

03_enzyme_oscillations

November 17, 2025

1 Biochemical Oscillations

Starting with bistability, additional feedback inhibition leads to spontaneous oscillations and self-organised temporal order. Processes can switch autonomously and repeatedly. Adding features can increase the complexity of self organisation, the idea of a hierarchy. Concept: self-organised rhythms in living systems.

```
[1]: from scipy.integrate import solve_ivp
from matplotlib.pyplot import subplots
import numpy as np
```

2 Forward inhibition combined with feedback inhibition

2.1 Time Series

```
[2]: def model(t, variables, a1, b1, a2, b2, k_max, K_m, k_i, n, m, q):
    """Coupled system with feedback inhibition"""
    S, P = variables

    enzymatic_rate = (k_max * S**n) / (K_m**m + S**m) / (1 + k_i * P**q)

    dSdt = a1 - b1 * S - enzymatic_rate
    dPdt = a2 - b2 * P + enzymatic_rate

    return [dSdt, dPdt]

y0 = [0.5, 6.97]

a1 = [0.58, 0.62]

a2      = 0.02
b1, b2  = 0.18, 0.05

k_max, K_m, k_i = 25.0, 0.7, 0.06
n, m, q = 1, 3, 3

t_span = (0, 700)
```

```

colors = ['tomato', 'deepskyblue']

fig, ax = subplots(ncols=2, nrows=2, figsize=(8, 4))

for index, color in enumerate(colors):

    solution = solve_ivp(model, t_span, y0, args=(a1[index], b1, a2, b2, k_max, ↴
    ↵K_m, k_i, n, m, q,), method='BDF', max_step=0.1)

    t = solution.t

    S = solution.y[0]
    P = solution.y[1]

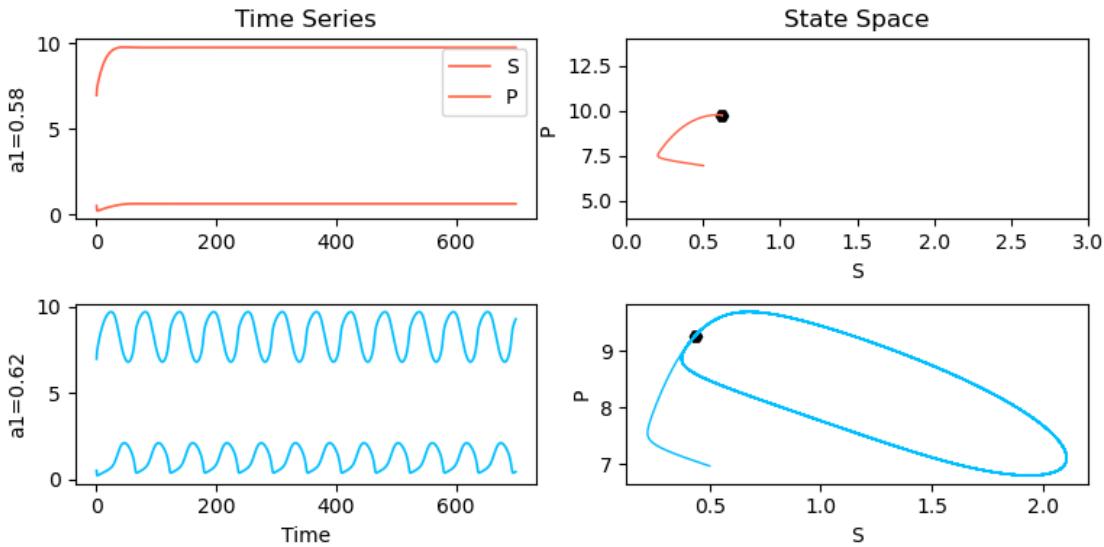
    ax[index, 0].plot(t, S, label='S', linewidth=1.2, color=colors[index])
    ax[index, 0].plot(t, P, label='P', linewidth=1.2, color=colors[index])
    ax[index, 1].scatter(S[-1], P[-1], c='k', marker='H')
    ax[index, 1].plot(S, P, linewidth=1, color=colors[index]);
    ax[index, 0].set_ylabel(f'a1={a1[index]}')

ax[1, 0].set_xlabel('Time')
ax[0, 0].legend()
ax[0, 0].set_title('Time Series')

ax[0, 1].set_xlabel('S')
ax[1, 1].set_xlabel('S')
ax[0, 1].set_ylabel('P')
ax[1, 1].set_ylabel('P')
ax[0, 1].set_title('State Space')
ax[0, 1].set_xlim(0, 3)
ax[0, 1].set_ylim(4, 14)

fig.tight_layout()

```



```
[3]: np.around((S[-1], P[-1]), 2)
```

```
[3]: array([0.44, 9.28])
```

2.2 State Space Nullclines

```
[4]: import plotly.graph_objects as go
from scipy.optimize import fsolve

# Oscillatory parameters
a1_fixed = 0.65

print("NULLCLINE ANALYSIS FOR OSCILLATORY SYSTEM")
print("*"*50)
print(f"b1={b1}, b2={b2}")
print(f"a1={a1_fixed}, a2={a2}")
print(f"k_max={k_max}, K_m={K_m}")
print(f"k_i={k_i}")
print(f"n={n}, m={m}, q={q}")
print()

def enzymatic_rate(S, P):
    """Enzymatic rate with forward and feedback inhibition"""
    return (k_max * S**n) / (K_m**m + S**m) / (1 + k_i * P**q)

def S_nullcline(S, P):
    """S-nullcline: dS/dt = 0 => a1 - b1*S = v(S,P)"""
    return a1_fixed - b1*S - enzymatic_rate(S, P)
```

```

def P_nullcline(S, P):
    """P-nullcline: dP/dt = 0 => a2 - b2*P = -v(S,P)"""
    return a2 - b2*P + enzymatic_rate(S, P)

# Compute S-nullcline: For each S, find P such that dS/dt = 0
print("Computing S-nullcline...")
S_values = np.linspace(0.1, 3, 300)
P_S_null = []

for S in S_values:
    def equation(P):
        return S_nullcline(S, P)

    try:
        # Try multiple initial guesses
        solutions = []
        for P_guess in [5.0, 6.0, 7.0, 8.0]:
            result = fsolve(equation, P_guess)
            if (result[0] > 0 and result[0] < 15 and
                abs(equation(result[0])) < 1e-6):
                solutions.append(result[0])

        # Remove duplicates and take the first valid solution
        if solutions:
            unique_solutions = []
            for sol in solutions:
                if not any(abs(sol - existing) < 0.1 for existing in
                           unique_solutions):
                    unique_solutions.append(sol)
            P_S_null.append(unique_solutions[0]) # Take first branch for
    ↵plotting
    else:
        P_S_null.append(np.nan)
    except:
        P_S_null.append(np.nan)

# Compute P-nullcline: For each S, find P such that dP/dt = 0
print("Computing P-nullcline...")
P_P_null = []

for S in S_values:
    def equation(P):
        return P_nullcline(S, P)

    try:
        # Try multiple initial guesses

```

```

    solutions = []
    for P_guess in [0.1, 1.0, 3.0, 5.0]:
        result = fsolve(equation, P_guess)
        if (result[0] > 0 and result[0] < 15 and
            abs(equation(result[0])) < 1e-6):
            solutions.append(result[0])

    # Remove duplicates and take the first valid solution
    if solutions:
        unique_solutions = []
        for sol in solutions:
            if not any(abs(sol - existing) < 0.1 for existing in
unique_solutions):
                unique_solutions.append(sol)
        P_P_null.append(unique_solutions[0]) # Take first branch for
plotting
    else:
        P_P_null.append(np.nan)
except:
    P_P_null.append(np.nan)

# Create the phase portrait
fig = go.Figure()

# Plot S-nullcline
valid_S_S = []
valid_P_S = []
for S, P in zip(S_values, P_S_null):
    if not np.isnan(P):
        valid_S_S.append(S)
        valid_P_S.append(P)

fig.add_trace(go.Scatter(x=valid_S_S, y=valid_P_S, mode='lines',
                        name='S-nullcline ( $dS/dt=0$ )',
                        line=dict(color='blue', width=2)))

# Plot P-nullcline
valid_S_P = []
valid_P_P = []
for S, P in zip(S_values, P_P_null):
    if not np.isnan(P):
        valid_S_P.append(S)
        valid_P_P.append(P)

fig.add_trace(go.Scatter(x=valid_S_P, y=valid_P_P, mode='lines',
                        name='P-nullcline ( $dP/dt=0$ )',
                        line=dict(color='red', width=2)))

```

```

# Find fixed points (intersections)
print("Finding fixed points...")
fixed_points = []

# Search in S-P space
S_search = np.linspace(0.01, 1.2, 50)
P_search = np.linspace(9, 11, 50)

for S_guess in S_search:
    for P_guess in P_search:
        def equations(vars):
            S, P = vars
            return [S_nullcline(S, P), P_nullcline(S, P)]

        try:
            result = fsolve(equations, [S_guess, P_guess])
            S_sol, P_sol = result

            # Check if valid solution
            residuals = equations([S_sol, P_sol])
            if (np.linalg.norm(residuals) < 1e-4 and
                S_sol > 0 and P_sol > 0 and
                S_sol <= 2 and P_sol <= 15):

                # Check if new
                is_new = True
                for existing in fixed_points:
                    if (abs(S_sol - existing[0]) < 0.1 and
                        abs(P_sol - existing[1]) < 0.1):
                        is_new = False
                        break

                if is_new:
                    fixed_points.append((S_sol, P_sol))
        except:
            continue

print(f"Found {len(fixed_points)} fixed point(s):")
for i, (S, P) in enumerate(fixed_points):
    print(f"  FP{i+1}: S = {S:.3f}, P = {P:.3f}")

# Plot fixed points
for i, (S, P) in enumerate(fixed_points):
    fig.add_trace(go.Scatter(x=[S], y=[P], mode='markers',
                             marker=dict(size=12, color='green', symbol='circle',
                                         line=dict(width=1, color='black'))),

```

```

        name=f'Fixed Point {i+1}')))

# Add a limit cycle from simulation to show oscillations
print("Adding limit cycle from simulation...")
from scipy.integrate import solve_ivp

def system_dynamics(t, variables):
    S, P = variables
    rate = enzymatic_rate(S, P)
    dSdt = a1_fixed - b1*S - rate
    dPdt = a2           - b2*P + rate
    return [dSdt, dPdt]

# Simulate to get limit cycle
sol = solve_ivp(system_dynamics, (0, 2000), [1.0, 1.0],
                 t_eval=np.linspace(0, 2000, 5000), method='RK45')

# Use only the last part to avoid transients
S_cycle = sol.y[0][-2000:]
P_cycle = sol.y[1][-2000:]

fig.add_trace(go.Scatter(x=S_cycle, y=P_cycle, mode='lines',
                         name='Oscillation',
                         line=dict(color='black', width=4)))

# Update layout
fig.update_layout(
    title="Nullclines and Limit Cycle for Oscillatory System",
    xaxis_title="Substrate Concentration S",
    yaxis_title="Product Concentration P",
    width=700,
    height=600,
    showlegend=True
)

fig.update_xaxes(range=[0, 3])
fig.update_yaxes(range=[6, 12])

fig.show()

# Mathematical analysis
print("\n" + "="*50)
print("MATHEMATICAL ANALYSIS")
print("=".*50)

print("Nullcline equations:")
print("S-nullcline: a - b · S = k_max · S/(K_m^3 + S^3) + 1/(1 + k_i · P^2)")

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print("P-nullcline: a - b · P = -k_max·S/(K_m³ + S³) + 1/(1 + k_i·P²)")
print()
print("Rearranged:")
print("S-nullcline: P = √[(k_max·S/((a - b · S)(K_m³ + S³)) - 1)/k_i]")
print("P-nullcline: P = [a + k_max·S/((K_m³ + S³)(1 + k_i·P²))]/b")
print()

if len(fixed_points) == 1:
    S_fp, P_fp = fixed_points[0]
    print(f"Single fixed point at: S = {S_fp:.3f}, P = {P_fp:.3f}")
    print("This is typical for oscillatory systems - an unstable fixed point")
    print("surrounded by a stable limit cycle!")

    # Check stability roughly by simulating nearby
    sol_test = solve_ivp(system_dynamics, (0, 50), [S_fp + 0.1, P_fp + 0.1],
                          t_eval=[0, 50], method='RK45')
    final_S, final_P = sol_test.y[0, -1], sol_test.y[1, -1]
    distance = np.sqrt((final_S - S_fp)**2 + (final_P - P_fp)**2)

    if distance > 0.5:
        print("Fixed point appears UNSTABLE (spiral source)")
    else:
        print("Fixed point appears STABLE")

print("\nThe purple limit cycle shows sustained oscillations around the fixed point!")

```

NULLCLINE ANALYSIS FOR OSCILLATORY SYSTEM
=====

b1=0.18, b2=0.05
a1=0.65, a2=0.02
k_max=25.0, K_m=0.7
k_i=0.06
n=1, m=3, q=3

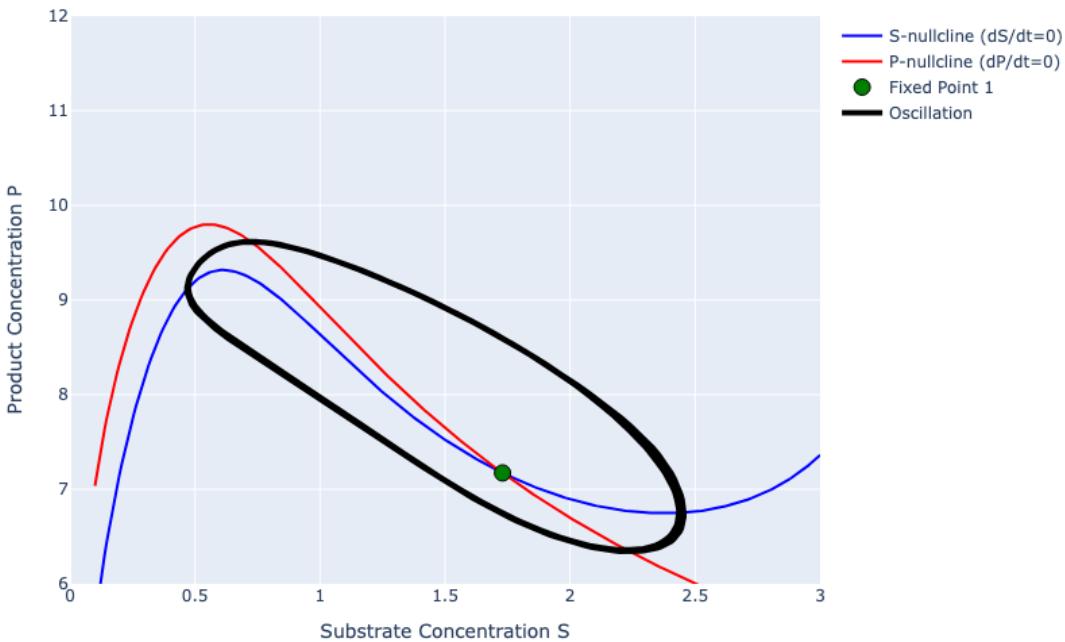
Computing S-nullcline...
Computing P-nullcline...
Finding fixed points...
Found 1 fixed point(s):
FP1: S = 1.730, P = 7.172

/var/folders/cs/lkcj7j890kv6kfxbk156w9h80000gn/T/ipykernel_77640/2912851335.py:1
29: RuntimeWarning:

The iteration is not making good progress, as measured by the improvement from the last ten iterations.

Adding limit cycle from simulation...

Nullclines and Limit Cycle for Oscillatory System



MATHEMATICAL ANALYSIS

Nullcline equations:

$$S\text{-nullcline: } a - b \cdot S = k_{\max} \cdot S / (K_m^3 + S^3) + 1 / (1 + k_i \cdot P^2)$$

$$P\text{-nullcline: } a - b \cdot P = -k_{\max} \cdot S / (K_m^3 + S^3) + 1 / (1 + k_i \cdot P^2)$$

Rearranged:

$$S\text{-nullcline: } P = \sqrt{[(k_{\max} \cdot S / ((a - b \cdot S)(K_m^3 + S^3)) - 1) / k_i]}$$

$$P\text{-nullcline: } P = [a + k_{\max} \cdot S / ((K_m^3 + S^3)(1 + k_i \cdot P^2))] / b$$

Single fixed point at: $S = 1.730$, $P = 7.172$

This is typical for oscillatory systems - an unstable fixed point surrounded by a stable limit cycle!

Fixed point appears STABLE

The purple limit cycle shows sustained oscillations around the fixed point!

[]:

2.3 Oscillation animation

```
[5]: import plotly.graph_objects as go

# Your model definition
def model(t, variables, a1, b1, a2, b2, k_max, K_m, k_i, n, m, q):
    """Coupled system with feedback inhibition"""
    S, P = variables

    enzymatic_rate = (k_max * S**n) / (K_m**m + S**m) / (1 + k_i * P**q)

    dSdt = a1 - b1 * S - enzymatic_rate
    dPdt = a2 - b2 * P + enzymatic_rate

    return [dSdt, dPdt]

# Parameters
S_0 = 1.97
P_0 = 6.97
b1, b2 = 0.18, 0.05
a1, a2 = 0.62, 0.02
k_max, K_m, k_i = 25.0, 0.7, 0.06
n, m, q = 1, 3, 3
t_span = (0, 700)

# Solve the ODE
t_eval = np.linspace(t_span[0], t_span[1], 1000) # Even fewer points for
    ↪stability
sol = solve_ivp(model, t_span, [S_0, P_0], args=(a1, b1, a2, b2, k_max, K_m,
    ↪k_i, n, m, q),
                t_eval=t_eval, method='RK45')

S_sol = sol.y[0]
P_sol = sol.y[1]
t_sol = sol.t

# Normalize for circle radii - using pixel units for shapes
min_radius, max_radius = 15, 40
S_radius = min_radius + (max_radius - min_radius) * (S_sol - np.min(S_sol)) / 
    ↪(np.max(S_sol) - np.min(S_sol))
P_radius = min_radius + (max_radius - min_radius) * (P_sol - np.min(P_sol)) / 
    ↪(np.max(P_sol) - np.min(P_sol))

# Fixed positions
S_pos = [-4, 0]
P_pos = [4, 0]
```

```

# Create the figure with shapes (much more stable than scatter plots)
fig = go.Figure()

# Create frames using shapes instead of scatter plots
frames = []
for i in range(len(t_sol)):
    frame_data = [
        # S circle as shape
        dict(
            type="circle",
            xref="x", yref="y",
            x0=S_pos[0] - S_radius[i]/20, # Divide by scaling factor
            y0=S_pos[1] - S_radius[i]/20,
            x1=S_pos[0] + S_radius[i]/20,
            y1=S_pos[1] + S_radius[i]/20,
            line_color="blue",
            fillcolor="blue",
            line_width=2,
            opacity=0.7
        ),
        # P circle as shape
        dict(
            type="circle",
            xref="x", yref="y",
            x0=P_pos[0] - P_radius[i]/20,
            y0=P_pos[1] - P_radius[i]/20,
            x1=P_pos[0] + P_radius[i]/20,
            y1=P_pos[1] + P_radius[i]/20,
            line_color="red",
            fillcolor="red",
            line_width=2,
            opacity=0.7
        ),
        # Arrow line
        dict(
            type="line",
            xref="x", yref="y",
            x0=S_pos[0] + S_radius[i]/20,
            y0=S_pos[1],
            x1=P_pos[0] - P_radius[i]/20,
            y1=P_pos[1],
            line=dict(color="green", width=4)
        ),
        # Arrow head
        dict(
            type="path",
            xref="x", yref="y",

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```

        path=f"M {P_pos[0] - P_radius[i]/20 - 0.3} {P_pos[1] - 0.2} L
        ↪{P_pos[0] - P_radius[i]/20} {P_pos[1]} L {P_pos[0] - P_radius[i]/20 - 0.3} ↪
        ↪{P_pos[1] + 0.2} Z",
        line_color="green",
        fillcolor="green"
    )
]

frame = go.Frame(
    data=[], # No scatter data
    layout=dict(
        shapes=frame_data,
        # annotations=text_annotations
    ),
    name=f'frame_{i}'
)
frames.append(frame)

# Add initial shapes
fig.add_shape(
    type="circle",
    xref="x", yref="y",
    x0=S_pos[0] - S_radius[0]/20,
    y0=S_pos[1] - S_radius[0]/20,
    x1=S_pos[0] + S_radius[0]/20,
    y1=S_pos[1] + S_radius[0]/20,
    line_color="blue",
    fillcolor="blue",
    line_width=2,
    opacity=0.7
)

fig.add_shape(
    type="circle",
    xref="x", yref="y",
    x0=P_pos[0] - P_radius[0]/20,
    y0=P_pos[1] - P_radius[0]/20,
    x1=P_pos[0] + P_radius[0]/20,
    y1=P_pos[1] + P_radius[0]/20,
    line_color="red",
    fillcolor="red",
    line_width=2,
    opacity=0.7
)

fig.add_shape(
    type="line",

```

```

        xref="x", yref="y",
        x0=S_pos[0] + S_radius[0]/20,
        y0=S_pos[1],
        x1=P_pos[0] - P_radius[0]/20,
        y1=P_pos[1],
        line=dict(color="green", width=4)
    )

fig.add_shape(
    type="path",
    xref="x", yref="y",
    path=f"M {P_pos[0]} - P_radius[0]/20 - 0.3} {P_pos[1]} - 0.2} L {P_pos[0]} - P_radius[0]/20} {P_pos[1]} L {P_pos[0]} - P_radius[0]/20 - 0.3} {P_pos[1]} + 0.2} Z",
    line_color="green",
    fillcolor="green"
)

# Add initial annotations
fig.add_annotation(
    x=S_pos[0],
    y=S_pos[1] - max(S_radius[0], P_radius[0])/15 - 0.8,
    # text=f"S: {S_sol[0]:.2f}",
    showarrow=False,
    font=dict(color="blue", size=12),
    xref="x",
    yref="y"
)

fig.add_annotation(
    x=P_pos[0],
    y=P_pos[1] - max(S_radius[0], P_radius[0])/15 - 0.8,
    # text=f"P: {P_sol[0]:.2f}",
    showarrow=False,
    font=dict(color="red", size=12),
    xref="x",
    yref="y"
)

# Configure animation
fig.frames = frames

# Animation controls
sliders = [dict(
    steps=[dict(
        method="animate",
        args=[[f'frame_{k}']],

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        dict(mode="immediate", frame=dict(duration=50, redraw=True),
              transition=dict(duration=0))],
        label=f'{t_sol[k]:.1f}' )
    ) for k in range(0, len(t_sol), 15)],
    active=0,
    currentvalue=dict(prefix="Time: ", visible=True),
    len=0.9,
    x=0.1,
    y=0
)

updatemenus = [dict(
    type="buttons",
    showactive=False,
    buttons=[
        dict(label="Play", method="animate",
            args=[None, dict(frame=dict(duration=50, redraw=True),
                             fromcurrent=True, mode="immediate")]),
        dict(label="Pause", method="animate",
            args=[[None], dict(frame=dict(duration=0, redraw=False),
                               mode="immediate")])
    ],
    x=0.1, y=-0.15,
    xanchor="right",
    yanchor="top"
)
]

# Update layout with FIXED ranges and no auto-scaling
fig.update_layout(
    title="Oscillating Reaction System",
    xaxis=dict(
        range=[-6, 6], # Fixed range
        showticklabels=False,
        showgrid=True,
        gridcolor="lightgray",
        zeroline=False,
        fixedrange=True, # Prevent any scaling
        constrain="domain"
    ),
    yaxis=dict(
        range=[-3, 3], # Fixed range
        showticklabels=False,
        showgrid=True,
        gridcolor="lightgray",
        zeroline=False,
        fixedrange=True, # Prevent any scaling
        scaleanchor="x",

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    scaleratio=1
),
plot_bgcolor="white",
width=800,
height=500,
showlegend=False,
sliders=sliders,
updatemenus=updatemenus,
# Critical: disable all auto-scaling and layout recalculations
autosize=False,
margin=dict(l=50, r=50, t=80, b=80)
)

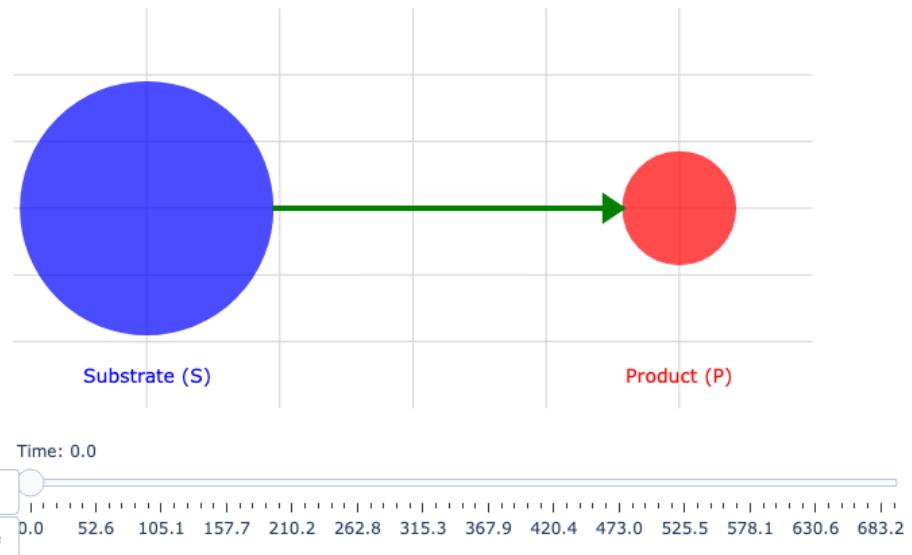
# Add static labels
fig.add_annotation(
    x=S_pos[0], y=-2.5,
    text="Substrate (S)",
    showarrow=False,
    font=dict(color="blue", size=14),
    xref="x",
    yref="y"
)

fig.add_annotation(
    x=P_pos[0], y=-2.5,
    text="Product (P)",
    showarrow=False,
    font=dict(color="red", size=14),
    xref="x",
    yref="y"
)

fig.show()

```

Oscillating Reaction System



[]: