

# FFTs in Graphics and Vision

Homogenous Polynomials and Irreducible Representations

### **Outline**



### Homogenous Polynomials

Representations of Functions on the Unit-Circle

- Sub-Representations for the Circle
- Sub-Representations for the Sphere

### **Monomials**



#### **Definition**:

A monomial in variables  $\{x_1, \dots, x_n\}$  is a product of non-negative integer powers of the variables.

The <u>degree</u> of a monomial is the sum of the powers.

## **Monomials**



### **Examples**:

- <u>Degree 0</u>: 1
- <u>Degree 1</u>: *x*, *y*, *z*
- Degree 2:  $x^2$ ,  $y^2$ ,  $z^2$ , xy, xz, yz
- Degree 3:  $x^3$ ,  $x^2y$ ,  $x^2z$ ,  $xy^2$ ,  $xz^2$ , xyz,  $y^3$ ,  $y^2z$ ,  $yz^2$ ,  $z^3$

# **Polynomials**



### **Definition**:

A <u>polynomial</u> of degree d in variables  $\{x_1, \dots, x_n\}$  is a linear sum of monomials in  $\{x_1, \dots, x_n\}$ , each of whose degree is no greater than d.

### Notation:

Denote by  $P^d(x_1, \dots, x_n)$  the set of polynomials in  $\{x_1, \dots, x_n\}$  of degree d.

## **Polynomials**



### **Examples**:

- d = 0: •  $P^0(x) = P^0(x, y) = P^0(x, y, z) = a$
- d = 1: •  $P^{1}(x) = ax + c$ •  $P^{1}(x, y) = ax + by + c$ •  $P^{1}(x, y, z) = ax + by + cz + d$
- d = 2: •  $P^{2}(x) = ax^{2} + bx + c$ •  $P^{2}(x, y) = ax^{2} + by^{2} + cxy + dx + ey + f$ •  $P^{2}(x, y, z) = ax^{2} + by^{2} + cz^{2} + dxy + exz + gyz + hx + iy + jz + k$
- •

# **Polynomials**



#### **Properties**:

• The linear sum of polynomials  $p, q \in P^d(x_1, \dots, x_n)$  is a polynomial:

$$a \cdot p(x_1, \dots, x_n) + b \cdot q(x_1, \dots, x_n) \in P^d(x_1, \dots, x_n)$$

• The product of polynomials  $p \in P^{d_1}(x_1, \dots, x_n)$  and  $q \in P^{d_2}(x_1, \dots, x_n)$  is a polynomial:  $p(x_1, \dots, x_n) \cdot q(x_1, \dots, x_n) \in P^{d_1 + d_2}(x_1, \dots, x_n)$ 

• The k-th power of a polynomial  $p \in P^d(x_1, \dots, x_n)$  is a polynomial:

$$p^k(x_1, \cdots, x_n) \in P^{d \cdot k}(x_1, \cdots, x_n)$$



#### **Definition**:

A degree d polynomial is said to be <u>homogenous</u> if the individual monomials all have degree d.

#### **Notation:**

Denote by  $HP^d(x_1, ..., x_n)$  the set of homogenous polynomials in  $\{x_1, ..., x_n\}$  of degree d.



#### **Examples**:

- d = 0: •  $HP^0(x) = HP^0(x, y) = HP^0(x, y, z) = a$
- d = 1: •  $HP^{1}(x) = ax$ •  $HP^{1}(x,y) = ax + by$ •  $HP^{1}(x,y,z) = ax + by + cz$
- d = 2: •  $HP^2(x) = ax^2$ •  $HP^2(x,y) = ax^2 + by^2 + cxy$ •  $HP^2(x,y,z) = ax^2 + by^2 + cz^2 + dxy + exz + gyz$
- •



#### **Properties**:

- The linear sum of homogenous polynomials  $p, q \in HP^d(x_1, \dots, x_n)$  is a homogenous polynomial:  $a \cdot p(x_1, \dots, x_n) + b \cdot p(x_1, \dots, x_n) \in HP^d(x_1, \dots, x_n)$
- The product of homogenous polynomials  $p \in HP^{d_1}(x_1, \dots, x_n)$  and  $q \in HP^{d_2}(x_1, \dots, x_n)$  is a homogenous polynomial:

$$p(x_1, \cdots, x_n) \cdot q(x_1, \cdots, x_n) \in HP^{d_1 + d_2}(x_1, \cdots, x_n)$$

• The k-th power of a homogenous polynomial  $p \in HP^d(x_1, \dots, x_n)$  is a homogenous polynomial:  $p^k(x_1, \dots, x_n) \in HP^{d \cdot k}(x_1, \dots, x_n)$ 



#### Note 1:

Any degree d polynomial in  $\{x_1, ..., x_n\}$  can be uniquely expressed as the sum of homogenous polynomials in  $\{x_1, ..., x_n\}$  of degrees 0 through d:  $P^d(x_1, ..., x_n) = HP^0(x_1, ..., x_n) \oplus ... \oplus HP^d(x_1, ..., x_n)$ 



#### Note 1:

$$P^d(x_1,\cdots,x_n)=HP^0(x_1,\cdots,x_n)\oplus\cdots\oplus HP^d(x_1,\cdots,x_n)$$

#### **Example:**



#### Note 2:

Any homogenous polynomial in  $\{x_1, ..., x_n\}$  of degree d can be uniquely expressed as:

- $x_1$  times a degree d-1 homogenous polynomial in  $\{x_1, \dots, x_n\}$ , plus
- a degree d homogenous polynomial in  $\{x_2, ..., x_n\}$ .

$$HP^d(x_1, \cdots, x_n) = x_1 \cdot HP^{d-1}(x_1, \cdots x_n) \oplus HP^d(x_2, \cdots, x_n)$$



#### Note 2:

$$HP^d(x_1, \cdots, x_n) = x_1 \cdot HP^{d-1}(x_1, \cdots x_n) \oplus HP^d(x_2, \cdots, x_n)$$

#### **Example:**

$$p(x,y) = 2x^{2} + 3y^{2} - xy$$

$$\in HP^{2}(x,y) = x \cdot (2x - y) + 3y^{2}$$

$$\in HP^{1}(x,y) \in HP^{2}(y)$$



What is the dimension of  $P^d(x_1, ..., x_n)$ ?

Since every polynomial of degree d can be uniquely expressed as the sum of homogenous polynomials of degrees 0 through d:

$$\dim\left(P^d(x_1,\cdots,x_n)\right) = \dim\left(HP^0(x_1,\cdots,x_n)\right) + \cdots + \dim\left(HP^d(x_1,\cdots,x_n)\right)$$



What is the dimension of  $HP^d(x_1, ..., x_n)$ ?



### Three properties give us a recursive definition:

- 1. A homogenous polynomial of degree d factors as:  $HP^d(x_1, \dots, x_n) = x_1 \cdot HP^{d-1}(x_1, \dots, x_n) \oplus HP^d(x_2, \dots, x_n)$
- 2. The space of homogenous polynomials in  $\{x_1, \dots, x_n\}$  of degree 0 is one-dimensional:  $HP^0(x_1, \dots, x_n) = a$
- 3. The space of homogenous polynomials in  $\{x\}$  of degree d is one-dimensional:

$$HP^d(x) = ax^d$$



## Homogenous Polynomials of Degree Zero:

$$\dim[HP^0(x_1,\cdots,x_n)]=1$$



## Homogenous Polynomials in One Variable:

The dimension of the space of homogenous polynomials of degree d in one variable is one, for all degrees d:

$$\dim[HP^d(x)] = 1$$



### Homogenous Polynomials in *n* Variables:

$$\dim[HP^d(x_1,\cdots,x_n)] = \dim[HP^d(x_2,\cdots x_n)] + \dim[HP^{d-1}(x_1,\cdots,x_n)]$$



### Homogenous Polynomials in *n* Variables:

```
\dim[HP^{d}(x_{1}, \dots, x_{n})] = \dim[HP^{d}(x_{2}, \dots x_{n})] + \dim[HP^{d-1}(x_{2}, \dots, x_{n})] + \dim[HP^{d-2}(x_{1}, \dots, x_{n})]
```



## Homogenous Polynomials in *n* Variables:

$$\dim[HP^{d}(x_{1}, \dots, x_{n})] = \sum_{i=1}^{a} \dim[HP^{i}(x_{2}, \dots x_{n})] + \dim[HP^{0}(x_{1}, \dots, x_{n})]$$



## Homogenous Polynomials in *n* Variables:

$$\dim[HP^d(x_1,\dots,x_n)] = \sum_{i=0}^d \dim[HP^i(x_2,\dots x_n)]$$



$$\dim[HP^d(x_1,\dots,x_n)] = \sum_{i=0}^d \dim[HP^i(x_2,\dots x_n)]$$

Homogenous Polynomials in *n* Variables:

One Variable:

$$\dim[HP^d(x)] = 1$$



$$\dim[HP^d(x_1, \dots, x_n)] = \sum_{i=0}^d \dim[HP^i(x_2, \dots x_n)]$$
$$\dim[HP^d(x)] = 1$$

## Homogenous Polynomials in *n* Variables:

Two Variables:

$$\dim[HP^{d}(x,y)] = \sum_{i=0}^{d} \dim[HP^{i}(x)]$$
$$= \sum_{i=0}^{d} 1$$
$$= d+1$$



$$\dim[HP^d(x_1,\cdots,x_n)] = \sum_{i=0}^d \dim[HP^i(x_2,\cdots x_n)]$$
$$\dim[HP^d(x,y)] = d+1$$

### Homogenous Polynomials in *n* Variables:

Three Variables:

$$\dim[HP^{d}(x, y, z)] = \sum_{i=0}^{d} \dim[HP^{i}(x, y)]$$
$$= \sum_{i=0}^{d} (i+1)$$
$$= \frac{(d+2) \cdot (d+1)}{2}$$



## Homogenous Polynomials in *n* Variables:

One Variable:  $\dim[HP^d(x)] = 1$ 

Two Variables:  $\dim[HP^d(x,y)] = d+1$ 

Three Variables:  $\dim[HP^d(x,y,z)] = \frac{(d+2)\cdot(d+1)}{2}$ 

### **Outline**



### Homogenous Polynomials

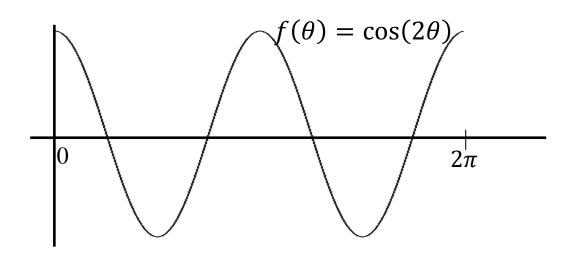
Representations of Functions on the Unit-Circle

- Sub-Representations for the Circle
- Sub-Representations for the Sphere

# Representing Functions on the Unit-Circle

There are two ways we can represent a function on the unit-circle:

- 1. By Parameter: Every point on the circle can be represented by an angle in the range  $[0,2\pi)$ .
- $\Rightarrow$  We can represent circular functions as 1D functions on the domain  $[0,2\pi)$ .

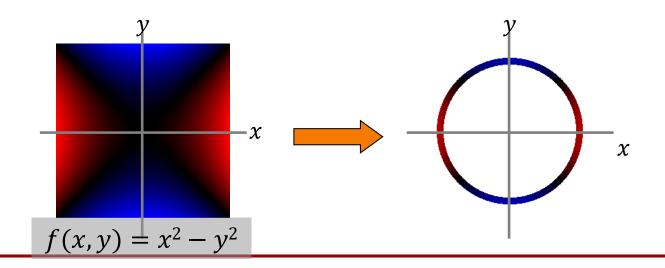


# Representing Functions on the Unit-Circle

There are two ways we can represent a function on the unit-circle:

2. By Restriction: We know that the unit-circle "lives" in 2D, i.e. it is the set of points (x, y) satisfying:  $x^2 + y^2 = 1$ 

⇒ We can represent circular functions by looking at the restriction of 2D functions to the unit-circle.



# Representing By Restriction



#### Observation 1:

On a circle, a point with angle  $\theta$  has x- and ycoordinates given by:

$$x = \cos(\theta)$$
  $y = \sin(\theta)$ 

This lets us transform a (circular) function represented by the restriction of a 2D function f(x,y) to a function represented by parameter:  $f(x,y) \rightarrow g(\theta) \equiv f(\cos\theta,\sin\theta)$ 

# Representing By Restriction

 $f(x,y)=x^2$ 

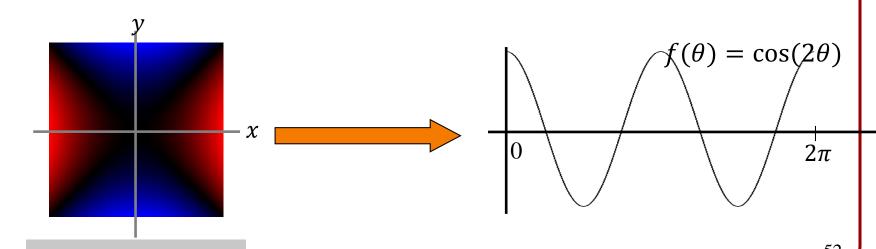


Example: If the circular function is defined as the restriction of the 2D function:

$$f(x,y) = x^2 - y^2$$

Then the representation in terms of angle is:

$$g(\theta) = \cos^2 \theta - \sin^2 \theta$$
$$= \cos 2\theta$$

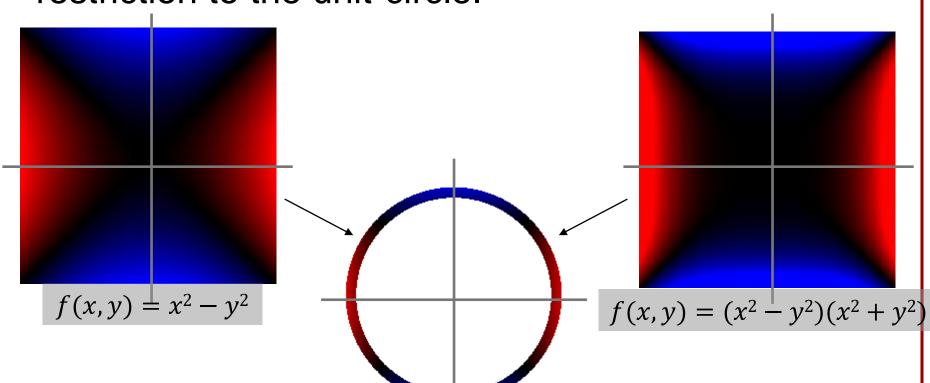


# Representing By Restriction



#### Observation 2:

Two different functions in 2D, can have the same restriction to the unit-circle.



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### **Outline**



Homogenous Polynomials

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# **Irreducible Representations**



### Recall:

In shape/image analysis tasks:

- Rotation invariant representation
- Image filtering
- Symmetry detection
- (2D) Rotational alignment

we needed to consider the representation of the group of 2D rotations on the space of circular functions.

# **Irreducible Representations**



### Recall:

To perform these tasks efficiently and/or effectively, we depended on Schur's Lemma.

⇒ Since the group was commutative, the irreducible representations were all one (complex) dimensional

# **Irreducible Representations**



#### Challenge:

We know that the irreducible representations exist. How do we find them?

#### **Sub-Representations**



How do we find a sub-space of functions that is also a sub-representation?

⇔ How do we find a space of functions such that a rotation of a function from this space gives some other function in the space?

#### **Fourier Basis**



For the circles, we know that these spaces are one-dimensional, spanned by:

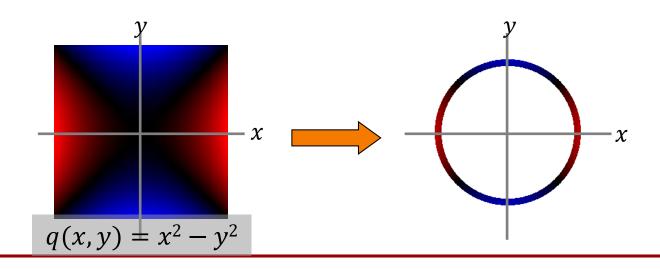
$$f_k(\theta) = e^{ik\theta}$$

But how would we go about finding them if we didn't know?



Consider the circular functions that are obtained by restricting degree d polynomials to the circle:

$$q(x,y) = \sum_{j+k \le d} a_{jk} \cdot x^j \cdot y^k$$





Consider the circular functions that are obtained by restricting degree d polynomials to the circle:

$$q(x,y) = \sum_{j+k \le d} a_{jk} \cdot x^j \cdot y^k$$

How does a rotation act on this function?

$$R = \begin{pmatrix} a & b \\ c & d \end{pmatrix}$$



Rotations act on the space of functions by rotating the domain of evaluation:

$$(\rho_R(q))(x,y) = q(R^{-1}(x,y))$$

Since the inverse of a rotation is its transpose, the rotation  $R^{-1}$ , acts on the 2D space by:

$$R^{-1}(x,y) = (ax + cy, bx + dy)$$



$$(\rho_R(q))(x,y) = q(ax + cy, bx + dy)$$

⇒ The rotation acts on the polynomial:

$$q(x,y) = \sum_{j+k \le d} a_{jk} \cdot x^j \cdot y^k$$

by sending it to:

$$(\rho_R(q))(x,y) = \sum_{j+k \le d} a_{jk} \cdot \underbrace{(ax+cy)^j \cdot (bx+dy)^k}_{\text{Degree 1}} \underbrace{bx+dy}^k$$



$$(\rho_R(q))(x,y) = q(ax + cy, bx + dy)$$

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by sending it to:

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$$(\rho_R(q))(x,y) = q(ax + cy, bx + dy)$$

⇒ The rotation acts on the polynomial:

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by sending it to:

$$(\rho_R(q))(x,y) = \sum_{j+k \le d} a_{jk} \cdot \underbrace{(ax + cy)^j \cdot (bx + dy)^k}_{\text{Degree } j + k}$$

 $\Rightarrow$  Since  $j + k \le d$ , the rotation of q(x, y) by R is also a polynomial of degree d.



If we start with a polynomial of degree d:

$$q(x,y) \in P^d(x,y)$$

and we apply any rotation R to it, the rotated polynomial will also be a polynomial of degree d:

$$\rho_R(q) \in P^d(x,y)$$

⇒ The space of functions obtained by restricting polynomials of degree d to the unit circle is a sub-representation.



We can repeat the argument for restrictions of homogenous polynomials:

$$q(x,y) = \sum_{j+k=d} a_{jk} \cdot x^j \cdot y^k$$

$$\updownarrow$$

$$(\rho_R(q))(x,y) = \sum_{j+k=d} a_{jk} \cdot (ax + cy)^j \cdot (bx + dy)^k$$



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⇒ The space of functions obtained by restricting homogenous polynomials of degree d to the unit circle is a sub-representation.



How small are these sub-representations?

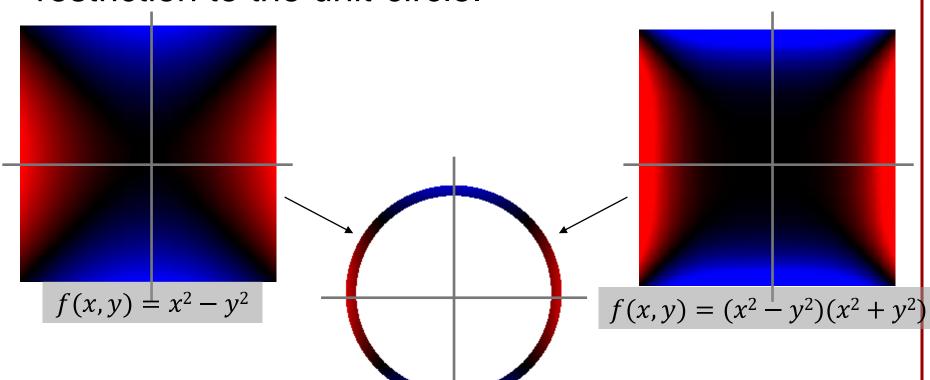
The space of homogenous polynomials of degree d in two variables is (d + 1)-dimensional.

We know that the irreducible representations all have to be one-dimensional – what's going on?



#### Recall:

Two different functions in 2D, can have the same restriction to the unit-circle.





Note that every point (x, y) on the circle satisfies:  $x^2 + y^2 + 1$ 

⇒ For any  $q(x,y) \in HP^d(x,y)$ , the homogenous polynomial  $q(x,y) \cdot (x^2 + y^2) \in HP^{d+2}(x,y)$  will have the same restriction to the unit circle.



When considering the restriction of homogenous polynomials to the circle, degree d polynomials are "contained" in the restriction of the degree (d+2) polynomials.

Since the restrictions of degree d polynomials to the circle form a sub-representation, we want the polynomials of degree (d + 2) whose restrictions are orthogonal to those of degree d polynomials.



#### Example:

• d = 0:

 $HP^d(x,y)$  is spanned by  $\{1\}$  so the restriction is the space of constant functions.



#### Example:

• d = 1:

 $HP^d(x,y)$  is spanned by  $\{x,y\}$  so the restriction is the space of functions ax + by.

Since we can write out the x and y coordinates in terms of the angle  $\theta$ :

$$x = \cos \theta$$
  $y = \sin \theta$ 

this gives the space of functions of the form:

$$f(\theta) = a \cdot \cos \theta + b \cdot \sin \theta$$



#### Example:

• d = 2:

 $HP^d(x,y)$  is spanned by  $\{x^2, xy, y^2\}$  so the restriction is the space of functions of the form  $ax^2 + bxy + cy^2$ . In terms of the angle, this gives the space of functions of the form:

$$f(\theta) = a \cdot \cos^2 \theta + b \cdot \cos \theta \cdot \sin \theta + c \cdot \sin^2 \theta$$



#### Example:

• 
$$d = 2$$
:  

$$f(\theta) = a \cdot \cos^2 \theta + b \cdot \cos \theta \cdot \sin \theta + c \cdot \sin^2 \theta$$

Since we know that:

$$\cos^2 \theta + \sin^2 \theta = 1$$

is a constant function accounted for by the d=0 case, we want the space of homogenous polynomial restrictions that are perpendicular to those accounted for by the d=0 case.



#### Example:

```
• d=2:

A function of the form:

f(\theta)=a\cdot\cos^2\theta+b\cdot\cos\theta\cdot\sin\theta+c\cdot\sin^2\theta

is perpendicular to the function:

\cos^2\theta+\sin^2\theta=1

if and only if:

0=\langle 1,a\cdot\cos^2\theta+b\cdot\cos\theta\cdot+c\cdot\sin^2\theta\rangle
```



#### Example:

• 
$$d = 2$$
:  

$$0 = \langle 1, a \cdot \cos^2 \theta + b \cdot \cos \theta \cdot \sin \theta + c \cdot \sin^2 \theta \rangle$$

$$0 = \int_0^{2\pi} (a \cdot \cos^2 \theta + b \cdot \cos \theta \cdot \sin \theta + c \cdot \sin^2 \theta) d\theta$$

$$0 = a \cdot \pi + c \cdot \pi$$

$$0 = a \cdot \pi + c \cdot \pi$$

$$0 = a \cdot \pi + c \cdot \pi$$



#### Example:

• d = 2:

Homogenous polynomials of degree two can be expressed as:

 $f(\theta) = a \cdot \cos^2 \theta + b \cdot \cos \theta \cdot \sin \theta + c \cdot \sin^2 \theta$ and orthogonality implies that:

$$c = -a$$

⇒ A basis for the sub-representation is:

$$\{\cos^2\theta - \sin^2\theta, \cos\theta \cdot \sin\theta\}$$

$$\{\cos 2\theta, \sin 2\theta\}$$



#### Example:

•  $d \ge 2$ :

As in the d=2 case, we start with the space of homogenous polynomials of degree d.

Since the space of homogenous polynomials of degree d-2 is contained in this space, we "remove" the degree d-2 polynomials.

Thus, the final dimension of the sub-representation is:  $\dim[HP^d(x,y)] - \dim[HP^{d-2}(x,y) = (d+1) - (d-1) = 2$ 



#### Example:

•  $d \ge 2$ :

As in the d=2 case, that the two functions:  $\{\cos d\theta \,, \sin d\theta \}$  are a basis for the sub-representation.



#### Note:

These sub-representations are not irreducible.

By Schur's lemma, the irreducible representations are all one-dimensional and for d>0, we are getting two-dimensional sub-representations.

To get the irreducible representations, we need to further break apart these sub-representations.

$$\{\cos d\theta, \sin d\theta\} = \begin{cases} \cos d\theta + i \sin d\theta \\ \cos d\theta + i \sin d\theta \end{cases} = \begin{cases} e^{i\theta} \\ e^{-i\theta} \end{cases}$$

These two-dimensional representations are irreducible representations for the group of orthogonal transformations (i.e. rotations <u>and reflections</u>).

#### **Outline**



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Representations of Functions on the Unit-Circle

- Sub-Representations for the Circle
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### **Spherical Functions**



As in the case of circular functions, we would like to find the sub-representations of the spherical functions — sub-spaces of spherical functions which get rotated back into themselves.

# **Spherical Functions**



As in the case of circular functions, we would like to find the sub-representations of the spherical functions — sub-spaces of spherical functions which get rotated back into themselves.

In this case, the group does not commute, so we do not expect the sub-representations to be one-dimensional.



As with circular functions, we consider spherical functions obtained by restricting homogenous polynomials of degree d to the unit sphere:

$$q(x,y,z) = \sum_{j+k+l=d} a_{jkl} \cdot x^j \cdot y^k \cdot z^l$$



If *R* is a rotation:

$$R = \begin{pmatrix} a & b & c \\ d & e & f \\ g & h & i \end{pmatrix}$$

then *R* will rotate the polynomial *q* by:

$$(\rho_R(q))(x,y,z) =$$

$$= \sum_{j+k+l=d} a_{jkl} \cdot (ax + dy + gz)^j \cdot (bx + ey + hz)^k \cdot (cx + fy + iz)^l$$

Again, rotations fix the space of homogenous polynomials – mapping homogenous polynomials of degree d back into homogenous polynomials of degree d.



As in the 2D case, we know that the restrictions of homogenous polynomials of degree d to the unit sphere contain the restrictions of homogenous polynomials of degree d-2 to the unit sphere.

So for any  $q(x,y,z) \in HP^d(x,y,z)$ , the polynomial  $q(x,y,z) \cdot (x^2 + y^2 + z^2) \in HP^{d+2}(x,y,z)$  will have the same restriction to the unit sphere.



 $\Rightarrow$  Sub-representations can be obtained by considering the restrictions of homogenous polynomials of degree d to the unit sphere, and removing those that were already accounted for at degree d-2.

⇒ The dimension of the space obtained from the degree d homogenous polynomials will be:

$$\dim[HP^{d}(x, y, z)] - \dim[HP^{d-2}(x, y, z)]$$

$$= \frac{(d+2) \cdot (d+1)}{2} - \frac{d \cdot (d-1)}{2}$$

$$= 2d+1$$



 $\Rightarrow$  Sub-representations can be obtained by considering the restrictions of homogenous polynomials of degree d to the unit sphere, and removing those that were already accounted for at degree d-2.

⇒ The dimension of the space obtained from the degree d homogenous polynomials will be:  $\dim[HP^d(x,y,z)] - \dim[HP^{d-2}(x,y,z)] =$ 

It turns out that for spherical functions, these are the irreducible representations for the group of rotations.