

# ICEACE Agent-based Simulation Model

(Adaptive monetary and fiscal policies to promote investment  
in an agent-based model)

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# ICEACE Project

- Home: <http://iceace.github.io/home>
- Matlab: <http://iceace.github.io/MATLAB>
- FLAME: <http://iceace.github.io/FLAME>

# ICEACE Model

- Agent Types:
  - Household
  - Firm
  - Bank
  - Equity Fund
  - Central Bank
  - Government
- Markets:
  - Labour Market
  - Production Markets (Consumption Goods, Housing Units)
  - Consumption Goods Market
  - Housing Market
  - Credit Market
- Communication Schemes:
  - Direct Messaging
  - Balance Sheet Flows
  - Agent-Agent Links

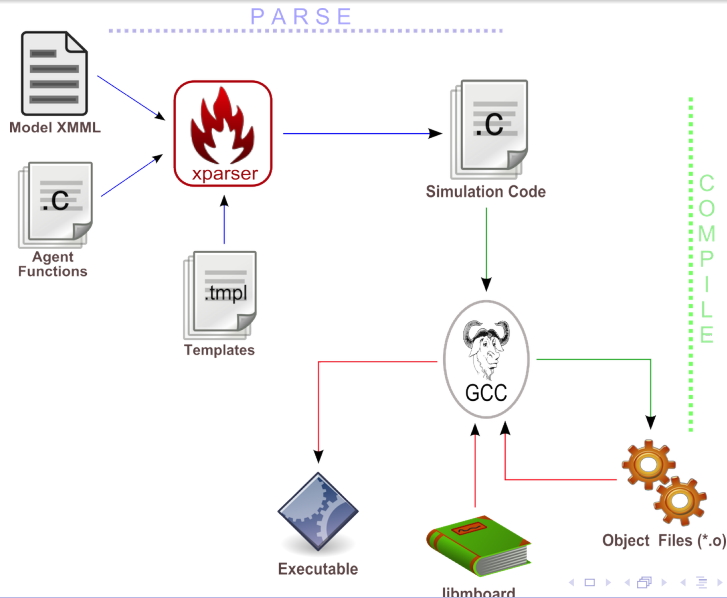
# Multi-agent Design Challenges

- Agents
  - Role Multiplicity
  - Beliefs, Desires, Intentions
  - Autonomy
- Environment
  - Context
  - Influence
- Communication
- Scalability
- Initialization

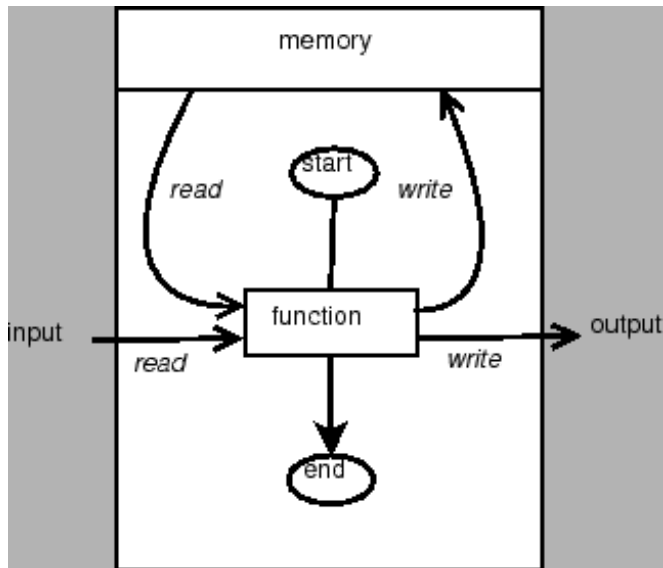
# ICEACE Implementation Choices (FLAME)

- Distributed Computing
  - XMachine
- Object Oriented Programming Paradigm
  - XMachine Markup Language (XMML)
- Message Passing
  - Message Boards (Broadcasting)
  - Message Filtering (Links)
- Synchronization
  - Time Units: Day (1), Week (5xD), Month (4xW), Quarter (3xM), Year (12xM)
- Acyclic Dependencies
  - Exclusive State Transitions
- High Performance Computing
  - MPI Protocol
- Initialization
  - Pythonic Agent Initialization Description Language (PyAIDL)

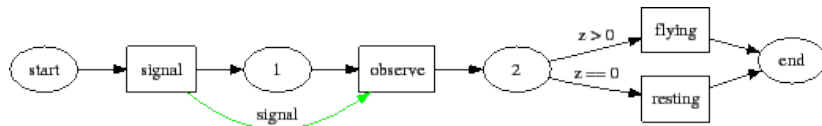
# FLAME Multi-agent Design Frame Framework



# XMachine - A Single Design Unit



# State Transitions





# ICEACE Model v0.9.0

Overall state transition and communication graph of ICEACE model:

[https://github.com/ICEACE/FLAME/blob/master/docs/stategraph\\_colour.pdf](https://github.com/ICEACE/FLAME/blob/master/docs/stategraph_colour.pdf)

# Conceptual Design Vs Implementation

- Pseudo Agents
  - Real Estate Agency
  - Job Placement Office
  - Mall
- Agent Subtypes
  - Households: Capitalist, Non-capitalist
  - Firm: Constructor, Regular
- Mortgage Durations & Annuity

# ICEACE Reference Manual

<https://github.com/ICEACE/FLAME/blob/master/docs/summary.pdf>

- State Variables (memory)
- Functions (behaviours)
- Messages (communication)

# Modular and Iterative Design

Model Descriptions:

```
https://github.com/ICEACE/FLAME/blob/master/  
model\_iceace.xml
```

# Labour Market

- Monthly
- Market opens first day of the month
- Payments are done at last day of the month
- Market closes either when all positions are filled or all households are employed.
- Employment turnover is possible
- Skilled households are given priority
- Firing, new hiring, and *wage adjustment* is possible

[https://github.com/ICEACE/FLAME/blob/master/docs/stategraph\\_colour.pdf](https://github.com/ICEACE/FLAME/blob/master/docs/stategraph_colour.pdf)

# Production Market

- Monthly
- Regular products are produced monthly
- A housing unit is completed in 12 months
- Production function
- Pricing
- Production planning
- Labour requirements

[https://github.com/ICEACE/FLAME/blob/master/docs/stategraph\\_colour.pdf](https://github.com/ICEACE/FLAME/blob/master/docs/stategraph_colour.pdf)

# Consumption Market

- Weekly
- Limited yet monthly adjustable disposable consumption budget
- Unspent budget maybe used in subsequent weeks
- Wealth effect as a mean of shock transmission mechanism from housing markets
- Arrival to mall is random
- Cheaper products have a higher probability to be consumed first

[https://github.com/ICEACE/FLAME/blob/master/docs/stategraph\\_colour.pdf](https://github.com/ICEACE/FLAME/blob/master/docs/stategraph_colour.pdf)

# Housing Market

- Monthly
- Housing units or homogenous
- Constructor firms, buyers, sellers
- Fire sale cases
- Pricing
- Mortgage requirements
- Annuity

[https://github.com/ICEACE/FLAME/blob/master/docs/stategraph\\_colour.pdf](https://github.com/ICEACE/FLAME/blob/master/docs/stategraph_colour.pdf)



# Credit Market

- Monthly
- Loans
- Mortgage annuity adjustment
- Equity Fund
- Illiquidity
- Insolvency

[https://github.com/ICEACE/FLAME/blob/master/docs/stategraph\\_colour.pdf](https://github.com/ICEACE/FLAME/blob/master/docs/stategraph_colour.pdf)

# Policy Making

- Quarterly, monthly, weekly
- Interest rates
- Tax rates and taxing
- Inflation, unemployment
- General benefits, unempoylemnt benefits

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# Computational Challenges

- Initialization
- Load Balancing
- Time Performance, worst case:  $O(|AgentCount|)$
- Memory Management

# ICEACE Iterative Design Process

- **Theoretical Design**
- **Prototyping**
- **Iterative Multi Agent Design Cycle:**
  - **Model Description (XMML):**
    - Memory
    - Action Description
    - State Transitions
    - Activation Conditions
    - Inputs: (filtering, sorting, randomizing)
    - Outputs
  - Behaviors (C Functions)
  - Unit Testing
  - Modular Verificatation
- **Initialization (via PyAIDL):**
  - Setting policy parameters
  - Instantiating agents
  - Initializing agent memories
- *Validation Experiments*

# *Validation*

- Calibration
- Randomness
- Paramater sensivity
- Empirical Tests

# Serial Run Time

- Households: 8000, Firms: 120(regular) + 30(constructor), Banks:2, Central Bank, Government, Job Placement Office, Real Estate Agency, Mall
- Dual Core MacPro OS 10.8.4, CPU 2.26 GHz, RAM 4G 1067MHz
- Data Collection Mode
- 3600 iterations (15 years)
- Wall clock time  $\approx 9min - 16min$

# A Crises Scenerio: Hyper-inflation and Defaults

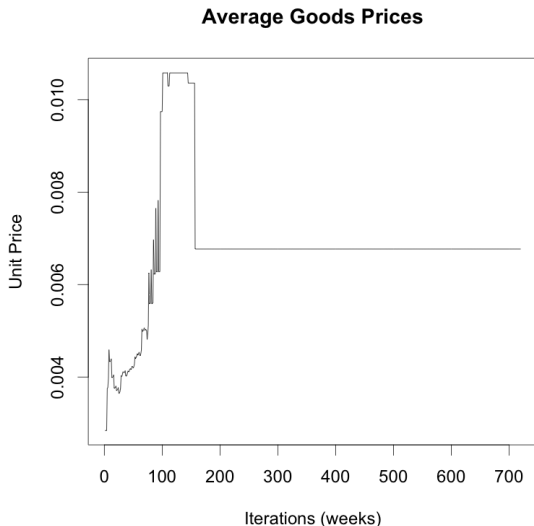
## Simulation Setup

- Free market price mechanism
- Initial high consumption demand
- A 'socialistic' government fiscal and social policies regarding taxes, benefits, and defaults

## Experiment

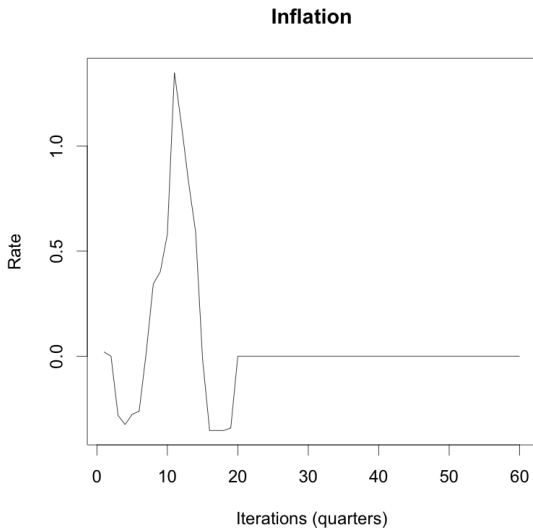
- Households: 8000, Firms: 120(regular) + 30(constructor), Banks:2, Central Bank, Government, Job Placement Office, Real Estate Agency, Mall
- 20 runs
- 3600 iterations (15 years)

# Consumption Goods Prices

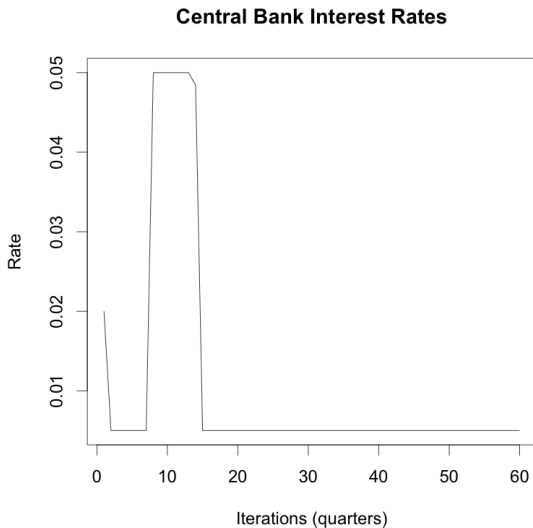




# Inflation

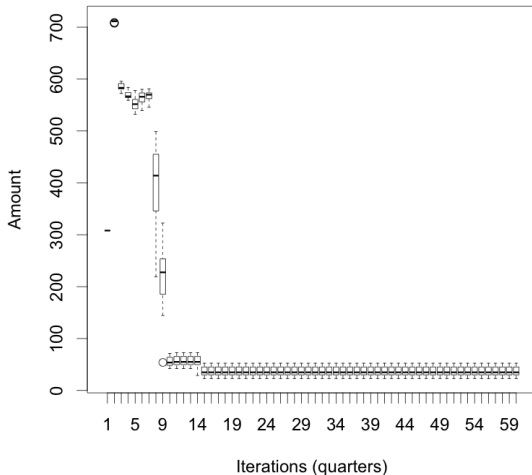


# Interest Rate



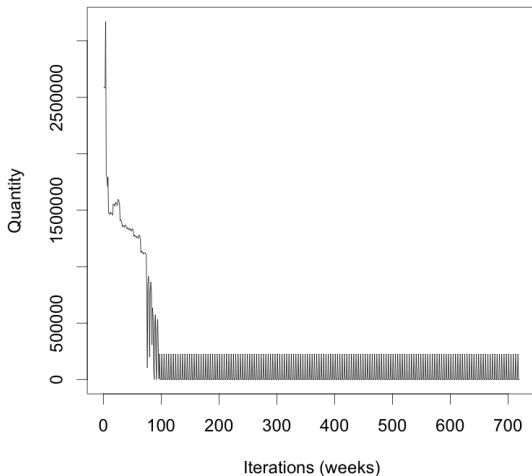
# Sale Revenues

Regular Firm Sale Revenues



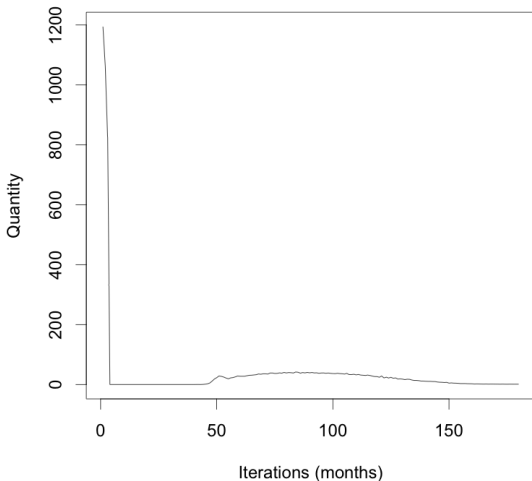
# Goods Transactions

**Weekly Consumption Goods Sales**

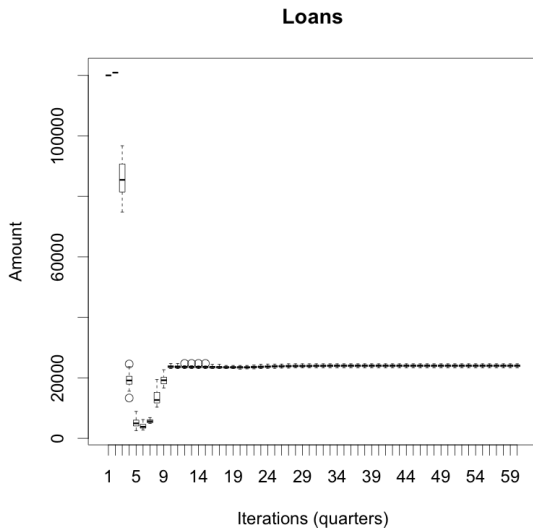


# Housing Transactions

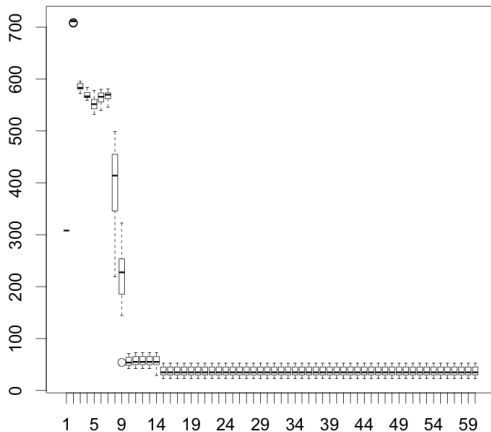
**Monthly Housing Unit Sales**



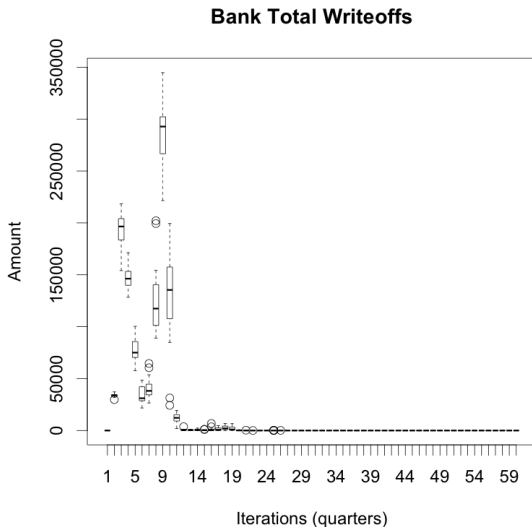
# Loans



# Mortgages



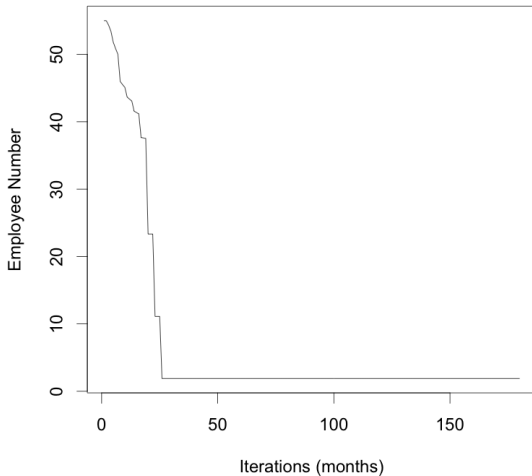
# Write-offs



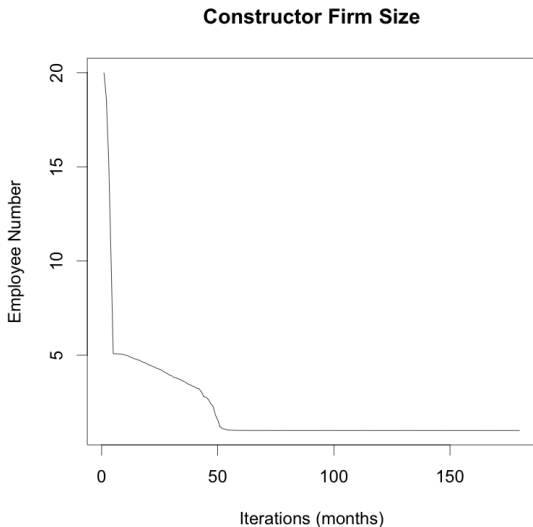


# Firm Size

**Regular Firm Size**



# Constructor Firm Size



# Unemployment

