Tree :

```
tumorAtLeastLarge => T
 smoker => T
  ZubrodaAtLeast1 => T
   diagnosisIsDGN5 => T
   patient(lived)
   diagnosisIsDGN5 => F
    patient(died)
  ZubrodaAtLeast1 => F
  patient(lived)
 smoker => F
  patient(lived)
tumorAtLeastLarge => F
 smoker => T
  diagnosisIsDGN3 => T
   young => T
    patient(lived)
   young => F
    dyspnoeaBeforeSurgery => T
     weaknessBeforeSurgery => T
      patient(lived)
     weaknessBeforeSurgery => F
      painBeforeSurgery => T
       patient(lived)
      painBeforeSurgery => F
       ZubrodaAtLeast1 => T
        patient(died)
       ZubrodaAtLeast1 => F
        patient(lived)
    dyspnoeaBeforeSurgery => F
     diabetesMellitus => T
      painBeforeSurgery => T
       patient(lived)
      painBeforeSurgery => F
       highFVC => T
        patient(lived)
       highFVC => F
        old \Rightarrow T
         coughBeforeSurgery => T
          tumorAtLeastMedium => T
           mediumVolume => T
            middleAge => T
             patient (died)
            middleAge => F
             asthmatic => T
              patient(died)
             asthmatic => F
              peripheralArterialDiseases => T
               patient(died)
              peripheralArterialDiseases => F
               recentMyocardialInfarction => T
                patient (died)
               recentMyocardialInfarction => F
                tumorAtLeastSmall => T
                 weaknessBeforeSurgery => T
                  patient (died)
```

```
weaknessBeforeSurgery => F
             haemoptysisBeforeSurgery => T
              patient (died)
             haemoptysisBeforeSurgery => F
              ZubrodaAtLeast2 => T
               patient (died)
              ZubrodaAtLeast2 => F
               ZubrodaAtLeast1 => T
                highVolume => T
                 patient(died)
                highVolume => F
                 lowVolume => T
                  patient(died)
                 lowVolume => F
                  mediumFVC => T
                   lowFVC => T
                    patient(died)
                   lowFVC => F
                    diagnosisIsDGN1 => T
                     patient(died)
                    diagnosisIsDGN1 => F
                     diagnosisIsDGN7 => T
                      patient (died)
                     diagnosisIsDGN7 => F
                      diagnosisIsDGN5 => T
                       patient(died)
                      diagnosisIsDGN5 => F
                       diagnosisIsDGN6 => T
                        patient (died)
                       diagnosisIsDGN6 => F
                        diagnosisIsDGN4 => T
                         patient(died)
                        diagnosisIsDGN4 => F
                         diagnosisIsDGN2 => T
                          patient(died)
                         diagnosisIsDGN2 => F
                          patient(lived)
                  mediumFVC => F
                   patient (died)
               ZubrodaAtLeast1 => F
                patient(died)
           tumorAtLeastSmall => F
            patient(died)
     mediumVolume => F
       patient(died)
     tumorAtLeastMedium => F
     patient (died)
    coughBeforeSurgery => F
    patient(lived)
   old => F
   patient(died)
diabetesMellitus => F
highFVC => T
 patient (died)
highFVC => F
 tumorAtLeastSmall => T
   coughBeforeSurgery => T
```

```
ZubrodaAtLeast2 => T
patient (died)
ZubrodaAtLeast2 => F
peripheralArterialDiseases => T
 patient(died)
peripheralArterialDiseases => F
 painBeforeSurgery => T
  patient(died)
 painBeforeSurgery => F
  haemoptysisBeforeSurgery => T
   old \Rightarrow T
    patient(lived)
   old \Rightarrow F
     patient(died)
  haemoptysisBeforeSurgery => F
   mediumVolume => T
     weaknessBeforeSurgery => T
      patient(died)
     weaknessBeforeSurgery => F
      old \Rightarrow T
       middleAge => T
        patient(died)
       middleAge => F
        asthmatic => T
         patient(died)
        asthmatic => F
         recentMyocardialInfarction => T
          patient (died)
         recentMyocardialInfarction => F
          tumorAtLeastMedium => T
           ZubrodaAtLeast1 => T
            highVolume => T
             patient(died)
            highVolume => F
             lowVolume => T
              patient(died)
             lowVolume => F
              mediumFVC => T
               lowFVC => T
                patient (died)
               lowFVC => F
                diagnosisIsDGN1 => T
                 patient (died)
                diagnosisIsDGN1 => F
                 diagnosisIsDGN7 => T
                  patient(died)
                  diagnosisIsDGN7 => F
                   diagnosisIsDGN5 => T
                   patient (died)
                   diagnosisIsDGN5 => F
                    diagnosisIsDGN6 => T
                     patient(died)
                    diagnosisIsDGN6 => F
                     diagnosisIsDGN4 => T
                      patient(died)
                     diagnosisIsDGN4 => F
                      diagnosisIsDGN2 => T
```

```
patient(died)
                 diagnosisIsDGN2 => F
                  patient(died)
          mediumFVC => F
           patient(died)
       ZubrodaAtLeast1 => F
        patient(died)
      tumorAtLeastMedium => F
       patient(died)
  old => F
   middleAge => T
    asthmatic => T
     patient(died)
    asthmatic => F
     recentMyocardialInfarction => T
      patient(died)
     recentMyocardialInfarction => F
      tumorAtLeastMedium => T
       ZubrodaAtLeast1 => T
        highVolume => T
         patient(died)
        highVolume => F
         lowVolume => T
          patient(died)
         lowVolume => F
          mediumFVC => T
           lowFVC => T
            patient(died)
           lowFVC => F
            diagnosisIsDGN1 => T
             patient(died)
            diagnosisIsDGN1 => F
             diagnosisIsDGN7 => T
              patient(died)
             diagnosisIsDGN7 => F
              diagnosisIsDGN5 => T
               patient (died)
              diagnosisIsDGN5 => F
               diagnosisIsDGN6 => T
                patient(died)
               diagnosisIsDGN6 => F
                diagnosisIsDGN4 => T
                 patient(died)
                diagnosisIsDGN4 => F
                 diagnosisIsDGN2 => T
                  patient(died)
                 diagnosisIsDGN2 => F
                  patient(died)
          mediumFVC => F
           patient(died)
       ZubrodaAtLeast1 => F
        patient(died)
      tumorAtLeastMedium => F
       patient (died)
   middleAge => F
    patient(died)
mediumVolume => F
```

```
old => T
       weaknessBeforeSurgery => T
        patient(lived)
       weaknessBeforeSurgery => F
        patient(died)
      old => F
       weaknessBeforeSurgery => T
        patient(died)
       weaknessBeforeSurgery => F
       mediumFVC => T
         patient(lived)
        mediumFVC => F
         tumorAtLeastMedium => T
          patient (died)
         tumorAtLeastMedium => F
          middleAge => T
           asthmatic => T
            patient(died)
           asthmatic => F
            recentMyocardialInfarction => T
             patient(died)
            recentMyocardialInfarction => F
             ZubrodaAtLeast1 => T
              highVolume => T
               patient(died)
              highVolume => F
               lowVolume => T
                lowFVC => T
                 diagnosisIsDGN1 => T
                  patient(died)
                 diagnosisIsDGN1 => F
                  diagnosisIsDGN7 => T
                   patient(died)
                  diagnosisIsDGN7 => F
                   diagnosisIsDGN5 => T
                    patient (died)
                   diagnosisIsDGN5 => F
                    diagnosisIsDGN6 => T
                     patient(died)
                    diagnosisIsDGN6 => F
                     diagnosisIsDGN4 => T
                      patient(died)
                     diagnosisIsDGN4 => F
                      diagnosisIsDGN2 => T
                       patient(died)
                      diagnosisIsDGN2 => F
                       patient(lived)
                lowFVC => F
                 patient (died)
               lowVolume => F
                patient(died)
             ZubrodaAtLeast1 => F
              patient(died)
          middleAge => F
           patient(died)
coughBeforeSurgery => F
mediumFVC => T
```

```
patient (died)
mediumFVC => F
 old => T
  middleAge => T
   patient(died)
  middleAge => F
   asthmatic => T
    patient(died)
   asthmatic => F
    peripheralArterialDiseases => T
     patient(died)
    peripheralArterialDiseases => F
     recentMyocardialInfarction => T
      patient (died)
     recentMyocardialInfarction => F
      tumorAtLeastMedium => T
       weaknessBeforeSurgery => T
        patient(died)
       weaknessBeforeSurgery => F
        haemoptysisBeforeSurgery => T
         patient(died)
        haemoptysisBeforeSurgery => F
         painBeforeSurgery => T
          patient(died)
         painBeforeSurgery => F
          ZubrodaAtLeast2 => T
           patient (died)
          ZubrodaAtLeast2 => F
           ZubrodaAtLeast1 => T
            patient (died)
           ZubrodaAtLeast1 => F
            highVolume => T
             patient(died)
            highVolume => F
             mediumVolume => T
              patient(died)
             mediumVolume => F
              lowVolume => T
               lowFVC => T
                diagnosisIsDGN1 => T
                 patient(died)
                diagnosisIsDGN1 => F
                 diagnosisIsDGN7 => T
                  patient (died)
                 diagnosisIsDGN7 => F
                  diagnosisIsDGN5 => T
                   patient (died)
                  diagnosisIsDGN5 => F
                   diagnosisIsDGN6 => T
                    patient(died)
                   diagnosisIsDGN6 => F
                    diagnosisIsDGN4 => T
                     patient(died)
                     diagnosisIsDGN4 => F
                     diagnosisIsDGN2 => T
                      patient(died)
                      diagnosisIsDGN2 => F
```

```
patient(died)
                 lowFVC => F
                  patient(died)
                lowVolume => F
                 patient (died)
        tumorAtLeastMedium => F
        patient(died)
   old \Rightarrow F
   patient(died)
tumorAtLeastSmall => F
mediumVolume => T
 haemoptysisBeforeSurgery => T
   weaknessBeforeSurgery => T
   patient (died)
   weaknessBeforeSurgery => F
    patient(lived)
 haemoptysisBeforeSurgery => F
  weaknessBeforeSurgery => T
    old \Rightarrow T
     ZubrodaAtLeast2 => T
      middleAge => T
       patient(died)
      middleAge => F
       asthmatic => T
        patient(died)
       asthmatic => F
        peripheralArterialDiseases => T
         patient(died)
        peripheralArterialDiseases => F
         recentMyocardialInfarction => T
          patient(died)
         recentMyocardialInfarction => F
          tumorAtLeastMedium => T
           patient (died)
          tumorAtLeastMedium => F
           coughBeforeSurgery => T
            painBeforeSurgery => T
             patient(died)
            painBeforeSurgery => F
             ZubrodaAtLeast1 => T
              highVolume => T
               patient(died)
              highVolume => F
               lowVolume => T
                patient(died)
               lowVolume => F
                mediumFVC => T
                 lowFVC => T
                  patient (died)
                 lowFVC => F
                  diagnosisIsDGN1 => T
                   patient(died)
                  diagnosisIsDGN1 => F
                   diagnosisIsDGN7 => T
                    patient (died)
                   diagnosisIsDGN7 => F
                    diagnosisIsDGN5 => T
```

```
patient(died)
               diagnosisIsDGN5 => F
                diagnosisIsDGN6 => T
                 patient(died)
                diagnosisIsDGN6 => F
                 diagnosisIsDGN4 => T
                  patient(died)
                 diagnosisIsDGN4 => F
                  diagnosisIsDGN2 => T
                   patient(died)
                  diagnosisIsDGN2 => F
                   patient(lived)
           mediumFVC => F
            patient (died)
        ZubrodaAtLeast1 => F
         patient(died)
      coughBeforeSurgery => F
       patient(died)
ZubrodaAtLeast2 => F
middleAge => T
 patient(died)
middleAge => F
 asthmatic => T
  patient(died)
 asthmatic => F
  peripheralArterialDiseases => T
   patient (died)
  peripheralArterialDiseases => F
    recentMyocardialInfarction => T
     patient (died)
    recentMyocardialInfarction => F
    tumorAtLeastMedium => T
     patient(died)
     tumorAtLeastMedium => F
      coughBeforeSurgery => T
       painBeforeSurgery => T
        patient(died)
       painBeforeSurgery => F
        ZubrodaAtLeast1 => T
         highVolume => T
          patient(died)
         highVolume => F
          lowVolume => T
           patient (died)
          lowVolume => F
           mediumFVC => T
            lowFVC => T
             patient (died)
            lowFVC => F
             diagnosisIsDGN1 => T
              patient(died)
             diagnosisIsDGN1 => F
              diagnosisIsDGN7 => T
               patient (died)
              diagnosisIsDGN7 => F
               diagnosisIsDGN5 => T
                patient (died)
```

```
diagnosisIsDGN5 => F
                   diagnosisIsDGN6 => T
                    patient(died)
                   diagnosisIsDGN6 => F
                    diagnosisIsDGN4 => T
                     patient (died)
                    diagnosisIsDGN4 => F
                     diagnosisIsDGN2 => T
                      patient(died)
                     diagnosisIsDGN2 => F
                      patient(lived)
             mediumFVC => F
              patient (died)
          ZubrodaAtLeast1 => F
           patient(died)
        coughBeforeSurgery => F
         patient (died)
 old => F
 patient(died)
weaknessBeforeSurgery => F
 coughBeforeSurgery => T
  old \Rightarrow T
   patient(died)
  old \Rightarrow F
   recentMyocardialInfarction => T
    patient(died)
   recentMyocardialInfarction => F
    mediumFVC => T
     middleAge => T
      asthmatic => T
       patient(died)
      asthmatic => F
       peripheralArterialDiseases => T
        patient(died)
       peripheralArterialDiseases => F
        tumorAtLeastMedium => T
         patient (died)
        tumorAtLeastMedium => F
         painBeforeSurgery => T
          patient (died)
         painBeforeSurgery => F
          ZubrodaAtLeast2 => T
           patient (died)
          ZubrodaAtLeast2 => F
           ZubrodaAtLeast1 => T
            highVolume => T
             patient(died)
            highVolume => F
             lowVolume => T
              patient(died)
             lowVolume => F
              lowFVC => T
               patient (died)
              lowFVC => F
               diagnosisIsDGN1 => T
                patient(died)
                diagnosisIsDGN1 => F
```

```
diagnosisIsDGN7 => T
                patient (died)
               diagnosisIsDGN7 => F
                diagnosisIsDGN5 => T
                 patient (died)
                diagnosisIsDGN5 => F
                 diagnosisIsDGN6 => T
                  patient(died)
                 diagnosisIsDGN6 => F
                  diagnosisIsDGN4 => T
                   patient(died)
                  diagnosisIsDGN4 => F
                   diagnosisIsDGN2 => T
                    patient(died)
                   diagnosisIsDGN2 => F
                    patient (died)
          ZubrodaAtLeast1 => F
           patient(died)
    middleAge => F
    patient(died)
   mediumFVC => F
   patient(died)
coughBeforeSurgery => F
 old => T
 middleAge => T
   patient (died)
 middleAge => F
   asthmatic => T
    patient (died)
   asthmatic => F
   peripheralArterialDiseases => T
    patient(died)
    peripheralArterialDiseases => F
     recentMyocardialInfarction => T
      patient(died)
     recentMyocardialInfarction => F
      tumorAtLeastMedium => T
       patient(died)
      tumorAtLeastMedium => F
       painBeforeSurgery => T
        patient (died)
       painBeforeSurgery => F
        ZubrodaAtLeast2 => T
         patient (died)
        ZubrodaAtLeast2 => F
         ZubrodaAtLeast1 => T
         patient(died)
         ZubrodaAtLeast1 => F
          highVolume => T
           patient(died)
          highVolume => F
           lowVolume => T
            patient(died)
           lowVolume => F
            mediumFVC => T
             lowFVC => T
              patient (died)
```

```
lowFVC => F
             diagnosisIsDGN1 => T
              patient(died)
             diagnosisIsDGN1 => F
              diagnosisIsDGN7 => T
               patient (died)
              diagnosisIsDGN7 => F
               diagnosisIsDGN5 => T
                patient(died)
               diagnosisIsDGN5 => F
                diagnosisIsDGN6 => T
                 patient(died)
                diagnosisIsDGN6 => F
                 diagnosisIsDGN4 => T
                  patient(died)
                 diagnosisIsDGN4 => F
                  diagnosisIsDGN2 => T
                   patient(died)
                  diagnosisIsDGN2 => F
                   patient (died)
           mediumFVC => F
            patient (died)
old => F
middleAge => T
  asthmatic => T
   patient(died)
  asthmatic => F
   peripheralArterialDiseases => T
    patient(died)
   peripheralArterialDiseases => F
    recentMyocardialInfarction => T
     patient(died)
    recentMyocardialInfarction => F
     tumorAtLeastMedium => T
      patient(died)
     tumorAtLeastMedium => F
      painBeforeSurgery => T
       patient(died)
      painBeforeSurgery => F
       ZubrodaAtLeast2 => T
        patient (died)
       ZubrodaAtLeast2 => F
        ZubrodaAtLeast1 => T
         patient (died)
        ZubrodaAtLeast1 => F
         highVolume => T
          patient(died)
         highVolume => F
          lowVolume => T
           patient (died)
          lowVolume => F
           mediumFVC => T
            lowFVC => T
             patient (died)
            lowFVC => F
             diagnosisIsDGN1 => T
              patient (died)
```

```
diagnosisIsDGN1 => F
                         diagnosisIsDGN7 => T
                          patient (died)
                         diagnosisIsDGN7 => F
                          diagnosisIsDGN5 => T
                          patient (died)
                          diagnosisIsDGN5 => F
                           diagnosisIsDGN6 => T
                            patient(died)
                           diagnosisIsDGN6 => F
                            diagnosisIsDGN4 => T
                             patient(died)
                            diagnosisIsDGN4 => F
                             diagnosisIsDGN2 => T
                              patient(died)
                             diagnosisIsDGN2 => F
                              patient (died)
                     mediumFVC => F
                      patient (died)
           middleAge => F
            patient (died)
      mediumVolume => F
       patient(died)
diagnosisIsDGN3 => F
 diabetesMellitus => T
  old => T
  peripheralArterialDiseases => T
    patient(lived)
   peripheralArterialDiseases => F
    patient (died)
  old => F
  patient(lived)
 diabetesMellitus => F
  ZubrodaAtLeast2 => T
  haemoptysisBeforeSurgery => T
    patient(died)
   haemoptysisBeforeSurgery => F
    patient(lived)
  ZubrodaAtLeast2 => F
   diagnosisIsDGN6 => T
    patient (died)
   diagnosisIsDGN6 => F
    diagnosisIsDGN4 => T
     lowFVC => T
      patient(lived)
     lowFVC => F
      patient(died)
    diagnosisIsDGN4 => F
     mediumVolume => T
      dyspnoeaBeforeSurgery => T
       patient(died)
      dyspnoeaBeforeSurgery => F
       peripheralArterialDiseases => T
        patient(lived)
       peripheralArterialDiseases => F
        diagnosisIsDGN1 => T
         patient (died)
```

```
diagnosisIsDGN1 => F
          tumorAtLeastSmall => T
           weaknessBeforeSurgery => T
            patient(died)
           weaknessBeforeSurgery => F
            old \Rightarrow T
             patient(lived)
            old \Rightarrow F
             haemoptysisBeforeSurgery => T
              patient(died)
             haemoptysisBeforeSurgery => F
              tumorAtLeastMedium => T
               coughBeforeSurgery => T
                diagnosisIsDGN5 => T
                  ZubrodaAtLeast1 => T
                   patient(died)
                  ZubrodaAtLeast1 => F
                   patient(lived)
                diagnosisIsDGN5 => F
                 patient(lived)
               coughBeforeSurgery => F
                patient(died)
              tumorAtLeastMedium => F
               patient(died)
          tumorAtLeastSmall => F
           old => T
            patient(died)
           old \Rightarrow F
            diagnosisIsDGN5 => T
             patient(lived)
            diagnosisIsDGN5 => F
             patient(died)
      mediumVolume => F
       patient(died)
smoker => F
 painBeforeSurgery => T
  coughBeforeSurgery => T
   patient(died)
  coughBeforeSurgery => F
   diagnosisIsDGN3 => T
   patient(lived)
   diagnosisIsDGN3 => F
    patient(died)
 painBeforeSurgery => F
  patient(died)
```

TEST DATA SET Failed Examples : Example failed : posTestEx1 Example failed : negTestEx7 Example failed : negTestEx13 Example failed : posTestEx2 Example failed : negTestEx15 Example failed : posTestEx3 Example failed : posTestEx4 Example failed : posTestEx5 Example failed : posTestEx6 Example failed: negTestEx46 Example failed : negTestEx56 Example failed : posTestEx8 Example failed : negTestEx60 Example failed : posTestEx10 Example failed : posTestEx11 Example failed: posTestEx12 Example failed : negTestEx73 Accuracy: 80.0%

Accuracy: 80.0% Fraction: (68/85)

The tree seems to have generalized moderately well. Based on reading some previous Moodle conversations, the accuracy could be greater. I found myself interested in the features that seemed to show very strong correlations and made sense medically, such as: A T for recentMyocardialInfarction basically indicates the patient died – but this was never true for a test example to haemoptysisBeforSurgery also provides high probability of death. This type of learning can really improve healthcare.

An example of a patient who lived, but was classified as died:

posTestEx1

This appears to have failed because of the diagnosis5 feature. This actually is not surprising to me as we only have binary attributes, which limits the information branching, but also in reality – mis-diagnosing is extremely common and while a diagnosis might appear to be one of the most significant pieces of information, patients are commonly mis-diagnosed.

An example of a patient who died, but was classified as lived:

negTestEx13

I found this example interesting because the leaf node actually has painbeforesurgery = T with a "lived" classification. Having pain immediately before surgery does not seem like a very useful feature. Particularly with the vast amount of pain this could be, does it mean there knee hurt before elective surgery? Or did they have excruciating gastrointestinal pain before a major surgery. This seems like a weakness in the tree or training set.