

# Probabilistic Model Checking

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Part 3 – DTMC Case Studies

# Overview

- Introduce two real-world examples
  - derived models as discrete-time Markov chains
  - **quantitatively** analysed them (with PRISM)
  - observed **unusual trends**...
-  **Bluetooth** device discovery
  - worked from the standard document (1000 pages), versions 1.1 and 1.2
- Contract signing
  - worked from the original paper, discovered a flaw and proposed a fix
- See PRISM webpage for models and more analysis...

# Bluetooth device discovery

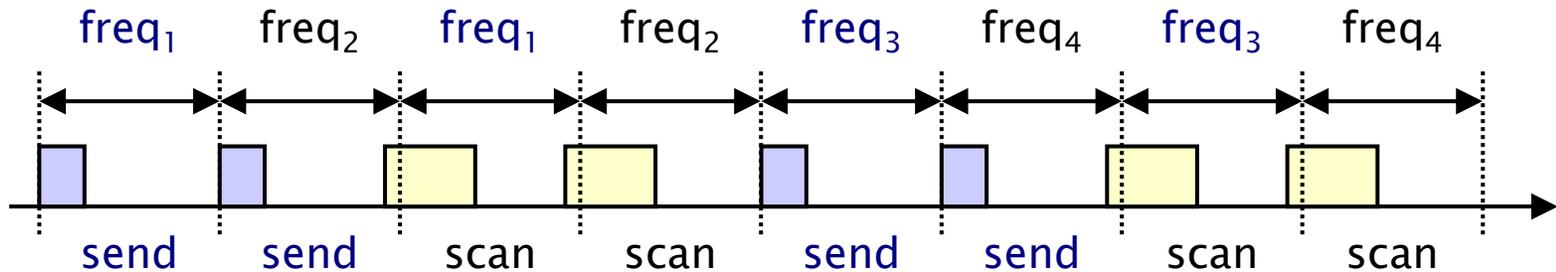
- **Bluetooth: short-range low-power wireless protocol**
  - widely available in phones, PDAs, laptops, ...
  - personal area networks (PANs)
  - open standard, specification freely available
- **Uses frequency hopping scheme**
  - to avoid interference (uses unregulated 2.4GHz band)
  - **pseudo-random** selection over 32 of 79 frequencies
- **Network formation**
  - piconets (1 master, up to 7 slaves)
  - self-configuring: devices discover themselves



# Bluetooth device discovery

- States of a Bluetooth device:
  - standby: default operational state
  - inquiry: device discovery
    - master looks for devices, slaves listens for master
  - page: establish connection – synchronise clocks, etc.
  - connected: device ready to communicate in a piconet
- Device discovery
  - mandatory first step before any communication possible
  - “page” reuses information from “inquiry” so is much faster
  - power consumption much higher for “page”
  - performance crucial

# Frequency hopping



- 28 bit free-running clock CLK, ticks every  $312.5\mu s$
- Master broadcasts inquiry packets on two consecutive frequencies, then listens on the same two (plus margin)
- Potential slaves want to be discovered, scan for messages
- Frequency sequence determined by formula, dependent on bits of clock CLK ( $k$  defined on next slide):

$$freq = [CLK_{16-12} + k + (CLK_{4-2,0} - CLK_{16-12}) \bmod 16] \bmod 32$$

# Master (sender) behaviour

- Broadcasts inquiry packets on two consecutive sequences, then listens on the same two
- Frequency hopping sequence determined by clock

$$\text{freq} = [\text{CLK}_{16-12} + k + (\text{CLK}_{4-2,0} - \text{CLK}_{16-12}) \bmod 16] \bmod 32$$

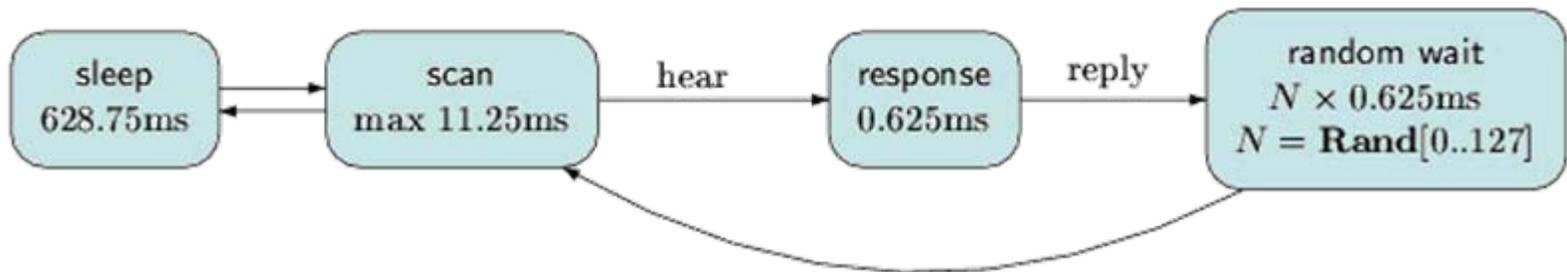
- two trains (=lines) of 16 frequencies (determined by offset k)
- each train repeated 128 times
- swaps between trains every 2.56s

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1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16
17 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16
1 2 19 20 21 22 23 24 25 26 27 28 29 30 31 32
1 2 3 20 21 22 23 24 25 26 27 28 29 30 31 32
17 18 19 20 5 6 7 8 9 10 11 12 13 14 15 16
17 18 19 20 21 6 7 8 9 10 11 12 13 14 15 16
1 2 3 4 5 6 23 24 25 26 27 28 29 30 31 32
1 2 3 4 5 6 7 24 25 26 27 28 29 30 31 32
17 18 19 20 21 22 23 24 9 10 11 12 13 14 15 16
17 18 19 20 21 22 23 24 25 10 11 12 13 14 15 16
1 2 3 4 5 6 7 8 9 10 27 28 29 30 31 32
1 2 3 4 5 6 7 8 9 10 11 28 29 30 31 32
17 18 19 20 21 22 23 24 25 26 27 28 13 14 15 16
17 18 19 20 21 22 23 24 25 26 27 28 29 14 15 16
1 2 3 4 5 6 7 8 9 10 11 12 13 14 31 32
1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 32
17 18 19 20 21 22 23 24 25 26 27 28 29 30 31 32
1 18 19 20 21 22 23 24 25 26 27 28 29 30 31 32
17 18 3 4 5 6 7 8 9 10 11 12 13 14 15 16
17 18 19 4 5 6 7 8 9 10 11 12 13 14 15 16
1 2 3 4 21 22 23 24 25 26 27 28 29 30 31 32
1 2 3 4 5 22 23 24 25 26 27 28 29 30 31 32
17 18 19 20 21 22 7 8 9 10 11 12 13 14 15 16
17 18 19 20 21 22 23 8 9 10 11 12 13 14 15 16
1 2 3 4 5 6 7 8 25 26 27 28 29 30 31 32
1 2 3 4 5 6 7 8 9 26 27 28 29 30 31 32
17 18 19 20 21 22 23 24 25 26 11 12 13 14 15 16
17 18 19 20 21 22 23 24 25 26 27 12 13 14 15 16
1 2 3 4 5 6 7 8 9 10 11 12 29 30 31 32
1 2 3 4 5 6 7 8 9 10 11 12 13 30 31 32
17 18 19 20 21 22 23 24 25 26 27 28 29 30 15 16
17 18 19 20 21 22 23 24 25 26 27 28 29 30 31 16
  
```

# Slave (receiver) behaviour

- Listens (scans) on frequencies for inquiry packets
  - must listen on right frequency at right time
  - cycles through frequency sequence at much slower speed (every 1.28s)



- On hearing packet, pause, send reply and then wait for a random delay before listening for subsequent packets
  - avoid repeated collisions with other slaves

# Bluetooth modelling

- Very complex interaction
  - genuine **randomness**, probabilistic modelling essential
  - devices make contact only if listen on the right frequency at the right time!
  - sleep/scan periods unbreakable, much longer than listening
  - cannot omit sub-activities, otherwise model is oversimplified
- **Huge model**, even for one sender and one receiver!
  - initial configurations dependent on 28 bit clock
  - cannot fix start state of receiver, clock value could be arbitrary
- But is a realistic future ubiquitous computing scenario!

# Bluetooth – PRISM model

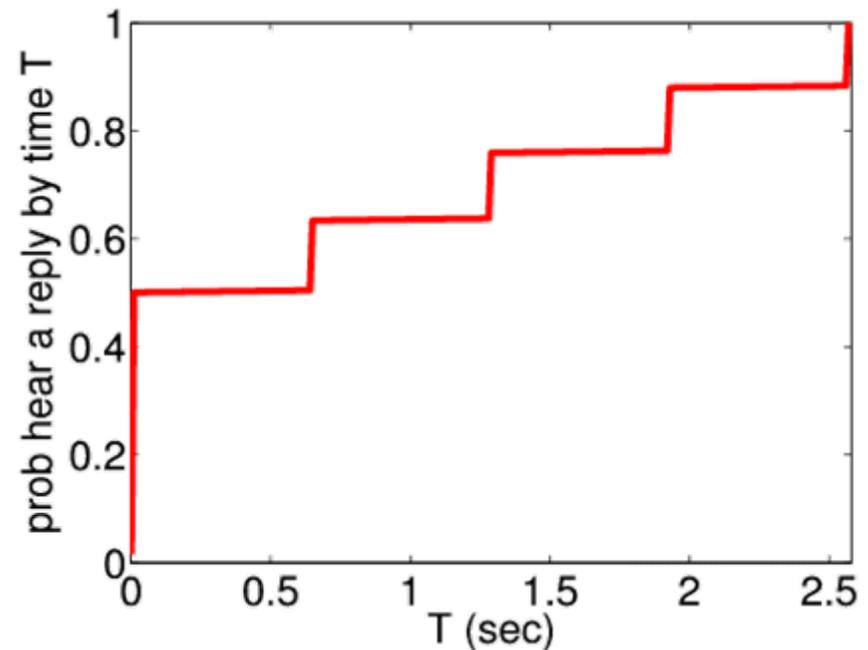
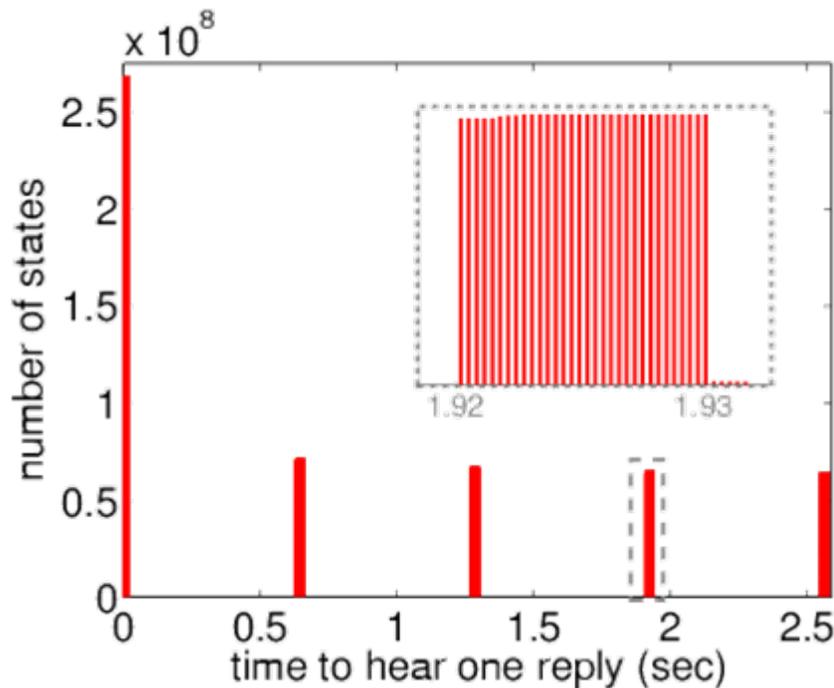
- Modelling in PRISM [DKNP06]
  - model one sender and one receiver
  - synchronous (clock speed defined by Bluetooth spec)
  - randomised behaviour – use DTMC
  - model at lowest-level (one clock-tick = one transition)
  - use real values for delays, etc, from Bluetooth spec
- Modelling challenges
  - complex interaction between sender/receiver
  - combination of short/long time-scales – cannot scale down
  - sender/receiver not initially synchronised, huge number of possible initial configurations (17,179,869,184)

# Bluetooth – Results

- Huge DTMC!
  - initially, model checking infeasible
  - partition into 32 scenarios, i.e. 32 separate DTMCs
  - on average, approx.  $3.4 \times 10^9$  states, 536,870,912 initial
  - can be built/analysed with PRISM's MTBDD engine
- Property model checked:
  - $R_{=?} [ F \text{ replies} = K \{ \text{“init”} \} \{ \text{max} \} ]$
  - “worst-case (maximum) expected time to hear K replies, over all possible initial configurations”
  - also: how many initial states for each possible expected time
  - and: cumulative distribution function assuming equal probability for each initial state

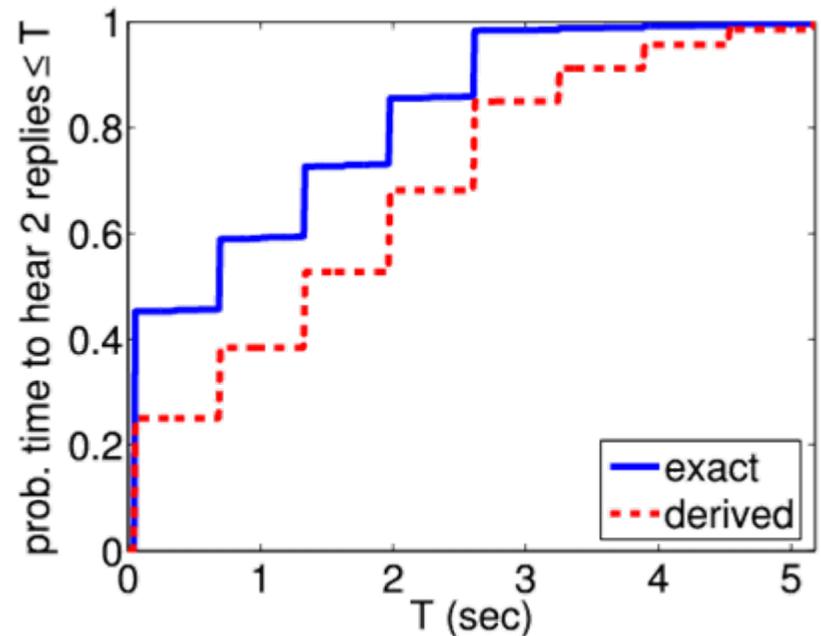
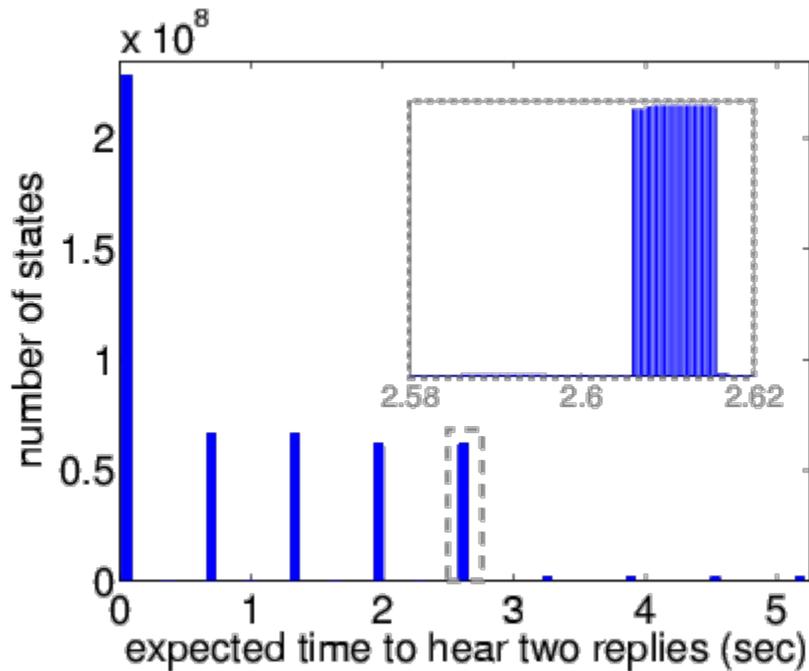
# Bluetooth – Time to hear 1 reply

- Worst-case expected time = 2.5716s
  - in 921,600 possible initial states
- Best-case expected time = 635 $\mu$ s



# Bluetooth – Time to hear 2 replies

- Worst-case expected time = 5.177s
  - in 444 possible initial states
- Compare actual CDF with derived version which assumes times to reply to first/second messages are **independent**



# Bluetooth – Results

- Other results (see [DKNP06])
  - compare versions 1.2 and 1.1 of Bluetooth, confirm 1.1 slower
  - power consumption analysis (using rewards)
- Conclusions
  - successful analysis of complex real-life model, actual parameters from standard
  - exhaustive analysis: best-/worst-case values
    - can pinpoint scenarios which give rise to them
    - not possible with simulation approaches
  - model still relatively simple
    - consider multiple receivers?
    - combine with simulation?

# Contract signing

- Two parties want to agree on a contract
  - each will sign if the other will sign, but **do not trust each other**
  - there may be a **trusted third party** (judge)
  - but it should only be used if something goes wrong
- In real life: contract signing with pen and paper
  - sit down and write signatures simultaneously
- On the Internet...
  - how to exchange commitments on an asynchronous network?
  - “**partial secret exchange protocol**” [EGL85]

# Contract signing – EGL protocol

- Partial secret exchange protocol for 2 parties (A and B)
- A (B) holds  $2N$  secrets  $a_1, \dots, a_{2N}$  ( $b_1, \dots, b_{2N}$ )
  - a secret is a binary string of length  $L$
  - secrets partitioned into pairs: e.g.  $\{ (a_i, a_{N+i}) \mid i=1, \dots, N \}$
  - A (B) committed if B (A) knows one of A's (B's) pairs
- Uses “1-out-of-2 oblivious transfer protocol”  $OT(S, R, x, y)$ 
  - S sends  $x$  and  $y$  to R
  - R receives  $x$  with **probability**  $\frac{1}{2}$  otherwise receives  $y$
  - S does not know which one R receives
  - if S cheats then R can detect this **with probability**  $\frac{1}{2}$

# Contract signing – EGL protocol

(step 1)

for (  $i=1, \dots, N$  )

OT( A, B,  $a_i$ ,  $a_{N+i}$  )

OT( B, A,  $b_i$ ,  $b_{N+i}$  )

(step 2)

for (  $i=1, \dots, L$  ) (where L is the bit length of the secrets)

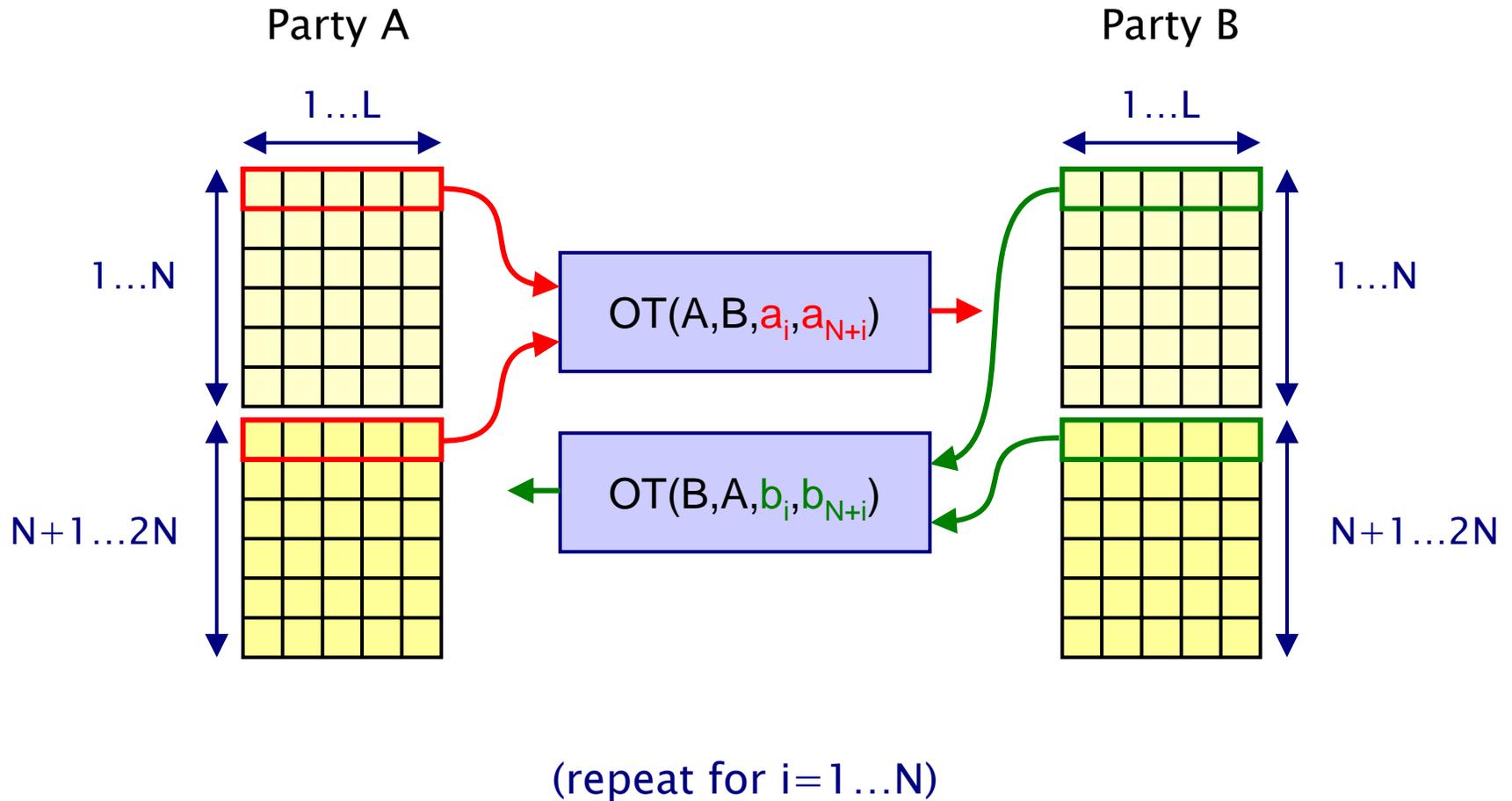
for (  $j=1, \dots, 2N$  )

A transmits bit i of secret  $a_j$  to B

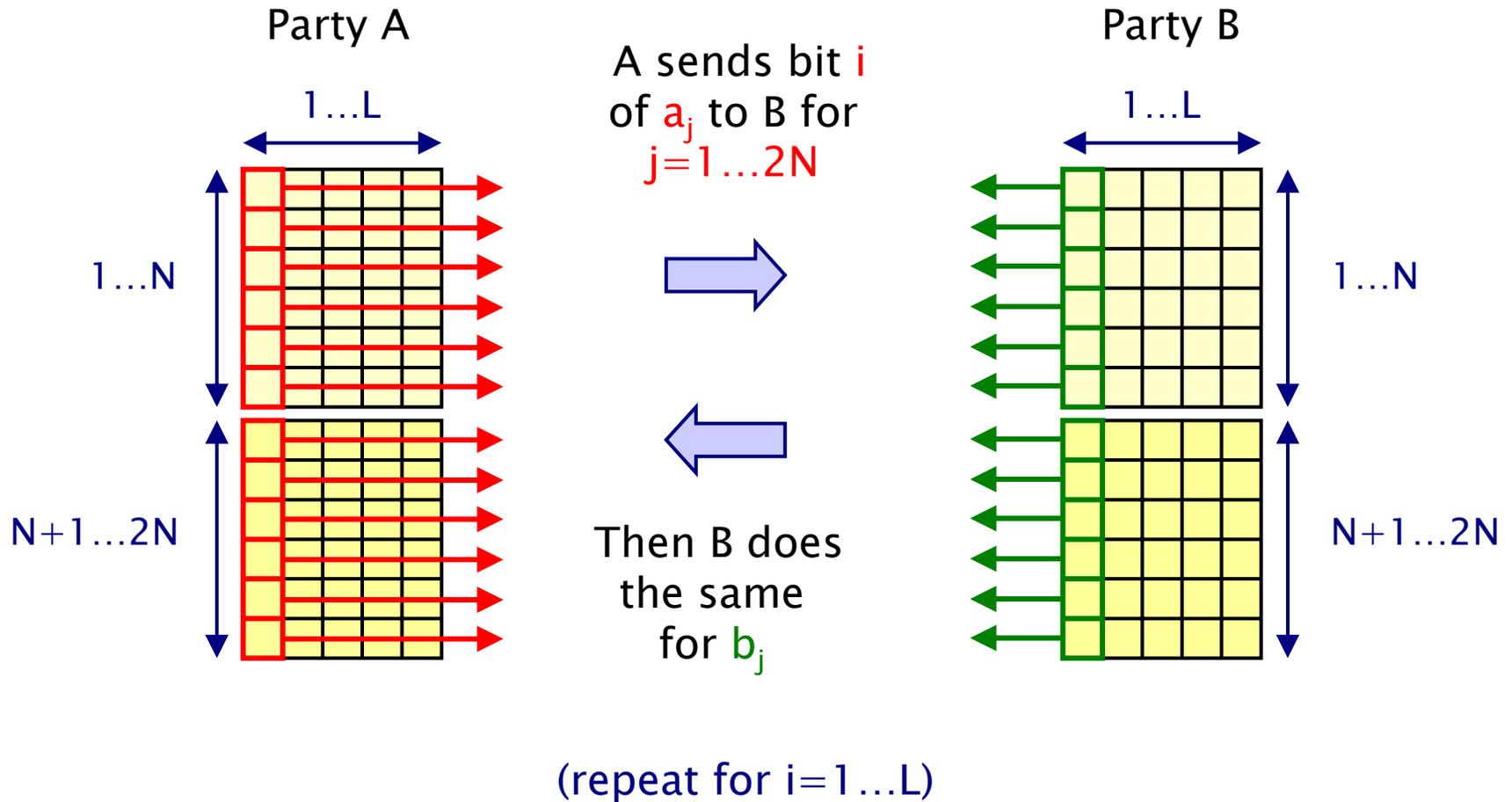
for (  $j=1, \dots, 2N$  )

B transmits bit i of secret  $b_j$  to A

# EGL protocol – Step 1



# EGL protocol – Step 2



# Contract signing – Results

- Modelled in PRISM as a DTMC (no concurrency) [NS06]
- Discovered a **weakness** in the protocol
  - party B can act maliciously by quitting the protocol early
  - this behaviour not considered in the original analysis
- PRISM analysis shows
  - if B stops participating in the protocol as soon as he/she has obtained one of A pairs, then, with probability 1, at this point:
    - B possesses a pair of A's secrets
    - A does **not** have complete knowledge of **any** pair of B's secrets
  - protocol is not fair under this attack:
  - B **has a distinct advantage over A**

# Contract signing – Results

- The protocol is unfair because in step 2:
  - A sends a bit for each of its secret **before** B does
- Can we make this protocol fair by changing the message sequence scheme?
- Since the protocol is asynchronous the best we can hope for is
  - B (or A) has this advantage with **probability  $\frac{1}{2}$**
- We consider 3 possible alternative message sequence schemes...

# Contract signing – EGL2

(step 1)

...

(step 2)

for (  $i=1, \dots, L$  )

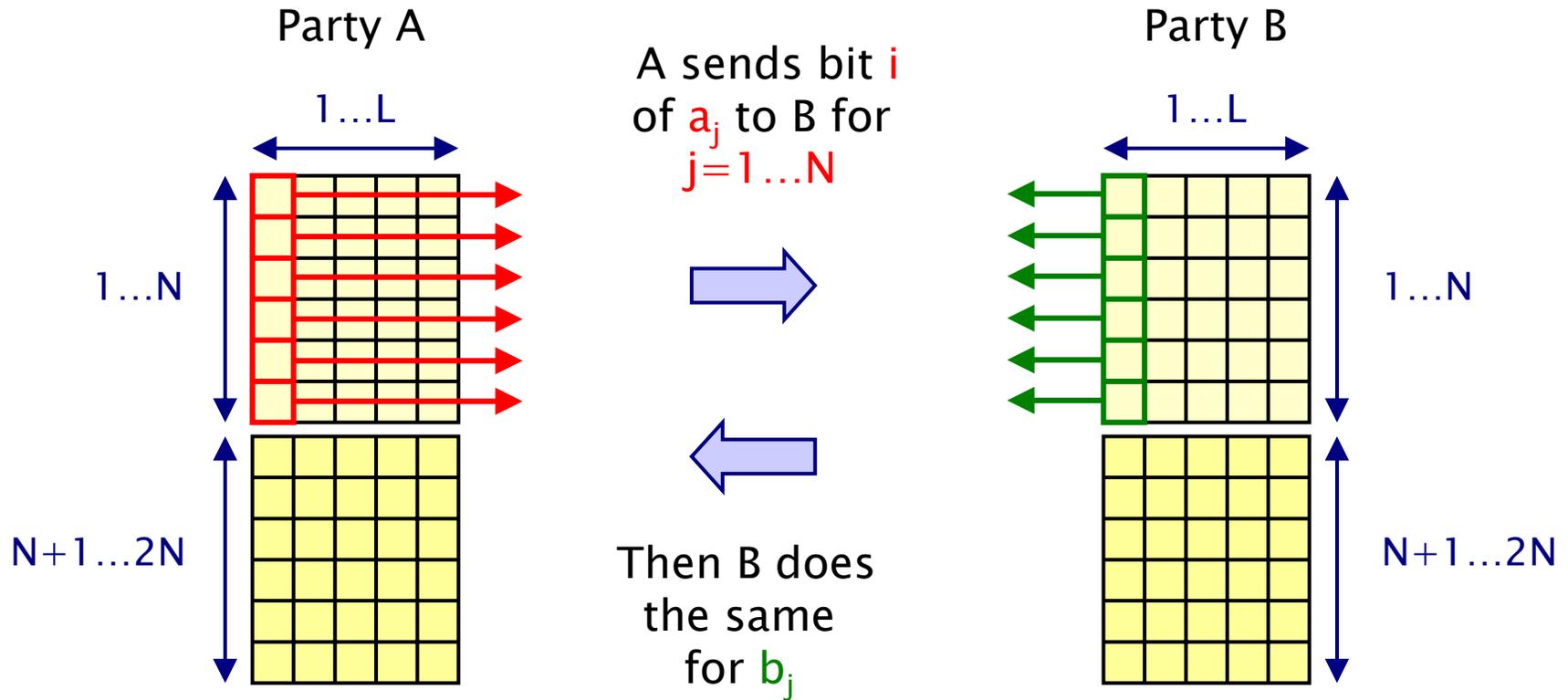
for (  $j=1, \dots, N$  ) A transmits bit  $i$  of secret  $a_j$  to B

for (  $j=1, \dots, N$  ) B transmits bit  $i$  of secret  $b_j$  to A

for (  $j=N+1, \dots, 2N$  ) A transmits bit  $i$  of secret  $a_j$  to B

for (  $j=N+1, \dots, 2N$  ) B transmits bit  $i$  of secret  $b_j$  to A

# Modified step 2 for EGL2



(after  $j=1 \dots N$ , send  $j=N+1 \dots 2N$ )  
(then repeat for  $i=1 \dots L$ )

# Contract signing – EGL3

(step 1)

...

(step 2)

for (  $i=1, \dots, L$  ) for (  $j=1, \dots, N$  )

    A transmits bit  $i$  of secret  $a_j$  to B

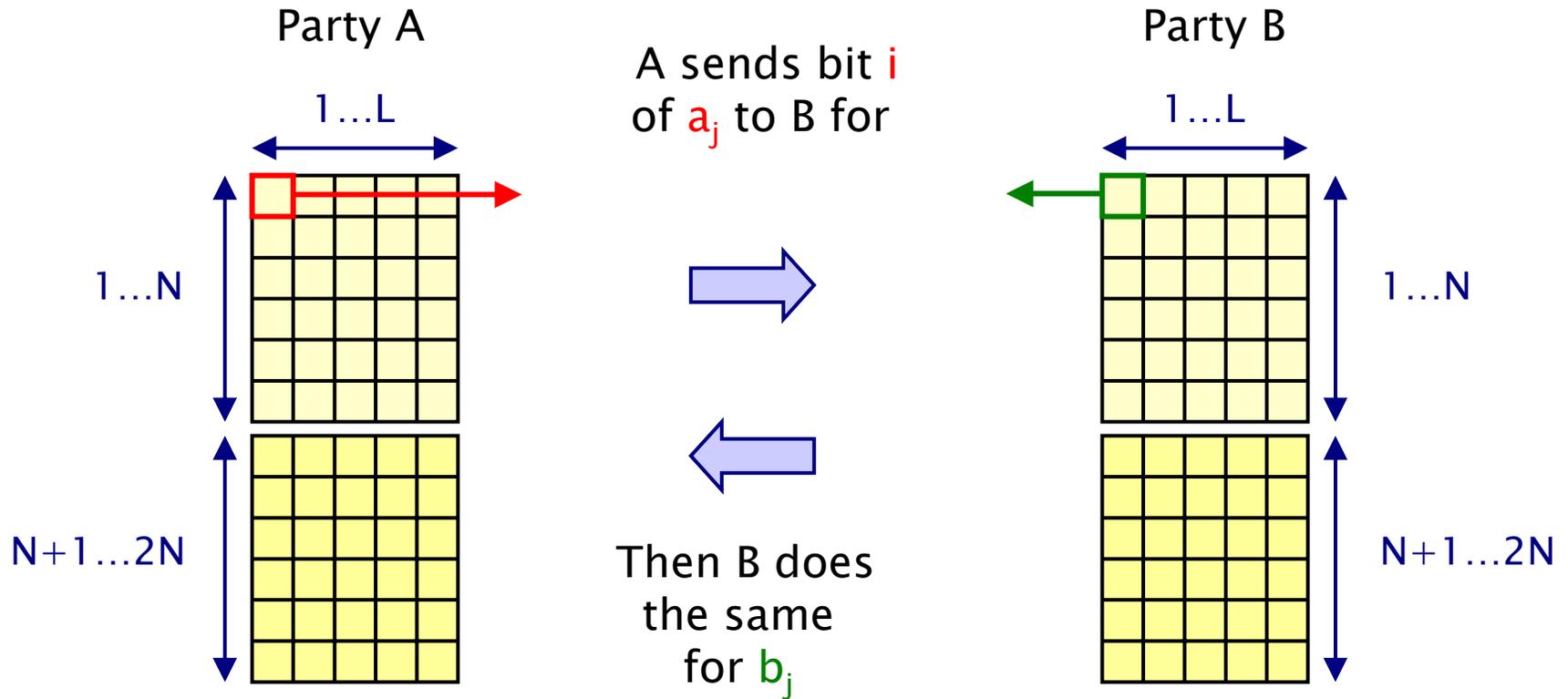
    B transmits bit  $i$  of secret  $b_j$  to A

for (  $i=1, \dots, L$  ) for (  $j=N+1, \dots, 2N$  )

    A transmits bit  $i$  of secret  $a_j$  to B

    B transmits bit  $i$  of secret  $b_j$  to A

# Modified step 2 for EGL3



(repeat for  $j=1 \dots N$  and for  $i=1 \dots L$ )  
(then send  $j=N+1 \dots 2N$  for  $i=1 \dots L$ )

# Contract signing – EGL4

(step 1)

...

(step 2)

for (  $i=1, \dots, L$  )

    A transmits bit  $i$  of secret  $a_1$  to B

        for (  $j=1, \dots, N$  ) B transmits bit  $i$  of secret  $b_j$  to A

        for (  $j=2, \dots, N$  ) A transmits bit  $i$  of secret  $a_j$  to B

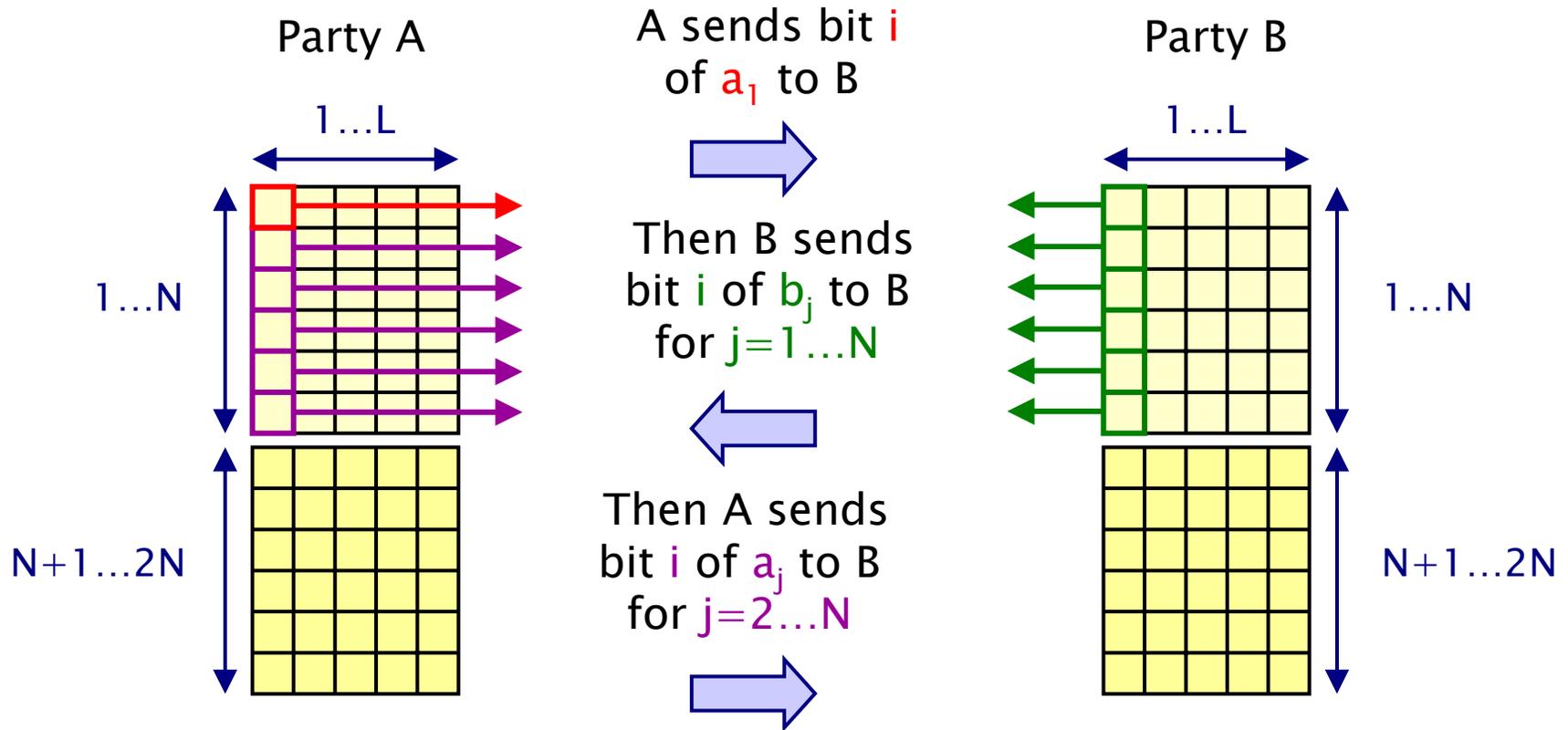
for (  $i=1, \dots, L$  )

    A transmits bit  $i$  of secret  $a_{N+1}$  to B

        for (  $j=N+1, \dots, 2N$  ) B transmits bit  $i$  of secret  $b_j$  to A

        for (  $j=N+2, \dots, 2N$  ) A transmits bit  $i$  of secret  $a_j$  to B

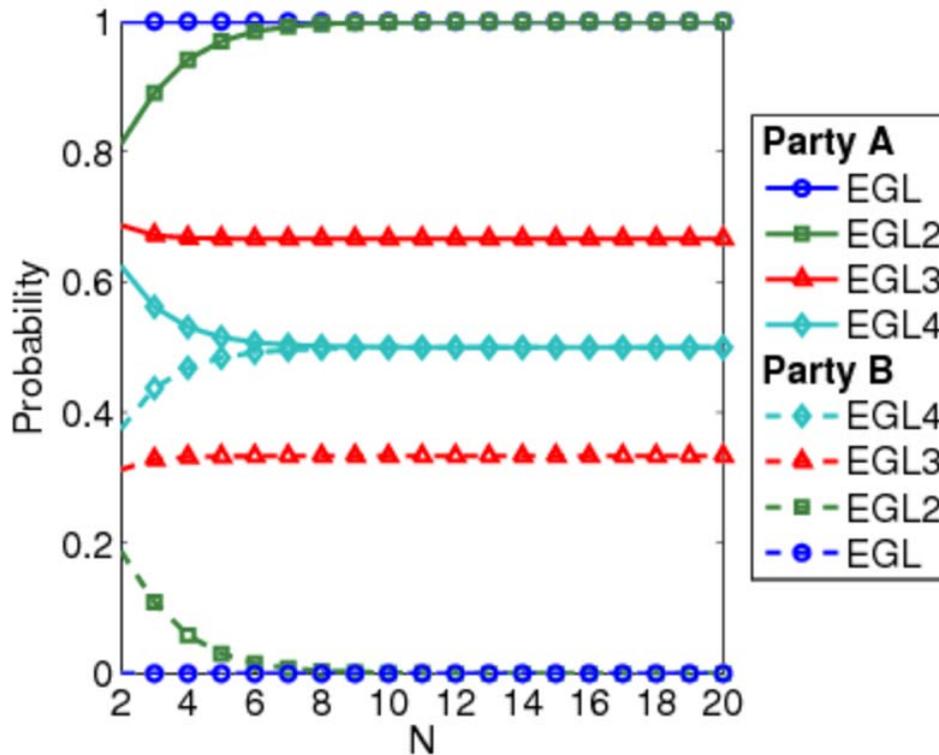
# Modified step 2 for EGL4



(repeat for  $i=1 \dots L$ )  
(then send  $j=N+1 \dots 2N$  in same fashion)

# Contract signing – Results

- The chance that the protocol is unfair
  - probability that one party gains knowledge first
  - $P_{=?}[F \text{ know}_B \wedge \neg \text{know}_A]$  and  $P_{=?}[F \text{ know}_A \wedge \neg \text{know}_B]$

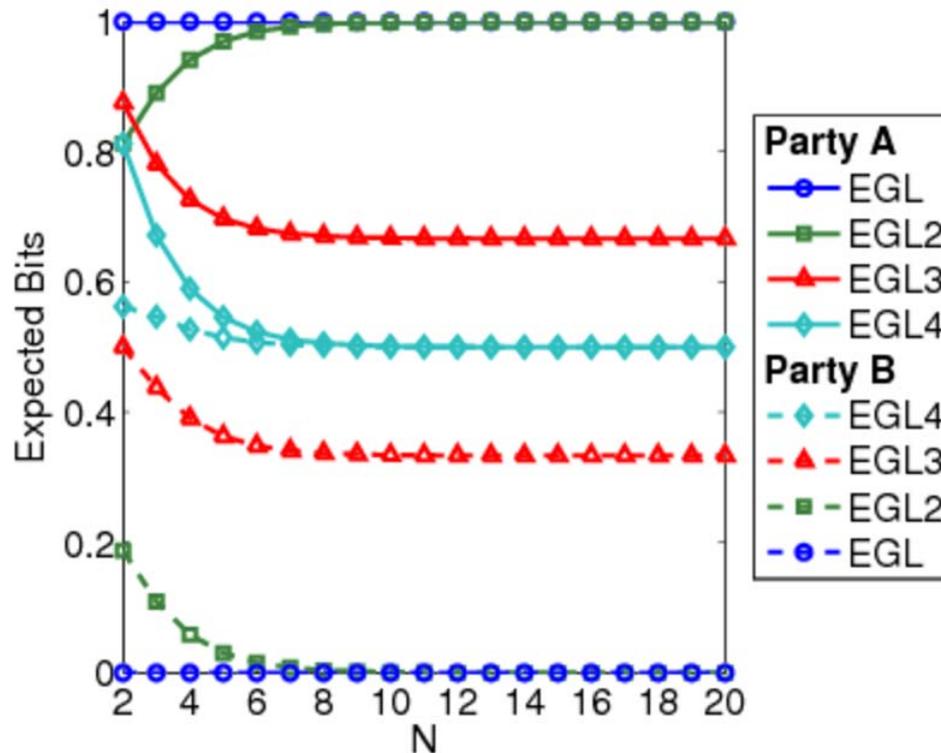


# Contract signing – Results

- How unfair the protocol is to each party
  - expected number of bits that a party needs to know a pair once the other party knows a pair
  - need to modify the model and define a reward structure
  - dependent on which party we are considering
- Expected number of bits that A needs to know a pair once B knows a pair
  - add a transition to a new state labelled by “done” as soon as B knows a pair
  - assign a reward equal to the number of bits that A requires to know a pair to this transition
  - check the formula  $R_{=?}[F \text{ done}]$

# Contract signing – Results

- How unfair the protocol is to each party
  - expected number of bits that a party needs to know a pair once the other party knows a pair

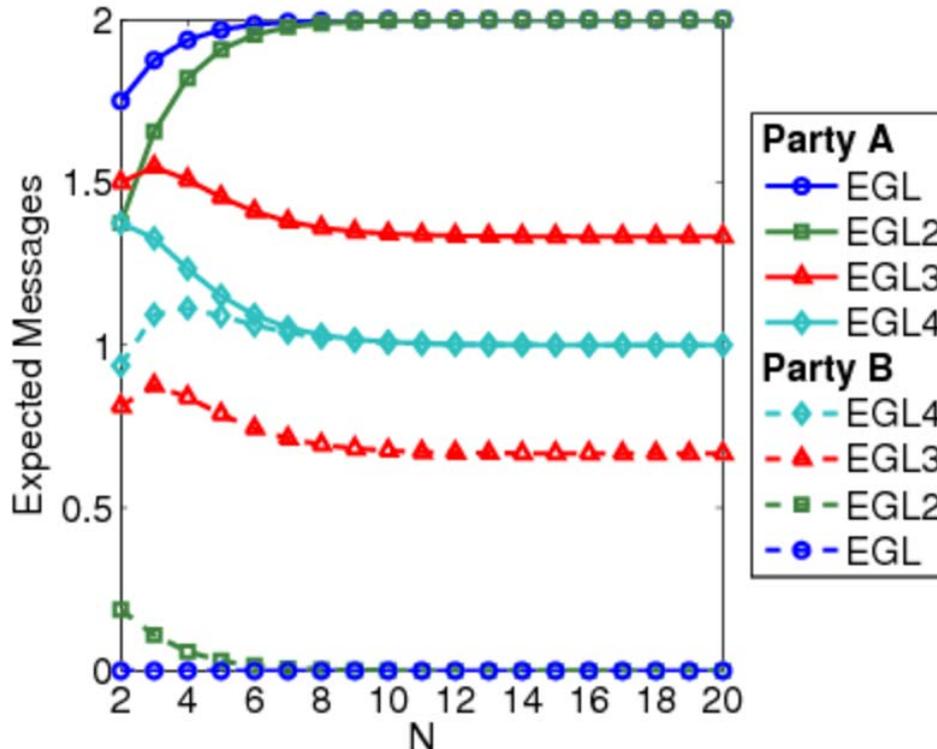


# Contract signing – Results

- The influence that each party has on the fairness
  - once a party knows a pair, the expected number of messages from this party required before the other party knows a pair
  - measures the influence as a corrupted party can delay its messages
  - need to define a reward structure
  - dependent on which party we are considering
- Once B knows a pair, the expected number of messages from B required before A knows a pair
  - assign reward of 1 to transitions which correspond to B sending a message to A from a state where B knows a pair
  - check the formula  $R_{=?}[F \text{ know}_A]$

# Contract signing – Results

- The influence the each party has on the fairness
  - once a party knows a pair, the expected number of messages from this party required before the other party knows a pair

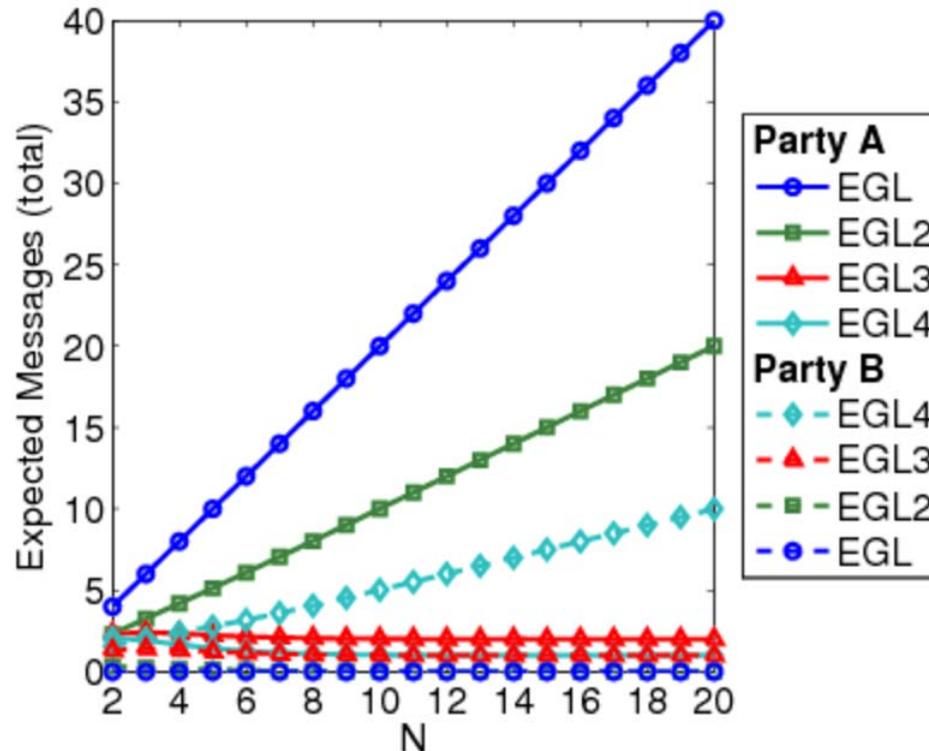


# Contract signing – Results

- The duration of unfairness of the protocol
  - once a party knows a pair, the expected total number of messages that need to be sent (by either party) before the other knows a pair
  - need to define a reward structure
  - dependent on which party we are considering
- Once B knows a pair, the expected total number of messages that need to be sent before A knows a pair
  - assign reward of 1 to transitions which correspond to either party sending a message from a state where B knows a pair
  - check the formula  $R_{=?}[F \text{ know}_A]$

# Contract signing – Results

- The duration of unfairness of the protocol
  - once a party knows a pair, the expected total number of messages that need to be sent before the other knows a pair

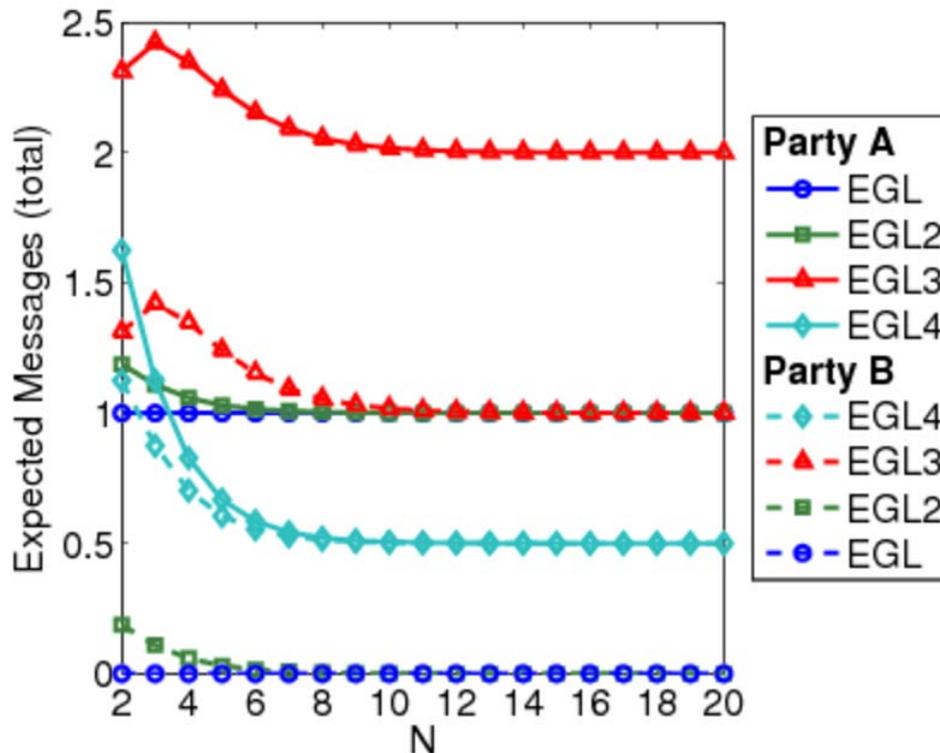


# Contract signing – Results

- Results show EGL4 is the ‘fairest’ protocol
- Except for duration of fairness measure...
- Expected messages that need to be sent for a party to know a pair once the other party knows a pair
  - this value is larger for B than for A
  - in fact, as  $n$  increases, this measure **increases for B** and **decreases for A**
- **Solution**
  - if a party sends a sequence of bits in a row (without the other party sending messages in between), require that the party send these bits as as a **single message**

# Contract signing – Results

- The duration of unfairness of the protocol
  - once a party knows a pair, the expected total number of messages that need to be sent before the other knows a pair



# Summing up...

- What have we achieved?
- For Bluetooth device discovery,
  - for the **first time**, obtained exact worst case expected response time to 1 message, and likewise for 2 messages
  - can pinpoint the cause, impossible with simulation
  - BTW, it is 2.5 seconds!
  - no wonder Bluetooth gets criticised for being slow...
- For contract signing
  - identified an assumption missed by the authors
  - proposed a fix

# Further information

- More on the Bluetooth case study
  - see [DKNP06]
- More on contract signing
  - see [NS06]
- More on similar protocols
  - Crowds anonymity [Shm04]
  - probabilistic anonymity [BP05]
  - PIN cracking [Ste06]
- More information, see the PRISM web page  
[www.prismmodelchecker.org](http://www.prismmodelchecker.org)