



Golang UA, Kyiv, May 18 2018

Go as an Agent-Based Model simulation tool



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Status.im

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What is ABM?

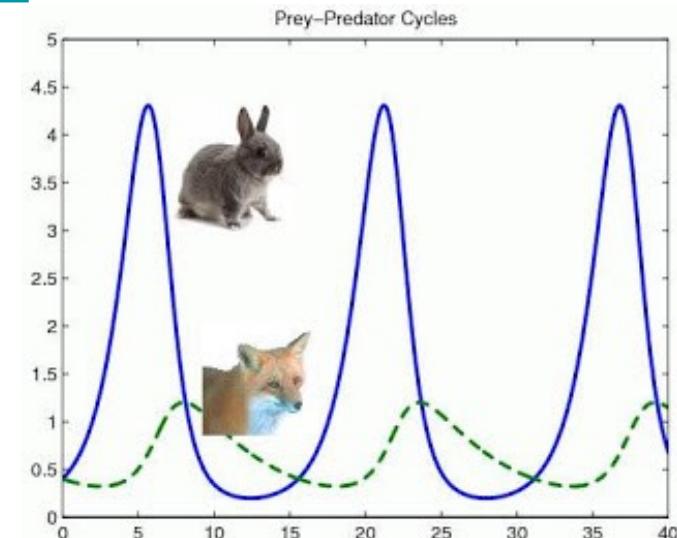


- Technique to explore complex phenomena
- Define behavior rules for **agents**
- Run them concurrently many times
- Observe emerging dynamics on macro-level



- Used in economics, social sciences, urban planning, biomedicine etc.
- Examples:
 - flock of birds
 - fish school
 - humans crowd
 - immune responses

- Opposite to equation based modelling
- Examples: Lotka–Volterra equations – predator-prey system
- Agent-based model reproduce the same oscillation pattern

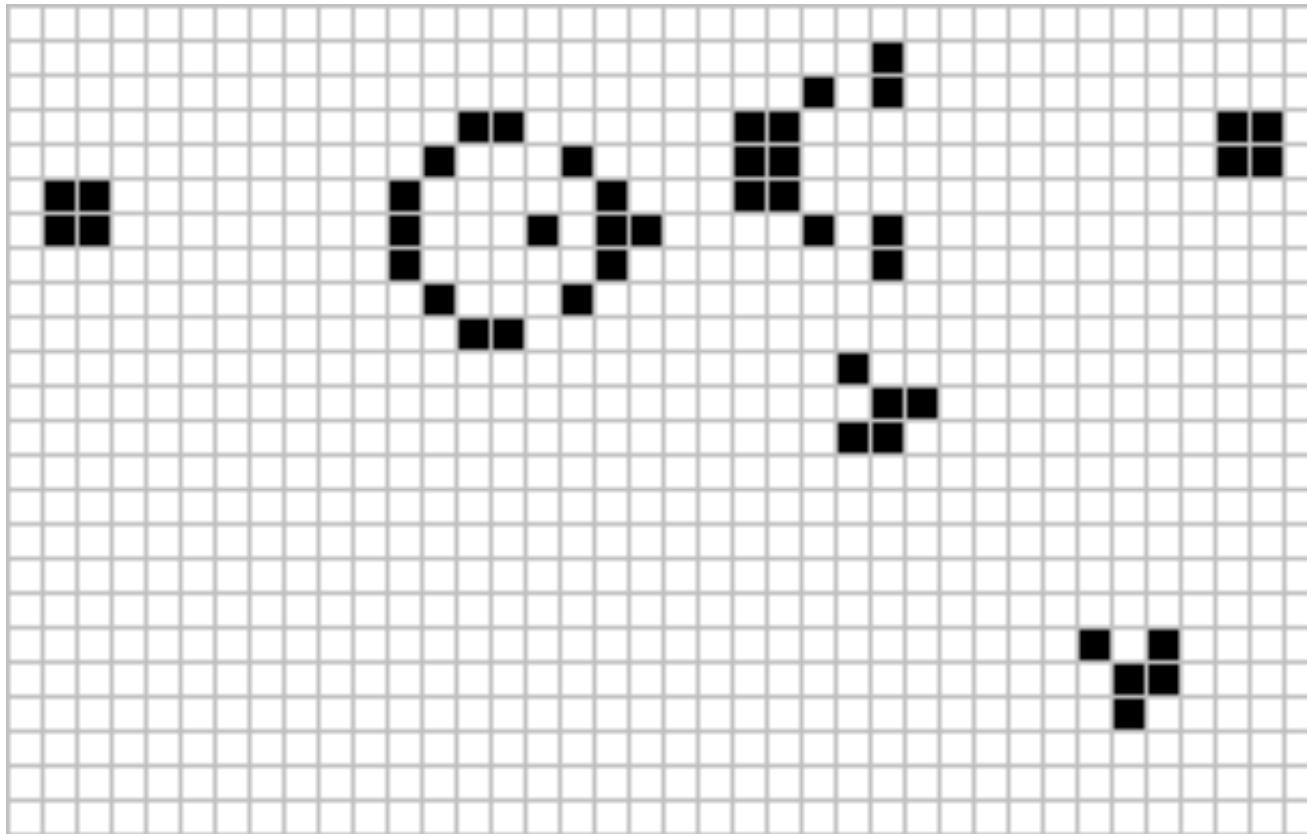




- **Cellular Automata** by Stanislaw Ulam and John von Neumann (1940s)
- **Game of Life** by John Horton Conway (1970s)
- **Distributed Prisoner's Dilemma** by Robert Axelrod (1980s)
- 1990-2000: Expansion of ABM software

Examples

Game of Life (Conway, 1970)



Real-world Comparison Visual Comparison





Facilities evacuation simulations



Source: <https://www.youtube.com/watch?v=bTp1DRfULII>



Traffic simulations



Source: <https://www.youtube.com/watch?v=h3HLzMJ-ac8>

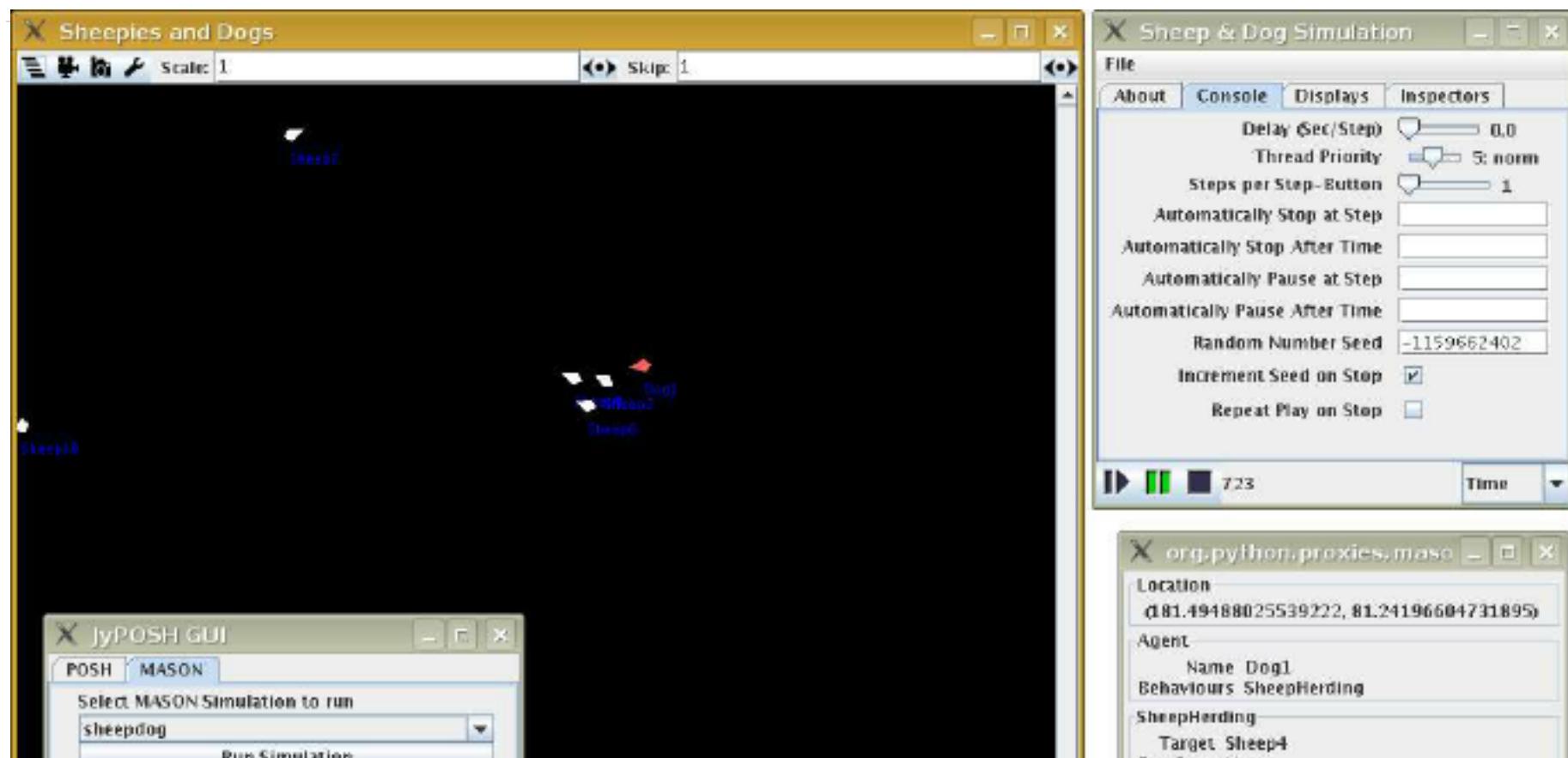


ABM Software

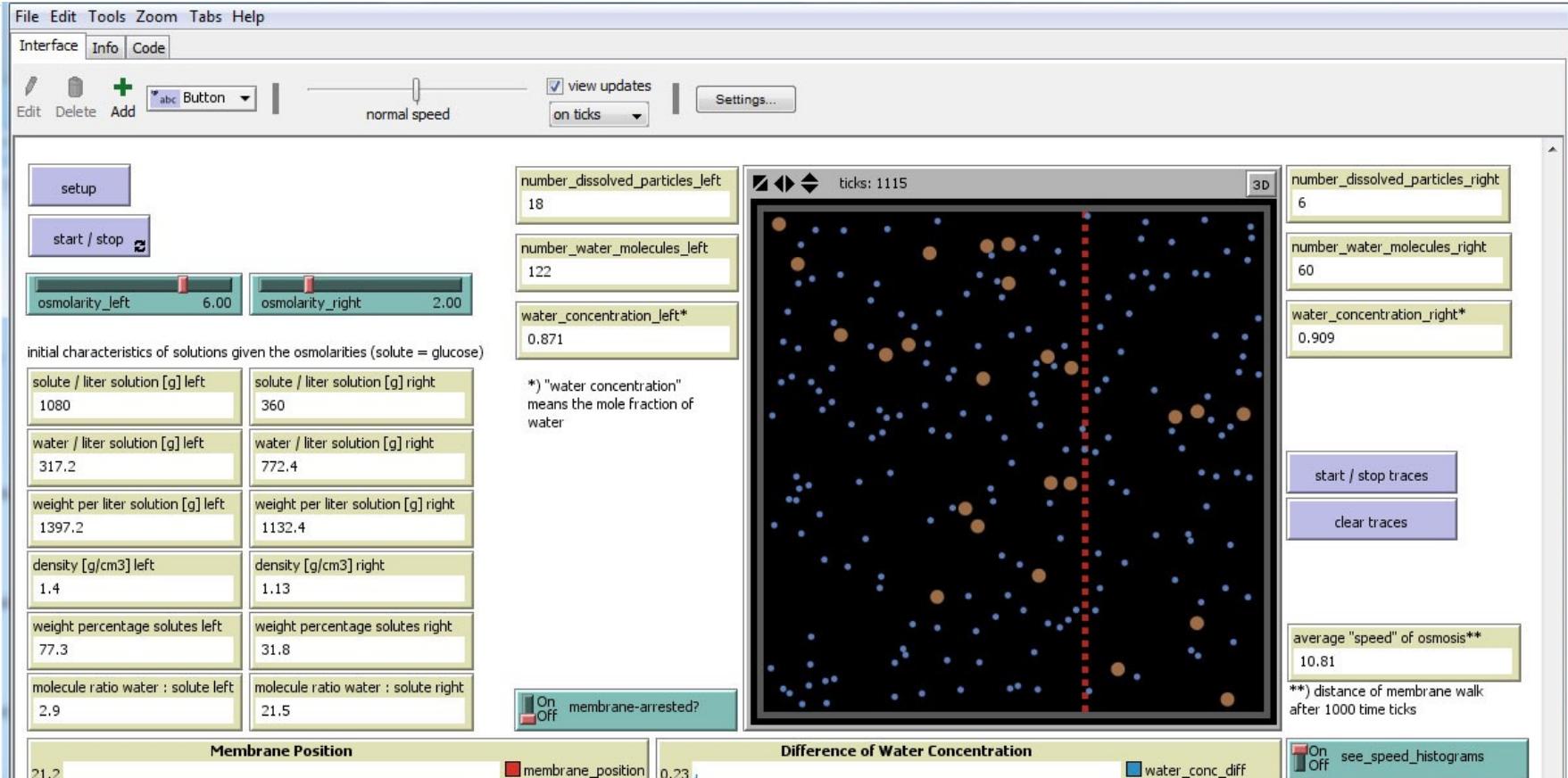


- Most of the ABM software is:
 - Hard to use
 - Complex
 - Ugly
 - Slow
 - Java

Mason



NetLogo



prey_predator - F:\Gama\GamaSource\msi.gama.models\models\Tutorials\Predator Prey\models\Model 13.gaml



File Edit Search Experiment Agents Views Help

19 cycles elapsed

main_display info_display

Monitors Parameters

Number of preys: 201

Number of predators: 27

Population_information

Species evolution

Cycle	Prey Population	Predator Population
0	200	20
1	200	25
2	200	20
3	200	25
4	200	20
5	200	30
6	200	25
7	200	20
8	200	25
9	200	20
10	200	30
11	200	25
12	200	20
13	200	25
14	200	20
15	200	30

File Edit View Draw Model Tools Help

Projects Main

Simulation View

get perspective as
Rotation Vertical Kamera Einstellung

selectedCamera

getObject... Function

Name: getObjectExpr

Show name: Ignore:

Visible: yes

Just action (returns nothing):

Returns value:

Type: String

Arguments

Name	Type
o	Shape:

Function body

```
if(o.isVisible())
{
    String filename = System.out.println("Visible object found: " + o);
    String objectID = String.valueOf(o);
    double rotation = o.getRotation();
    String rotationString = String.format("Rotation: %.2f", rotation);
    String scaleFA = String.valueOf(o.getScaleFactor());
    String x = "" + o.getX();
    String y = "" + o.getY();
    String z = "" + o.getZ();
    String objectE = return objectE;
}
```

Tick Count: 65.0

User Panel

Number of Humans 50

Number of Zombies 5

Gestation 5

Remaining Humans 12

ReLogo: ReLogo Default Display

The ReLogo interface shows a simulation environment with a grid-based world. The world contains several colored human figures (blue, green, red, yellow) and grey zombie figures. White arrows point from one grid cell to another, indicating the movement paths of the human figures. The background is a dark green gradient.



Hard
to use



- New programming language
- UI / Interface
- Performance / scalability
- Installation issues



Good luck trying to play
with even simple model
on your weekend.



What exactly ABM software does?



- Program model in high-level simple language
- Run many models concurrently
- Compute interactions/world/state
- Collect/analyze world/model
- Present result via some UI



- Program model in high-level **simple language** ✓
- Run many models concurrently
- Compute interactions/world/state
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- Present result via some UI



- Program model in high-level **simple language** ✓
- Run many models **concurrently** ✓
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- Program model in high-level **simple language** ✓
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- **Compute** interactions/world/state ✓
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- Program model in high-level **simple language** ✓
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- Program model in high-level **simple language** ✓
- Run many models **concurrently** ✓
- **Compute** interactions/world/state ✓
- **Collect/analyze** world/model ✓
- Present result via some UI ?



“

Sounds like a plan!

”

Gopher





GoABM

github.com/divan/goabm





What's important for ABM framework?



What's important for ABM framework?

Engine



What's important for ABM framework?

Engine

Model



What's important for ABM framework?

Engine

World

Model



What's important for ABM framework?

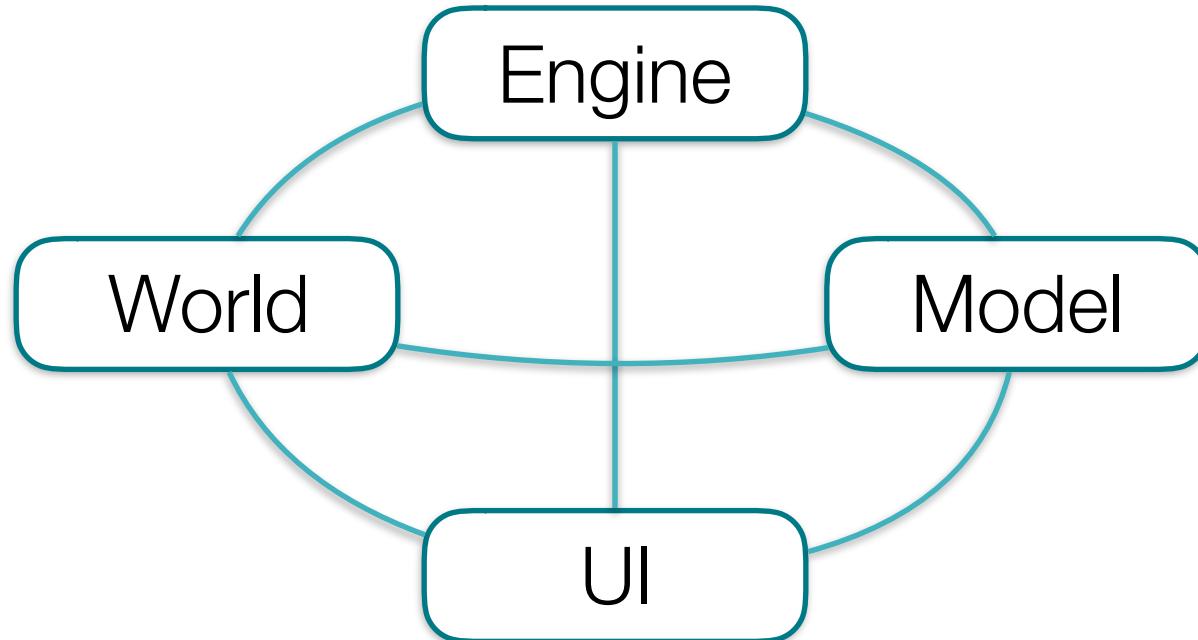
Engine

World

Model

UI

What's important for ABM framework?





Engine



```
// ABM is an "engine" of the simulation framework.  
// It connects the Agents, Worlds and UI and runs the actual  
// simulation.  
type ABM struct {  
    ... // private fields  
}  
  
func (*ABM) AddAgent(a Agent) {  
    ...  
}  
  
func (*ABM) StartSimulation() {  
    ...  
}
```

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}  
  
func (*ABM) AddAgent(a Agent) {  
    ...  
}  
  
func (*ABM) StartSimulation() {  
    ...  
}
```

```
for i := 0; i < a.Limit(); i++ {
    if a.World() != nil {
        a.World().Tick()
    }
    var wg sync.WaitGroup
    for j := 0; j < a.AgentsCount(); j++ {
        wg.Add(1)
        go func(wg *sync.WaitGroup, , j int) {
            a.agents[j].Run()
            wg.Done()
        }(&wg, j)
    }
    wg.Wait()
    if a.reportFunc != nil {
        a.reportFunc(a)
    }
}
```

Agent



```
// Agent defines a model of  
independent agent's behavior.  
type Agent interface {  
    Run()  
}
```

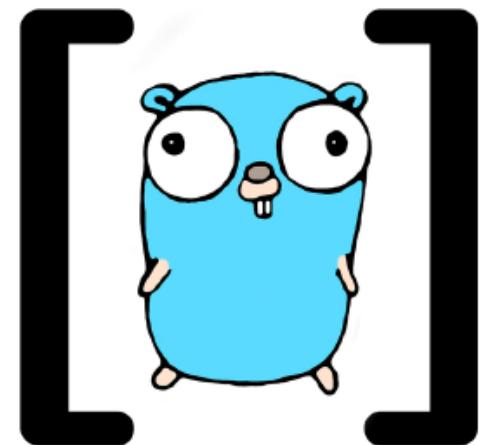
```
// Agent defines a model of  
independent agent's behavior.  
type Agent interface {  
    Run()  
}
```

```
// Human implements Agent for human that can age.  
type Human struct {  
    age int  
    dead bool // zero values must be useful :)  
}
```

```
// Human implements Agent for human that can age.  
type Human struct {  
    age int  
    dead bool // zero values must be useful :)  
}  
  
func (h *Human) Run() {  
    If h.dead { return }  
    h.age++  
    if h.age == AvgDeathAge {  
        h.Die()  
    }  
}  
  
func (h *Human) Die() {  
    h.dead = true  
}
```

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// Human implements Agent for human that can age.  
type Human struct {  
    age int  
    dead bool // zero values must be useful :)  
}  
  
func (h *Human) Run() {  
    If h.dead { return }  
    h.age++  
    if h.age == AvgDeathAge {  
        h.Die()  
    }  
}  
  
func (h *Human) Die() {  
    h.dead = true  
}
```

- You can create any type of actions
- Use random generators for different probability distributions
 - github.com/atgjack/prob
 - <http://www.gonum.org>





World





- World is where agent interact and have "location"
 - Continious
 - Discrete (grids)
 - Graphs
 - GIS data (geography)
- Non-spatial worlds
 - Belief space
 - XOR-distance based P2P networks



```
// World represents space in which agents dwell and  
// interact. It updates the state on each Tick().  
type World interface {  
    Tick() // mark the beginning of the next time period  
}
```

```
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// interact. It updates the state on each Tick().  
type World interface {  
    Tick() // mark the beginning of the next time period  
}
```



UI



```
// UI defines the minimal user interface type.  
type UI interface {  
    Stop()  
    Loop()  
}  
  
type Charts interface {  
    AddChart(name string, values <-chan float64)  
}  
  
type Grid interface {  
    AddGrid(<-chan [][]interface{})  
}  
  
type Grid3D interface {  
    AddGrid3D(<-chan []interface{})  
}
```

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// UI defines the minimal user interface type.  
type UI interface {  
    Stop()  
    Loop()  
}  
  
type Charts interface {  
    AddChart(name string, values <-chan float64)  
}  
  
type Grid interface {  
    AddGrid(<-chan [][]interface{})  
}  
  
type Grid3D interface {  
    AddGrid3D(<-chan []interface{})  
}
```

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type UI interface {  
    Stop()  
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    AddGrid(<-chan [][]interface{})  
}  
  
type Grid3D interface {  
    AddGrid3D(<-chan []interface{})  
}
```

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// UI defines the minimal user interface type.  
type UI interface {  
    Stop()  
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}  
  
type Charts interface {  
    AddChart(name string, values <-chan float64)  
}  
  
type Grid interface {  
    AddGrid(<-chan [][]interface{})  
}  
  
type Grid3D interface {  
    AddGrid3D(<-chan []interface{})  
}
```

- Console / terminal
- Native Desktop (x/exp/shiny)
- Web-based / WebGL



User code



```
func main() {
    a := abm.New()
    a.SetWorld(grid.New(100, 100))
    a.AddAgent(&Human{})

    ch := make(chan int)
    a.SetReportFunc(func(a *abm.ABM) {
        ch <- a.Count(func(agent abm.Agent) bool {
            return agent.(*human.Human).IsAlive()
        })
    })
    go a.StartSimulation()

    ui := term.NewUI()
    defer ui.Stop()
    ui.AddChart("Humans Alive", ch)
    ui.Loop()
}
```

Demo time

UI implementing ui.Charts interface



```
package main

import (
    "github.com/divan/goabm/abm"
    "github.com/divan/goabm/models/human"
    "github.com/divan/goabm/ui/term"
)

func main() {
    a := abm.New()

    for i := 0; i < 100; i++ {
        a.AddAgent(human.New(a))
    }

    a.LimitIterations(200)

    alivesCh := make(chan float64)
    a.SetReportFunc(func(a *abm.ABM) {
        alive := a.Count(func(agent abm.Agent) bool {
            h := agent.(*human.Human)
            return h.IsAlive()
        })
        alivesCh <- float64(alive)
    })
}

go a.StartSimulation()
ui := term.NewUI()
defer ui.Stop()
ui.AddChart("Humans Alive", alivesCh)
ui.Loop()
```

UI implementing ui.Charts interface



```
package main

import (
    "github.com/divan/goabm/abm"
    "github.com/divan/goabm/models/human"
    "github.com/divan/goabm/ui/term"
)

func main() {
    a := abm.New()

    for i := 0; i < 100; i++ {
        a.AddAgent(human.New(a))
    }

    a.LimitIterations(500)

    alivesCh, newbornsCh := make(chan float64), make(chan
float64)
    a.SetReportFunc(func(a *abm.ABM) {
        alive := a.Count(func(agent abm.Agent) bool {
            h := agent.(*human.Human)
            return h.Age() < 3
        })
        alivesCh <- float64(alive)
    })
}
```

```
newborns := a.Count(func(agent abm.Agent) bool {
    h := agent.(*human.Human)
    return h.Age() < 3
})
newbornsCh <- float64(newborns)
})

go a.StartSimulation()

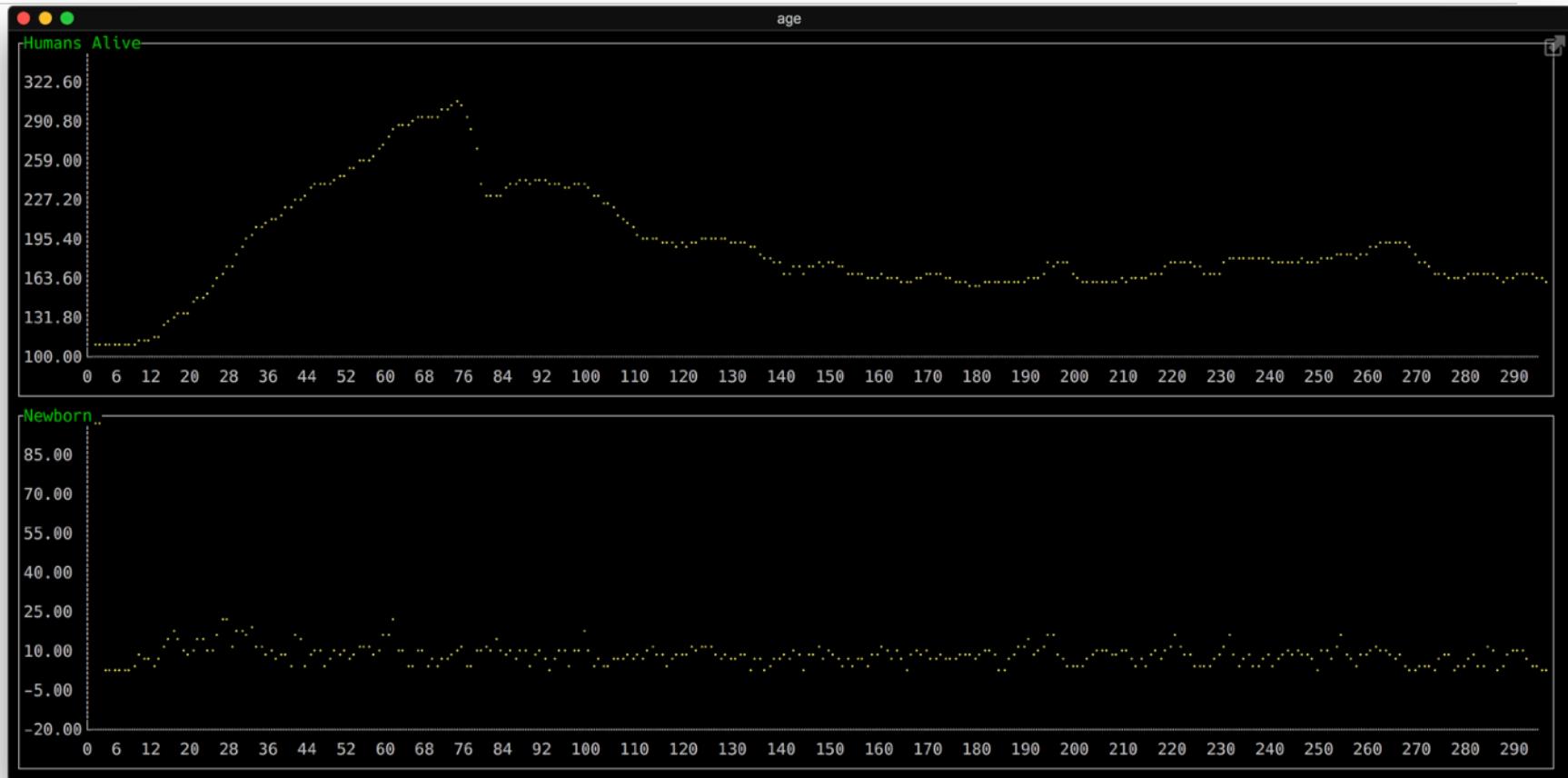
ui := term.NewUI()
defer ui.Stop()

ui.AddChart("Humans Alive", alivesCh)
ui.AddChart("Newborns", newbornsCh)

ui.Loop()
}
```



UI implementing ui.Charts interface





Game of Life example

```
// Run runs single iteration over cell.  
//  
// Any live cell with fewer than two live neighbors dies, as if caused by under population.  
// Any live cell with two or three live neighbors lives on to the next generation.  
// Any live cell with more than three live neighbors dies, as if by overpopulation.  
// Any dead cell with exactly three live neighbors becomes a live cell, as if by reproduction.  
func (c *Cell) Run() {  
    neighbors := c.CountNeighbors()  
    if c.IsAlive() {  
        if neighbors < 2 || neighbors > 3 {  
            c.Die()  
        }  
    } else {  
        if neighbors == 3 {  
            c.Reborn()  
        }  
    }  
}
```

Game of Life example



```
package main

import (
    "math/rand"
    "time"

    "github.com/divan/goabm/abm"
    "github.com/divan/goabm/models/conway_life"
    "github.com/divan/goabm/ui/term_grid"
    "github.com/divan/goabm/worlds/grid2d"
)

func main() {
    rand.Seed(time.Now().UnixNano())
    a := abm.New()
    w, h := termgrid.TermSize()
    g := grid.New(w, h)
    a.SetWorld(g)

    // populate grid randomly
    for x := 0; x < w; x++ {
        for y := 0; y < h; y++ {
            alive := rand.Float64() > 0.5
            cell := life.New(a, x, y, alive)
            a.AddAgent(cell)
            g.SetCell(x, y, cell)
        }
    }

    ch := make(chan [][]interface{})
    a.SetReportFunc(func(a *abm.ABM) {
        ch <- g.Dump(life.IsAlive)
        time.Sleep(10 * time.Millisecond)
    })

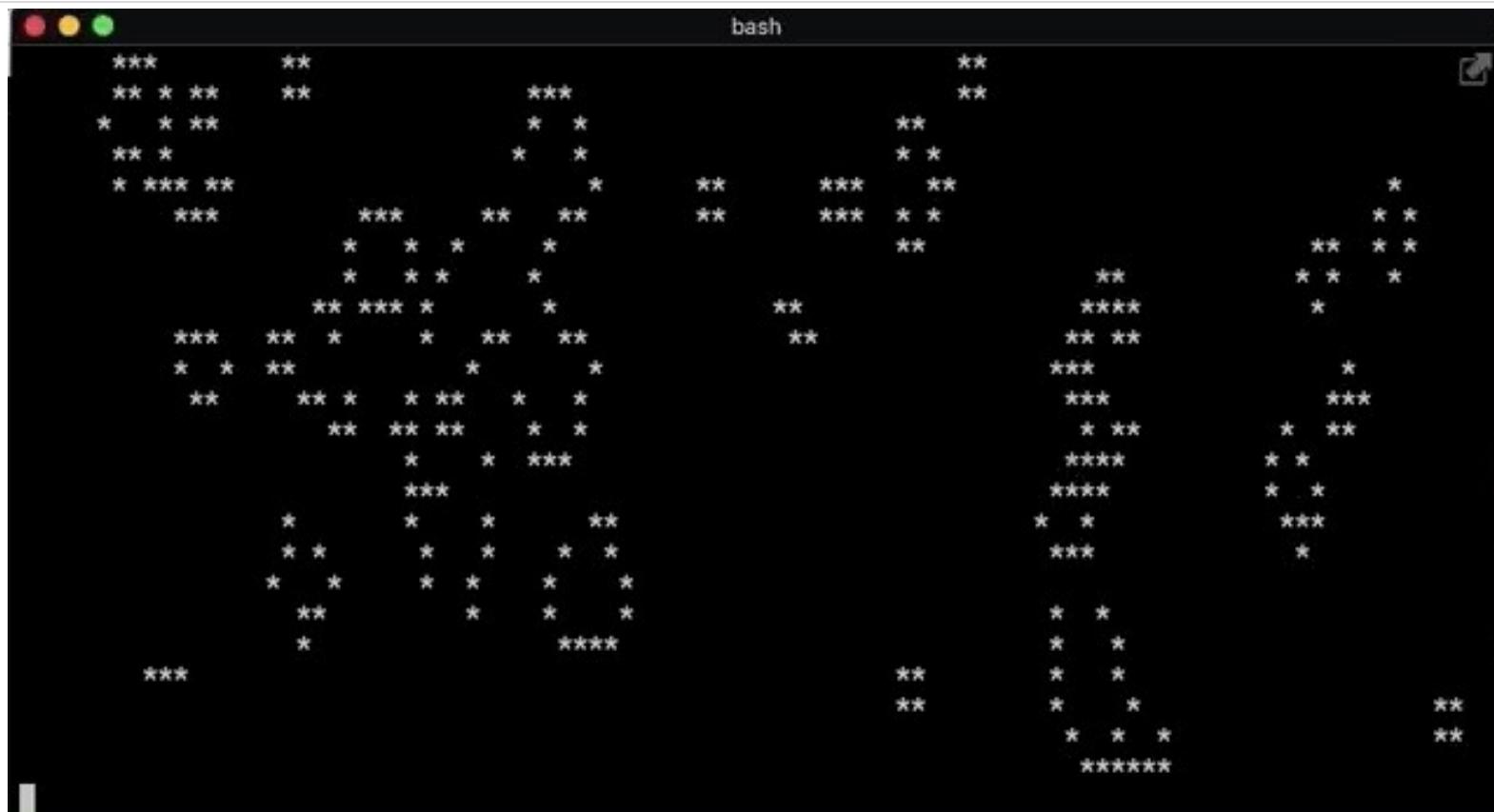
    go a.StartSimulation()

    ui := termgrid.New()
    defer ui.Stop()
    ui.AddGrid(ch)
    ui.Loop()
}
```





Game of Life example



Game of Life example



```
package main

import (
    "math/rand"
    "time"

    "github.com/divan/goabm/abm"
    "github.com/divan/goabm/models/conway_life"
    "github.com/divan/goabm/ui/shiny_grid"
    "github.com/divan/goabm/worlds/grid2d"
)

func main() {
    rand.Seed(time.Now().UnixNano())
    a := abm.New()
    w, h := 300, 200
    g := grid.New(w, h)
    a.SetWorld(g)

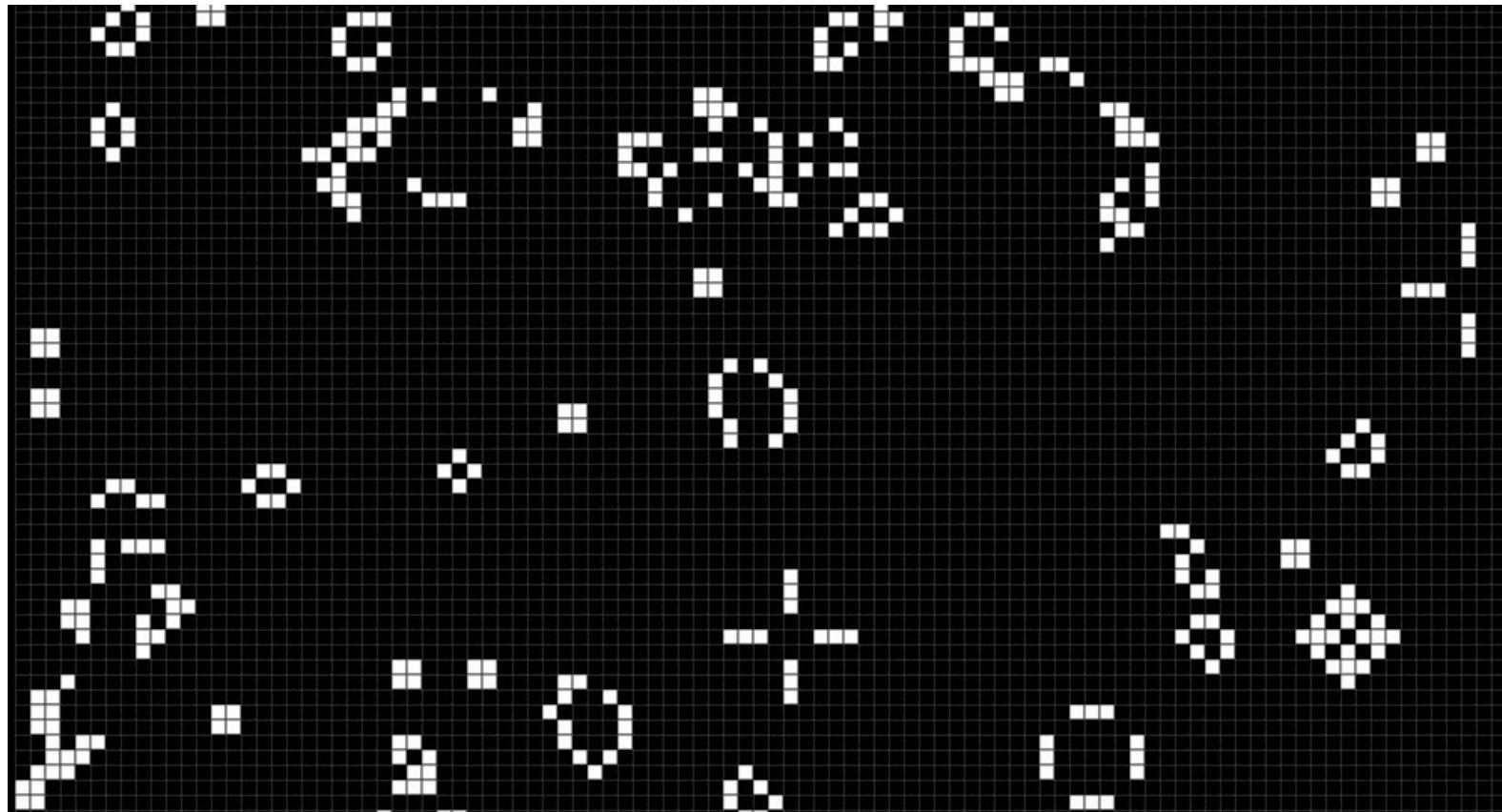
    // populate grid randomly
    for x := 0; x < w; x++ {
        for y := 0; y < h; y++ {
            alive := rand.Float64() > 0.5
            cell := life.New(a, x, y, alive)
            a.AddAgent(cell)
            g.SetCell(x, y, cell)
        }
    }

    ch := make(chan [][]interface{})
    a.SetReportFunc(func(a *abm.ABM) {
        ch <- g.Dump(life.IsAlive)
        time.Sleep(10 * time.Millisecond)
    })

    go a.StartSimulation()

    ui := shiny.New()
    defer ui.Stop()
    ui.AddGrid(ch)
    ui.Loop()
}
```

Game of Life example



Random Walk

Main page
 Contents
 Featured content
 Current events
 Random article
 Donate to Wikipedia
 Wikipedia store

Interaction
 Help
 About Wikipedia
 Community portal
 Recent changes
 Contact page

Tools
[What links here](#)
[Related changes](#)
[Upload file](#)
[Special pages](#)
[Permanent link](#)
[Page information](#)
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 Čeština
 Deutsch

Random walk

From Wikipedia, the free encyclopedia

For the Lawrence Block novel, see [Random Walk](#).

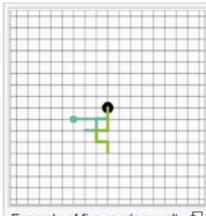
A **random walk** is a [mathematical](#) object, known as a [stochastic](#) or [random process](#), that describes a path that consists of a succession of [random](#) steps on some mathematical space such as the integers. An elementary example of a random walk is the random walk on the [integer](#) number line, \mathbb{Z} , which starts at 0 and at each step moves +1 or −1 with equal probability. Other examples include the path traced by a [molecule](#) as it travels in a liquid or a gas, the search path of a [foraging](#) animal, the price of a fluctuating [stock](#) and the financial status of a [gambler](#) can all be approximated by random walk models, even though they may not be truly random in reality. As illustrated by those examples, random walks have applications to many scientific fields including [ecology](#), [psychology](#), [computer science](#), [physics](#), [chemistry](#), [biology](#) as well as [economics](#). Random walks explain the observed behaviors of many processes in these fields, and thus serve as a fundamental model for the recorded [stochastic activity](#). As a more mathematical application, the value of pi can be approximated by the usage of random walk in agent-based modelling environment.^{[1][2]} The term *random walk* was first introduced by [Karl Pearson](#) in 1905.^[3]

Various types of random walks are of interest, which can differ in several ways. The term itself most often refers to a special category of [Markov chains](#) or [Markov processes](#), but many time-dependent processes are referred to as random walks, with a modifier indicating their specific properties. Random walks (Markov or not) can also take place on a variety of spaces: commonly studied ones include [graphs](#), others on the integers or the real line, in the plane or in higher-dimensional vector spaces, on [curved surfaces](#) or higher-dimensional [Riemannian manifolds](#), and also on [groups](#) finite, [finitely generated](#) or [Lie](#). The time parameter can also be manipulated. In the simplest context the walk is in discrete time, that is a sequence of [random variables](#) $(X_t) = (X_1, X_2, \dots)$ indexed by the natural numbers. However, it is also possible to define random walks which take their steps at random times, and in that case the position X_t has to be defined for all times $t \in [0, +\infty)$. Specific cases or limits of random walks include the [Lévy flight](#) and [diffusion](#) models such as [Brownian motion](#).

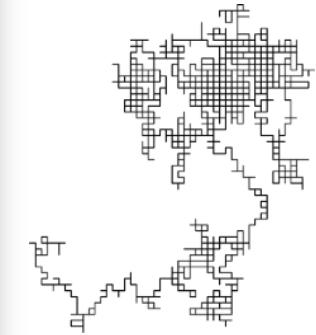
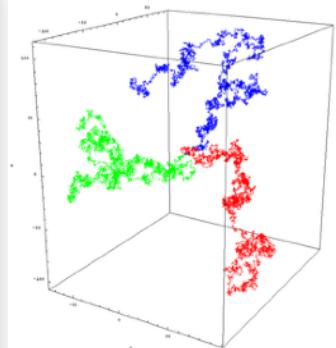
Random walks are a fundamental topic in discussions of Markov processes. Their mathematical study has been extensive. Several properties, including dispersal distributions, first-passage or hitting times, encounter rates, recurrence or transience, have been introduced to quantify their behaviour.

Contents [hide]

- 1 Lattice random walk
 - 1.1 One-dimensional random walk
 - 1.1.1 As a Markov chain
 - 1.2 Higher dimensions
 - 1.3 Relation to Wiener process



Example of five random walk simulations in a 2-dimensional integer lattice. Produced by the Random Walk Simulator.





Random Walk

```
func (w *Walker) Run() {
    rx := rand.Intn(4)
    oldx, oldy := w.x, w.y
    switch rx {
    case 0:
        w.x++
    case 1:
        w.y++
    case 2:
        w.x--
    case 3:
        w.y--
    }

    var err error
    if w.trail {
        err = w.grid.Copy(oldx, oldy, w.x, w.y)
    } else {
        err = w.grid.Move(oldx, oldy, w.x, w.y)
    }

    if err != nil {
        w.x, w.y = oldx, oldy
    }
}
```

Random Walk



```
package main

import (
    "log"
    "math/rand"
    "time"

    "github.com/divan/goabm/abm"
    "github.com/divan/goabm/models/random_walker"
    "github.com/divan/goabm/ui/term_grid"
    "github.com/divan/goabm/worlds/grid2d"
)

func main() {
    rand.Seed(time.Now().UnixNano())
    a := abm.New()
    w, h := termgrid.TermSize()
    grid2D := grid.New(w, h)
    a.SetWorld(grid2D)

    cell, err := walker.New(a, rand.Intn(w-1),
        rand.Intn(h-1), true)
    if err != nil {
        log.Fatal(err)
    }
    a.AddAgent(cell)
    grid2D.SetCell(cell.X(), cell.Y(), cell)

    ch := make(chan [][]interface{})
    a.SetReportFunc(func(a *abm.ABM) {
        ch <- grid2D.Dump(func(a abm.Agent) bool
{ return a != nil })
    })

    go func() {
        a.StartSimulation()
        close(ch)
    }()
    ui := termgrid.New()
    defer ui.Stop()
    ui.AddGrid(ch)
    ui.Loop()
}
```



Random Walk



The terminal window is titled "random_walk". It displays a 2D random walk path using asterisks (*) on a black background. The path starts at the center and moves in various directions, with some segments being longer than others, creating a fractal-like pattern. The window has standard OS X-style red, yellow, and green close buttons in the top-left corner. In the top-right corner, there is a small icon consisting of a square with a diagonal line and an arrow pointing up and to the right.

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**
```

Random Walk



```
package main

import (
    "log"
    "math/rand"
    "time"

    "github.com/divan/goabm/abm"
    "github.com/divan/goabm/models/random_walker"
    "github.com/divan/goabm/ui/term_grid"
    "github.com/divan/goabm/worlds/grid2d"
)

func main() {
    rand.Seed(time.Now().UnixNano())
    a := abm.New()
    w, h := 300, 200
    grid2D := grid.New(w, h)
    a.SetWorld(grid2D)

    cell, err := walker.New(a, rand.Intn(w-1),
        rand.Intn(h-1), true)
    if err != nil {
        log.Fatal(err)
    }
    a.AddAgent(cell)
    grid2D.SetCell(cell.X(), cell.Y(), cell)

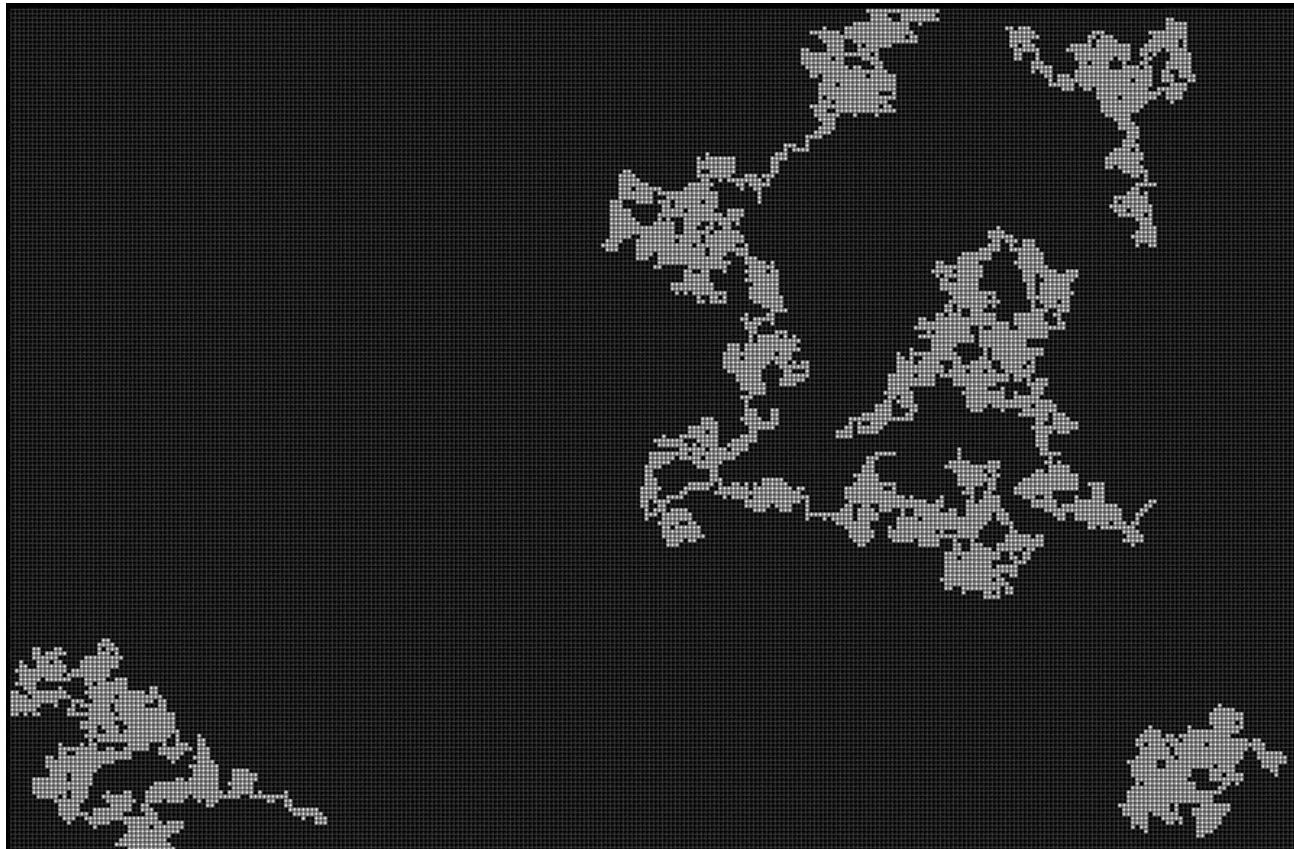
    ch := make(chan [][]interface{})
    a.SetReportFunc(func(a *abm.ABM) {
        ch <- grid2D.Dump(func(a abm.Agent) bool
        { return a != nil })
    })

    go func() {
        a.StartSimulation()
        close(ch)
    }()
}

ui := shiny.New(w, h)
defer ui.Stop()
ui.AddGrid(ch)
ui.Loop()
```

≡

Random Walk





Random Walk

```
func (w *Walker) Run() {
    rx := rand.Intn(6)
    oldx, oldy, oldz := w.x, w.y, w.z
    switch rx {
    case 0:
        w.x++
    case 1:
        w.y++
    case 2:
        w.x--
    case 3:
        w.y--
    case 4:
        w.z++
    case 5:
        w.z--
    }
    err := w.abm.World().(*grid.Grid).Copy(oldx, oldy, oldz, w.x, w.y, w.z)
    if err != nil {
        w.x, w.y, w.z = oldx, oldy, oldz
    }
}
```

Random Walk



```
func main() {
    rand.Seed(time.Now().UnixNano())
    a := abm.New()
    w, h, d := 100, 100, 100
    g := grid.New(w, h, d)
    a.SetWorld(g)

    for i := 0; i < 10; i++ {
        cell := NewWalker(a, rand.Intn(w),
                           rand.Intn(h), rand.Intn(d))
        a.AddAgent(cell)
        g.SetCell(cell.x, cell.y, cell.z,
                  cell)
    }

    a.LimitIterations(10000)

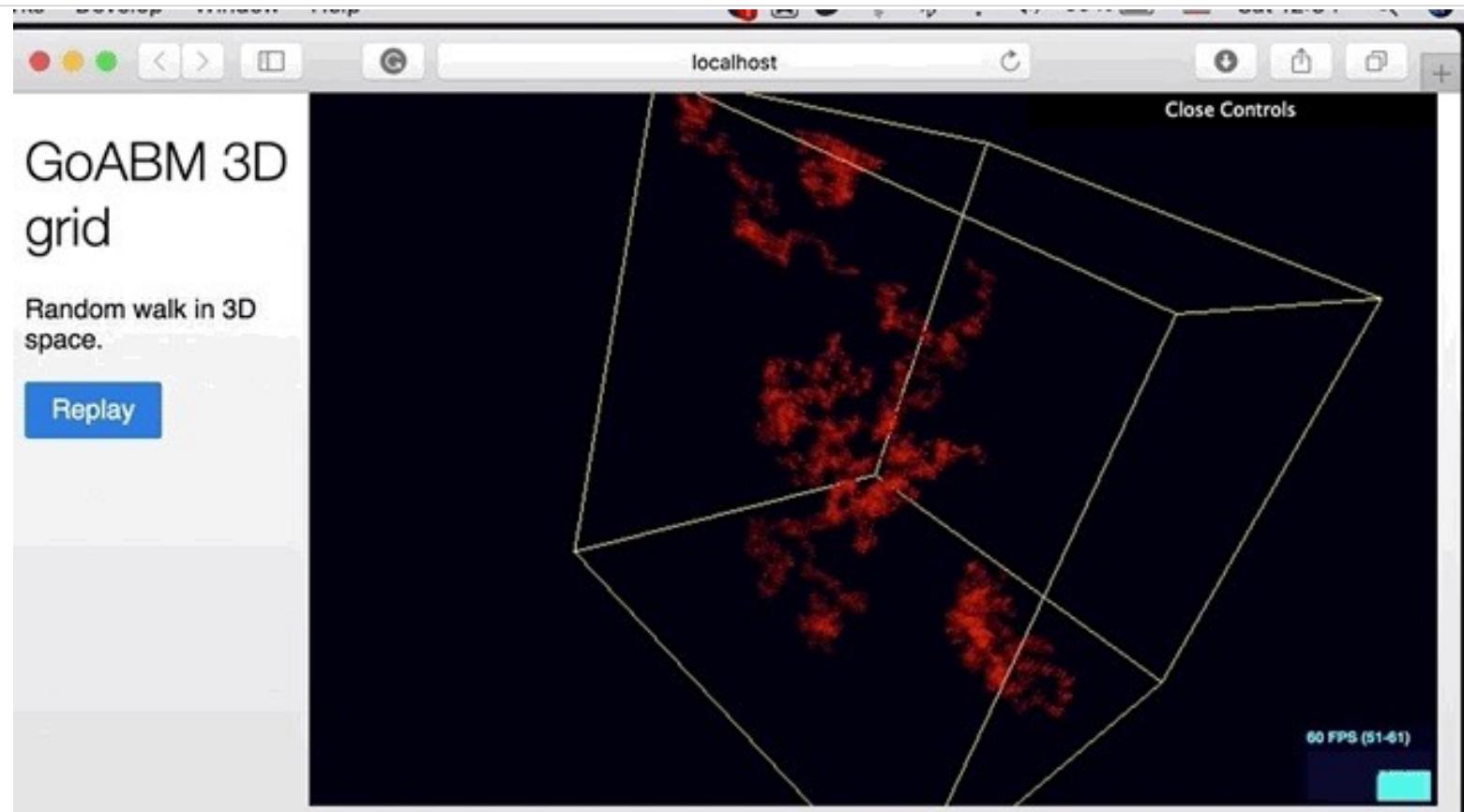
    ch := make(chan []interface{})
    a.SetReportFunc(func(a *abm.ABM) {
```

```
        ch <- g.Dump(func(a abm.Agent) bool {
            return a != nil })
    })

    go func() {
        time.Sleep(1 * time.Second)
        a.StartSimulation()
        close(ch)
    }()

    ui3d := ui.New(w, h, d)
    defer ui3d.Stop()
    ui3d.AddGrid3D(ch)
    ui3d.Loop()
}
```

Random Walk



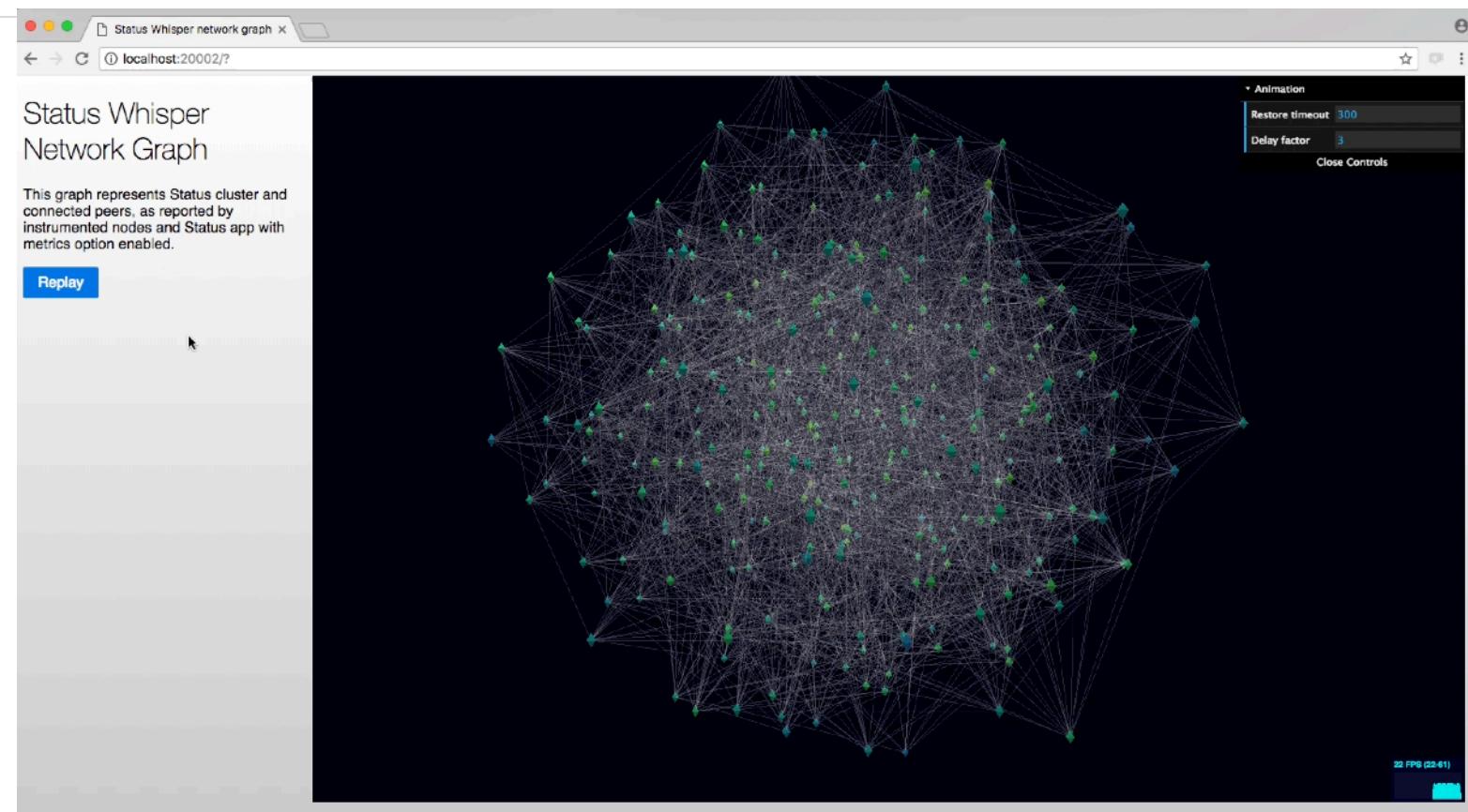


Bonus: wrap existing Go software into Agent interface.

Example: simulation of Whisper P2P messaging protocol using go-ethereum codebase



Whisper simulation



Source: <https://www.youtube.com/watch?v=lt54a1ELUwE>



Conclusions

Model Language

- A good fit for models language (simple, readable, easy to learn)
- Allows reusing existing software (e.g. networking simulations)
- Testable (you can write state-of-the-art tests for your models)



Performance

- Nothing on CPU can beat GPU-optimized simulations
- Currently not optimized at all and gives decent performance on classic models
- Huge space for further optimization
- Good flexibility in what can be optimized on framework side vs user model side



UI

- No out of the box high-level UI solutions
- But many options available (console, native desktop, Canvas, WebGL based)
- Framework can provide UIs for most common cases
- Truly awesome flexibility with UIs (switch between console to WebGL with one line of code)



goabm is pretty much work-in-progress/proof-of-concept pet project

may be a good fit to develop models before running large-scale simulation

will be open sourced soon



Thank you

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