

# Parallel & Distributed Computing: Lecture 3

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March 15, 2017

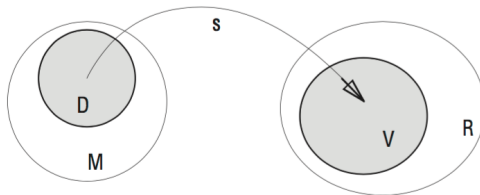
# Introduction to geometric modeling

- 1 Solid modeling
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- 3 Symbolic solution to domain integration of polynomials
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# Solid modeling

## Representation scheme

mapping  $s : M \rightarrow R$  from a space of math models  $M$  to computer representations  $R$



- ① The set  $M$  contains the **mathematical models** of the class of solid objects that the scheme aims to represent.
- ② The set  $R$  contains **symbolic representations**, i.e. suitable data structures, built according to some appropriate computer grammar.

Figure 1: **representation scheme**

# Some types of representation schemes

- Primitive instancing
- Quasidisjoint decomposition
- (Simple) sweeping
- Boundary representation
- Constructive solid geometry (CSG)

# Volume integration in CAD/CAE

Volume, moments of inertia, and similar properties of solids are defined by triple (volumetric) integrals over subsets of 3D Euclidean space.

The automatic computation of integral properties for geometrically complex solids is important in CAD/CAM/CAE (in a single word: PLM), and robotics

(Lee and Requicha 1982) discusses methods for computation of

$$\int_S f(P) dV$$

where  $P = (x, y, z) \in \mathbb{E}^3$ ,  $dV$  is the volume differential,  $f$  is a real-valued scalar function, e.g., a polynomial, and  $S$  is a solid (r-set) that may be geometrically complex, e.g., a typical mechanical part bounded by many curved faces.

# Typical integrals in mechanical CAD

$$\int_S f(P) dV$$

$$f(P) = p$$

$I = m$ , or volume, when  $p = 1$

$$f(P) = x/m$$

$I = x$ -coordinate of barycenter

$$f(p) = x^2 + y^2$$

$I =$  moment of inertia about  $z$

# Integration in Solid Modeling



# “Natural” integration methods

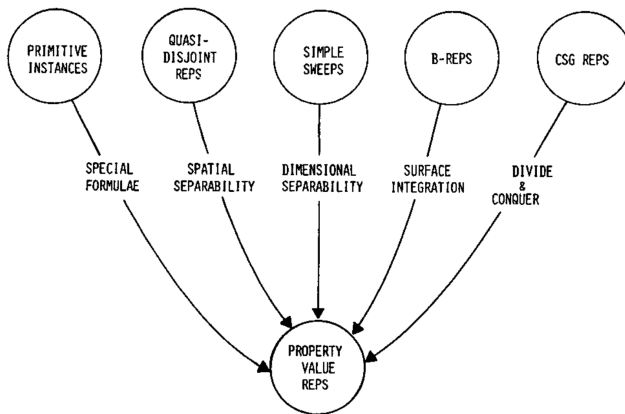


Figure 2: “Natural” integration methods

# Timmer-Stern Method for B-reps w parametric surfaces

See “Computation of global geometric properties of solid objects”

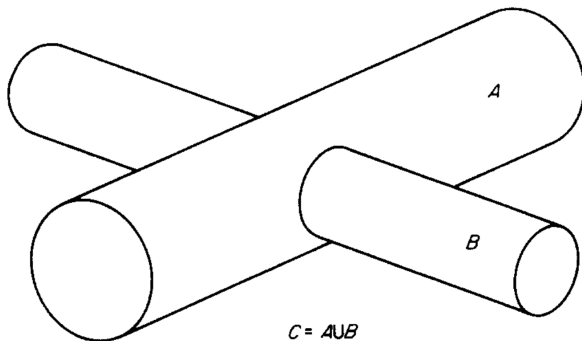


Figure 3: Example of solid model

# Symbolic solution to domain integration of polynomials

# Problem formulation

Finite evaluation of integrals:

$$II_S \equiv \iint_S f(\mathbf{p}) dS,$$

$$III_P \equiv \iiint_P f(\mathbf{p}) dV,$$

where  $S$ , and  $P$  are linear and regular 2- or 3-polyhedra in  $\mathbb{R}^3$ ,  $dS$  and  $dV$  are the differential surface and the differential volume.

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where  $S$ , and  $P$  are linear and regular 2- or 3-polyhedra in  $\mathbb{R}^3$ ,  $dS$  and  $dV$  are the differential surface and the differential volume.

The integrating function is a **trivariate polynomial**

$$f(\mathbf{p}) = \sum_{\alpha=0}^n \sum_{\beta=0}^m \sum_{\gamma=0}^p a_{\alpha\beta\gamma} x^\alpha y^\beta z^\gamma,$$

where  $\alpha, \beta, \gamma$  are non-negative integers.

# Problem solution

See “Boundary integration over linear polyhedra”

In the following we summarize from (Cattani and Paoluzzi 1990) an “exact” symbolic solution both to the surface and volume integration of polynomials, by using a **triangulation of the volume boundary**.

The evaluation of volume integrals is achieved **by transforming** them into **line integrals** over the **boundary of every simplex** of a boundary triangulation of integration domain

# Finite integration over polyhedra

**Problem statement** The finite method [CP90] to compute double and triplet integrals of monomials over linear regular polyhedra in  $\mathbb{R}^3$  is discussed. In particular, this method enables practical formulae for the exact evaluation of integrals to be achieved:

$$II_S \equiv \iint_S f(\mathbf{p}) dS, \quad III_P \equiv \iiint_P f(\mathbf{p}) dV, \quad (1)$$

where  $S$ , and  $P$  are linear and regular 2- or 3-polyhedra in  $\mathbb{R}^3$ ,  $dS$  and  $dV$  are the differential surface and the differential volume. The integrating function is a trivariate polynomial

$$f(\mathbf{p}) = \sum_{\alpha=0}^n \sum_{\beta=0}^m \sum_{\gamma=0}^p a_{\alpha\beta\gamma} x^\alpha y^\beta z^\gamma,$$

where  $\alpha, \beta, \gamma$  are non-negative integers.

Since the extension to  $f(\mathbf{p})$  is straightforwardly given by the linearity of integral operator, we may focus on the calculation of integrals of monomials:

$$II_S^{\alpha\beta\gamma} \equiv \iint_S x^\alpha y^\beta z^\gamma dS, \quad III_P^{\alpha\beta\gamma} \equiv \iiint_P x^\alpha y^\beta z^\gamma dV. \quad (2)$$

# Finite integration over polyhedra

**Surface integration** We call *structure product* the integral of a monomial over a simplicial complex. Exact formulae for structure products over n-sided polygons in 2-space, the unit triangle in 2-space, and an arbitrary triangle in 3-space, are derived in the following. Structure products are a generalization of the usual products and moments of inertia, that can be obtained from (2) by assuming  $\alpha + \beta + \gamma \leq 2$ .

Figure 5: [aaa](#)



# Finite integration over polyhedra

**Polygon integrals** A structure product over a polygon  $\pi$  in the plane  $xy$  is

$$II_{\pi}^{\alpha\beta} = \iint_{\pi} x^{\alpha} y^{\beta} dS, \quad \alpha, \beta \geq 0, \text{ integers.} \quad (3)$$

Such integrals can be exactly expressed, when  $\pi$  is a polygon with  $n$  oriented edges, as:

$$II_{\pi}^{\alpha\beta} = \frac{1}{\alpha+1} \sum_{i=1}^n \sum_{h=0}^{\alpha+1} \binom{\alpha+1}{h} x_i^{\alpha+1-h} X_i^h \sum_{k=0}^{\beta} \frac{\binom{\beta}{k}}{h+k+1} y_i^{\beta-k} Y_i^{k+1} \quad (4)$$

where  $\mathbf{p}_i = (x_i, y_i)$ ,  $X_i = x_{i+1} - x_i$ ,  $Y_i = y_{i+1} - y_i$  and  $\mathbf{p}_{n+1} = \mathbf{p}_1$ . The derivation of the formula (4) is based on the application of Green's theorem and on Newton's expression for binomial powers.

Figure 6: [aaa](#)

# Finite integration over polyhedra

**Unit triangle integrals** The general formula (4) can be specialized for the unit triangle  $\tau' = \langle \mathbf{w}_o, \mathbf{w}_a, \mathbf{w}_b \rangle$ , with vertices

$$\mathbf{w}_o = (0, 0), \quad \mathbf{w}_a = (1, 0), \quad \mathbf{w}_b = (0, 1), \quad (5)$$

getting a very simplified expression. With some algebraic manipulations, we obtain<sup>1</sup>

$$II^{\alpha\beta} = \frac{1}{\alpha + 1} \sum_{h=0}^{\alpha+1} \binom{\alpha+1}{h} \frac{(-1)^h}{h + \beta + 1}, \quad (6)$$

which reduces, for  $\alpha = \beta = 0$ , to the area of the triangle (5):  $II^{00} = 1/2$ .

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<sup>1</sup>  $II_{\pi}^{\alpha\beta}$  is substituted, when referred to the unit triangle, by the symbol  $II^{\alpha\beta}$ .

Figure 7: [aaa](#)

# Finite integration over polyhedra

**Triangle integrals** In the following we derive the general expression for structure products evaluated on an arbitrary triangle  $\tau = \langle \mathbf{v}_o, \mathbf{v}_a, \mathbf{v}_b \rangle$  of the 3-space  $xyz$ , defined by  $\mathbf{v}_o = (x_o, y_o, z_o)$  and by the vectors  $\mathbf{a} = \mathbf{v}_a - \mathbf{v}_o$  and  $\mathbf{b} = \mathbf{v}_b - \mathbf{v}_o$ . The parametric equation of its embedding plane is:

$$\mathbf{p} = \mathbf{v}_o + u \mathbf{a} + v \mathbf{b}, \quad (7)$$

where the area element is

$$d\tau = |J| du dv = \left| \frac{\partial \mathbf{p}}{\partial u} \times \frac{\partial \mathbf{p}}{\partial v} \right| du dv = |\mathbf{a} \times \mathbf{b}| du dv. \quad (8)$$

A structure product over a triangle  $\tau$  in 3-space can be transformed by a coordinates transformation, as follows:

$$II_{\tau}^{\alpha\beta\gamma} = \iint_{\tau} x^{\alpha} y^{\beta} z^{\gamma} d\tau = |\mathbf{a} \times \mathbf{b}| \iint_{\tau'} x^{\alpha}(u, v) y^{\beta}(u, v) z^{\gamma}(u, v) du dv, \quad (9)$$

where  $\tau'$  is the  $uv$  domain that corresponds to  $\tau$  under the coordinate transformation (7).

Figure 8: [aaa](#)

# Finite integration over polyhedra

In this case we have (the proof is given in [?]):

$$\begin{aligned}
 II_{\tau}^{\alpha\beta\gamma} &= |\mathbf{a} \times \mathbf{b}| \sum_{h=0}^{\alpha} \binom{\alpha}{h} x_o^{\alpha-h} \sum_{k=0}^{\beta} \binom{\beta}{k} y_o^{\beta-k} \sum_{m=0}^{\gamma} \binom{\gamma}{m} z_o^{\gamma-m} \cdot \\
 &\quad \cdot \sum_{i=0}^h \binom{h}{i} a_x^{h-i} b_x^i \sum_{j=0}^k \binom{k}{j} a_y^{k-j} b_y^j \sum_{l=0}^m \binom{m}{l} a_z^{m-l} b_z^l II^{\mu\nu}, \quad (10)
 \end{aligned}$$

where  $\mu = (h + k + m) - (i + j + l)$ ,  $\nu = (i + j + l)$ , and  $II^{\mu\nu}$  is a structure product over the triangle (5), as given by formula (6). Of course the area of a triangle  $\tau$  is:

$$II_{\tau}^{000} = \iint_{\tau} d\tau = |\mathbf{a} \times \mathbf{b}| II^{00} = \frac{|\mathbf{a} \times \mathbf{b}|}{2}. \quad (11)$$

**Surface integrals** In conclusion, a structure product over a polyhedral surface  $S$ , open or closed, is a summation of structure products (10) over the 2-simplices of a triangulation  $K_2$  of  $S$ :

$$II_S^{\alpha\beta\gamma} = \iint_S x^{\alpha} y^{\beta} z^{\gamma} dS = \sum_{\tau \in K_2} II_{\tau}^{\alpha\beta\gamma}. \quad (12)$$

# Finite integration over polyhedra

**Volume integration** Let  $P$  be a three-dimensional polyhedron bounded by a polyhedral surface  $\partial P$ . The regularity of the integration domain and the continuity of the integrating function enable us to apply the divergence theorem, which can be briefly summarized, for a vector field  $\mathbf{F} = \mathbf{F}(\mathbf{p})$  as:

$$\iiint_P \nabla \cdot \mathbf{F} \, dx \, dy \, dz = \iint_{\partial P} \mathbf{F} \cdot \mathbf{n} \, dS = \sum_{\tau \in K_2} \iint_{\tau} \mathbf{F} \cdot \mathbf{n}_{\tau} \, d\tau, \quad (13)$$

where  $\mathbf{n}$  is the outward vector normal to the surface portion  $dS$ , and hence  $\mathbf{n}_{\tau} = \mathbf{a} \times \mathbf{b} / |\mathbf{a} \times \mathbf{b}|$ .

Figure 10: [aaa](#)

# Finite integration over polyhedra

As the function  $x^\alpha y^\beta z^\gamma$  equates the divergence of the vector field  $\mathbf{F} = (x^{\alpha+1}y^\beta z^\gamma / \alpha + 1, 0, 0)$ , an expression for  $III_P^{\alpha\beta\gamma}$  is easily derived, which depends only on the 1-simplices of a triangulation of the domain boundary and on the structure products over its 2-simplices.

Figure 11: [aaa](#)

# Finite integration over polyhedra

As a matter of fact, we have:

$$\begin{aligned}
 III_P^{\alpha\beta\gamma} &= \iiint_P x^\alpha y^\beta z^\gamma \, dx \, dy \, dz \\
 &= \iiint_P \frac{\partial}{\partial x} \left( \frac{1}{\alpha+1} x^{\alpha+1} y^\beta z^\gamma \right) \, dx \, dy \, dz \\
 &= \frac{1}{\alpha+1} \sum_{\tau' \in K'_2} (\mathbf{a} \times \mathbf{b})_x \iint_{\tau'} x^{\alpha+1} y^\beta z^\gamma \, du \, dv.
 \end{aligned} \tag{14}$$

Taking into account equations (8) and (9), we can substitute the integral in the previous equation, getting finally:

$$III_P^{\alpha\beta\gamma} = \frac{1}{\alpha+1} \sum_{\tau \in K_2} \left[ \frac{(\mathbf{a} \times \mathbf{b})_x}{|\mathbf{a} \times \mathbf{b}|} \right]_\tau II_\tau^{\alpha+1, \beta, \gamma} \tag{15}$$

where the surface integrals are evaluated by using the formula (10).

Figure 12: [aaa](#)

# Python & Julia implementation



# Surface and volume integrals

```
""" Surface and volume integrals """  
def Surface(P, signed=False):  
    return II(P, 0, 0, 0, signed)  
def Volume(P):  
    return III(P, 0, 0, 0)
```

# Terms of the Euler tensor

```
def FirstMoment(P):
```

```
    out = [None]*3
```

```
    out[0] = III(P, 1, 0, 0)
```

```
    out[1] = III(P, 0, 1, 0)
```

```
    out[2] = III(P, 0, 0, 1)
```

```
    return out
```

```
def SecondMoment(P):
```

```
    out = [None]*3
```

```
    out[0] = III(P, 2, 0, 0)
```

```
    out[1] = III(P, 0, 2, 0)
```

```
    out[2] = III(P, 0, 0, 2)
```

```
    return out
```

```
def InertiaProduct(P):
```

```
    out = [None]*3
```

```
    out[0] = III(P, 0, 1, 1)
```

```
    out[1] = III(P, 1, 0, 1)
```

```
    out[2] = III(P, 1, 1, 0)
```

```
    return out
```

# Vectors and covectors of mechanical interest

```
def Centroid(P):  
    out = [None]*3  
    firstMoment = FirstMoment(P)  
    volume = Volume(P)  
    out[0] = firstMoment[0]/volume  
    out[1] = firstMoment[1]/volume  
    out[2] = firstMoment[2]/volume  
    return out  
  
def InertiaMoment(P):  
    out = [None]*3  
    secondMoment = SecondMoment(P)  
    out[0] = secondMoment[1] + secondMoment[2]  
    out[1] = secondMoment[2] + secondMoment[0]  
    out[2] = secondMoment[0] + secondMoment[1]  
    return out
```

# Basic integration functions

```
def M(alpha, beta):  
    a = 0  
    for l in range(alpha + 2):  
        a += CHOOSE([alpha+1,1]) * POWER([-1,1])/(1+beta+1)  
    return a/(alpha + 1)  
  
def II(P, alpha, beta, gamma, signed):  
    w = 0  
    V, FV = P  
    for i in range(len(FV)):  
        tau = [V[v] for v in FV[i]]  
        term = TT(tau, alpha, beta, gamma, signed)  
        w += term  
    return w
```

# Basic integration functions

```
def III(P, alpha, beta, gamma):
    w = 0
    V, FV = P
    for i in range(len(FV)):
        tau = [V[v] for v in FV[i]]
        vo,va,vb = tau
        a = VECTDIFF([va,vo])
        b = VECTDIFF([vb,vo])
        c = VECTPROD([a,b])
        w += (c[0]/VECTNORM(c)) * TT(tau, alpha+1, beta, gamma)
    return w/(alpha + 1)
```

# Basic integration functions

```
def TT(tau, alpha, beta, gamma, signed=False):
    vo,va,vb = tau
    a = VECTDIFF([va,vo])
    b = VECTDIFF([vb,vo])
    s1 = 0;
    for h in range(alpha+1):
        for k in range(beta+1):
            for m in range(gamma+1):
                s2 = 0
                for i in range(h+1):
                    s3 = 0
                    for j in range(k+1):
                        s4 = 0
                        for l in range(m+1):
                            s4 += CHOOSE([m, l]) * POWER([a[2], m-1]) \
                                * POWER([b[2], l]) * M( h+k+m-i-j-1, i+j+1 )
                        s3 += CHOOSE([k, j]) * POWER([a[1], k-j]) \
                            * POWER([b[1], j]) * s4
                    s2 += CHOOSE([h, i]) * POWER([a[0], h-i]) * POWER([b[0], i]) * s3;
            s1 += CHOOSE([alpha, h]) * CHOOSE([beta, k]) * CHOOSE([gamma, m]) \
                * POWER([vo[0], alpha-h]) * POWER([vo[1], beta-k]) \
                * POWER([vo[2], gamma-m]) * s2
    c = VECTPROD([a, b])
    if not signed: return s1 * VECTNORM(c)
    elif isclose(a[2],0.0) and isclose(b[2],0.0):
        return s1 * VECTNORM(c) * SIGN(c[2])
    else: print "error: in signed surface integration"
```

# Julia implementation

# Basic integration functions

From Cattani, Paoluzzi. “Boundary integration over linear polyhedra”, CAD, 1990

$$I^{\alpha\beta} = \frac{1}{\alpha + 1} \sum_{h=0}^{\alpha+1} \binom{\alpha + 1}{h} \frac{(-1)^h}{h + \beta + 1},$$

```
function M(alpha, beta)
    a = 0
    for l=1:(alpha + 2)
        a += binomial(alpha+1,l) * (-1)^l/(l+beta+1)
    end
    return a/(alpha + 1)
end
```



# Basic integration functions

structure product over a polyhedral surface  $S$ , open or closed, is a summation of structure products (1) over the 2-simplices of a triangulation  $K_2$  of  $S$ :

$$I_S^{\alpha\beta\gamma} = \iint_S x^\alpha y^\beta z^\gamma dS = \sum_{\tau \in K_2} I_\tau^{\alpha\beta\gamma}$$

```
function II(P, alpha, beta, gamma, signedInt=false)
    w = 0
    V, FV = P
    if typeof(P) == PyCall.PyObject
        if typeof(V) == Array{Any,2}
            V = V'
        end
        if typeof(FV) == Array{Any,2}
            FV = [FV[k,:] for k=1:size(FV,1)]
            FV = FV+1
        end
    end
    if typeof(FV) == Array{Int64,2}
        FV = [FV[:,k] for k=1:size(FV,2)]
    end
    for i=1:length(FV)
        tau = hcat([V[:,v] for v in FV[i]]...)
        if size(tau,2) == 3
            term = TT(tau, alpha, beta, gamma, signedInt)
            if signedInt
                w += term
            else
                w += abs(term)
            end
        elseif size(tau,2) > 3
            println("ERROR: FV[$(i)] is not a triangle")
        else
            println("ERROR: FV[$(i)] is degenerate")
        end
    end
    return w
end
```

# Basic integration functions

$$\begin{aligned}
 III_P^{\alpha\beta\gamma} &= \iiint_P x^\alpha y^\beta z^\gamma \, dx \, dy \, dz \\
 &= \frac{1}{\alpha+1} \sum_{\tau \in K_2} \left[ \frac{(\mathbf{a} \times \mathbf{b})_x}{|\mathbf{a} \times \mathbf{b}|} \right]_\tau III_\tau^{\alpha+1, \beta, \gamma}
 \end{aligned}$$

```

function III(P, alpha, beta, gamma)
    w = 0
    V, FV = P
    if typeof(P) == PyCall.PyObject
        if typeof(V) == Array{Any,2}
            V = V'
        end
        if typeof(FV) == Array{Any,2}
            FV = [FV[k,:]] for k=1:size(FV,1)]
            FV = FV+1
        end
    end
    for i=1:length(FV)
        tau = hcat([V[:,v]] for v in FV[i])...
        vo,va,vb = tau[:,1],tau[:,2],tau[:,3]
        a = va - vo
        b = vb - vo
        c = cross(a,b)
        w += c[1]/vecnorm(c) * TT(tau, alpha+1, beta, gamma)
    end
    return w/(alpha + 1)
end

```

# Basic integration functions

$$\begin{aligned}
 I_{\tau}^{\alpha\beta\gamma} &= |\mathbf{a} \times \mathbf{b}| \sum_{h=0}^{\alpha} \binom{\alpha}{h} x_o^{\alpha-h} \cdot \\
 &\quad \cdot \sum_{k=0}^{\beta} \binom{\beta}{k} y_o^{\beta-k} \cdot \\
 &\quad \cdot \sum_{m=0}^{\gamma} \binom{\gamma}{m} z_o^{\gamma-m} \cdot \\
 &\quad \cdot \sum_{i=0}^h \binom{h}{i} a_x^{h-i} b_x^i \cdot \\
 &\quad \cdot \sum_{j=0}^k \binom{k}{j} a_y^{k-j} b_y^j \cdot \\
 &\quad \cdot \sum_{l=0}^m \binom{m}{l} a_z^{m-l} b_z^l \cdot \\
 &\quad \cdot I^{\mu\nu}
 \end{aligned}$$

```

function TT(tau::Array{Float64,2}, alpha, beta, gamma, signedInt=false)
    vo,va,vb = tau[:,1],tau[:,2],tau[:,3]
    a = va - vo
    b = vb - vo
    s1 = 0.0
    for h=0:alpha
        for k=0:beta
            for m=0:gamma
                s2 = 0.0
                for i=0:h
                    s3 = 0.0
                    for j=0:k
                        s4 = 0.0
                        for l=0:m
                            s4 += binomial(m,l) * a[3]^(m-l) * b[3]^l * M(
                                h+k+m-i-j-l, i+j+1 )
                        end
                        s3 += binomial(k,j) * a[2]^(k-j) * b[2]^j * s4
                    end
                    s2 += binomial(h,i) * a[1]^(h-i) * b[1]^i * s3;
                end
                s1 += binomial(alpha,h) * binomial(beta,k) * binomial(gamma,m) *
                    vo[1]^(alpha-h) * vo[2]^(beta-k) * vo[3]^(gamma-m) * s2
            end
        end
    end
    c = cross(a,b)
    if signedInt == true
        return s1 * vecnorm(c) * sign(c[3])
    else return s1 * vecnorm(c) end
end

```

# References