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Help
/*Tsitsiklis & VanRoy algorithm, backward paths simulation*
#include <stdlib.h>
#include <stdio.h>
#include <math.h>
#include "bsnd stdnd.h"
#include "math/linsys.h"
#include "pnl/pnl_basis.h"
#include "black.h"
#include "optype.h"
#include "enums.h"
#include "var.h"
#include "pnl/pnl_random.h"
#include "pnl/pnl_matrix.h"
static double *FP, *Paths=NULL, *Vector_Price=NULL;
static double *Brownian_Bridge=NULL;
static PnlVect *AuxR=NULL, *Res=NULL, *VBase=NULL;
static PnlMat *M=NULL;
static PnlBasis *Basis;
static int TsRoB_Allocation(long AL_MonteCarlo_Iterations,
               int AL Basis Dimension, int BS Dimens
    ion)
{
  if (FP==NULL)
 FP=(double*)malloc(AL_MonteCarlo_Iterations*sizeof(
    double));
  if (FP==NULL) { return MEMORY ALLOCATION FAILURE; }
  if (Paths==NULL)
  Paths=(double*)malloc(AL_MonteCarlo_Iterations*BS_Dimens
    ion*sizeof(double));
  if (Paths==NULL){ return MEMORY ALLOCATION FAILURE; }
  if (Vector_Price==NULL)
  Vector_Price=(double*)malloc(AL_MonteCarlo_Iterations*si
    zeof(double));
  if (Vector_Price==NULL) {return MEMORY_ALLOCATION_FAILU
    RE; }
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if (M==NULL) M=pnl mat create(AL Basis Dimension, AL Basi
    s_Dimension);
  if (M==NULL) return MEMORY ALLOCATION FAILURE;
  if (Brownian Bridge==NULL)
  Brownian_Bridge=(double*)malloc(AL_MonteCarlo_Iterations
    *BS Dimension*sizeof(double));
  if (Brownian Bridge==NULL){return MEMORY ALLOCATION FAILU
   RE; }
  if (Res==NULL) Res=pnl vect create (AL Basis Dimension);
  if (Res==NULL) return MEMORY_ALLOCATION_FAILURE;
  if (AuxR==NULL) AuxR = pnl_vect_create (AL_Basis_Dimensio
    n);
  if (AuxR==NULL) return MEMORY ALLOCATION FAILURE;
  if (VBase==NULL) VBase = pnl_vect_create (AL_Basis_Dimens
    ion):
  if (VBase==NULL) return MEMORY ALLOCATION FAILURE;
  return OK;
}
static void TsRoB_Liberation()
  if (FP!=NULL) {free(FP); FP=NULL; }
  if (Brownian Bridge!=NULL) { free(Brownian Bridge);
    Brownian Bridge=NULL; }
  if (Paths!=NULL) { free(Paths); Paths=NULL;
  if (Vector_Price!=NULL) { free(Vector_Price); Vector_
   Price=NULL; }
  if (M!=NULL) {pnl_mat_free (&M);}
  if (Res!=NULL) {pnl_vect_free (&Res); }
  if (AuxR!=NULL) {pnl_vect free (&AuxR);}
  if (VBase!=NULL) {pnl_vect_free (&VBase);}
}
static void Compute Vector Price(long AL MonteCarlo Itera
    tions, NumFunc_nd *p,
                                 int OP_Exercise_Dates,
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int AL Basis Dimension, int BS Dim
    ension, int Time,
                  int AL_PayOff_As_Regressor,double
    DiscountStep)
{
  long k;
  int i;
  double Aux, AuxOption, AuxScal;
  PnlVect VStock;
  VStock.size=BS_Dimension;
  for(k=0;k<AL MonteCarlo Iterations;k++){</pre>
    VStock.array=&(Paths[k*BS_Dimension]);
    AuxOption=DiscountStep*p->Compute(p->Par, &VStock);
    if (Time==OP_Exercise_Dates-1){
    /*initialisation of the payoff values and of the
                                                            dynamical programming p
    Vector Price[k] = AuxOption;
    FP[k] = AuxOption;
  } else {
      /*computation of the regressor values*/
    if (AL_PayOff_As_Regressor<=Time){</pre>
    /*here, the payoff function is introduced in the
         * regression basis*/
        VStock.array=&(Paths[k*BS Dimension]);
    pnl_vect_set (VBase, 0, p->Compute(p->Par, &VStock));
    for (i=1;i<AL Basis Dimension;i++){</pre>
      pnl vect set (VBase, i, pnl basis i(Basis, Paths+k*
    BS_Dimension, i-1));
    }
    } else {
    for (i=0;i<AL Basis Dimension;i++){</pre>
      pnl vect set (VBase, i, pnl basis i(Basis, Paths+k*
    BS_Dimension,i));
    }
    }
    AuxScal=0;
    for (i=0;i<AL_Basis_Dimension;i++){</pre>
    AuxScal += pnl vect get (Res, i) * pnl vect get (VB
    ase, i);
    }
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/*dynamical programming for the backward price*/
    AuxScal*=DiscountStep;
    Aux=MAX(AuxOption,AuxScal);
    Vector Price[k]=Aux;
    /*dynamical programming for the forward price*/
    if (AuxOption==Aux){
    FP[k]=Aux;
    } else {
    FP[k] *=DiscountStep;
    }
  }
  }
}
static void Regression(long AL MonteCarlo Iterations,
    OP_Exercice_Dates, NumFunc_nd *p,
             int AL_Basis_Dimension, int BS_Dimension,
     int Time,
             int AL PayOff As Regressor)
{
  int i,j;
  long k;
  double tmp;
  PnlVect VStock;
  VStock.size=BS Dimension;
  pnl_vect_set_double (AuxR, 0.);
  pnl_mat_set_double (M, 0.0);
  for(k=0;k<AL MonteCarlo Iterations;k++){</pre>
  /*value of the regressor basis on the kth path*/
  if (AL_PayOff_As_Regressor<=Time){</pre>
    /*here, the payoff function is introduced in the
       * regression basis*/
      VStock.array=&(Paths[k*BS_Dimension]);
      pnl_vect_set (VBase, 0, p->Compute(p->Par, &VStock));
      for (i=1;i<AL Basis Dimension;i++){</pre>
        pnl_vect_set (VBase, i, pnl_basis_i(Basis,Paths+k*
    BS_Dimension,i-1));
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}
    } else {
      for (i=0;i<AL_Basis_Dimension;i++){</pre>
        pnl_vect_set (VBase, i, pnl_basis_i(Basis,Paths+k*
    BS Dimension, i));
      }
    /*empirical regressor dispersion matrix*/
    for (i=0;i<AL Basis Dimension;i++)</pre>
      for (j=0;j<AL_Basis_Dimension;j++)</pre>
          tmp = pnl_mat_get (M, i, j);
          pnl_mat_set (M, i, j , tmp + pnl_vect_get (VBase,
     i) * pnl_vect_get (VBase,j));
    /*auxiliary for regression formulae*/
    for (i=0;i<AL Basis Dimension;i++){</pre>
      tmp = pnl_vect_get(AuxR, i);
      pnl_vect_set (AuxR, i, Vector_Price[k] * pnl_vect_get
     (VBase,i) + tmp);
    }
  }
  pnl_vect_clone (Res, AuxR);
  /* solve in the least square sense, using a QR decomposi
    tion */
  pnl_mat_ls (M, Res);
static void Close()
  /*memory liberation*/
  TsRoB Liberation();
  End_BS();
  /*useful only when the payoff function is a formulae*/
}
/*see the documentation for the parameters meaning*/
int TsRoB(PnlVect *BS Spot,
           NumFunc nd *p,
           double OP_Maturity,
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double BS Interest Rate,
           PnlVect *BS Dividend Rate,
           PnlVect *BS_Volatility,
           double *BS Correlation,
           long AL MonteCarlo Iterations,
           int generator,
           int name_basis,
           int AL Basis_Dimension,
           int OP Exercise Dates,
           int AL_PayOff_As_Regressor,
           double *AL FPrice,
           double *AL BPrice)
{
 double DiscountStep, Step, Aux, AuxOption;
  long i;
  int k, init_mc;
  int BS Dimension = BS Spot->size;
  /* MC sampling */
  init mc= pnl rand init(generator, BS Dimension, AL
    MonteCarlo_Iterations);
    /* Test after initialization for the generator */
  if(init mc != OK) return init mc;
  /*time step*/
  Step=OP Maturity/(double)(OP_Exercise_Dates-1);
  /*discounting factor for a time step*/
  DiscountStep=exp(-BS Interest Rate*Step);
  /*memory allocation of the BlackScholes variables*/
  Init BS(BS Dimension,BS Volatility->array,
      BS Correlation, BS Interest Rate, BS Dividend Rate->
    array);
  /*Initialization of the regression basis*/
  Basis = pnl basis create (name basis, AL Basis Dimension,
     BS Dimension);
  /*memory allocation of the algorithm's variables*/
  TsRoB Allocation(AL MonteCarlo Iterations, AL Basis Dimens
    ion, BS Dimension);
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```
/*initialisation of the brownian bridge at the maturity*/
Init Brownian Bridge (Brownian Bridge, AL MonteCarlo Itera
  tions,
           BS Dimension, OP Maturity, generator);
/*computation of the BlackScholes paths at the maturity
  related to Brownian Bridge*/
Backward_Path(Paths,Brownian_Bridge,BS_Spot->array,OP_
  Maturity,
      AL_MonteCarlo_Iterations,BS_Dimension);
/*computation of the dynamical programming prices at
  time OP Exercise Dates-1*/
Compute Vector Price(AL MonteCarlo Iterations,p, OP Exerc
  ise Dates, AL Basis Dimension, BS Dimension,
           OP_Exercise_Dates-1,AL_PayOff_As_Regres
  sor,DiscountStep);
for (k=OP_Exercise_Dates-2;k>=1;k--){
  /*computation of the brownian bridge at time k*/
  Compute_Brownian_Bridge(Brownian_Bridge,k*Step,Step,BS_
  Dimension,
                          AL MonteCarlo Iterations,
                                                         generator);
  /*computation of the BlackScholes paths at time k rel
  ated to Brownian_Bridge*/
  Backward_Path(Paths,Brownian_Bridge,BS_Spot->array,(
  double)k*Step,
                AL MonteCarlo Iterations, BS Dimension);
  /*regression procedure*/
  Regression(AL MonteCarlo Iterations, OP Exercise Dates,
  p,
             AL Basis Dimension, BS Dimension, k, AL PayOff
  As Regressor);
  /*computation of the dynamical programming prices at
  time k*/
  Compute_Vector_Price(AL_MonteCarlo_Iterations,p, OP_Exe
  rcise_Dates, AL_Basis_Dimension,
                       BS Dimension, k, AL PayOff As Regres
  sor,DiscountStep);
}
Aux=0;
/*at time 0, the conditionnal expectation reduces to an
  expectation*/
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for (i=0;i<AL MonteCarlo Iterations;i++){</pre>
  Aux+=Vector Price[i];
  }
  Aux/=(double)AL MonteCarlo Iterations;
  AuxOption=p->Compute(p->Par,BS Spot);
  /*output backward price*/
  *AL_BPrice=MAX(AuxOption,Aux);
  Aux=0;
  for (i=0;i<AL_MonteCarlo_Iterations;i++){</pre>
  Aux+=FP[i];
  }
  Aux/=(double)AL_MonteCarlo_Iterations;
  /*output forward price*/
  *AL_FPrice=MAX(AuxOption,Aux);
  pnl_basis_free (&Basis);
  Close();
  return OK;
}
int CALC(MC TsitsiklisVanRoyND)(void *Opt, void *Mod, Prici
    ngMethod *Met)
{
  TYPEOPT* ptOpt=(TYPEOPT*)Opt;
  TYPEMOD* ptMod=(TYPEMOD*)Mod;
  double r;
  double *BS cor;
  int i, res;
  PnlVect *divid = pnl_vect_create(ptMod->Size.Val.V_PINT);
  PnlVect *spot, *sig;
  spot = pnl_vect_compact_to_pnl_vect (ptMod->S0.Val.V_PNLV
    ECTCOMPACT);
  sig = pnl_vect_compact_to_pnl_vect (ptMod->Sigma.Val.V_PN
    LVECTCOMPACT);
  for(i=0; i<ptMod->Size.Val.V PINT; i++)
    pnl_vect_set (divid, i,
           log(1.+ pnl_vect_compact_get (ptMod->Divid.Val.
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V PNLVECTCOMPACT, i)/100.));
  r= log(1.+ptMod->R.Val.V_DOUBLE/100.);
  if ((BS cor = malloc(ptMod->Size.Val.V PINT*ptMod->Size.
    Val.V PINT*sizeof(double)))==NULL)
    return MEMORY_ALLOCATION_FAILURE;
  for(i=0; i<ptMod->Size.Val.V PINT*ptMod->Size.Val.V PINT;
     i++)
    BS_cor[i] = ptMod->Rho.Val.V_DOUBLE;
  for(i=0; i<ptMod->Size.Val.V PINT; i++)
    BS cor[i*ptMod->Size.Val.V PINT+i] = 1.0;
  res=TsRoB(spot,
            ptOpt->PayOff.Val.V NUMFUNC ND,
            ptOpt->Maturity.Val.V_DATE-ptMod->T.Val.V_DATE,
            r, divid, sig,
            BS cor,
            Met->Par[0].Val.V LONG,
            Met->Par[1].Val.V_ENUM.value,
            Met->Par[2].Val.V_ENUM.value,
            Met->Par[3].Val.V INT,
            Met->Par[4].Val.V INT,
            Met->Par[5].Val.V ENUM.value,
            &(Met->Res[0].Val.V DOUBLE),
            &(Met->Res[1].Val.V_DOUBLE));
  pnl_vect_free(&divid);
  pnl_vect_free (&spot);
 pnl_vect_free (&sig);
 free(BS cor);
 return res;
static int CHK_OPT(MC_TsitsiklisVanRoyND)(void *Opt, void *
    Mod)
  Option* ptOpt= (Option*)Opt;
  TYPEOPT* opt= (TYPEOPT*)(ptOpt->TypeOpt);
```

}

{

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if ((opt->EuOrAm).Val.V BOOL==AMER)
    return OK;
  return WRONG;
static int MET(Init)(PricingMethod *Met,Option *Opt)
  if (Met->init == 0)
      Met->init=1;
      Met->Par[0].Val.V_LONG=50000;
      Met->Par[1].Val.V ENUM.value=0;
      Met->Par[1].Val.V ENUM.members=&PremiaEnumMCRNGs;
      Met->Par[2].Val.V_ENUM.value=0;
      Met->Par[2].Val.V_ENUM.members=&PremiaEnumBasis;
      Met->Par[3].Val.V_INT=9;
      Met->Par[4].Val.V INT=10;
      Met->Par[5].Val.V_ENUM.members=&PremiaEnumBool;
    }
  return OK;
}
PricingMethod MET(MC_TsitsiklisVanRoyND)=
  "MC TsitsiklisVanRoy ND",
  {{"N iterations",LONG,{100},ALLOW},
   {"RandomGenerator", ENUM, {100}, ALLOW},
   {"Basis", ENUM, {1}, ALLOW},
   {"Dimension Approximation", INT, {100}, ALLOW},
   {"Number of Exercise Dates", INT, {100}, ALLOW},
   {"Use Payoff as Regressor", ENUM, {1}, ALLOW},
   {" ",PREMIA NULLTYPE, {0}, FORBID}},
  CALC(MC TsitsiklisVanRoyND),
  {{"Forward Price", DOUBLE, {100}, FORBID},
   {"Backward Price", DOUBLE, {100}, FORBID},
   {" ",PREMIA NULLTYPE, {0}, FORBID}},
  CHK_OPT(MC_TsitsiklisVanRoyND),
  CHK_mc,
  MET(Init)
};
```

## References