🔦 Advanced Senescence Model - Crop Physiologist Expert Guide

Physiological Foundation: Understanding Plant Senescence

Senescence: The Programmed Aging Process

As a crop physiologist, understanding senescence is crucial because it represents one of the most sophisticated regulatory mechanisms in plant biology. Senescence isn't simply "dying" - it's an active, genetically programmed process that allows plants to recycle valuable nutrients from aging tissues to support continued growth and reproduction.

The Evolutionary Logic of Senescence

From an evolutionary perspective, senescence makes perfect sense. Plants have evolved this mechanism to:

- 1. Maximize Resource Efficiency: Rather than maintaining old, less productive leaves, plants actively dismantle them and relocate the nutrients to more productive sinks
- 2. Adaptive Response to Stress: Under limiting conditions, senescence allows plants to "cut their losses" and focus resources on survival
- 3. Reproductive Success: During reproduction, senescence helps redirect nutrients from vegetative tissues to developing seeds
- 4. Seasonal Adaptation: Annual plants use senescence to complete their life cycle before adverse seasons

The Molecular Machinery of Senescence

The senescence process involves a complex cascade of molecular events:

1. Initiation Signals

- Age-related factors: Telomere shortening, accumulated damage
- Environmental triggers: Stress hormones (ABA, ethylene), nutrient limitation
- **Developmental cues**: Reproductive hormones, circadian rhythms

2. Transcriptional Reprogramming

- Senescence-associated genes (SAGs): Over 3000 genes change expression
- Transcription factors: NAC, WRKY, MYB families orchestrate the process
- **MicroRNAs**: Fine-tune gene expression during senescence

3. Metabolic Reorganization

- Catabolism activation: Proteases, nucleases, lipases increase dramatically
- Anabolism shutdown: Photosynthesis, protein synthesis decline
- Transport enhancement: Nutrient export machinery upregulated

Physiological Triggers and Mechanisms

Age-Related Senescence: The Biological Clock

python	

```
def calculate_chronological_senescence(leaf_age_days, leaf_lifespan_gdd,
                    current_thermal_time, physiological_age_factors):
  Model age-related senescence based on chronological and physiological aging
  Physiological Basis:
  - Leaves have genetically determined lifespans
  - Aging involves accumulation of cellular damage
  - Repair mechanisms become less efficient over time
  - Metabolic efficiency declines with age
  # Chronological age component
  chronological_age = leaf_age_days / 60.0 # Normalize to ~2 month lifespan
  # Thermal time accumulation (more mechanistic)
  thermal_age = current_thermal_time / leaf_lifespan_gdd
  # Physiological aging factors
  cellular_damage = calculate_cellular_damage_accumulation(leaf_age_days)
  metabolic_decline = calculate_metabolic_efficiency_decline(leaf_age_days)
  repair_capacity = calculate_repair_system_efficiency(leaf_age_days)
  # Integrated physiological age
  physiological_age = (
    0.3 * chronological_age +
    0.4 * thermal_age +
    0.1 * cellular_damage +
    0.1 * metabolic_decline +
    0.1 * (1.0 - repair_capacity)
  # Senescence onset threshold
  senescence_threshold = 0.7 # Begin senescence at 70% of lifespan
  if physiological_age >= senescence_threshold:
    # Sigmoid senescence progression
    relative_age = (physiological_age - senescence_threshold) / (1.0 - senescence_threshold)
    senescence_rate = 1.0 / (1.0 + \text{math.exp}(-10 * (relative_age - 0.5)))
  else:
    senescence_rate = 0.0
  return {
```

```
'physiological_age': physiological_age,
    'senescence_rate': senescence_rate,
    'cellular_damage_level': cellular_damage,
    'metabolic_efficiency': 1.0 - metabolic_decline,
    'repair_capacity': repair_capacity,
    'days_to_complete_senescence': estimate_senescence_duration(senescence_rate)
def calculate_cellular_damage_accumulation(leaf_age_days):
  Model accumulation of cellular damage over time
  Damage Sources:
  - Reactive oxygen species (ROS) from photosynthesis
  - UV radiation damage to proteins and membranes
  - Mechanical stress and herbivore damage
  - Temperature extremes
  # Base damage accumulation rate
  base_damage_rate = 0.002 # 0.2% per day
  # Age-dependent acceleration (repair systems decline)
  age_factor = 1.0 + 0.001 * leaf_age_days
  # Cumulative damage (bounded between 0 and 1)
  cumulative_damage = min(1.0, base_damage_rate * leaf_age_days * age_factor)
  return cumulative_damage
def calculate_metabolic_efficiency_decline(leaf_age_days):
  0.00
  Model decline in metabolic efficiency with age
  Mechanisms:
  - Protein aggregation and misfolding
  - Membrane lipid peroxidation
  - Enzyme activity decline
  - Mitochondrial dysfunction
  # Metabolic efficiency follows exponential decay
  half_life = 45.0 # Days for 50% efficiency loss
  decay_constant = math.log(2) / half_life
```

efficiency_decline = 1.0 - math.exp(-decay_constant * leaf_age_days)	
return min(0.8, efficiency_decline) # Maximum 80% decline	

Stress-Induced Senescence: The Emergency Response

python	

```
def calculate_stress_induced_senescence(stress_factors, stress_duration,
                     plant_resource_status, leaf_hierarchy):
  Model stress-induced senescence responses
  Physiological Rationale:
  Stress-induced senescence is an adaptive mechanism that allows plants to:
  1. Reduce transpiration surface (water stress)
  2. Recycle nutrients from expendable tissues (nutrient stress)
  3. Reduce metabolic burden (temperature stress)
  4. Reallocate resources to survival-critical organs
  # Stress sensitivity varies by stress type and plant condition
  stress_sensitivities = {
    'water_stress': 0.8, # High sensitivity (immediate survival threat)
    'nitrogen_stress': 0.9, # Very high (nutrient conservation critical)
    'phosphorus_stress': 0.7, # High (growth limitation)
    'temperature_stress': 0.6, # Moderate (acclimation possible)
    'light_stress': 0.5,  # Lower (shade adaptation possible)
    'salt_stress': 0.8 # High (ion toxicity and osmotic stress)
  # Calculate weighted stress impact
  total_stress_impact = 0.0
  for stress_type, stress_level in stress_factors.items():
    if stress_type in stress_sensitivities:
      sensitivity = stress_sensitivities[stress_type]
      # Duration effect (chronic stress more damaging)
      duration_factor = calculate_stress_duration_factor(
         stress_duration.get(stress_type, 0), stress_type
      # Resource status modulates stress response
      resource_factor = calculate_resource_modulation(
         plant_resource_status, stress_type
      stress_impact = stress_level * sensitivity * duration_factor * resource_factor
      total_stress_impact += stress_impact
```

Leaf hierarchy determines senescence priority

```
senescence_priority = calculate_leaf_senescence_priority(
    leaf_hierarchy, total_stress_impact
  # Stress-induced senescence rate
  if total_stress_impact > 0.3: # Threshold for stress senescence
    excess_stress = total_stress_impact - 0.3
    stress_senescence_rate = min(0.8, 2.0 * excess_stress) # Rapid response
  else:
    stress_senescence_rate = 0.0
  return {
    'stress_senescence_rate': stress_senescence_rate,
    'total_stress_impact': total_stress_impact,
    'senescence_priority': senescence_priority.
    'resource_conservation_benefit': estimate_resource_conservation(stress_senescence_rate),
    'survival_advantage': assess_survival_advantage(total_stress_impact, stress_senescence_rate)
def calculate_stress_duration_factor(duration_days, stress_type):
  0.00
  Calculate how stress duration affects senescence induction
  Acute vs Chronic Stress Responses:
  - Acute stress: Immediate protective responses
  - Chronic stress: Progressive tissue sacrifice
  0.00
  stress_kinetics = {
    'water_stress': {'fast_response': 1, 'chronic_threshold': 5},
    'nitrogen_stress': {'fast_response': 3, 'chronic_threshold': 10},
    'temperature_stress': {'fast_response': 2, 'chronic_threshold': 7},
    'salt_stress': {'fast_response': 2, 'chronic_threshold': 8}
  kinetics = stress_kinetics.get(stress_type, {'fast_response': 2, 'chronic_threshold': 7})
  if duration_days <= kinetics['fast_response']:</pre>
    # Acute phase - minimal senescence induction
    return 0.3
  elif duration_days <= kinetics['chronic_threshold']:</pre>
    # Transition phase - increasing senescence
    transition_progress = (duration_days - kinetics['fast_response']) / (
      kinetics['chronic_threshold'] - kinetics['fast_response']
```

```
return 0.3 + 0.7 * transition_progress
    # Chronic phase - full senescence induction
    return 1.0
def calculate_leaf_senescence_priority(leaf_hierarchy, stress_level):
  Determine which leaves senesce first under stress
  Physiological Hierarchy (from most to least expendable):
  1. Old, shaded lower leaves (low photosynthetic contribution)
  2. Damaged or diseased leaves (metabolic burden)
  3. Mature outer leaves (moderate photosynthetic activity)
  4. Young expanding leaves (high sink activity)
  5. Meristematic tissues (growth points - highest priority)
  priority_scores = {}
  for leaf_id, leaf_characteristics in leaf_hierarchy.items():
    age_factor = leaf_characteristics['age_days'] / 60.0 # Older = higher priority
    position_factor = 1.0 - leaf_characteristics['canopy_position'] # Lower = higher priority
    damage_factor = leaf_characteristics.get('damage_level', 0.0) # Damaged = higher priority
    photosynthetic_value = leaf_characteristics['light_level'] * leaf_characteristics['leaf_area']
    # Calculate expendability score (higher = more expendable)
    expendability = (
       0.4 * age_factor +
      0.3 * position_factor +
       0.2 * damage_factor +
       0.1 * (1.0 - photosynthetic_value)
    # Stress level modulates how selective the plant is
    if stress_level > 0.7: # Severe stress - less selective
       selection_pressure = 0.3
    elif stress_level > 0.4: # Moderate stress - moderately selective
       selection_pressure = 0.6
    else: # Mild stress - highly selective
       selection_pressure = 0.9
    # Only leaves above selection threshold are targeted
    if expendability > selection_pressure:
```

priority_scores[leaf_id] = expendability	
return priority_scores	

Nutrient Remobilization: The Recycling Process

The Biochemistry of Nutrient Recovery

python		

```
def calculate_nutrient_remobilization_efficiency(leaf_tissue_composition,
                           senescence_stage, environmental_conditions):
  Model nutrient remobilization during senescence
  Physiological Process:
  1. Protein degradation by proteases (especially RuBisCO breakdown)
  2. Chlorophyll breakdown and nitrogen recovery
  3. Nucleic acid catabolism
  4. Membrane lipid breakdown
  5. Transport of mobile nutrients via phloem
  The efficiency depends on:
  - Nutrient mobility (N, P, K mobile; Ca, Fe immobile)
  - Environmental conditions (temperature, water status)
  - Sink demand (growing tissues create strong pull)
  - Plant health status
  # Nutrient-specific remobilization characteristics
  nutrient_mobility = {
    'nitrogen': {
      'max_efficiency': 0.80, # Up to 80% recoverable
      'breakdown_sources': ['proteins', 'chlorophyll', 'nucleic_acids'],
      'transport_form': 'amino_acids',
      'rate_limiting_step': 'protein_degradation'
    },
    'phosphorus': {
      'max_efficiency': 0.70, # 70% recoverable
      'breakdown_sources': ['nucleic_acids', 'phospholipids', 'phosphoproteins'],
      'transport_form': 'phosphate',
      'rate_limiting_step': 'membrane_breakdown'
    },
    'potassium': {
      'max_efficiency': 0.90, # Very mobile
      'breakdown_sources': ['cytoplasm', 'vacuole'],
      'transport_form': 'K_ion',
      'rate_limiting_step': 'transport_capacity'
    },
    'calcium': {
      'max_efficiency': 0.10, # Mostly immobile
      'breakdown_sources': ['cell_walls'],
       'transport_form': 'limited',
```

```
'rate_limiting_step': 'structural_binding'
  },
  'magnesium': {
    'max_efficiency': 0.60, # Moderately mobile
    'breakdown_sources': ['chlorophyll', 'enzymes'],
    'transport_form': 'Mg_ion',
    'rate_limiting_step': 'chlorophyll_breakdown'
remobilization_results = {}
for nutrient, content in leaf_tissue_composition.items():
  if nutrient in nutrient_mobility:
    mobility_params = nutrient_mobility[nutrient]
    # Base remobilization efficiency
    base_efficiency = mobility_params['max_efficiency']
    # Environmental modifiers
    temp_factor = calculate_temperature_effect_on_remobilization(
       environmental_conditions.get('temperature', 22), nutrient
    water_factor = calculate_water_status_effect_on_remobilization(
      environmental_conditions.get('water_status', 1.0)
    # Senescence stage effect
    stage_factor = calculate_senescence_stage_efficiency(senescence_stage, nutrient)
    # Sink demand effect
    sink_demand_factor = environmental_conditions.get('sink_demand', 0.5)
    # Actual remobilization efficiency
    actual_efficiency = (
      base_efficiency *
      temp_factor *
      water_factor *
      stage_factor *
       (0.5 + 0.5 * sink_demand_factor) # Sink demand enhances remobilization
    # Calculate remobilized amount
```

```
remobilized_amount = content * actual_efficiency
      remaining_amount = content - remobilized_amount
      remobilization_results[nutrient] = {
         'original_content': content,
         'remobilized_amount': remobilized_amount.
         'remaining_content': remaining_amount,
         'remobilization_efficiency': actual_efficiency,
         'transport_form': mobility_params['transport_form'],
         'rate_limiting_process': mobility_params['rate_limiting_step']
  # Calculate overall remobilization efficiency
  total_original = sum(leaf_tissue_composition.values())
  total_remobilized = sum(r['remobilized_amount'] for r in remobilization_results.values())
  overall_efficiency = total_remobilized / total_original if total_original > 0 else 0
  return {
    'nutrient_specific_results': remobilization_results,
    'overall_efficiency': overall_efficiency,
    'total_nutrients_recovered': total_remobilized,
    'environmental_limitations': assess_remobilization_limitations(environmental_conditions)
  }
def calculate_temperature_effect_on_remobilization(temperature, nutrient):
  Temperature effects on remobilization processes
  Physiological Mechanisms:
  - Enzyme activity (Q10 response for proteases, nucleases)
  - Membrane fluidity (affects transport)
  - Phloem transport rate (temperature-dependent viscosity)
  # Optimal temperature for remobilization processes
  optimal_temp = 25.0 # °C
  if 15 <= temperature <= 30:
    # Normal range - Q10 response
    q10 = 2.2 # Typical for enzymatic processes
    temp_factor = q10 ** ((temperature - optimal_temp) / 10)
  elif temperature < 15:
    # Cold limitation - membrane rigidity, slow transport
    temp_factor = 0.3 + 0.05 * temperature
```

```
else: # temperature > 30
    # Heat stress - enzyme denaturation, membrane disruption
    temp_factor = max(0.2, 1.5 - 0.03 * (temperature - 30))
  return min(1.5, max(0.2, temp_factor))
def calculate_senescence_stage_efficiency(senescence_stage, nutrient):
  How remobilization efficiency changes through senescence stages
  Senescence Stages:
  1. Initiation (0-20%): Setup of degradation machinery
  2. Active degradation (20-70%): Peak remobilization
  3. Late senescence (70-90%): Declining efficiency
  4. Death (90-100%): Minimal additional remobilization
  if senescence_stage < 0.2: # Initiation
    return 0.3 # Low efficiency, machinery still developing
  elif senescence_stage < 0.7: # Active phase
    # Peak efficiency during active degradation
    progress_in_active = (senescence_stage - 0.2) / 0.5
    return 0.3 + 0.7 * (1.0 - (progress_in_active - 0.5) ** 2) # Parabolic peak
  elif senescence_stage < 0.9: # Late senescence
    # Declining efficiency
    late_progress = (senescence_stage - 0.7) / 0.2
    return 0.8 * (1.0 - late_progress)
  else: # Death phase
    return 0.1 # Minimal remobilization possible
```

Hormonal Control of Senescence

python

```
def calculate_hormonal_regulation_of_senescence(hormone_levels, tissue_sensitivity):
  0.00
  Model hormonal control of senescence initiation and progression
  Key Hormones in Senescence:
  1. ETHYLENE: Primary senescence promoter
    - Induces senescence-associated genes
    - Promotes chlorophyll breakdown
   - Enhances proteolysis
  2. ABSCISIC ACID (ABA): Stress-induced senescence
    - Responds to water/salt stress
    - Promotes stomatal closure and senescence
    - Interacts with ethylene pathway
  3. CYTOKININS: Senescence inhibitors
   - Maintain cellular activity
   - Delay protein degradation
   - Promote sink activity
  4. AUXINS: Context-dependent effects
   - High levels delay senescence
   - Redistribution affects sink-source relationships
  5. GIBBERELLINS: Developmental regulation
    - Coordinate with developmental programs
   - Interact with nutrient status
  # Hormone effects on senescence rate
  hormone_effects = {
    'ethylene': {
      'effect_type': 'promoter',
      'sensitivity': tissue_sensitivity.get('ethylene', 1.0),
      'saturation_level': 0.8, # \muL L<sup>-1</sup>
      'response_curve': 'sigmoidal'
    },
    'aba': {
      'effect_type': 'promoter',
      'sensitivity': tissue_sensitivity.get('aba', 0.8),
       'saturation_level': 10.0, #μΜ
```

'response_curve': 'linear'

```
'cytokinin': {
    'effect_type': 'inhibitor',
    'sensitivity': tissue_sensitivity.get('cytokinin', 1.2),
    'saturation_level': 1.0, #μΜ
    'response_curve': 'saturating'
  },
  'auxin': {
    'effect_type': 'inhibitor',
    'sensitivity': tissue_sensitivity.get('auxin', 0.6),
    'saturation_level': 0.5, #μΜ
    'response_curve': 'bell_shaped'
# Calculate individual hormone effects
senescence_promotion = 0.0
senescence_inhibition = 0.0
for hormone, level in hormone_levels.items():
  if hormone in hormone_effects:
    effect_params = hormone_effects[hormone]
    sensitivity = effect_params['sensitivity']
    saturation = effect_params['saturation_level']
    # Calculate normalized hormone effect
    if effect_params['response_curve'] == 'sigmoidal':
       # Ethylene-type response
       normalized_effect = level / (level + saturation/2)
       hormone_effect = sensitivity * normalized_effect
    elif effect_params['response_curve'] == 'linear':
       # ABA-type response
       hormone_effect = sensitivity * min(1.0, level / saturation)
    elif effect_params['response_curve'] == 'saturating':
       # Cytokinin-type response
       hormone_effect = sensitivity * (1.0 - math.exp(-level / saturation))
    else: # bell_shaped for auxin
       optimal_level = saturation / 2
       if level <= optimal_level:</pre>
         hormone_effect = sensitivity * (level / optimal_level)
         hormone_effect = sensitivity * (2 - level / optimal_level)
       hormone_effect = max(0, hormone_effect)
```

```
# Apply to appropriate category
      if effect_params['effect_type'] == 'promoter':
         senescence_promotion += hormone_effect
      else: # inhibitor
        senescence_inhibition += hormone_effect
  # Net hormonal effect on senescence
  net_hormonal_effect = senescence_promotion / (1.0 + senescence_inhibition)
  # Hormone interaction effects
  interaction_effects = calculate_hormone_interactions(hormone_levels)
  return {
    'senescence_promotion': senescence_promotion,
    'senescence_inhibition': senescence_inhibition,
    'net_effect': net_hormonal_effect,
    'hormone_interactions': interaction_effects,
    'dominant_signal': determine_dominant_hormone_signal(hormone_levels, hormone_effects)
  }
def calculate_hormone_interactions(hormone_levels):
  Model known hormone interactions affecting senescence
  Key Interactions:
  1. Ethylene-Cytokinin antagonism
  2. ABA-Cytokinin interaction
  3. Ethylene-ABA synergism under stress
  interactions = {}
  # Ethylene-Cytokinin antagonism
  if 'ethylene' in hormone_levels and 'cytokinin' in hormone_levels:
    eth_level = hormone_levels['ethylene']
    cyt_level = hormone_levels['cytokinin']
    # Competitive interaction
    interaction_strength = (eth_level * cyt_level) / (eth_level + cyt_level + 0.1)
    interactions['ethylene_cytokinin_antagonism'] = interaction_strength
  # Ethylene-ABA synergism
  if 'ethylene' in hormone_levels and 'aba' in hormone_levels:
    eth_level = hormone_levels['ethylene']
```

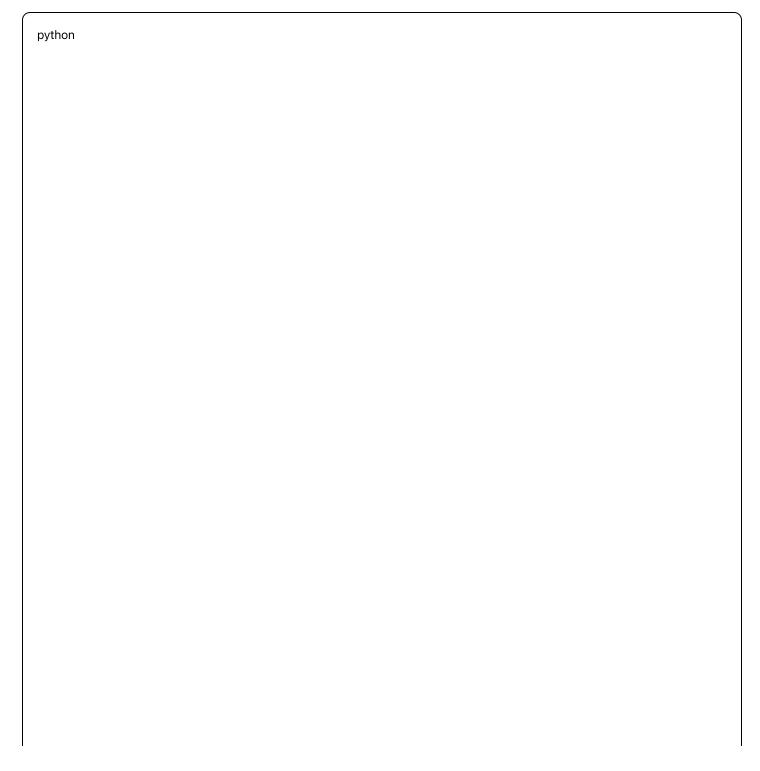
```
aba_level = hormone_levels['aba']

# Synergistic interaction under stress
synergism = math.sqrt(eth_level * aba_level) * 0.5
interactions['ethylene_aba_synergism'] = synergism

return interactions
```

Solution Practical Applications for Crop Management

Optimizing Harvest Timing Through Senescence Prediction



```
def predict_optimal_harvest_window(current_senescence_state, environmental_forecast,
                  quality_requirements, market_considerations):
  Use senescence modeling to optimize harvest timing for lettuce
  Considerations:
  1. QUALITY: Before significant senescence reduces appearance/nutrition
  2. YIELD: Maximum biomass accumulation
  3. SHELF LIFE: Post-harvest longevity
  4. MARKET TIMING: Price optimization
  5. RESOURCE EFFICIENCY: Space turnover for next crop
  # Current senescence assessment
  current_quality_score = assess_lettuce_quality_from_senescence(current_senescence_state)
  # Simulate senescence progression
  forecast_days = 14 # 2-week forecast window
  harvest_windows = []
  for day in range(forecast_days):
    # Project senescence state
    daily_conditions = environmental_forecast.get(day, {})
    projected_senescence = simulate_daily_senescence_progression(
      current_senescence_state, daily_conditions, day
    # Assess quality metrics
    visual_quality = calculate_visual_quality_score(projected_senescence)
    nutritional_quality = calculate_nutritional_quality_score(projected_senescence)
    shelf_life_potential = calculate_post_harvest_longevity(projected_senescence)
    # Overall quality score
    quality_score = (
      0.4 * visual_quality +
      0.3 * nutritional_quality +
      0.3 * shelf_life_potential
    # Check if quality meets requirements
    if quality_score >= quality_requirements['minimum_quality']:
      harvest_windows.append({
         'day': day,
```

```
'quality_score': quality_score,
         'visual_quality': visual_quality,
         'nutritional_quality': nutritional_quality,
         'shelf_life_days': shelf_life_potential * 14, # Convert to days
         'senescence_level': projected_senescence['overall_senescence'],
         'recommendation': assess_harvest_recommendation(quality_score, day)
      })
  # Find optimal harvest day
  if harvest_windows:
    optimal_harvest = max(harvest_windows, key=lambda x: x['quality_score'])
    return {
      'optimal_harvest_day': optimal_harvest['day'],
       'quality_at_optimal': optimal_harvest['quality_score'],
       'harvest_window': harvest_windows,
       'quality_trajectory': [h['quality_score'] for h in harvest_windows],
      'management_recommendations': generate_harvest_management_recommendations(optimal_harvest)
  else:
    return {
      'status': 'quality_below_threshold',
      'immediate_harvest_required': True,
      'expected_quality_loss': 'significant'
    }
def assess_lettuce_quality_from_senescence(senescence_state):
  Translate senescence metrics into lettuce quality parameters
  Quality Factors Affected by Senescence:
  1. Visual appeal: Yellowing, wilting, tip burn
  2. Texture: Firmness, crispness
  3. Flavor: Bitterness, off-flavors
  4. Nutrition: Vitamin C, antioxidants, nitrates
  # Visual quality (most important for market acceptance)
  chlorophyll_retention = 1.0 - senescence_state.get('chlorophyll_breakdown', 0)
  leaf_turgor = 1.0 - senescence_state.get('water_loss', 0)
  tissue_integrity = 1.0 - senescence_state.get('membrane_damage', 0)
  visual_score = (
    0.5 * chlorophyll_retention + # Green color retention
```

```
0.3 * leaf_turgor + # Crispness/firmness
    0.2 * tissue_integrity # Structural integrity
  # Nutritional quality
  vitamin_c_retention = calculate_vitamin_c_retention(senescence_state)
  antioxidant_levels = calculate_antioxidant_levels(senescence_state)
  nitrate_levels = calculate_nitrate_accumulation(senescence_state)
  nutritional_score = (
    0.4 * vitamin_c_retention +
    0.3 * antioxidant_levels +
    0.3 * (1.0 - nitrate_levels) # Lower nitrates = better
  # Flavor quality
  bitterness_level = calculate_bitterness_from_senescence(senescence_state)
  sweetness_retention = 1.0 - senescence_state.get('sugar_breakdown', 0)
  flavor_score = (
    0.6 * (1.0 - bitterness_level) +
    0.4 * sweetness_retention
  # Overall quality assessment
  overall_quality = (
    0.5 * visual_score + # Visual most important
    0.3 * nutritional_score +
    0.2 * flavor_score
  return {
    'overall_quality': overall_quality,
    'visual_quality': visual_score,
    'nutritional_quality': nutritional_score,
    'flavor_quality': flavor_score,
    'quality_grade': classify_quality_grade(overall_quality)
def classify_quality_grade(quality_score):
  """Classify lettuce into commercial quality grades"""
  if quality_score >= 0.9:
    return 'Premium'
  elif quality_score >= 0.8:
```

```
return 'Grade A'
elif quality_score >= 0.7:
    return 'Grade B'
elif quality_score >= 0.6:
    return 'Processing Grade'
else:
    return 'Below Standard'
```

Senescence-Based Nutrient Management

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```
def optimize_nutrient_management_for_senescence_control(growth_stage, senescence_risk_factors,
                             production_goals):
  Optimize nutrient management to control senescence timing and maximize quality
  Nutrient Effects on Senescence:
  1. NITROGEN:
   - Deficiency accelerates senescence
   - Excess delays senescence but may reduce quality
   - Optimal timing of reduction can improve harvest quality
  2. PHOSPHORUS:
   - Deficiency causes premature senescence
   - Adequate P maintains membrane integrity
  3. POTASSIUM:
   - Critical for osmotic regulation
   - Deficiency increases stress-induced senescence
  4. CALCIUM:
   - Structural stability
   - Deficiency causes tip burn and early senescence
  0.00
  # Assess current senescence risk
  risk_assessment = assess_senescence_risk(senescence_risk_factors)
  # Stage-specific nutrient strategies
  if growth_stage in ['early_vegetative', 'mid_vegetative']:
    # Growth phase - prevent premature senescence
    strategy = {
      'nitrogen': {
         'target_concentration': 150, # ppm NO3-N
        'strategy': 'maintain_high',
        'rationale': 'Prevent N-deficiency senescence during rapid growth'
      },
      'phosphorus': {
         'target_concentration': 40, # ppm P
        'strategy': 'adequate_supply',
        'rationale': 'Maintain membrane integrity and energy metabolism'
```

'potassium': {

```
'target_concentration': 200, # ppm K
       'strategy': 'high_supply',
       'rationale': 'Support rapid growth and stress resistance'
elif growth_stage == 'head_formation':
  # Head development - optimize for quality
  strategy = {
    'nitrogen': {
       'target_concentration': 120, # Reduced N
       'strategy': 'controlled_reduction',
       'rationale': 'Reduce nitrate accumulation while maintaining growth'
     'phosphorus': {
       'target_concentration': 35,
       'strategy': 'maintain_adequate',
       'rationale': 'Support continued cell division in head'
     'potassium': {
       'target_concentration': 180,
       'strategy': 'maintain_high',
      'rationale': 'Critical for head firmness and shelf life'
elif growth_stage == 'pre_harvest':
  # Final weeks - optimize for quality and shelf life
  strategy = {
    'nitrogen': {
       'target_concentration': 80, #Further reduction
       'strategy': 'strategic_reduction',
       'rationale': 'Minimize nitrate levels, trigger natural senescence'
    'phosphorus': {
       'target_concentration': 30,
       'strategy': 'maintenance_only',
       'rationale': 'Maintain cell membrane stability'
     'potassium': {
       'target_concentration': 160,
       'strategy': 'maintain_moderate',
       'rationale': 'Maintain quality while allowing natural maturation'
```

```
# Risk-based modifications
  if risk_assessment['water_stress_risk'] == 'high':
    # Increase K for osmotic adjustment
    strategy['potassium']['target_concentration'] *= 1.2
  if risk_assessment['temperature_stress_risk'] == 'high':
    # Maintain higher N for stress proteins
    strategy['nitrogen']['target_concentration'] *= 1.1
  if risk_assessment['premature_senescence_risk'] == 'high':
    # Increase all nutrients to delay senescence
    for nutrient in strategy:
      strategy[nutrient]['target_concentration'] *= 1.15
  return {
    'nutrient_strategy': strategy,
    'implementation_timeline': generate_implementation_timeline(strategy, growth_stage),
    'monitoring_parameters': define_monitoring_parameters(strategy),
    'expected_outcomes': predict_strategy_outcomes(strategy, risk_assessment)
def assess_senescence_risk(risk_factors):
  """Assess risk of premature or delayed senescence"""
  # Risk factor weights
  risk_weights = {
    'nutrient_deficiency': 0.3,
    'water_stress': 0.25,
    'temperature_stress': 0.2,
    'light_stress': 0.15,
    'plant_density': 0.1
  # Calculate weighted risk scores
  risk_scores = {}
  for factor, weight in risk_weights.items():
    factor_level = risk_factors.get(factor, 0.0)
    risk_scores[factor] = factor_level * weight
  total_risk = sum(risk_scores.values())
  # Classify risk levels
```

```
if total_risk < 0.3:
    risk_level = 'low'
elif total_risk < 0.6:
    risk_level = 'moderate'
else:
    risk_level = 'high'

return {
    'total_risk_score': total_risk,
    'risk_level': risk_level,
    'individual_risks': risk_scores,
    'primary_risk_factor': max(risk_scores.items(), key=lambda x: x[1])[0]
}</pre>
```

This advanced senescence model enables precise control of leaf aging processes, optimizing both crop quality and resource efficiency through science-based understanding of the underlying physiological mechanisms.