

TAREA:

GRAFICAR C EN FUNCIÓN DE LA DIMENSIÓN D. D = (2, 3, 4, 5, 10, 20, 30, 40, 50, 100, 200, 300, 400, 500)

CONSIDERAR DISTANCIA EUCLIDEANA Y NORMAL (MANHATTAN).

In [1]: import math
 import matplotlib.pyplot as plt

Distance Formulas

In multidimensional space, two commonly used metrics to measure distance between points are the **Euclidean** and **Manhattan** distances.

Euclidean Distance (L2-Norm):

The Euclidean distance between two points ($x = (x_1, x_2, ..., x_n)$) and ($y = (y_1, y_2, ..., y_n)$) in (n)-dimensional space is defined as:

$$d_{ ext{Euclidean}}(x,y) = \sqrt{\sum_{i=1}^n (x_i - y_i)^2}$$

This metric corresponds to the straight-line distance between two points in Euclidean geometry.

Manhattan Distance (L1-Norm):

The Manhattan distance between two points ($x = (x_1, x_2, ..., x_n)$) and ($y = (y_1, y_2, ..., y_n)$) in (n)-dimensional space is defined as:

$$d_{ ext{Manhattan}}(x,y) = \sum_{i=1}^n |x_i - y_i|$$

This metric represents the sum of absolute differences across all dimensions. It is analogous to the distance traveled along grid lines in a city layout (hence the name "Manhattan").

```
In [2]: # Define dimensions, radius R and shell thickness s
        dimensions = [2, 3, 4, 5, 10, 20, 30, 40, 50, 100, 200, 300, 400, 500]
        # Examplary values for R and s
        R = 1.0
        s = 0.01
        # euclidean volume
        def log_volume_l2(r, d):
            Returns ln(Volume) of the d-dimensional Euclidean ball of radius r.
            Formula: ln(V) = (d/2)*ln(pi) + d*ln(r) - lnGamma(d/2 + 1)
            if r <= 0:
                return float('-inf')
            return (d / 2.0) * math.log(math.pi) + d * math.log(r) - math.lgamma(
        #manhattan volume
        def log_volume_l1(r, d):
            Returns ln(Volume) of the d-dimensional L1-ball (cross-polytope) of r
            Formula: ln(V) = d*ln(2) + d*ln(r) - lnGamma(d + 1)
            if r <= 0:
                return float('-inf')
            return d * math.log(2.0) + d * math.log(r) - math.lgamma(d + 1)
        #shell fraction
        def shell_fraction(R, s, d, log_vol_func):
            Computes the fraction of volume in the outer shell [R-s, R] in dimension
            using a log-volume function (either log_volume_l2 or log_volume_l1).
            .....
            logVout = log_vol_func(R, d) # ln(V_out)
            logVin = log_vol_func(R - s, d) if (R - s) > 0 else float('-inf')
            # If V_out is effectively zero, return 0 fraction
            if logVout == float('-inf'):
                return 0.0
            if logVin == float('-inf'):
                return 1.0
            ratio = math.exp(logVin - logVout)
            return 1.0 - ratio
        euclidean_shell_fractions = []
        manhattan_shell_fractions = []
        for d in dimensions:
```

```
frac_l2 = shell_fraction(R, s, d, log_volume_l2)
    frac_l1 = shell_fraction(R, s, d, log_volume_l1)
    euclidean_shell_fractions.append(frac_l2)
    manhattan_shell_fractions.append(frac_l1)
# results in a table
print("Dimension | C (Euclidean) | C (Manhattan)")
for d, c_l2, c_l1 in zip(dimensions, euclidean_shell_fractions, manhattan
    print(f"{d:9d} | {c_l2:13.6e} | {c_l1:13.6e}")
fig, (ax1, ax2) = plt.subplots(1, 2, figsize=(12, 5))
ax1.plot(dimensions, euclidean_shell_fractions, 'o-', color='blue')
ax1.set_title("Euclidean (L2)")
ax1.set_xlabel("Dimension D")
ax1.set_ylabel("Shell Fraction C")
ax1.grid(True)
ax2.plot(dimensions, manhattan_shell_fractions, 's-', color='green')
ax2.set_title("Manhattan (L1)")
ax2.set_xlabel("Dimension D")
ax2.set_ylabel("Shell Fraction C")
ax2.grid(True)
plt.tight_layout()
plt.show()
Dimension | C (Euclidean) | C (Manhattan)
            1.990000e-02 | 1.990000e-02
        2 |
        3 |
             2.970100e-02 |
                              2.970100e-02
             3.940399e-02 |
                              3.940399e-02
        5 |
             4.900995e-02 |
                             4.900995e-02
             9.561792e-02 |
                              9.561792e-02
             1.820931e-01 |
                              1.820931e-01
       20 |
       30 I
             2.602996e-01 |
                              2.602996e-01
       40
             3.310282e-01 |
                              3.310282e-01
       50 I
             3.949939e-01 |
                              3.949939e-01
             6.339677e-01 |
      100 l
                              6.339677e-01
      200 |
             8.660203e-01 |
                              8.660203e-01
      300 l
             9.509591e-01 |
                              9.509591e-01
             9.820494e-01 |
                              9.820494e-01
      400
      500
             9.934295e-01 |
                              9.934295e-01
                Euclidean (L2)
                                                       Manhattan (L1)
                                        0.8
Fraction C
 0.6
                                       Fraction (
                                        0.6
Shell 0.4
                                       9.0
9.0
 0.2
                                        0.2
 0.0
```

Shell Fraction for High-Dimensional Balls

When calculating the fraction (C) of the volume contained in an outer shell (of thickness (s)) for a high-dimensional ball (radius (R)), we have:

$$C = \frac{V(R) - V(R - s)}{V(R)} = 1 - \frac{V(R - s)}{V(R)}.$$

Euclidean (L2) and Manhattan (L1) Volumes

• Euclidean ball (L2-norm):

$$V_{L2}(r,d)=rac{\pi^{d/2}}{\Gamma(rac{d}{2}+1)}r^d$$

• Manhattan ball (L1-norm or cross-polytope):

$$V_{L1}(r,d)=rac{2^d}{d!}r^d$$

Notice that both volume formulas share a common factor of (r^d). This is key to the simplification.

Simplification of (C):

Substituting the volume formulas into the shell fraction, we have:

$$C = 1 - rac{V(R-s)}{V(R)} = 1 - rac{(ext{constant factor}) \cdot (R-s)^d}{(ext{constant factor}) \cdot R^d}$$

Because the constant factors (($\frac{d}{2}}{\Gamma(\frac{d}{2}+1)}$) and ($\frac{2^d}{d!}$)) appear in both numerator and denominator, they cancel out. Thus, the fraction simplifies to:

$$C = 1 - rac{(R-s)^d}{R^d} = 1 - \left(1 - rac{s}{R}
ight)^d$$

Result and Implications:

The shell fraction therefore simplifies neatly to:

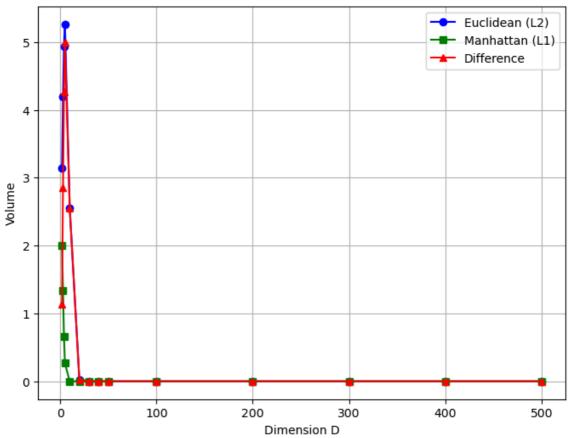
$$C = 1 - (1 - s)^d$$
 (for $R = 1$)

This simplification indicates an important geometric insight:

For small (s) and large dimensions (d), nearly all the volume of high-dimensional balls is concentrated in a very thin shell close to their surface, irrespective of the type of norm (Euclidean or Manhattan).

This phenomenon illustrates the **curse of dimensionality**, where high-dimensional spaces behave in ways that differ significantly from low-dimensional intuition.

Volumes of Euclidean and Manhattan Balls



Volumes of Euclidean and Manhattan Balls Euclidean (L2) Manhattan (L1) Difference 10⁻⁵⁶ 10⁻⁹³ 10⁻¹⁶⁷ 10⁻²⁰⁴ 10⁻²⁷⁸

Why the Shell Fraction (C) Converges to Zero for High Dimensions

200

300

Dimension D

400

500

100

Shell fraction is defined as:

$$C = 1 - (1 - s)^d$$

where:

- (s) is the thickness of the outer shell (small value, e.g., (s = 0.01))
- (d) is the dimensionality.

As the dimension (d) grows, the term $((1 - s)^d)$ behaves as follows:

 Since (0 < (1 - s) < 1), raising it to increasingly large powers (d) causes it to rapidly approach (0):

$$\lim_{d o\infty}(1-s)^d=0$$

Thus, the fraction (C) approaches:

$$\lim_{d o \infty} C = 1 - 0 = 1$$

Important clarification: Actually, the expression above indicates that (C) approaches **1** as (d) grows large, meaning nearly all the volume is concentrated in the outer shell (not zero). The fraction of volume in the *inner region* shrinks rapidly to zero. Thus:

- Inner volume fraction → (0) as (d \to \infty).
- Outer shell fraction ((C)) → (1) as (d \to \infty).
- The **inner region** (center of the ball) becomes insignificant as dimension increases.
- Almost the **entire volume** is concentrated in a thin outer shell near the surface.

This phenomenon is known as the "curse of dimensionality" and is critical in high-dimensional geometry, as it implies that high-dimensional balls become essentially hollow with volume mostly on their surfaces.

Visualization of Sphere in 3D

```
In [5]: import numpy as np
        import plotly.graph_objects as go
        import ipywidgets as widgets
        from IPython.display import display, clear_output
        # Function that generates the Plotly figure.
        def generate_fig(s, X_cut):
            # --- Outer and Inner Spheres ---
            num phi = 50
            num\_theta = 50
            phi = np.linspace(0, np.pi, num_phi)
            theta = np.linspace(0, 2*np.pi, num_theta)
            phi, theta = np.meshgrid(phi, theta)
            # Outer sphere (radius 1)
            x_outer = np.sin(phi) * np.cos(theta)
            y_outer = np.sin(phi) * np.sin(theta)
            z_outer = np.cos(phi)
            # Only show points with x \ge X_{cut}
            mask_outer = x_outer < X_cut</pre>
            x_outer[mask_outer] = np.nan
            y_outer[mask_outer] = np.nan
            z_outer[mask_outer] = np.nan
            # Inner sphere (radius = 1 - s)
            r_{inner} = 1 - s
            x_inner = r_inner * np.sin(phi) * np.cos(theta)
            y_inner = r_inner * np.sin(phi) * np.sin(theta)
            z_inner = r_inner * np.cos(phi)
            mask_inner = x_inner < X_cut</pre>
            x_inner[mask_inner] = np.nan
            y_inner[mask_inner] = np.nan
            z_inner[mask_inner] = np.nan
            # --- Cross-Section Surfaces at x = X_cut ---
            # Cross section for the outer sphere:
            if X_cut**2 < 1:
                R_{outer} = np.sqrt(1 - X_{cut}**2)
            else:
                R_{outer} = 0
```

```
# Cross section for the inner sphere:
if X_cut**2 < (r_inner**2):
    R_inner_cut = np.sqrt(r_inner**2 - X_cut**2)
else:
    R_{inner_cut} = 0
# Create a polar grid for the cross-section (in the y-z plane)
num r = 50
num_ang = 50
r_vals = np.linspace(0, R_outer, num_r)
ang_vals = np.linspace(0, 2*np.pi, num_ang)
r_grid, ang_grid = np.meshgrid(r_vals, ang_vals)
y_disc = r_grid * np.cos(ang_grid)
z_{disc} = r_{grid} * np.sin(ang_{grid})
x_disc = X_cut * np.ones_like(y_disc)
# Inner disc: for r <= R_inner_cut (inner volume)</pre>
y_inner_disc = np.where(r_grid <= R_inner_cut, y_disc, np.nan)</pre>
z_inner_disc = np.where(r_grid <= R_inner_cut, z_disc, np.nan)</pre>
x_inner_disc = X_cut * np.ones_like(y_inner_disc)
# Outer disc: for r >= R_inner_cut (shell)
y_outer_annulus = np.where(r_grid >= R_inner_cut, y_disc, np.nan)
z_outer_annulus = np.where(r_grid >= R_inner_cut, z_disc, np.nan)
x_outer_annulus = X_cut * np.ones_like(y_outer_annulus)
# Compute the shell volume fraction for a unit sphere in 3D.
frac = 1 - (1 - s)**3
traces = []
# Outer sphere
traces.append(go.Surface(
    x=x_outer, y=y_outer, z=z_outer,
    colorscale='Blues',
    showscale=False,
    opacity=0.5,
    name='Outer Sphere'
))
# Inner sphere
traces.append(go.Surface(
    x=x_inner, y=y_inner, z=z_inner,
    colorscale='Oranges',
    showscale=False,
    opacity=0.5,
    name='Inner Surface'
))
# Cross-section inner disc (inner volume)
traces.append(go.Surface(
    x=x_inner_disc, y=y_inner_disc, z=z_inner_disc,
    colorscale=[[0, 'orange'], [1, 'orange']],
    showscale=False,
    opacity=1.0,
    name='Inner Volume (Cut)'
))
# Cross-section outer annulus (shell)
traces.append(go.Surface(
    x=x_outer_annulus, y=y_outer_annulus, z=z_outer_annulus,
    colorscale=[[0, 'blue'], [1, 'blue']],
    showscale=False,
```

```
opacity=1.0,
        name='Shell (Cut)'
    ))
    layout = go.Layout(
        title=f"Shell thickness s = \{s:.3f\} (Shell fraction = \{frac:.3f\})
        scene=dict(
            xaxis=dict(range=[-1.2, 1.2]),
            yaxis=dict(range=[-1.2, 1.2]),
            zaxis=dict(range=[-1.2, 1.2]),
            aspectmode='data'
        )
    )
    fig = go.Figure(data=traces, layout=layout)
    return fig
# Create an Output widget to hold the plot. (wegen jupyter notebook)
out = widgets.Output()
display(out)
# Update function to refresh the plot in the output widget. Wenn nicht we
def update_plot(s, X_cut):
    with out:
        clear_output(wait=True)
        fig = generate_fig(s, X_cut)
        fig.show()
# Create two sliders for s and X_cut.
s slider = widgets.FloatSlider(min=0, max=0.5, step=0.01, value=0.1, desc
X_cut_slider = widgets.FloatSlider(min=-1, max=1, step=0.01, value=0.0, d
# Use interactive_output to tie the sliders to update_plot.
ui = widgets.HBox([s_slider, X_cut_slider])
interactive_plot = widgets.interactive_output(update_plot, {'s': s_slider
# Display the sliders and the output.
display(ui, out)
Output()
HBox(children=(FloatSlider(value=0.1, description='Shell thickness s', m
ax=0.5, step=0.01), FloatSlider(value=...
Output()
```

In []: