highlight-cl">                weigh
Sum += weightMap.get(feature).getWeight()*fieldList.get(field);
</span></span><span class="highlight-line"><span class="highlight-cl">            }
</span></span><span class="highlight-line"><span class="highlight-cl">        }
</span></span><span class="highlight-line"><span class="highlight-cl">        if(weightS
m>15)
</span></span><span class="highlight-line"><span class="highlight-cl">        {
</span></span><span class="highlight-line"><span class="highlight-cl">            weightS
m=15;
</span></span><span class="highlight-line"><span class="highlight-cl">        }
</span></span><span class="highlight-line"><span class="highlight-cl">        p[i] = Math
exp(weightSum);
</span></span><span class="highlight-line"><span class="highlight-cl">        sum += p[i]
;
</span></span><span class="highlight-line"><span class="highlight-cl">    }
</span></span><span class="highlight-line"><span class="highlight-cl">    //System.out
println();
</span></span><span class="highlight-line"><span class="highlight-cl">    for (int i = 0; i
<&lt; p.length; ++i)
</span></span><span class="highlight-line"><span class="highlight-cl">    {
</span></span><span class="highlight-line"><span class="highlight-cl">        p[i] /= sum
if(Double
isNaN(p[i]))
</span></span><span class="highlight-line"><span class="highlight-cl">    {
</span></span><span class="highlight-line"><span class="highlight-cl">        System
out.println(p[i]);
</span></span><span class="highlight-line"><span class="highlight-cl">    }
</span></span><span class="highlight-line"><span class="highlight-cl">    }
</span></span><span class="highlight-line"><span class="highlight-cl">    return p;
</span></span><span class="highlight-line"><span class="highlight-cl">    }
</span></span><span class="highlight-line"><span class="highlight-cl">    /**
</span></span><span class="highlight-line"><span class="highlight-cl">     * 一个观测实例
</span></span><span class="highlight-line"><span class="highlight-cl">     */
</span></span><span class="highlight-line"><span class="highlight-cl">    class Instance i
plements Serializable
</span></span><span class="highlight-line"><span class="highlight-cl">    {
</span></span><span class="highlight-line"><span class="highlight-cl">        /**
</span></span><span class="highlight-line"><span class="highlight-cl">         * 事件 (类
) , 如Outdoor

```

```

</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
环境集合, 如[Sunny, Happy]
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
,Integer> fieldList = new HashMap<&&>();
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
e(String label, Map<String,Integer>;fieldList)
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
label;
</span></span><span class="highlight-line"><span class="highlight-cl">
= fieldList;
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
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</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
=0;
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
dWeight(double w)
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
w);
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
getWeight() {
</span></span><span class="highlight-line"><span class="highlight-cl">
ht;
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
dCnt(int c)
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
tWeight(double weight) {
</span></span><span class="highlight-line"><span class="highlight-cl">
= weight;
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
Cnt() {
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">
</span></span><span class="highlight-line"><span class="highlight-cl">

```

```

*/
String label;
/**
 * 事件发生
*/
Map<String,Strin
public Instan
{
    this.label =
        this.fieldLis
}
}
/**
 * 特征(二值函数)
*/
class Weight
{
    double weigh
    int cnt=0;
    public void a
    {
        weight+=
    }
    public double
        return wei
    }
    public void a
    {
        cnt+=c;
    }
    public void s
        this.weight
    }
    public int ge
        return cnt;
}

```

