## A Multi-Paradigm Concurrent Programming Model

Janwillem Swalens

Promotors:

Prof. Dr. Wolfgang De Meuter

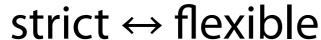
Prof. Dr. Joeri De Koster





## Q: Why are there so many programming languages?

Different tools for different jobs







general purpose ↔ domain specific





fast programs ↔ fast development

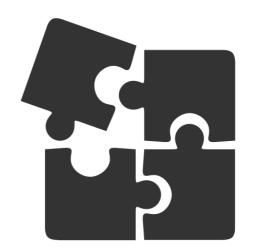




## Q: Why create a new programming language?

Research technique

Small language with features we want to study

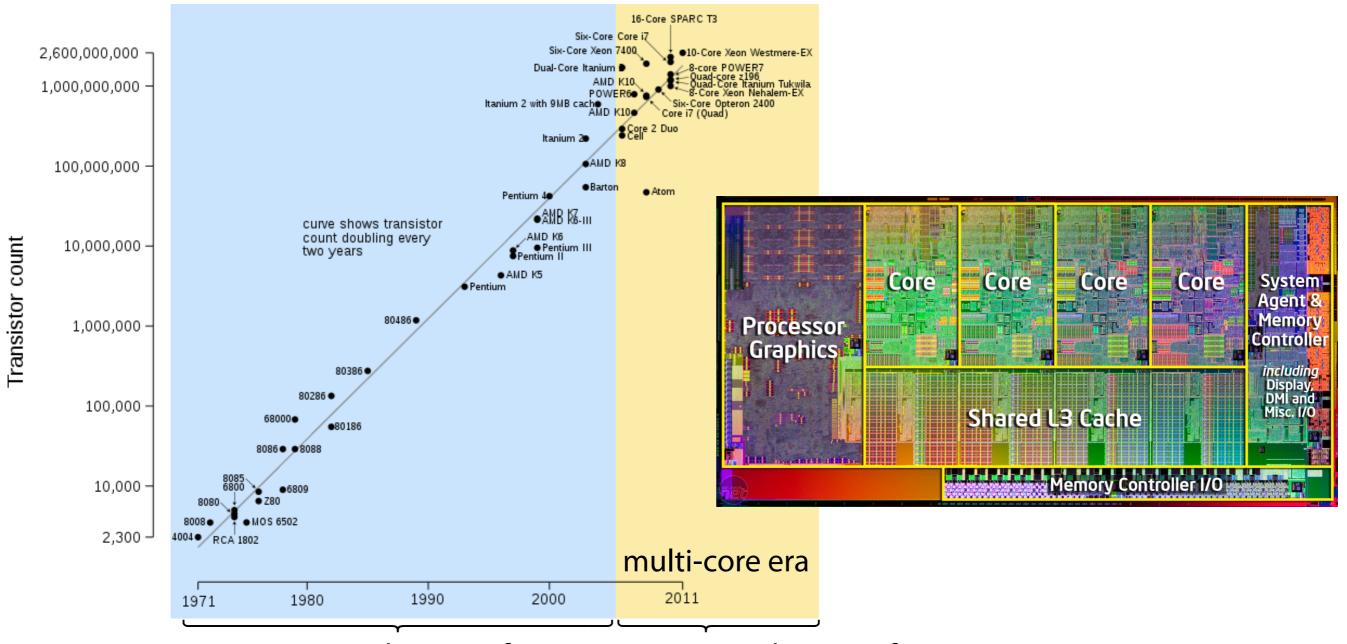


Can later be added to existing programming languages

### Multi-core processors

#### Moore's law:

# transistors on chip doubles every two years

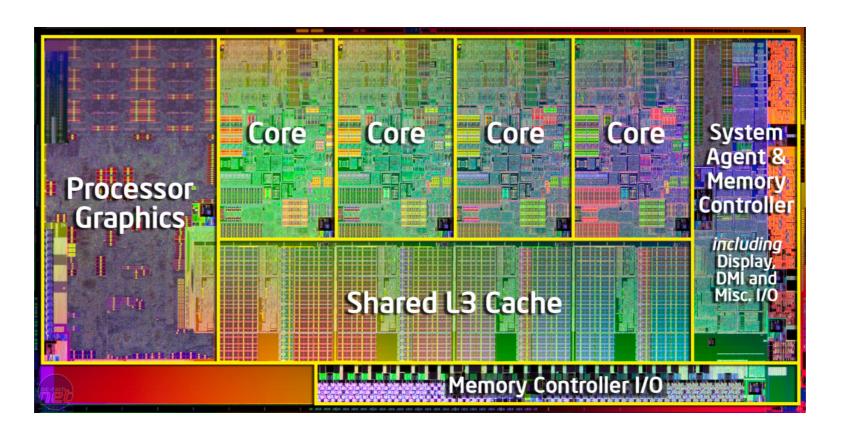


processors become faster because they execute instructions faster

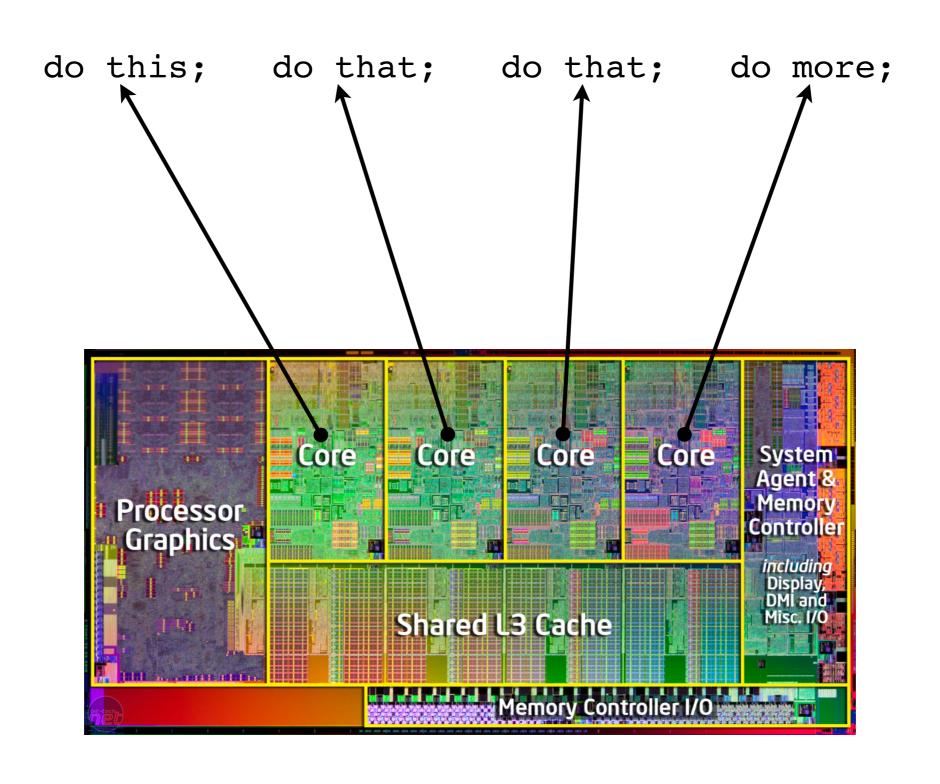
processors become faster because they execute more instructions in parallel

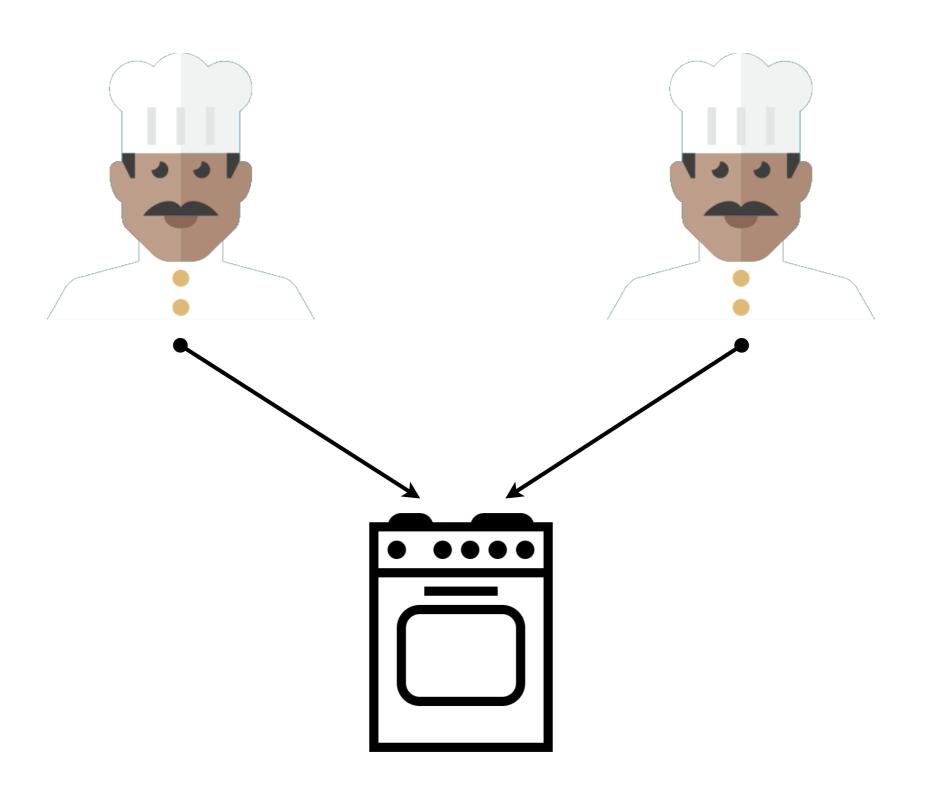
## Sequential program

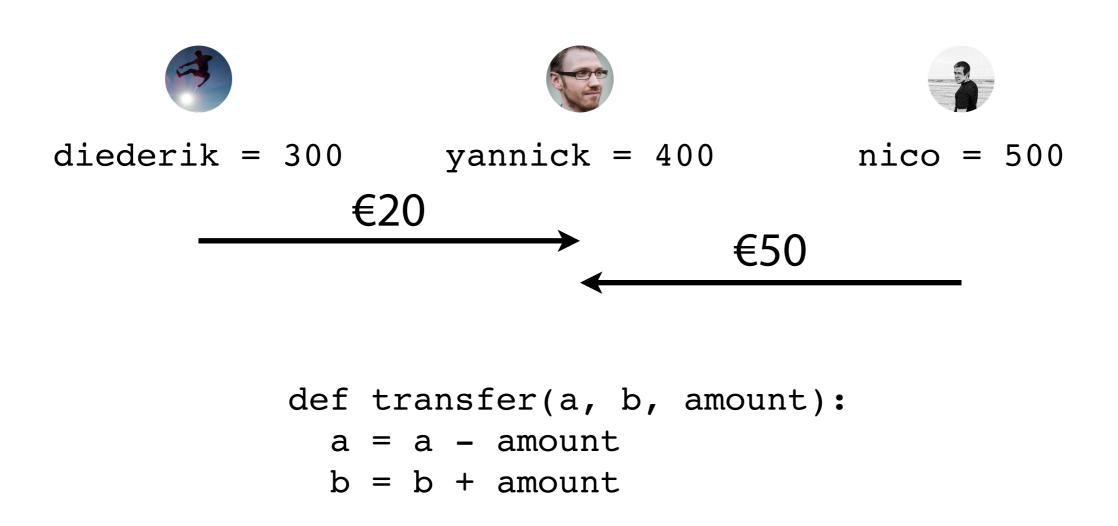
```
do this;
do that;
do that;
do more;
```

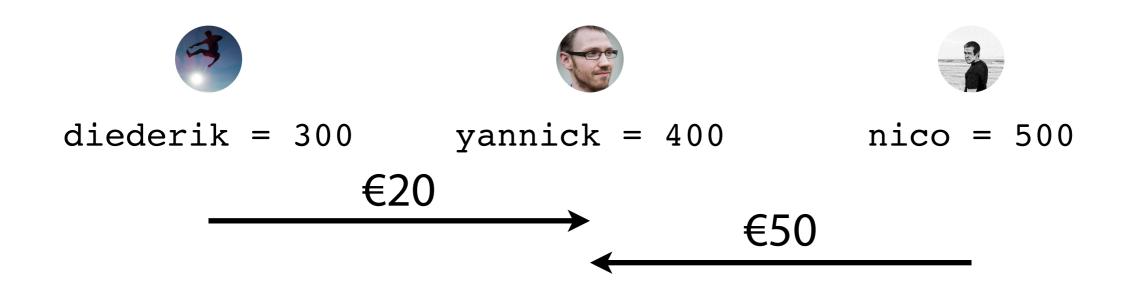


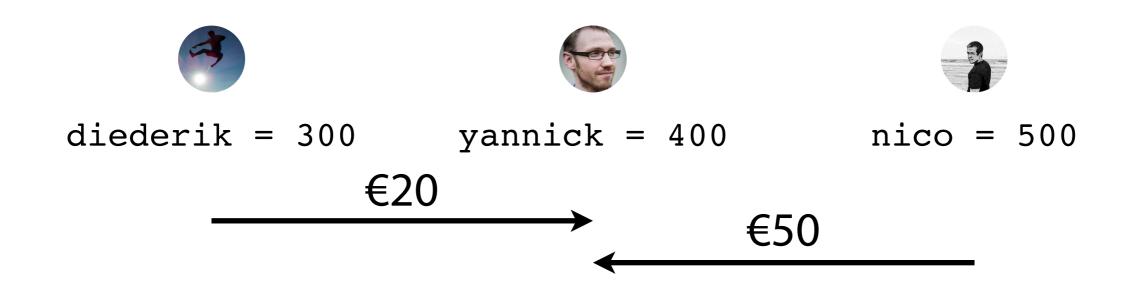
#### Program with concurrency

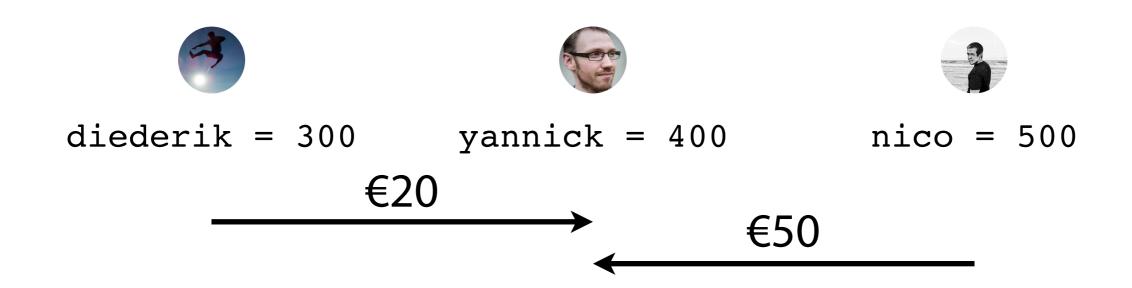


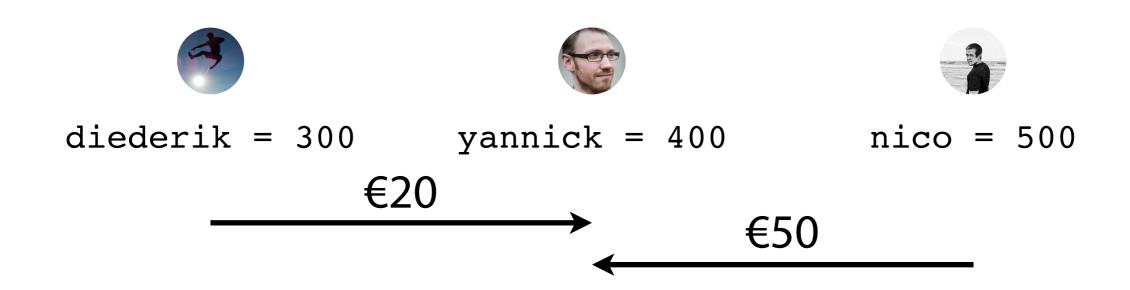


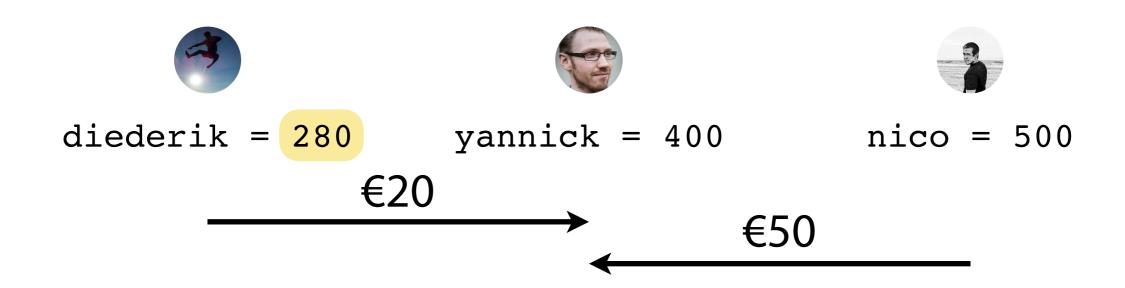


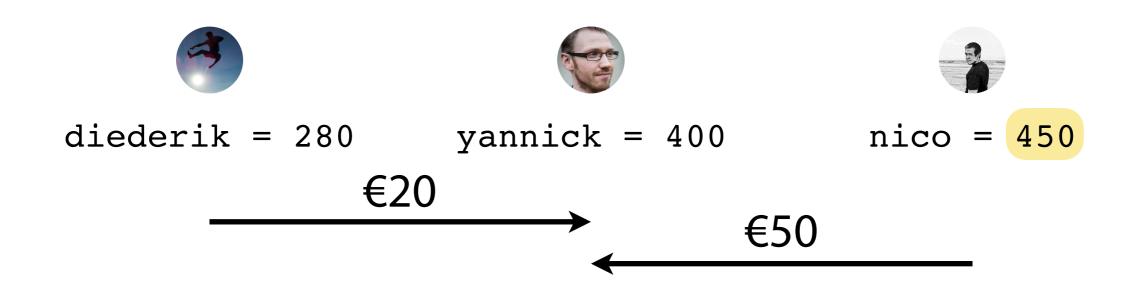


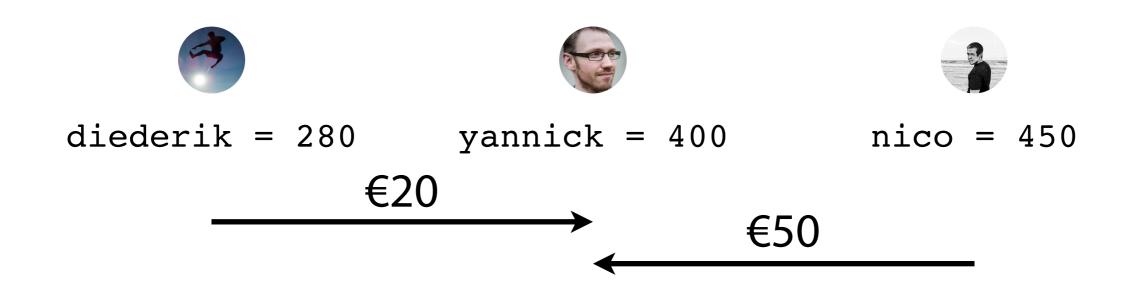




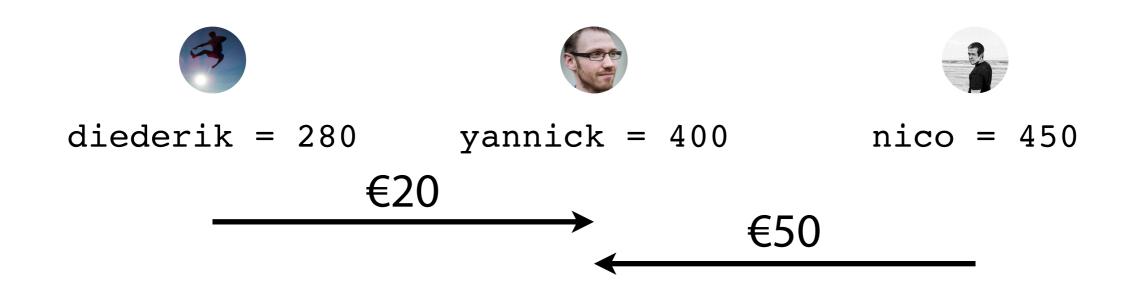






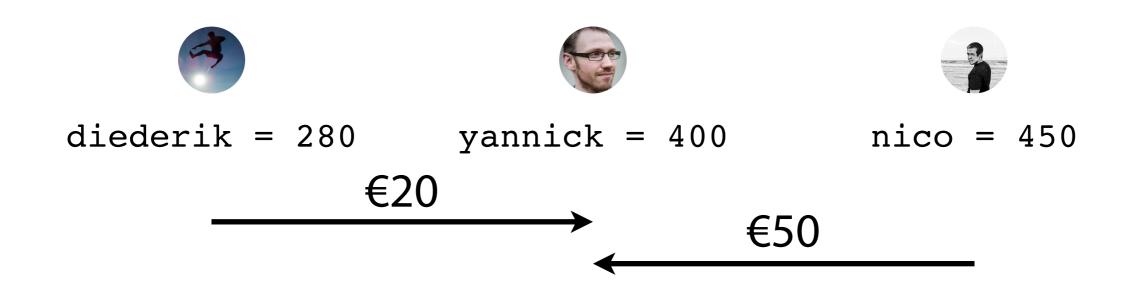


$$diederik = 280$$
  
yannick =  $400 + 20$ 

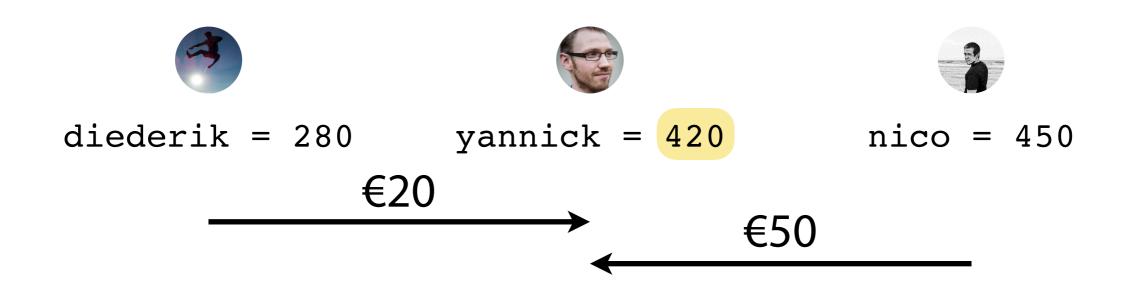


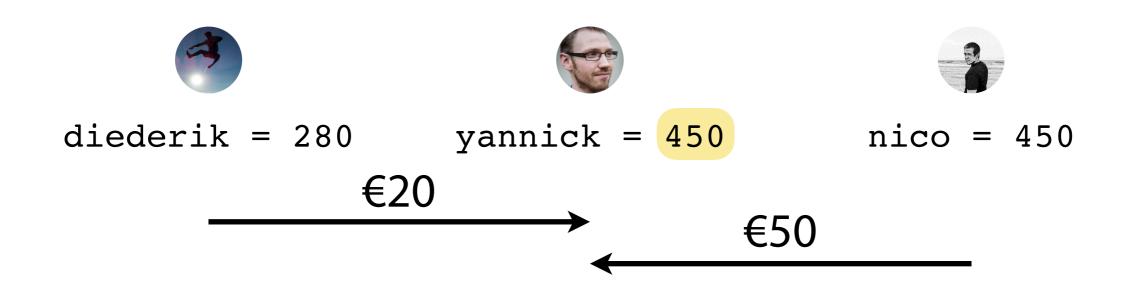
$$diederik = 280$$
  
yannick =  $400 + 20$ 

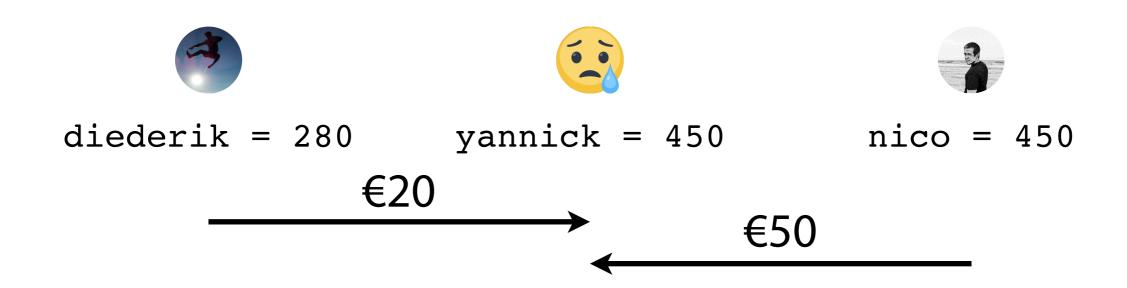
$$nico = 450$$
  
yannick =  $400 + 50$ 



diederik = 280 yannick = 420 nico = 450 yannick = 450







#### race condition

### Concurrency is necessary but difficult

Concurrency bugs are frequent, difficult to reproduce, and difficult to debug

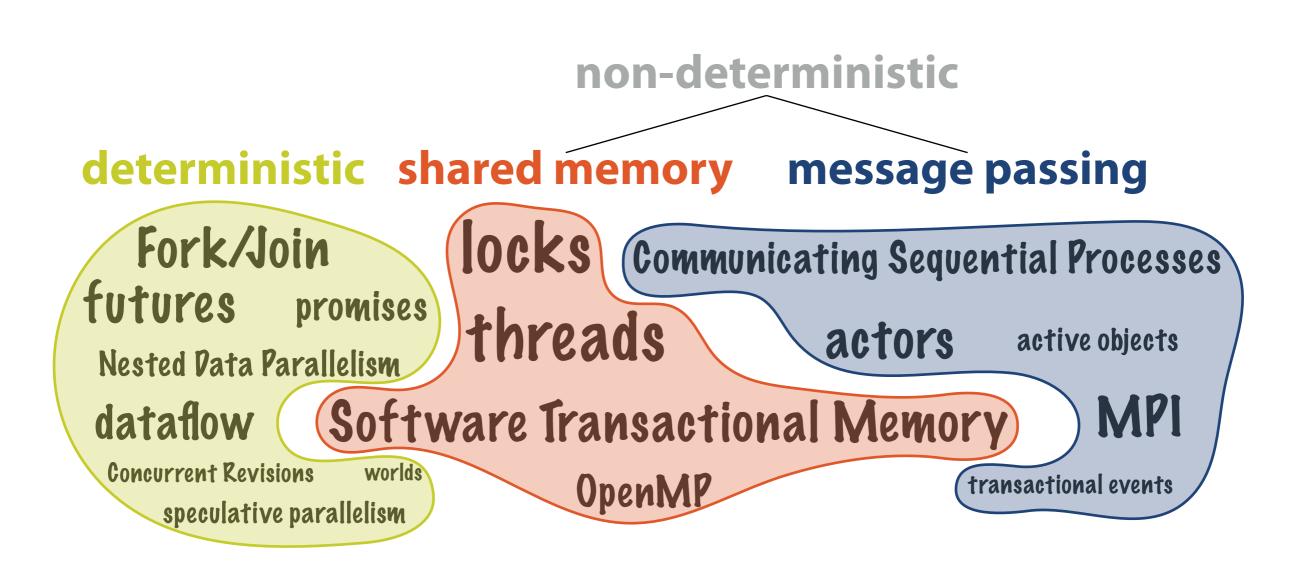


#### **Concurrency models:**

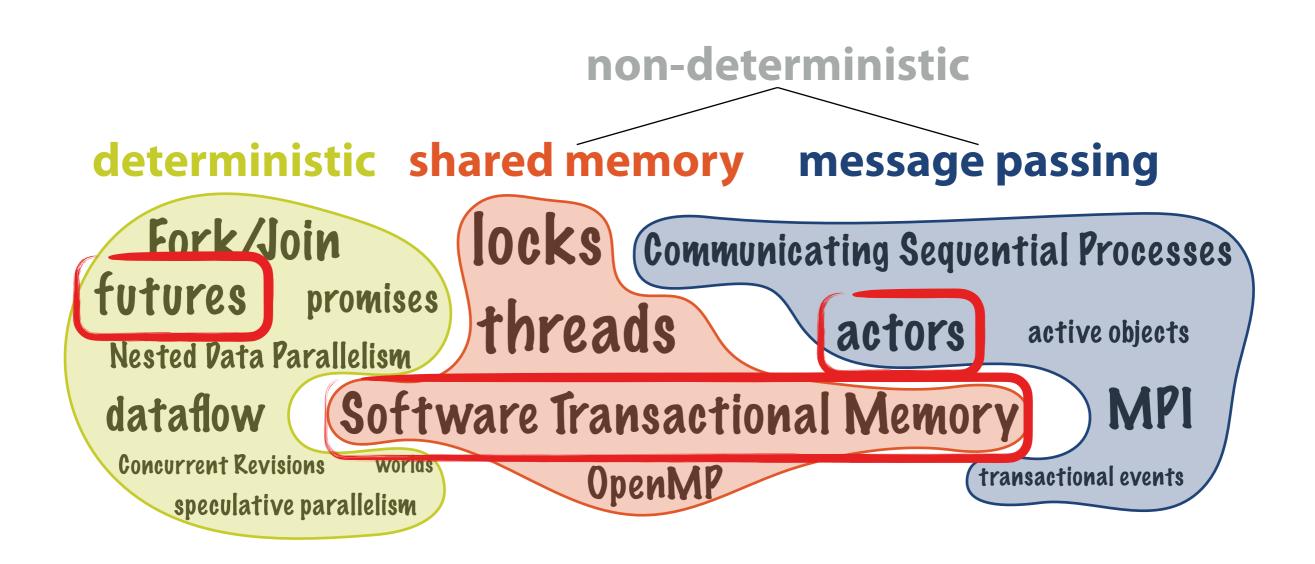
set of programming language constructs

that introduce concurrency but with restrictions to prevent bugs

# There are many different concurrency models



# There are many different concurrency models



#### **Futures**

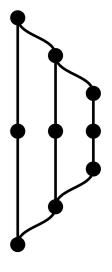
```
(def thumbnail1 (resize-image "1.jpg"))
(def thumbnail2 (resize-image "2.jpg"))
(show thumbnail1 thumbnail2)
```

#### **Futures**

```
(def thumbnail1 (fork (resize-image "1.jpg")))
(def thumbnail2 (fork (resize-image "2.jpg")))
(show (join thumbnail1) (join thumbnail2))
```

Guarantee:

**Det** determinacy

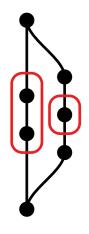


#### **Transactions**

#### Guarantees:

Iso isolation (e.g. serializability, snapshot isolation)

Pro progress (e.g. deadlock freedom)



#### **Actors**

```
(def airline-behavior
  (behavior [flights]
    [orig dest n]
    (let [flight (search-flight flights orig dest)
          flights' (reserve flights flight)]
      (become airline-behavior flights'))))
(def air-canada
  (spawn airline-behavior
    {"AC854" {:orig "YVR" :dest "LHR" :seats 211}
     "AC855" {:orig "LHR" :dest "YVR" :seats 211}}))
(send air-canada "LHR" "YVR" 2)
Guarantees:
                                                   behavior
ITP isolated turn principle
                                                   code
```

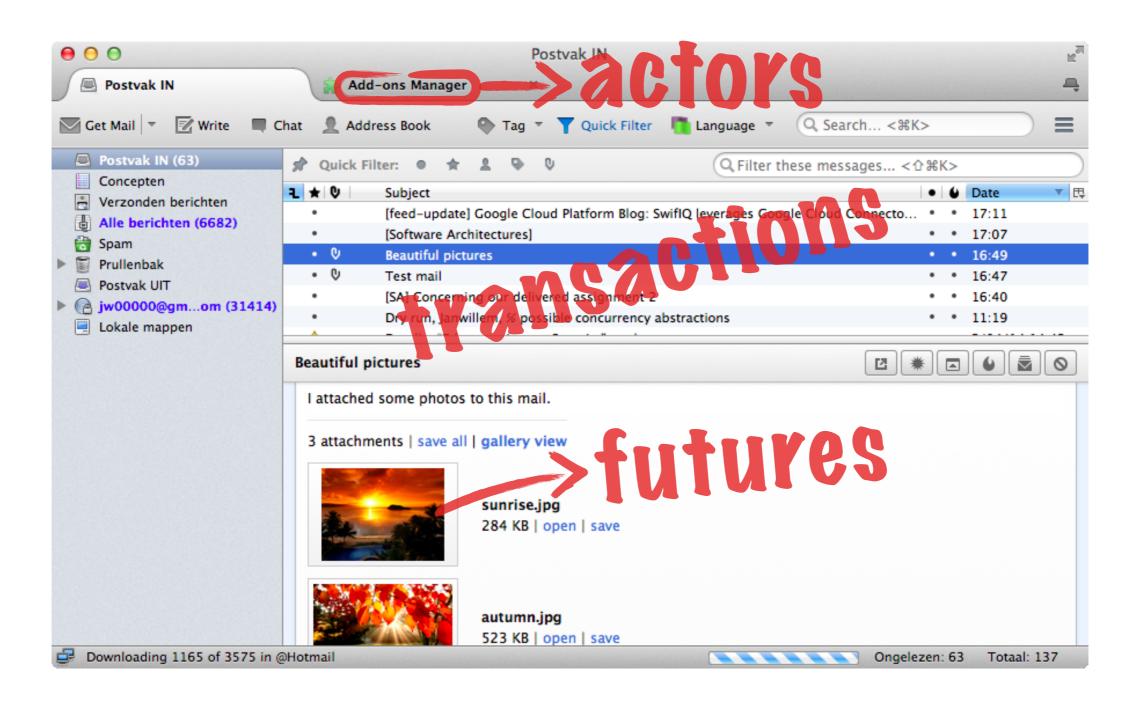
**DLF** deadlock freedom

### Summary

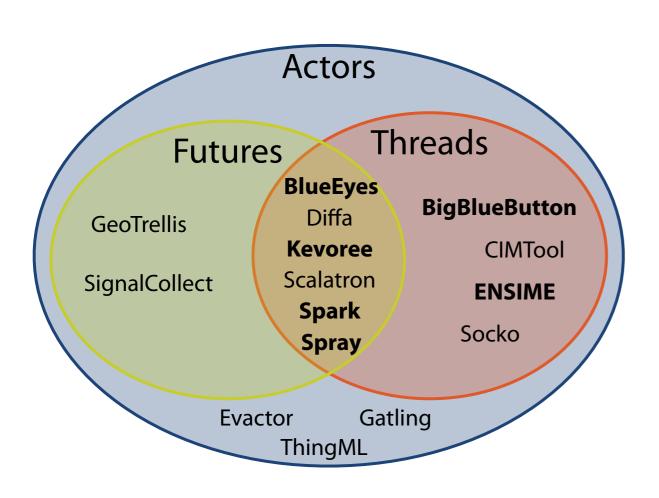
Futures	Transactions	Actors			
Deterministic	Shared memory	Message passing			
(fork e)	(atomic e)	(behavior [x] [x] e)			
(join f)	(ref v)	(spawn b v)			
	(deref r)	(send a v)			
	(ref-set r v)	(become b v)			
<b>Det</b> Determinacy	Iso Isolation	ITP Isolated turn principle			
	Pro Progress	DLF Deadlock freedom			

Formalization of three separate models © Chapter 2

## Different concurrency models target different use cases



## Observation 1: programmers combine concurrency models



15 Scala programs with actors:

- 12/15 (80%) combine with another model
- 6/15 (40%) say they circumvent it where it is "not a good fit"

## Observation 2: programming languages support many concurrency models

	Clojure	Scala	Java	Haskell	C++
Deterministic models					
Futures	$\checkmark$	$\checkmark$	$\checkmark$	•	$\checkmark$
Promises	$\checkmark$	$\checkmark$	$\checkmark$	•	$\checkmark$
Fork/Join	<b>/</b> *	<b>/</b> *	$\checkmark$		•
Parallel collections	<b>/</b> *	$\checkmark$	$\checkmark$	•	•
Dataflow	•	•	•	•	
Shared-memory models					
Threads	<b>/</b> *	<b>/</b> *	$\checkmark$	$\checkmark$	$\checkmark$
Locks	<b>/</b> *	<b>/</b> *	$\checkmark$	$\checkmark$	$\checkmark$
Atomic variables	$\checkmark$	<b>/</b> *	$\checkmark$	$\checkmark$	$\checkmark$
Transactional memory	<b>√</b>	•	•	$\checkmark$	•
Message-passing models					
Actors	•	•	•	•	•
Channels	$\checkmark$	$\checkmark$	•	$\checkmark$	•
Agents	$\checkmark$				
# supported models	10	8	7	5	5

✓ built in

library

Clojure has 6 concurrency models built in

(+ 4 through JVM)

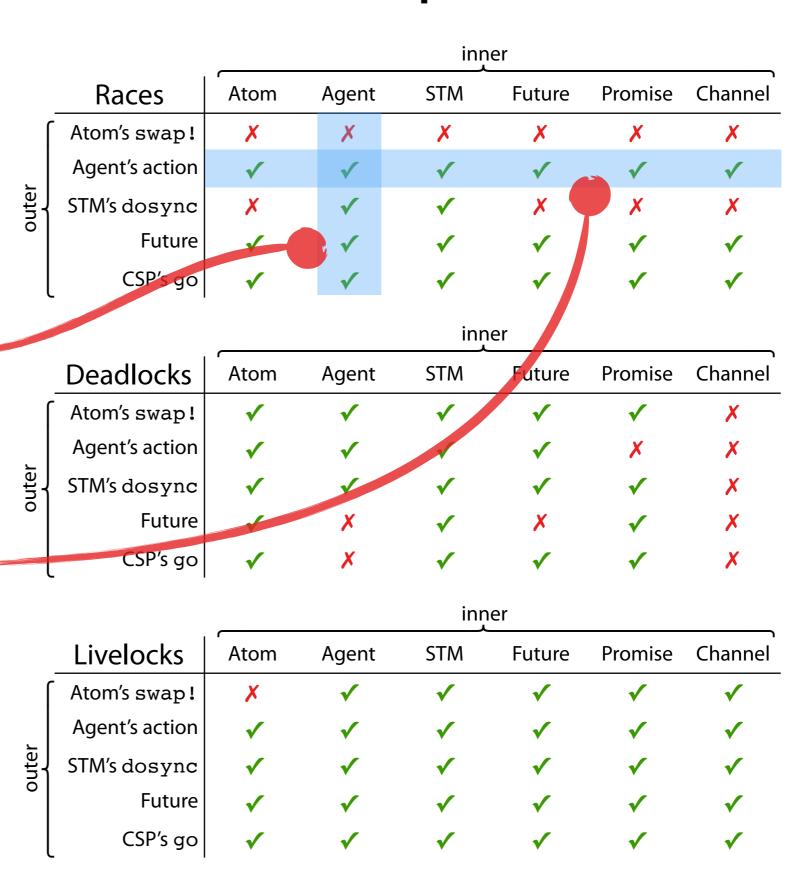
Developers **combine** concurrency models. Programming languages allow this.

How does this affect their **guarantees**?

#### Naive combinations lead to problems

#### Case study of Clojure

```
(send (fn [v] (swap! ...))
(send (fn [v] (send ...))
(send (fn [v] (dosync ...))
(send (fn [v] (future ...))
(send (fn [v] (promise ...))
(send (fn [v] (go ...))
```



#### Naive combinations lead to problems

#### 3 common problems:

- spurious retries
  - $\Rightarrow$  races
- unexpected blocking
  - ⇒ deadlocks
- unexpected retries
  - ⇒ livelocks

				inn	ner		
	Races	Atom	Agent	STM	Future	Promise	Channel
	Atom's swap!	Х	X	X	Х	X	X
	Agent's action	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
outer	STM's dosync	X	✓	✓	X	X	X
	Future	✓	✓	✓	✓	✓	✓
	CSP's go	✓	✓	✓	✓	✓	✓

				inr 	ner		
	Deadlocks	Atom	Agent	STM	Future	Promise	Channel
	Atom's swap!	✓	✓	✓	✓	✓	X
outer	Agent's action	✓	✓	$\checkmark$	$\checkmark$	X	X
	STM's dosync	✓	$\checkmark$	$\checkmark$	$\checkmark$	✓	X
0	Future	✓	X	✓	X	✓	X
	CSP's go	✓	X	<b>√</b>	✓	<b>√</b>	X

Caused by operations that:

- retry
- block

				inn	er		
	Livelocks	Atom	Agent	STM	Future	Promise	Channel
uter	Atom's swap!	X	✓	✓	✓	✓	✓
	Agent's action	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
	STM's dosync	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
Ō	Future	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$
l	CSP's go	✓	$\checkmark$	✓	✓	$\checkmark$	$\checkmark$

#### Naive combinations lead to problems

We need to study each combination and how it affects the guarantees

				inn	ner		
	Races	Atom	Agent	STM	Future	Promise	Channel
ſ	Atom's swap!	X	Х	Х	Х	Х	Х
	Agent's action	✓	✓	✓	✓	✓	✓
outer	STM's dosync	X	✓	✓	X	X	X
$^{\circ}$	Future	✓	✓	$\checkmark$	✓	✓	✓
l	CSP's go	✓	✓	✓	✓	✓	$\checkmark$
				inņ	ner		
	Deadlocks	Atom	Agent	STM	Future	Promise	Channel
ſ	Atom's swap!	✓	✓	✓	✓	✓	Х
	Agent's action	✓	✓	✓	✓	X	X
outer	STM's dosync	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	X
$^{\circ} $	Future	✓	X	✓	X	$\checkmark$	X
l	CSP's go	✓	X	✓	✓	$\checkmark$	X
				inn	ier		
	Livelocks	Atom	Agent	STM	Future	Promise	Channel
ſ	Atom's swap!	Х	✓	✓	✓	✓	✓
outer	Agent's action	✓	✓	✓	✓	✓	$\checkmark$
	STM's dosync	✓	✓	✓	✓	$\checkmark$	$\checkmark$
$^{\circ} $	Future	✓	✓	✓	✓	✓	$\checkmark$
	CSP's go	✓	$\checkmark$	$\checkmark$	<b>√</b>	$\checkmark$	$\checkmark$

## We studied the combinations of futures, transactions, and actors

	Future	Transaction	Actor
Future	(fork (fork) (join))	(fork (atomic))	<pre>(fork   (spawn)   (send)   (become))  Communication</pre>
	Nested futures	Parallel transactions	in future
Transaction	<pre>(atomic   (fork)   (join))  Parallelism   in transaction</pre>	<pre>(atomic   (atomic)   (ref)   (deref)   (ref-set))  Nested transactions</pre>	<pre>(atomic   (spawn)   (send)   (become))  Communication   in transaction</pre>
Actor	(behavior [] []   (fork)   (join))  Parallelism in actor	(behavior [] []   (atomic))  Shared memory   in actor	(behavior [] []   (spawn)   (send)   (become))  Actors

#### Goals

Unified model of futures, transactions, and actors that:

1 Separate models: backward compatibility

2 Combinations: maintain guarantees of all models If impossible: define a less restrictive guarantee

## "Naive" combinations

	inner				
	→ in↓	Future	Transaction	Actor	
	Future	Nested futures (Section 3.3.3)	Parallel transactions (Section 4.1)	Communication in future (Section 6.1)	
outer	Transaction	Parallelism in transaction (Sections 4.2–4.4)  Det  Iso Pro	Nested transactions (Section 3.3.3)  Iso Pro	Communication in transaction (Chapter 5)  Pro  DLF  DLF  DLF	
	Actor	Parallelism in actor (Section 6.1)  Det  DLF	Shared memory in actor (Chapter 5)  Iso Pro  DLF	Actors (Section 3.3.3)  ITP DLF	

## Trivial combinations

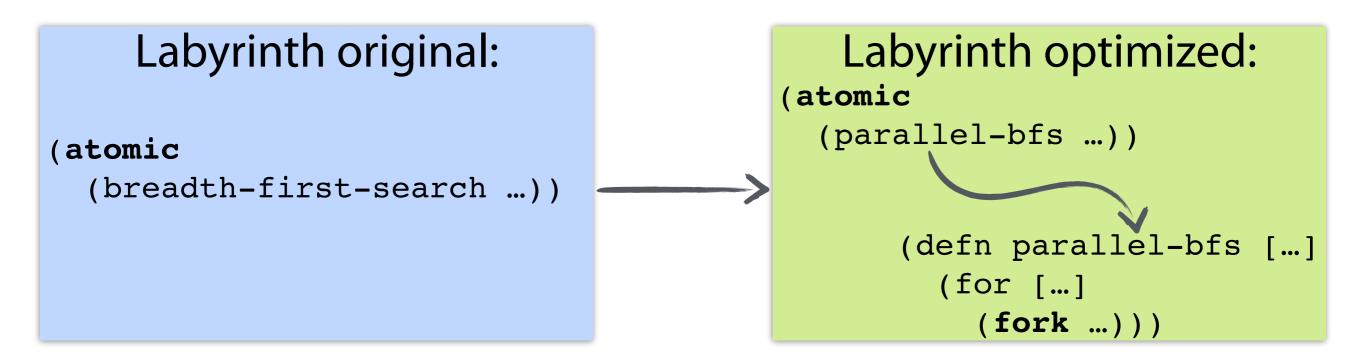
	inner				
→ in↓		Future	Transaction	Actor	
	Future	Nested futures (Section 3.3.3)  Det	Parallel transactions (Section 4.1)  Det  Iso Pro	Communication in future (Section 6.1)  Det  ITP DLF	
outer	Transaction	Parallelism in transaction (Sections 4.2–4.4)  Det  Iso Pro	Nested transactions (Section 3.3.3)  Iso Pro	Communication in transaction (Chapter 5)  Iso Pro  DLF	
	Actor	Parallelism in actor (Section 6.1)  Det  DLF	Shared memory in actor (Chapter 5)  Iso Pro  DLF	Actors (Section 3.3.3)  ITP DLF	

### Transactions + Futures

inner				
→in↓		Future	Transaction	Actor
	Future	Nested futures (Section 3.3.3)  Det	Parallel transactions (Section 4.1)  Det  Iso Pro	Communication in future (Section 6.1)  Det  ITP DLF
outer	Transaction	Parallelism in transaction (Sections 4.2–4.4)  Det  Iso Pro	Nested transactions (Section 3.3.3)  Iso Pro	Communication in transaction (Chapter 5)  Pro  DLF
	Actor	Parallelism in actor (Section 6.1)  Det  DLF	Shared memory in actor (Chapter 5)  Iso Pro  DLF	Actors (Section 3.3.3)  ITP DLF

### Motivation: Parallelism in Transaction

Application	Transaction length (mean # of instructions per tx)	Average time in transaction	
Labyrinth	219,571	100% ■	
Bayes	60,584	83%	
Yada	9,795	100%	
Vacation-high	3,223	86%	
Genome	1,717 ■	97%	parallelism within transaction
Intruder	330 □	33% □	paranensin within transaction
Kmeans-high	117 □	7% □	
SSCA2	50 □	17% □	



## Problems when creating future in transaction

Impure languages (e.g. Clojure, ScalaSTM)

Tasks in transaction do not share context

⇒ no access to transactional state

⇒ isolation broken 180



#### Pure languages (Haskell)

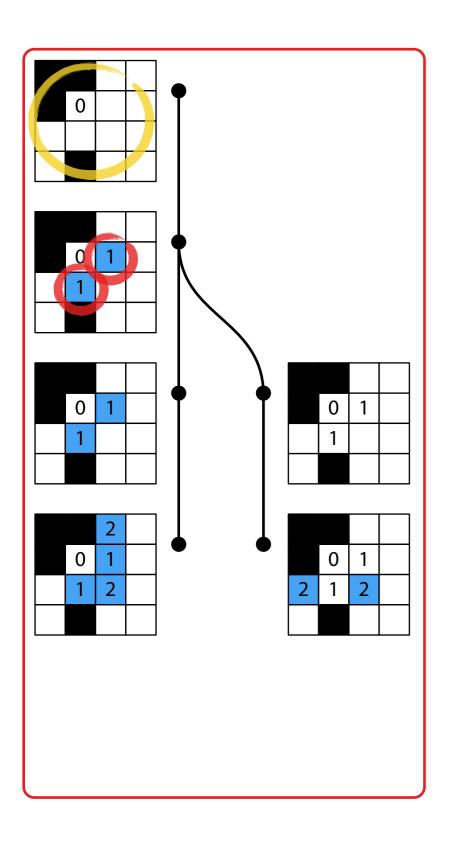
Tasks in transaction prohibited

⇒ isolation guaranteed but parallelism limited

```
(atomic
  (fork
(atomic
  (fork
     (atomic (ref-set ...)))
```

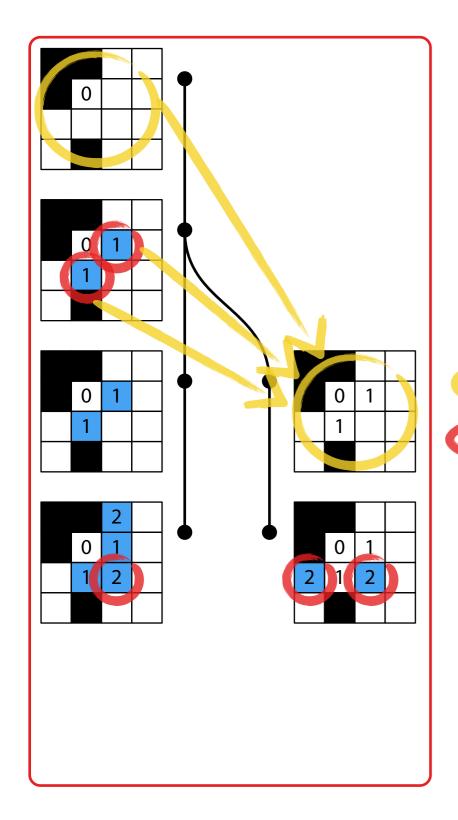


## **Transactional Futures**



```
(atomic (ref-set ... 1)
```

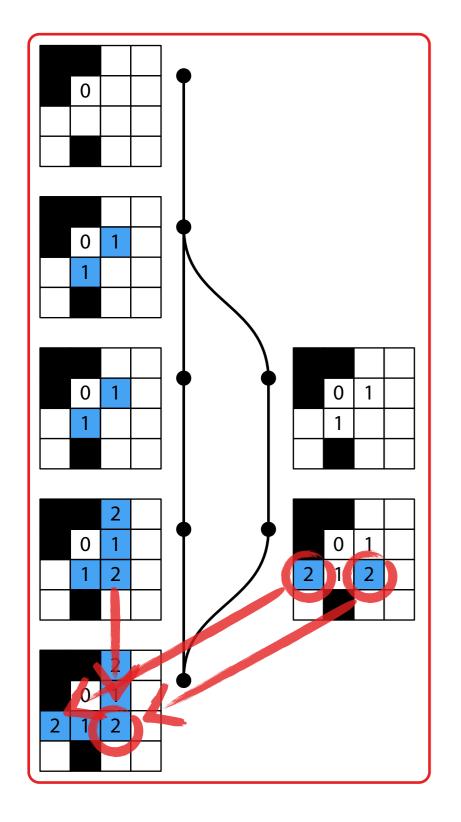
#### fork creates isolated task



Each transactional task contains:

**snapshot**: transactional state on creation **docal store**: local modifications

## join merges changes

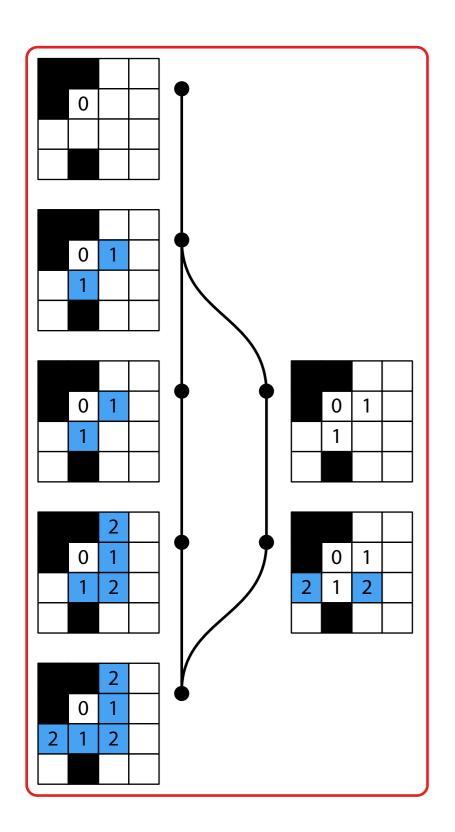


```
(atomic
...
  (join child))
```

merge local store of child into parent

Conflict resolution function: (ref 0 resolve)

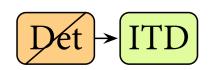
# All tasks commit atomically ⇒ isolation and progress maintained



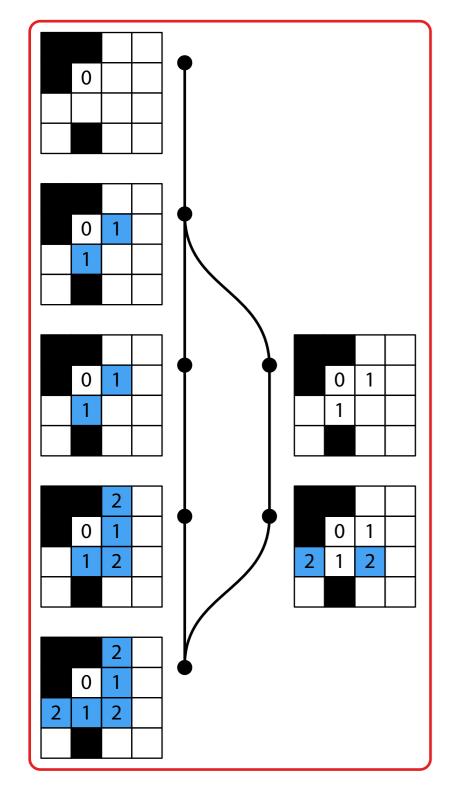
```
(atomic
...
(join child))
```

All tasks must be joined before commit

⇒ isolation maintained Iso progress maintained Pro



## Intratransaction determinacy



Transactions can commit in any order ⇒ Det inevitable

But: determinacy within each transaction = intratransaction determinacy ITD

And isolation *between* transactions Iso

## Transactions + Actors

inner				
→in↓		Future	Transaction	Actor
	Nested futures (Section 3.3.3)  Det		Parallel transactions (Section 4.1)  Det  Iso Pro	Communication in future (Section 6.1)  Det  ITP DLF
outer	Transaction	Parallelism in transaction (Sections 4.2–4.4)  Det  Iso Pro	Nested transactions (Section 3.3.3)  Iso Pro	Communication in transaction (Chapter 5)  Pro  DLF
	Actor	Parallelism in actor (Section 6.1)  Det  DET  DLF	Shared memory in actor (Chapter 5)  Iso Pro  IPP DLF	Actors (Section 3.3.3)  ITP DLF

## Motivation: (1) safe shared information between actors

#### Impure actor languages (e.g. Scala)

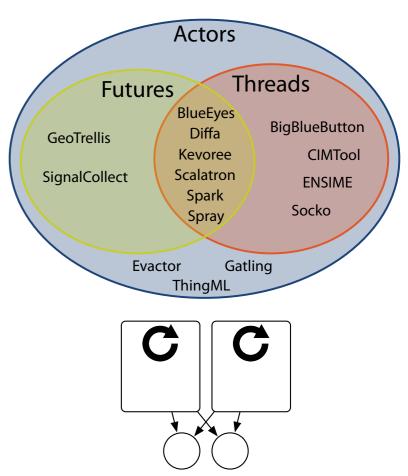
10/15 projects introduce shared memory

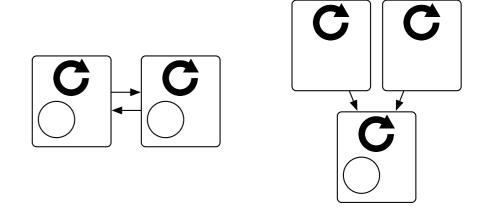
- ⇒ ITP broken [ITP]
- ⇒ races & deadlocks possible



Patterns: replication/delegation

⇒ ITP guaranteed but safety up to the developer





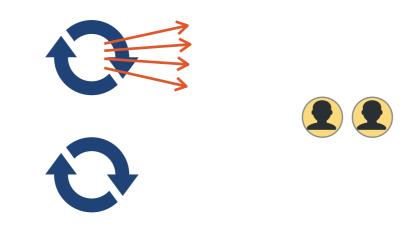
## Motivation: (2) communication between transactions

"Vacation" processes customers in parallel



## Motivation: (2) communication between transactions

but more fine-grained parallelism is possible



⇒ isolation broken 186

#### **Transactional Actors**

Make side effects on actors part of transaction

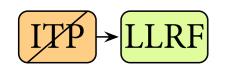
```
(atomic
  (def airline-beh
                                   separate from transaction,
    (behavior [flights]
                                   no side-effect
      ...))
                                   delay side effect
  (spawn airline-beh flights)
                                   until commit (pessimistic)
  (become airline-beh flights)
                                   sent immediately, but
  (send :process-customer
                                   rolled back on abort
    (deref c)))
                                   (optimistic)
```

## Sending a message in a transaction

#### Message depends on the transaction

#### Receiving turn is **tentative**:

- Side effects (spawn, become) delayed
- Sends get dependency
- At the end, wait for dependency to commit
- ⇒ isolation maintained Iso progress maintained Pro



#### Low-level Race Freedom

#### But: Low-level Race Freedom LLRF

- → shared memory is isolated at level of transactions
- → private memory of actors is isolated at level of turns

## Actors + Futures

	inner				
→ in↓		Future	Transaction	Actor	
	Future	Nested futures (Section 3.3.3)  Det	Parallel transactions (Section 4.1)  Det  Iso Pro	Communication in future (Section 6.1)  Det  ITP DLF	
outer	Transaction	Parallelism in transaction (Sections 4.2–4.4)  Det  Iso Pro	Nested transactions (Section 3.3.3)  Iso Pro	Communication in transaction (Chapter 5)  Pro  DLF	
	Actor	Parallelism in actor (Section 6.1)  Det  ITP DLF	Shared memory in actor (Chapter 5)  Iso Pro  ITP DLF	Actors (Section 3.3.3)  ITP DLF	

## Chocola: <u>chomposable concurrency language</u>

		inner				
→ in↓		Future	Transaction	Actor		
outer	Future	Nested futures (Section 3.3.3)  Det	Parallel transactions (Section 4.1)  Det  Iso Pro	Communication in future (Section 6.1)  Det  ITP DLF		
	Transaction	Parallelism in trans- action (Sections 4.2–4.4)  Det ITD  Iso Pro	Nested transactions (Section 3.3.3)  Iso Pro	Communication in transaction (Chapter 5)  Iso Pro  ITP LLRF DLF		
	Actor	Parallelism in actor (Section 6.1)  Det  ITP DLF	Shared memory in actor (Chapter 5)  Iso Pro  LLRF DLF	Actors (Section 3.3.3)  ITP DLF		



## Implementation

#### **Extension of Clojure**

- Futures & Transactions: built into Clojure
- Actors: simple implementation
- Transactional Futures addedTransactional Actors

- Chapter 8
- http://soft.vub.ac.be/~jswalens/chocola

## Formalization of Operational Semantics "PureChocola"

Uniform formalization of three separate models © Chapter 2

 $::= \langle T, \tau, \sigma \rangle$ 

```
Program state
                                                                                                                                                                                                                                  := \langle A, \mu \rangle
                                                                                           Task
                                                                                                                                       := \langle f, e, n^? \rangle
                                                                                                           task \in Task
                                                                                                                                                                                                             A \subset Actor
                                                                                                                                                                                           Actors
                                                                              Transactions
Program state
                                                                                                              \tau: TransactionNumber \rightharpoonup Transaction
                                                                                                                                                                                                          \mu: Address \longrightarrow \overline{Message}
                                                                                                                                                                                         Inboxes
                                                                  snapshot, local store \sigma, \overleftarrow{\sigma}, \underline{\delta}: TVar \rightarrow Value
             Tasks
                             T \subset \mathsf{Task}
                                                                                                                                                                                                           act \in Actor ::= \langle a, e^2, beh \rangle
                                                                                                                                                                                            Actor
              Task (task \in Task ::= \langle f, e \rangle)
                                                                                                            \mathsf{tx} = \mathsf{Transaction} ::= \langle \circ, \overleftarrow{\sigma}, \overleftarrow{e}, \delta \rangle
                                                                               Transaction
                                                                                                                                                                                       Behavior beh ∈ Behavior ::=
                                                                                                                 \in TransactionNumber = \mathbb{N}^+
                                                                            Transaction id
                                                                                                                                                                                        Message msg ∈ Message ::=
                                                                       Transaction state
                                                                                                                                       ::= ▷ | ✓ | X
                                                                                        Program state
                                                                                                                                                         \langle A, T, \mu, \tau, \sigma \rangle
                                                                                                   Actors
                                                                                                                        A \subset Actor
                                                                                                     Tasks
                                                                                                                        T \subset \mathsf{Task}
                                                                                                                        \mu: Address \rightarrow Message
                                                                                                 Inboxes
                                                                                                                        \tau: TransactionNumber 
ightharpoonup Transaction
                                                                                          Transactions
                                                                                                                        \sigma: \mathbb{Z} Var \longrightarrow Value
                                                                               Transactional heap
                                                                                                                                                := \langle a, f_{\text{root}}^?, \text{ beh}, n_{\text{dep}}^? \rangle
                                                                                                     Actor
                                                                                                                                                 := \langle f, a, e, F_s, F_j, eff, ctx^? \rangle
                                                                                                                     task∈ Task
                                                                                                       Task
                                                                                                                       \mathsf{tx} \in \mathsf{Transaction} ::=
                                                                                           Transaction
                                                                 Spawned and joined futures F_s, F_i \subset Future
                                                                                                                                                := \langle \overrightarrow{A}, \overrightarrow{beh}^? \rangle
                                                                                   Effects on actors
                                                                                                                      eff
                                                                                                                                                := \langle \mathsf{n}, \overleftarrow{\sigma}, \delta, \mathsf{eff}_{\mathsf{tx}} \rangle
                                                                           Transactional context
                                                                                                                     ctx
                                                                                                                    msg ∈ Message
                                                                                                                                              := \langle a_{\text{from}}, a_{\text{to}}, \overline{\nu}, \mathsf{n}_{\text{dep}}^? \rangle
                                                                                                Message
                                                                                              As before:
                                                                                               Behavior
                                                                                                                    beh \in Behavior := \langle b, \overline{\nu} \rangle
                                                                                                                    \overleftarrow{\sigma}, \delta : \text{TVar} \rightarrow \text{Value}
                                                                             Snapshot, local store
                                                                                       Transaction id
                                                                                                                        n \in TransactionNumber
```

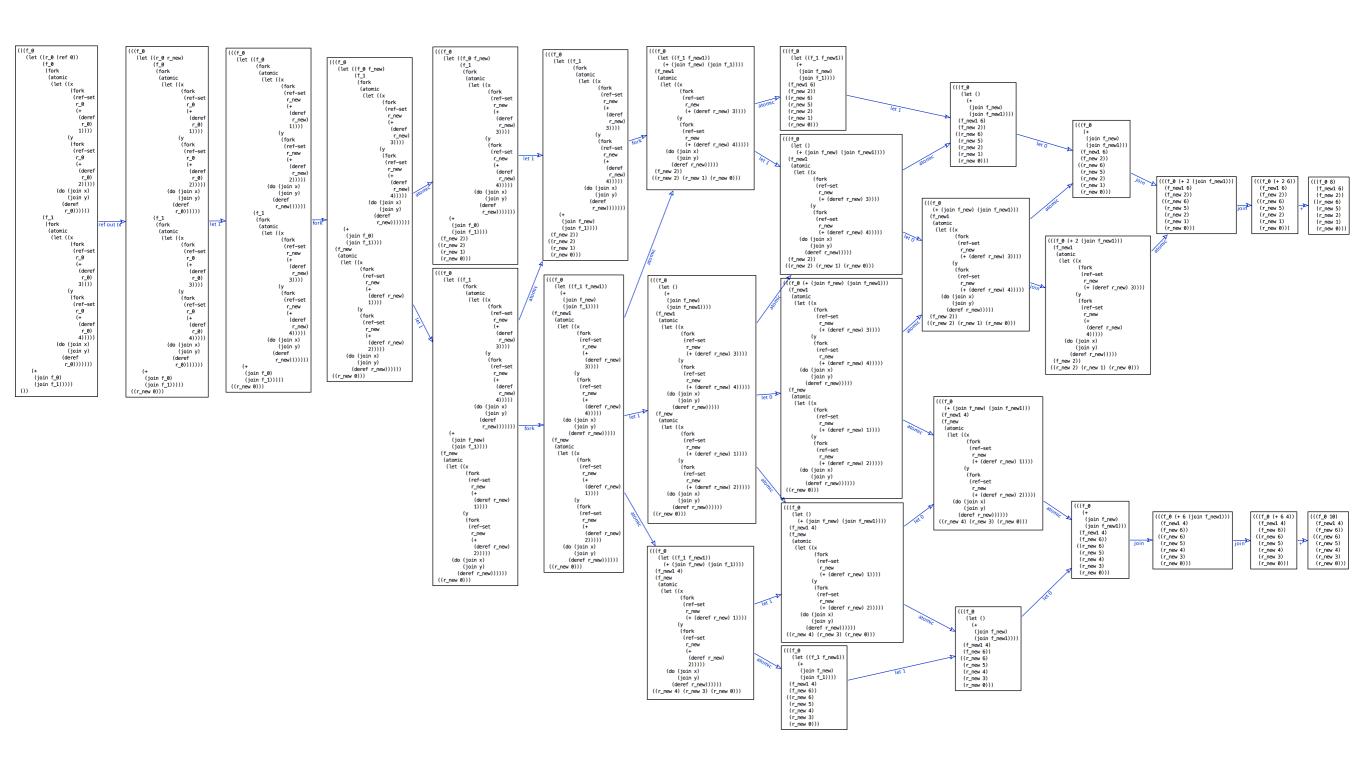
Transaction state

Program state

::= ▷ | **✓** | **X** 

 $\langle a_{\rm from}, a_{\rm to}, \overline{\nu} \rangle$ 

#### Executable formal semantics with PLT Redex



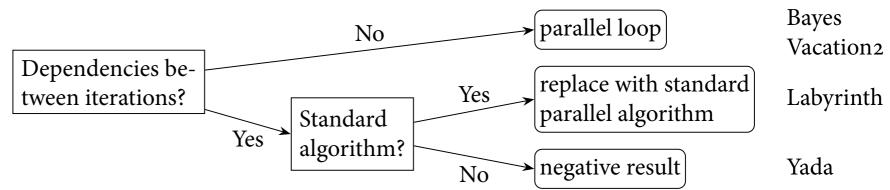
https://github.com/jswalens/chocola-redex

## **Evaluation approach**

#### 1 selection of benchmarks

Application	Transaction length (mean # of instructions per tx)	Average time in transaction
Labyrinth	219,571	100% ■
Bayes	60,584	83%
Yada	9,795	100%
Vacation-high	3,223	86%
Genome	1,717	97%
Intruder	330 □	33%
Kmeans-high	117 🔲	7% □
SSCA2	50 □	17% 🗆

## 2 parallelization



③ evaluation criteria

performance: speed-up

developer effort: lines changed + qualitative assessment

## Summary of results

	Speed-up original	Speed-up Chocola	Lines of code added	_
Labyrinth	1.3	2.3	+11% +1	8 cores
Bayes	2.8	3.5	+1	<b>S</b> o coics
Vacation2	2.6	33.2	+8%	64 cores
Yada	futures/	actors not ap	oplicable	

Better performance for little effort

Chapter 8

https://github.com/jswalens/{labyrinth,bayes,yada,vacation2}

#### Contributions

- Systematic study of combinations of concurrency models in Clojure [Swalens et al., 2014]
- Systematic study of combinations of futures, transactions, and actors
- Transactional futures [Swalens et al., 2016]
- Transactional actors [Swalens et al., 2017]
- Unified framework Chocola: [Swalens et al., 2018; accepted]
  - Implementation
  - Formal semantics
  - Evaluation

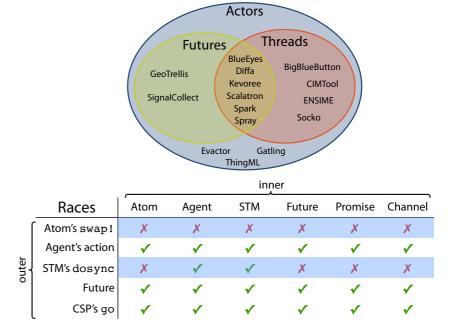
#### Future work

- Formal proofs of guarantees
- Other concurrency models
- Applicability & more benchmarks
- Comparison of implementation techniques

#### Conclusion

Concurrency models are combined

Naive combinations violate guarantees



We studied the combinations of futures, transactions, and actors

- → Transactional Futures
- → Transactional Actors
- ← Chocola

→ in↓	Future	Transaction	Actor
Future	Nested futures (Section 3.3.3)  Det	Parallel transactions (Section 4.1)  Det Iso Pro	Communication in future (Section 6.1)  Det  ITP DLF
Transaction	Parallelism in transaction (Sections 4.2–4.4)  Det ITD  Iso Pro	Nested transactions (Section 3.3.3)  Iso Pro	Communication in transaction (Chapter 5)  Iso Pro  LLRF DLF
Actor	Parallelism in actor (Section 6.1)  Det  ITP DLF	Shared memory in actor (Chapter 5)  Iso Pro  ITP LLRF DLF	Actors (Section 3.3.3)  ITP DLF