

Numerical integration using MonteCarlo integration: Convert an *integration problem* into a *sampling problem*

Using mean value theorem of integration, $\int_{xMin}^{xMax} f(x) dx$ is given by $f(c)(xMax - xMin)$ where $f(c)$ is the “area of the curve”. The function $f(c)$ can be estimated by choosing random variables $x \approx \text{UniformDistribution}[\{xMin, xMax\}]$. The $f(c)$, which is an average height of the function $f(x)$ is then calculated as the expectation of the function $f(x)$ when x is chosen randomly from a uniform distribution between $xMin$ and $xMax$

Example problem: Integrate $f(x) = \text{Cos}(x)$ between the limits -3.5 and 3.5 using the Monte Carlo method. Compare with analytical method

```
In[ ]:= mcIntegrate[xMin_, xMax_, f_] := Module[{xMin1 = xMin, xMax1 = xMax, f1 = f},
  NExpectation[f, x  $\approx$  UniformDistribution[{xMin, xMax}],
  Method -> "MonteCarlo", AccuracyGoal -> 5] * (xMax - xMin)
]
```

```
In[ ]:= mcIntegrate[-3.5, 3.5, Cos[x]]
```

```
Out[ ]:= -0.702417
```

"Analytical" solution and L-2 (Frobenius) norm of error

```
{Integrate[Cos[x], x], iExact = Integrate[Cos[x], {x, -3.5, 3.5}],
  Norm[mcIntegrate[-3.5, 3.5, Cos[x]] - iExact, "Frobenius"]}
```

```
Out[ ]:= {Sin[x], -0.701566, 0.00126258}
```

```
In[ ]:= NIntegrate[Cos[x], {x, -3.5, 3.5}, Method -> "MonteCarlo"] // Quiet
```

```
Out[ ]:= -0.703549
```

Solve a differential equation by applying the Monte Carlo integration method

Example problem: Solve $\frac{\partial u}{\partial x} = x$ with the initial condition $u(x_0) = 1$

This problem may be solved analytically as $u(x) = u(x_0) + \int_{x_0}^x x \, dx$. The integral, $\int_{x_0}^x x \, dx$, may be performed using the Monte Carlo method

```
In[ ]:= u0 = 1; (*Initial condition*)
uMC = u0 + mcIntegrate[0, xi, x]

Out[ ]:= 1 + xi NExpectation[x,
      x ~ UniformDistribution[{0, xi}], Method -> MonteCarlo, AccuracyGoal -> 5]
```

The exact solution is easily found as a function of x . One can substitute a desired value for x to evaluate the solution at that location.

```
In[ ]:= uExact = DSolveValue[{u'[x] == x, u[0] == 1}, u[x], x]

Out[ ]:= 1/2 (2 + x^2)
```

Comparison of "Exact" solution vs Monte Carlo solution for $x=5$

```
In[ ]:= {uMC /. xi -> 5, uExact /. x -> 5 // N}

Out[ ]:= {13.4974, 13.5}
```

This integration may also be completed through the *MonteCarlo* setting in *NIntegrate*