

[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_Dimension)
{
    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_Dimension * sizeof(double));
    if (Paths == NULL)
    {
        return MEMORY_ALLOCATION_FAILURE;
    }
    if (Vector_Price == NULL)
        Vector_Price = (double *)malloc(AL_MonteCarlo_Iterations * sizeof(double));
```

```

    if (Vector_Price == NULL)
    {
        return MEMORY_ALLOCATION_FAILURE;
    }

    if (M == NULL) M = pnl_mat_create(AL_Basis_Dimension, AL_Basis_Dimension);
    if (M == NULL) return MEMORY_ALLOCATION_FAILURE;

    if (Brownian_Bridge == NULL)
        Brownian_Bridge = (double *)malloc(AL_MonteCarlo_Iterations * BS_Dimension *
    if (Brownian_Bridge == NULL)
    {
        return MEMORY_ALLOCATION_FAILURE;
    }

    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_Dimension);
    if (AuxR == NULL) return MEMORY_ALLOCATION_FAILURE;

    if (VBase == NULL) VBase = pnl_vect_create(AL_Basis_Dimension);
    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_Iterations, NumFunc_nd *p,
                                int OP_Exercise_Dates,
                                int AL_Basis_Dimension, int BS_Dimension, int T
                                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++)
    {
        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
    Vector_Price[k] = AuxOption;
    FP[k] = AuxOption;
}
else
{
    /*computation of the regressor values*/
    if (AL_PayOff_As_Regressor <= Time)
    {
        /*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++)
        {
            pnl_vect_set(VBase, i, pnl_basis_i(Basis, Paths + k * BS_Dimen
        }
    }
    else
    {
        for (i = 0; i < AL_Basis_Dimension; i++)
        {
            pnl_vect_set(VBase, i, pnl_basis_i(Basis, Paths + k * BS_Dimen
        }
    }

    AuxScal = 0;
    for (i = 0; i < AL_Basis_Dimension; i++)
    {
        AuxScal += pnl_vect_get(Res, i) * pnl_vect_get(VBase, i);
    }

    /*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, int OP_Exercice_Dates, Nu
                    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++)
    {
        /*value of the regressor basis on the kth path*/
        if (AL_PayOff_As_Regressor <= Time)
        {
            /*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++)
            {
                pnl_vect_set(VBase, i, pnl_basis_i(Basis, Paths + k * BS_Dimension
            }
        }
        else
        {
            for (i = 0; i < AL_Basis_Dimension; i++)
            {

```

```

        pnl_vect_set(VBase, i, pnl_basis_i(Basis, Paths + k * BS_Dimension
    }
}
/*empirical regressor dispersion matrix*/
for (i = 0; i < AL_Basis_Dimension; i++)
    for (j = 0; j < AL_Basis_Dimension; j++)
    {
        tmp = pnl_mat_get(M, i, j);
        pnl_mat_set(M, i, j, tmp + pnl_vect_get(VBase, i) * pnl_vect_get(VB
    }
/*auxiliary for regression formulae*/
for (i = 0; i < AL_Basis_Dimension; i++)
{
    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 decomposition */
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,
          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_Dimension, BS_Dimension);

    /*initialisation of the brownian bridge at the maturity*/
    Init_Brownian_Bridge(Brownian_Bridge, AL_MonteCarlo_Iterations,
                        BS_Dimension, OP_Maturity, generator);
    /*computation of the BlackScholes paths at the maturity related to Brownian_Br
    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_Exercise_Dates, AL_Basis_
                OP_Exercise_Dates - 1, AL_PayOff_As_Regressor, DiscountSt
    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 related to Brownian_Brid
    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_Exercise_Dates, AL_Ba
                        BS_Dimension, k, AL_PayOff_As_Regressor, DiscountStep
}

Aux = 0;
/*at time 0, the conditionnal expectation reduces to an expectation*/
for (i = 0; i < AL_MonteCarlo_Iterations; i++)
{
    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++)
{
    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, PricingMethod *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_PNLVECTCOMPACT);
    sig = pnl_vect_compact_to_pnl_vect(ptMod->Sigma.Val.V_PNLVECTCOMPACT);

    for (i = 0; i < ptMod->Size.Val.V_PINT; i++)
        pnl_vect_set(divid, i,
                     log(1. + pnl_vect_compact_get(ptMod->Divid.Val.V_PNLVECTCOMPACT, i)));

    r = log(1. + ptMod->R.Val.V_DOUBLE / 100.);

    if ((BS_cor = malloc(ptMod->Size.Val.V_PINT * ptMod->Size.Val.V_PINT * sizeof(
        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);
    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 = 3;
        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},
      {"Approximation order", 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)
};
```