

Is integration in 2D or 3D really different from integration in 1D?

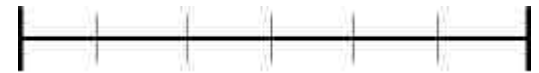
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Overview

- Numerical integration in 1D
- Numerical integration in x D
- Literature
- Available software

Numerical integration

1. Partition complex region into fundamental ones



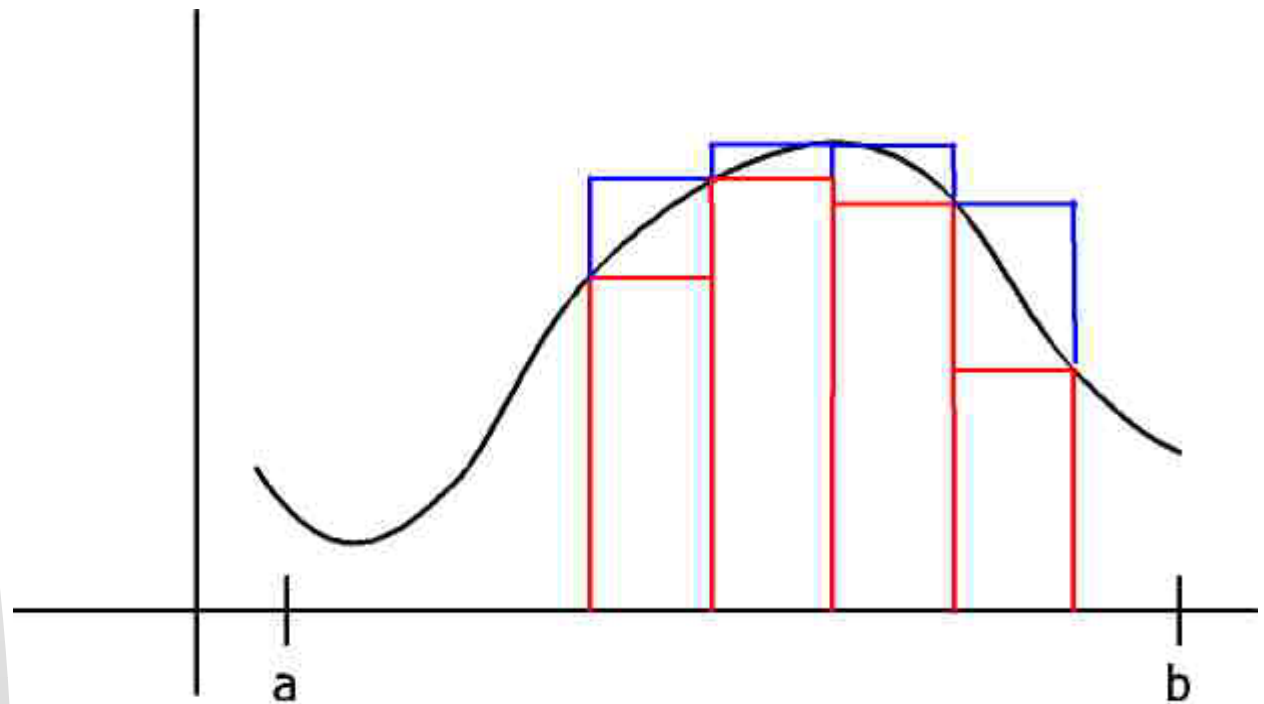
2. Use numerical integration on fundamental region



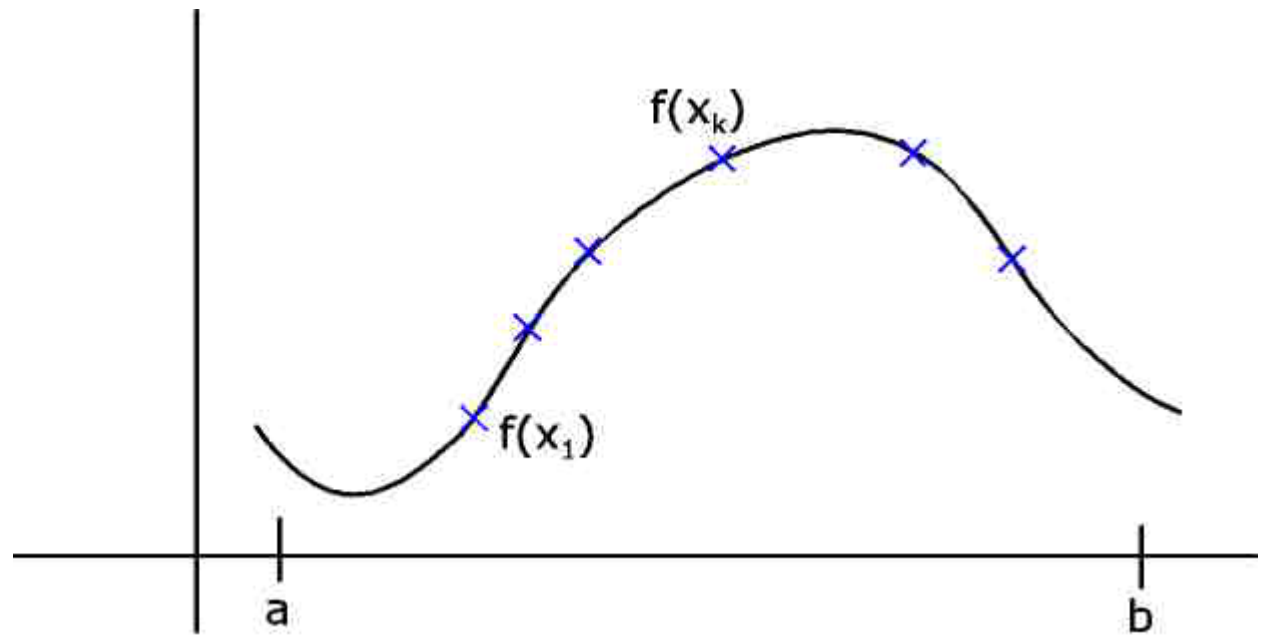
3. Adaptive: let partition depend on function

Riemann integration

- Approximation:



Monte Carlo



$$\int_{\Omega} f = \frac{1}{N} \sum_{k=1}^N f(x_k)$$

Errors

1. In basic region, due to approximation error
2. Error due to non-exact covering of the region with basic regions

Num. Integration of Basic Regions

- Standard

$$\int f \doteq \sum_i w_i f(x_i)$$

- Advanced

$$\int f \doteq \sum_k \sum_p w_{k,p} f^{(p)}(x_k)$$

Degrees of freedom: w_k and x_k

Error

- A rule is called *exact* for $f(x)$ if the error, given by $\int f - \sum w_k f(x_k)$ is zero.
- A rule is *exact for degree n* if it is exact for polynomials of degree up to n and not for $n+1$

The best integration rule

- Minimal amount of points, such that the rule is exact for specific degree p

Rules for integration

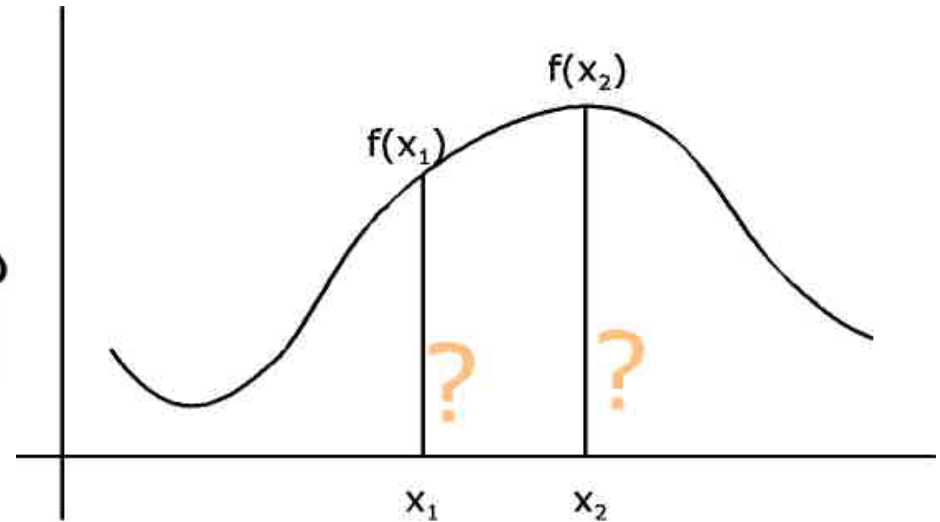
1. Choose x_k determine w_k : Newton-Cotes (demand degree p exact)
2. Interpolate the function
 $f(x) \doteq \sum_{k=1}^n \alpha_k(f) g_k(x)$ then:
$$\int f(x) \doteq \int \sum_{i=1}^n \alpha_i(f) g_i(x) = \sum_{i=1}^n \alpha_i(f) \int g_i(x)$$
3. Determine x_k and w_k : Gauss-Legendre (demand degree p exact)

Rules for integration

- Newton-Cotes via interpolation
 - ◆ Error also via interpolation error
- Gauss-Legendre via orthogonal polynomials
 - ◆ Error also via orthogonal polynomials

Examples

- Newton-Cotes
- Gauss-Legendre



Orthogonal polynomials

Integration over interval $[a,b]$

- The optimal points are the zeros of the orthogonal polynomial $P_n(x)$ on $[a,b]$.

$$\int_a^b P_n(x)Q_{n-1}(x)dx = 0$$

for all polynomials $Q_{n-1}(x)$ of degree $\leq n-1$.

Proof in [1]

Proof

[1] A.H. Stroud “ Numerical Quadrature and Solution of Ordinary Differential Equations”

$$\int_a^b P_n(x) Q_{n-1}(x) dx = 0 = \sum w_k P_n(x_k) Q_{n-1}(x_k)$$

$$\Rightarrow P_n(x_k) = 0$$

and

$$\int Q_{2n-1}(x) dx = \sum A_k Q_{2n-1}(x_k) \quad \text{exact}$$

$$\underbrace{\int S_{n-1}(x) dx}_{\text{exact}} + \underbrace{\int P_n(x) R_{n-1}(x) dx}_0$$

Orthogonal polynomials

- It can be proven that:
 - ◆ $P_n(x)$ is unique (normalized)
 - ◆ That zeros are real and distinct and lie in the open interval (a,b)
 - ◆ Zeros distributed symmetrically?
- $P_n(x)$ can be found efficiently via recursion relation.

$$P_n(x) = (x - \beta_n)P_{n-1}(x) - \gamma_n P_{n-2}(x)$$

$$P_1(x) = x - \beta_1 \quad P_0(x) = 1$$

Error Newton-Cotes

- Error made with Newton-Cotes can be determined with the interpolation error:

$$f(x) - p_f(x) = (x - x_1) \dots (x - x_n) \frac{f^{(n)}(\xi)}{n!}$$

SO:

$$\int f(x) - \int p_f(x) = \int (x - x_1) \dots (x - x_n) \frac{f^{(n)}(\xi)}{n!}$$

Error Gauss-Legendre

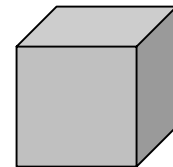
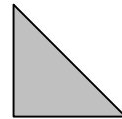
- Also: weights are positive
- The error made for arbitrary $f(x)$ for a simple region:

$$R(f) = I(f) - \sum_{i=1}^n w_i f(x_i) =$$
$$\frac{1}{(2n)!} f^{(2n)}(\theta) \int_a^b (P_n(x))^2 dx = cf^{(2n)}(\theta)$$

Integration in 2D

- For basic regions some formulae exist or can be determined from 1D method

- **Fundamental geometries**



- For non-trivial regions:
 - ◆ Use Monte Carlo
 - ◆ Partition into basic regions

Lagrange for basic region in xD

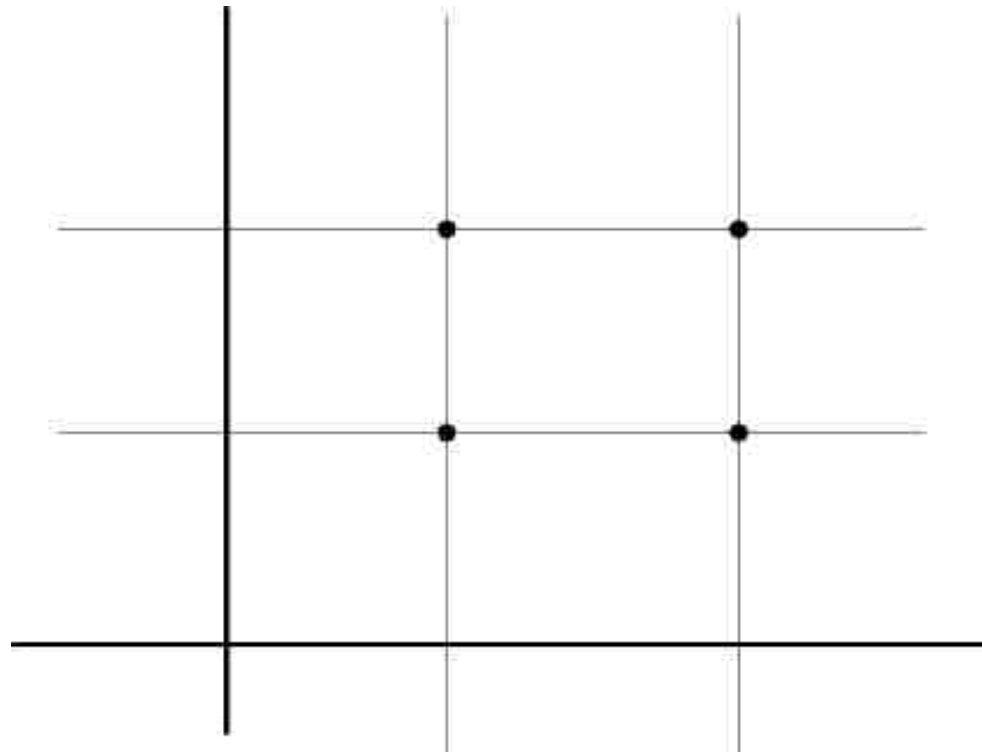
- Let two Lagrangian polynomials be given:

$$L_n(f, x) = \sum_{i=1}^n \lambda_i(x) f(x_i, y), \quad L_m(f, y) = \sum_{j=1}^m \mu_j(y) f(x, y_j)$$

- Then the 2-dimensional interpolating function:

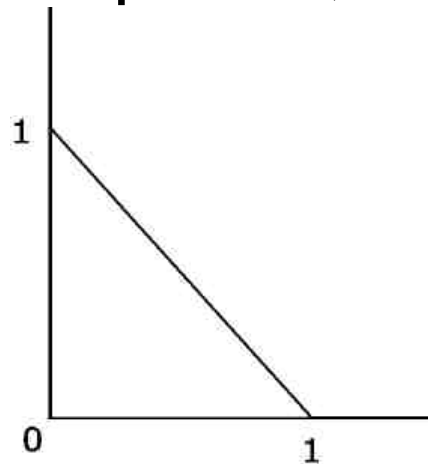
$$L_{nm}(f, x, y) \equiv L_n(L_m(f, x), y) = \sum_{i=1}^n \sum_{j=1}^m \lambda_i(x) \mu_j(y) f(x_i, y_j)$$

Lagrange for basic region in xD



Newton-Cotes for basic region in xD

- For simple domains only
- Domain specific, example simplex



- Newton-Cotes cubatures can be found via cardinal functions [3]

Newton-Cotes for basic region in x D

- Cardinal functions:

$$\lambda_{1,1}(x, y) = -(x + y - 1), \quad \lambda_{1,2}(x, y) = x, \quad \lambda_{1,3}(x, y) = y,$$

- Interpolating

$$L_1(f, x, y) = (1 - x - y) f(0,0) + x f(1,0) + y f(0,1)$$

- Which leads to a first-degree rule

$$C_3 f = \int_0^1 \int_0^{1-x} L_1(f, x, y) dy dx = \frac{1}{6} [f(0,0) + f(1,0) + f(0,1)]$$

Given rules for 2D

- Stroud [2] gives some rules for a set of basic regions
 - ◆ Degree
 - ◆ Number of points
- With * are “particularly useful”

Given rules for 2D

- *-Example:

$C_{2,5-1}$ degree 5, with 7 points:

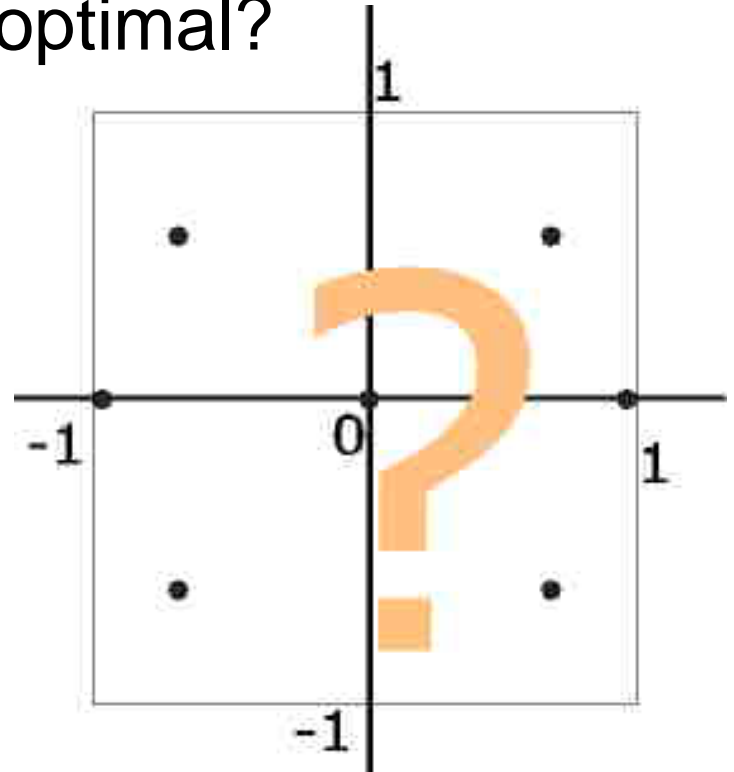
$$\left(\pm \sqrt{\frac{3}{5}}, \pm \sqrt{\frac{1}{3}} \right) \quad \text{with weight } \frac{5}{36}V$$

$$\left(0, \pm \sqrt{\frac{14}{15}} \right) \quad \text{with weight } \frac{5}{63}V$$

$$(0,0) \quad \text{with weight } \frac{2}{7}V$$

The optimal choice?

- Problem remains: is the choice of your points optimal?



Gauss for x D

- Zeros of x D-orthogonal polynomials
- Example 2D:
- Square $|x|, |y| \leq 1$. Find cubature rule with degree 2.
- Orthogonal polynomials can be found:

$$p^{(2,0)}(x, y) = x^2 - \frac{1}{3} \quad p^{(1,1)}(x, y) = xy \quad p^{(0,2)}(x, y) = y^2 - \frac{1}{3}$$

- But, how many points to choose?



Open problem

Given a fundamental geometry

Then find the least amount of points
(and weights) such that

$$\int_{\hat{e}} f \doteq \sum_i w_i f(x_i)$$

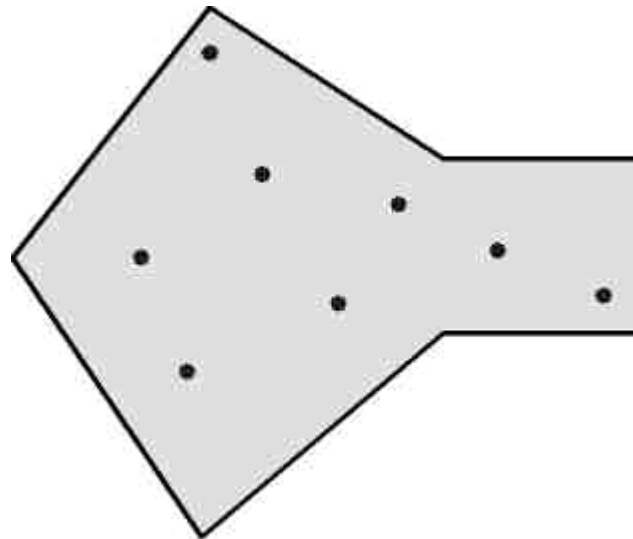
is exact for degree d .

Next session more about this problem

Monte Carlo approach

- First order method: $\int_{\Omega} f = \frac{1}{N} \sum_{i=1}^N f(x_i)$

with N randomly chosen numbers



Literature

Library (CUL):

- [1] A.H. Stroud “ *Numerical Quadrature and Solution of Ordinary Differential Equations*”, 1974
- [2] A.H. Stroud, “ *Appr. Calculation of Multiple Integrals*”, 1971
- [3] H. Engels, “ *Numerical Quadrate and Cubature*”, 1980

Articles:

```
@ARTICLE{AllgGeor4,  
  AUTHOR="E. Allgower, K. Georg and R. Widmann",  
  TITLE="Volume integrals for boundary element methods",  
  JOURNAL="Journal of Computational and Applied Mathematics",  
  PAGES="17--29",  
  VOLUME="38",  
  YEAR="1991" }
```

```
@ARTICLE{CooRab,  
  AUTHOR="R. Cools and P. Rabinowitz",  
  TITLE="Monomial cubature rules since ``Stroud'': a compilation",  
  JOURNAL="Journal of Computational and Applied Mathematics",  
  PAGES="309--326",  
  VOLUME="48",  
  YEAR="1993" }
```

```
@ARTICLE{Duve,  
  AUTHOR="D.A.~Dunavant",  
  TITLE="High degree efficient symmetric gauss quadrature rules for the  
    triangle",  
  JOURNAL="International Journal for Numerical Methods in Engineering",  
  PAGES="1129--1148",  
  VOLUME="21",  
  YEAR="1985" }
```

```
@ARTICLE{GeorWidm,  
  AUTHOR="K. Georg and R. Widmann",  
  TITLE="Adaptive quadratures over volumes",  
  JOURNAL="Computing",  
  PAGES="121--136",  
  VOLUME="47",  
  YEAR="1991" }
```

```

@ARTICLE{Grund78,
  AUTHOR="Axel Grundmann and H.M. M\"oller",
  TITLE="Invariant integration formulas for the n-simplex by combinatorial methods",
  JOURNAL="SIAM J. Numer. Anal.",
  VOLUME="15",
  NUMBER="2",
  PAGES="282-290",
  YEAR="1978"}

@ARTICLE{Kaha91,
  AUTHOR="D.K. Kahaner",
  TITLE="A Survey of Existing multidimensional quadrature
  Routines",
  JOURNAL="Contemporary Mathematics",
  VOLUME="155",
  YEAR="1991"}

@BOOK{Reich,
  AUTHOR="S. Reich",
  BOOKTITLE="Backward Error Analysis for Numerical Integrators",
  YEAR="1996",
  PUBLISHER="Preprint SC of the Konrad Zuse-Zentrum f\"ur Informationstechnik Berlin,
  Berlin, October Germany"}

@BOOK{Zumb1,
  AUTHOR="G. W. Zumbusch",
  BOOKTITLE="Adaptive h-p approximation procedures, graded meshes and anisotropic refinement
  for Numerical Quadrature",
  YEAR="1995",
  PUBLISHER="Preprint SC of the Konrad Zuse-Zentrum f\"ur Informationstechnik Berlin,
  Berlin, October Germany"}

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Available software

- NAG-Lib
- QUADPACK
- Net-lib
- Mathematica
 - ◆ Packages:
 - ★ NumericalMath`GaussianQuadrature`
 - ★ NumericalMath`NewtonCotes`
 - ★ More...
 - ◆ **Normally Gauss-Konrod based**
- Matlab

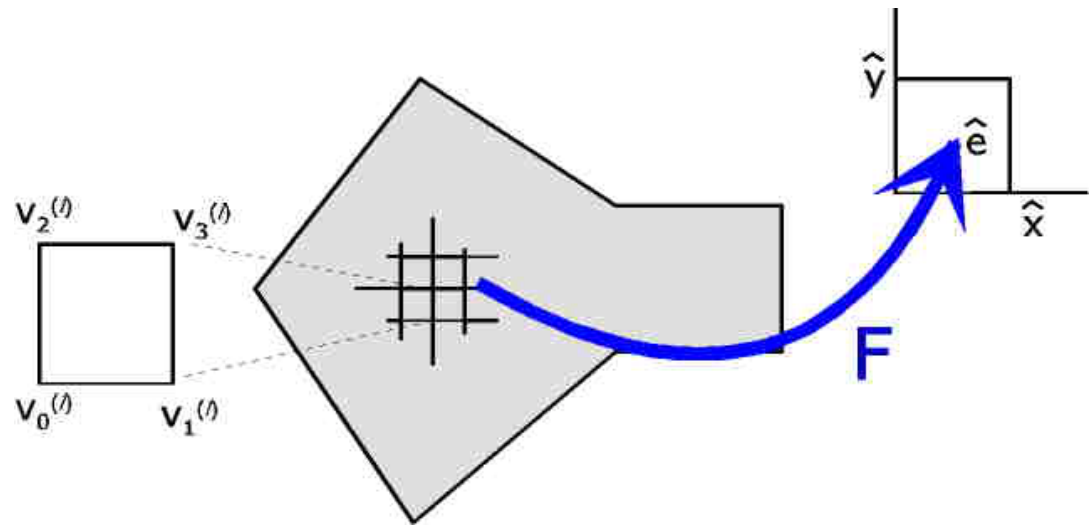
The answer is....

Yes!

Integrating in 2D or 3D **is** really different from integrating in 1D!

Map to fundamental geometry

- The domain Ω is divided into elements:



$$F_l \begin{pmatrix} \hat{x} \\ \hat{y} \end{pmatrix} = \begin{bmatrix} v_1^{(l)} - v_0^{(l)} & v_2^{(l)} - v_0^{(l)} \end{bmatrix} \begin{bmatrix} \hat{x} \\ \hat{y} \end{bmatrix} + v_0^{(l)}$$

Domain Decomposition

- Integration per element:

$$\int_{e_l} f(x) dx = \int_{\hat{e}} f(F_l(\hat{x})) |\det(\partial F_l(\hat{x}))| d\hat{x}$$

- Assume a given quadrature rule:

$$\int_{\hat{e}} g(\hat{x}) d\hat{x} \doteq \sum_i w_i g(\hat{x}_i)$$

- Then: $\int_{e_l} f(x) dx = |\det(\partial F_l(\hat{x}))| \sum_i w_i f(F_l(\hat{x}_i))$

$|\det(\partial F_l(\hat{x}))|$ is a number dependent on the element.