

Controller Synthesis for Linear Hybrid Systems

Part 2: Verification of LHAs

Formal Methods for Cyber-Physical Systems
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Lesson Summary

- Symbolic operations on polyhedra
- Linear Hybrid Automata
- An exact semi-algorithm for the BRP

Convex Sets

- A **convex combination** of two points p and q is a point of the type

$$a \cdot p + (1-a) \cdot q, \quad \text{for all } a \text{ in } [0, 1]$$

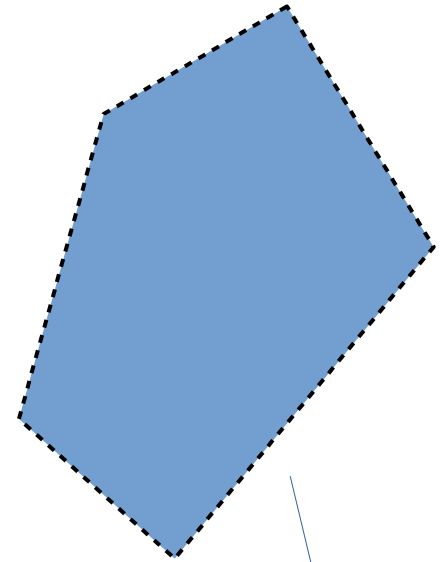
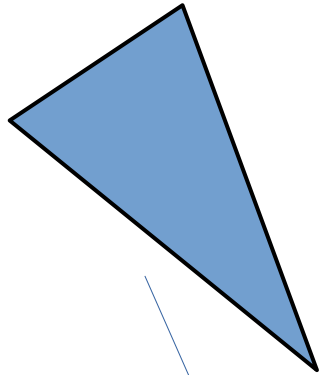
- A set is **convex** if it is closed under convex combinations
- Examples:
 - a **rectangle** is convex
 - a **disk** is convex, whereas a **circle** is *not*
 - an **L-shaped polygon** is *not* convex
 - the empty set and the universe set are convex

Convex Polyhedra

- A conjunction of (finitely many) linear inequalities
- Inequalities may be strict ($<$) and non-strict (\leq)
- Examples:
 - a **rectangle** is a convex polyhedron
 - a **cube** is a convex polyhedron
 - a **cone** is a convex set but *not* a convex polyhedron

Types of Convex Polyhedra

- (topologically) **closed** if all inequalities are non-strict
- “ **open** if all inequalities are strict
- **Bounded** if it is included in a hyper-sphere
- **Unbounded** otherwise



a *closed*
convex
polyhedron

a convex
polyhedron

an *open*
convex
polyhedron

Basic Operations on Polyhedra (1)

- **Intersection:** $P1 \cap P2$
- Implementation: merge the sets of constraints

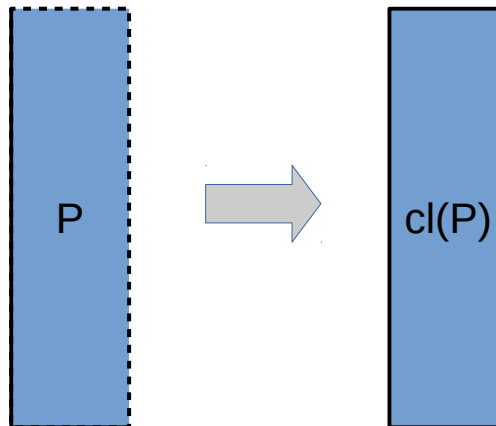
- Notice: convex polyhedra are not closed under union or complement

Basic Operations on Polyhedra (2)

- Topological **closure**:

$cl(P)$

- Implementation: convert all constraints into non-strict



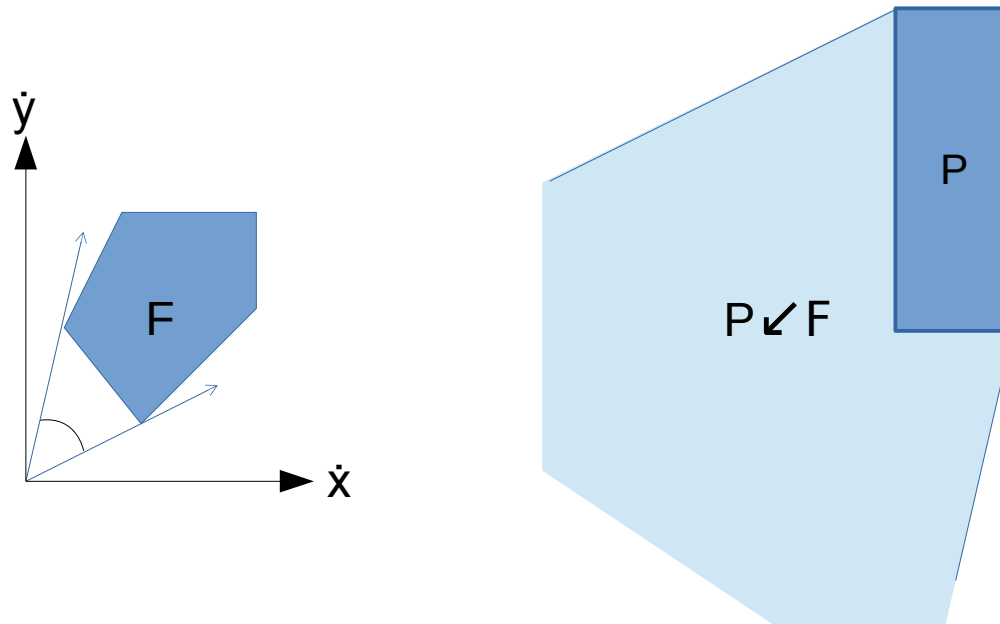
Basic Operations on Polyhedra (3)

- **Pre-flow** of P w.r.t. F :

$$P \swarrow F \quad (\text{or simply } P \swarrow)$$

The set of points that can reach P using a direction in F

Formally, $P \swarrow F = \{ p - t \cdot c \mid p \text{ in } P, c \text{ in } F, t \geq 0 \}$



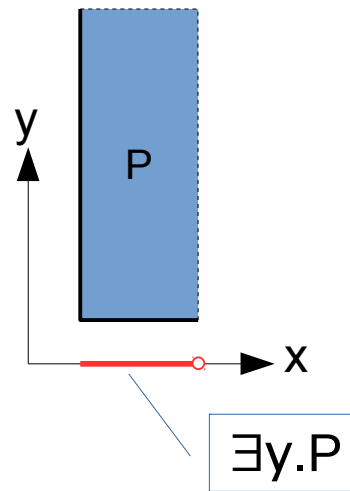
Exercise

Find two convex polyhedra P and F such that $P \vee F$ is *not* a convex polyhedron.

Basic Operations on Polyhedra (4)

- **Projection** (removal of variables):

$$\exists y.P$$

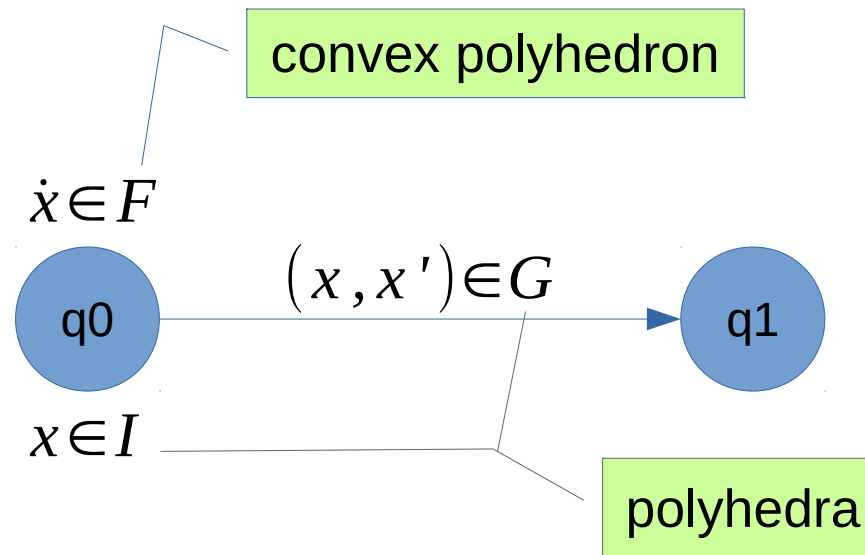


All provided by libraries like Parma Polyhedra Library (PPL)

Basic Operations on Polyhedra (5)

- **Variable renaming**
- Jump relations are defined over two sets of variables X and X'
- We need to convert polyhedra to the primed variables
- So:
 $\text{prime}(P)$ rename variables of P from X to X'

Linear Hybrid Automata



Polyhedral Sets of States

- For a set of states Z and a location q , let $\mathbf{Z}(q)$ be the set
$$\{ x \mid (q,x) \text{ in } Z \}$$
- We say that Z is **polyhedral** if $Z(q)$ is a (possibly non-convex) polyhedron for all locations q

An exact semi-algorithm for BRP on LHAs

- Given an LHA and a polyhedral set of states E (error), compute the set of states that can reach E
- We build (sets of) runs backwards
- Given a polyhedral set of states Z , we simulate discrete steps and timed steps backwards (*symbolic execution*)
- For discrete steps:
 - **PreJump**(Z) = states that can reach Z via a discrete step
- For timed steps:
 - **PreTime**(Z) = states that can reach Z via a timed step

An exact semi-algorithm for BRP on LHAs

- The solution to BRP is:

$$Z^* = \mu Z . E \cup \text{PreJump}(Z) \cup \text{PreTime}(Z)$$

- By fixpoint theorem, Z^* is the limit of the sequence

$$Z_0 = \emptyset$$

$$Z_1 = E \cup \text{PreJump}(Z_0) \cup \text{PreTime}(Z_0)$$

...

- **Fact:** When Z is polyhedral, PreJump and PreTime can be effectively computed and their result is polyhedral
- However, reachability is undecidable, so the above sequence may not converge in a finite number of steps!

Defining PreJump

Let Z be a polyhedral set of states

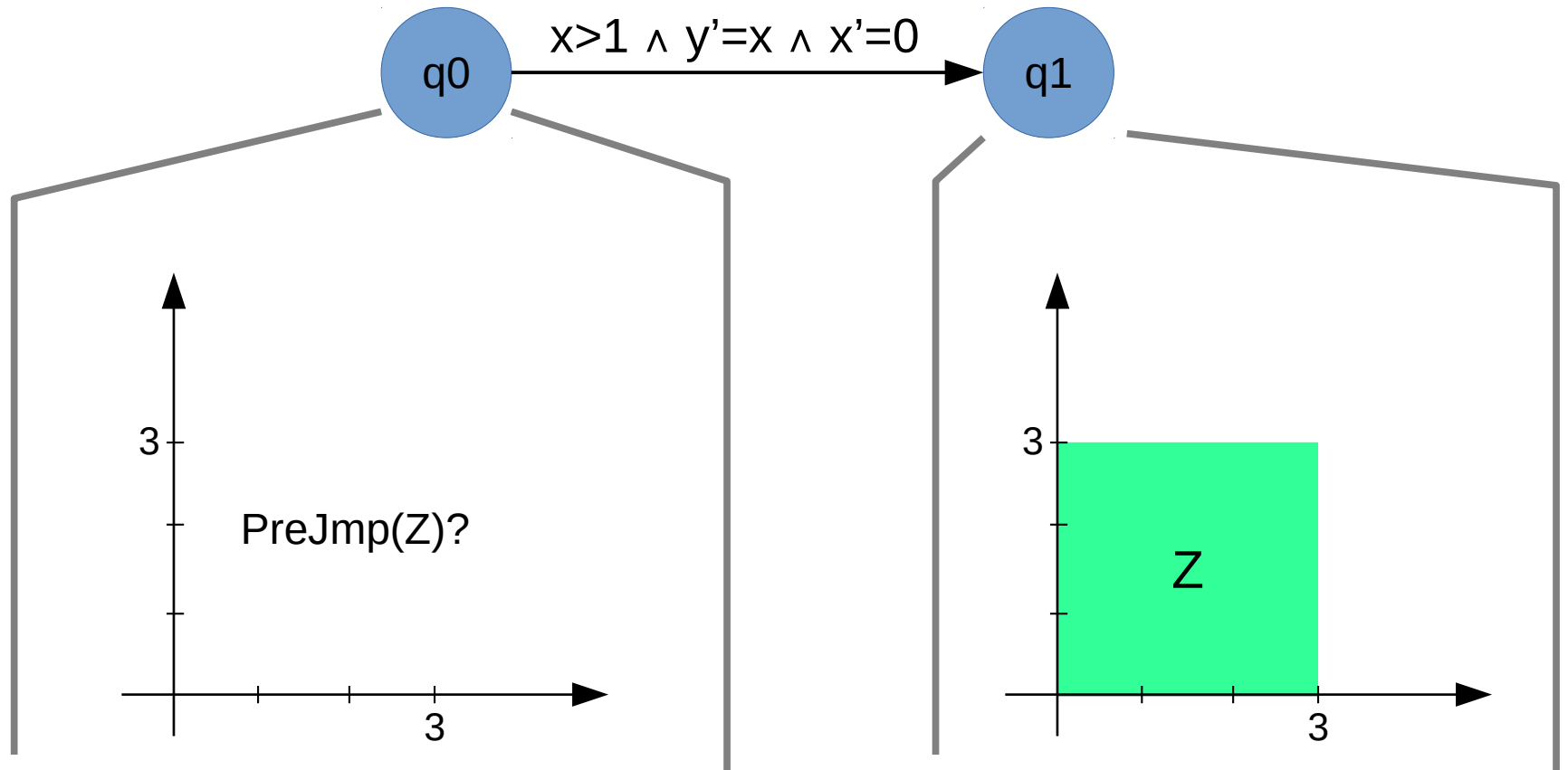
Let $j = (q, G, q') \in \text{Jump}$

recall that G is a polyhedron on \mathbb{R}^{2n}

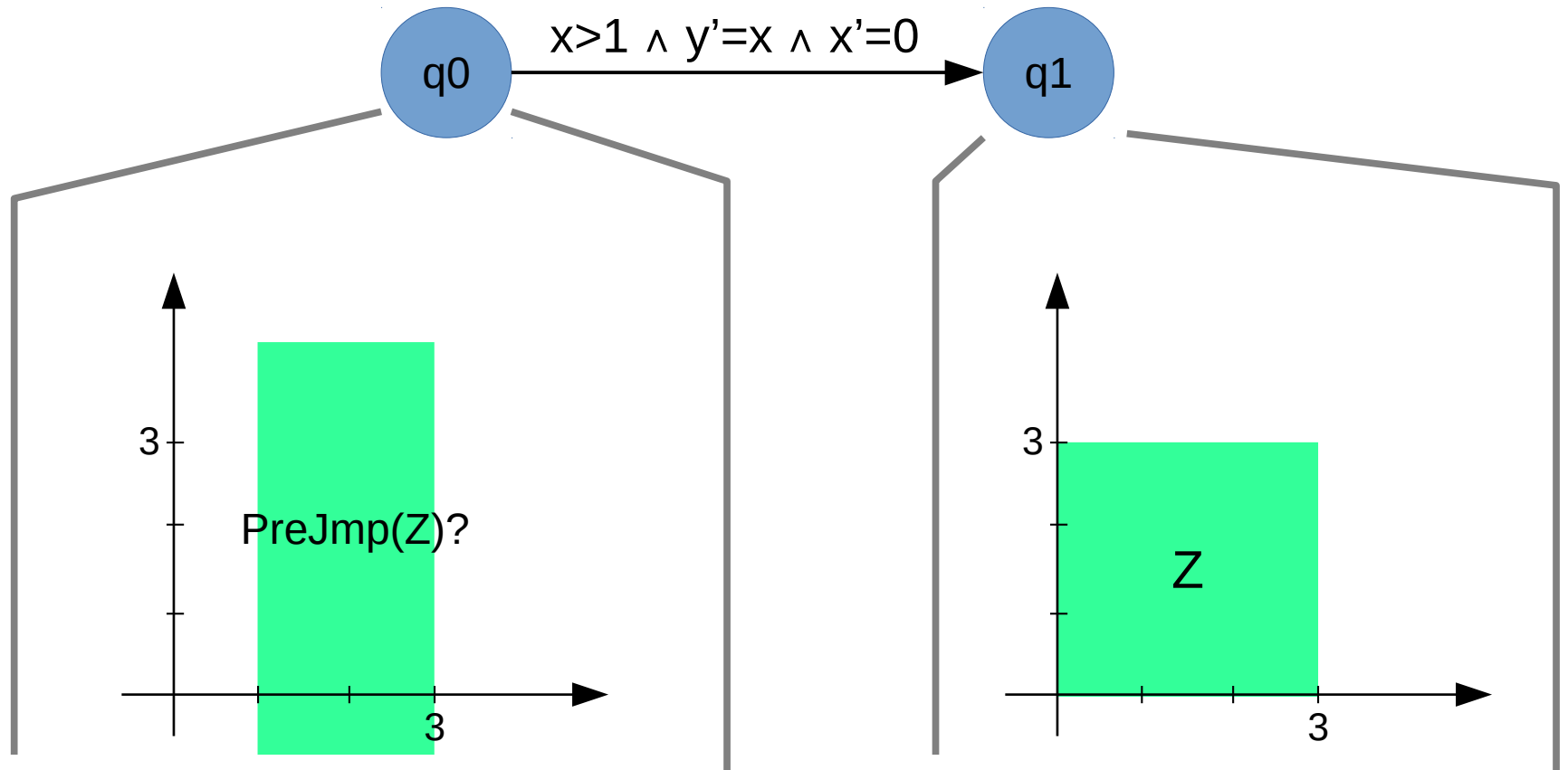
Define:

- **$\text{PreJump}(Z, j) = \{ (q, x) \mid (x, x') \in G \text{ for some } (q', x') \in Z \}$**
- **$\text{PreJump}(Z) = \bigcup_{j \in \text{Jump}} \text{PreJump}(Z, j)$**

PreJump Example



PreJump Example



Computing PreJump

Let Z be a polyhedral set of states

Let $j = (q, G, q') \in \text{Jump}$

We compute $\text{PreJump}(Z, j)$ as follows:

$$\text{PreJump}(Z, j) = \{q\} \times \exists X'. (G \cap \text{prime}(Z(q')))$$

where X' is the set of all primed variables

Computing PreTime

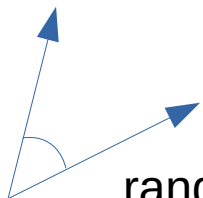
- PreTime(Z) is the set of states (q,x) from which there is a trajectory that reaches Z while staying in $\text{Inv}(q)$ and satisfying $\text{Flow}(q)$
- First, assume that: $Z = \{q\} \times U$ and **Inv(q) is convex**
- Then,

$$\text{PreTime}(Z) = (U \not\leftarrow \text{Flow}(q)) \cap \text{Inv}(q)$$

- What if $\text{Inv}(q)$ is not convex?
- The above formula **does not work**

PreTime and non-Convex Invariants

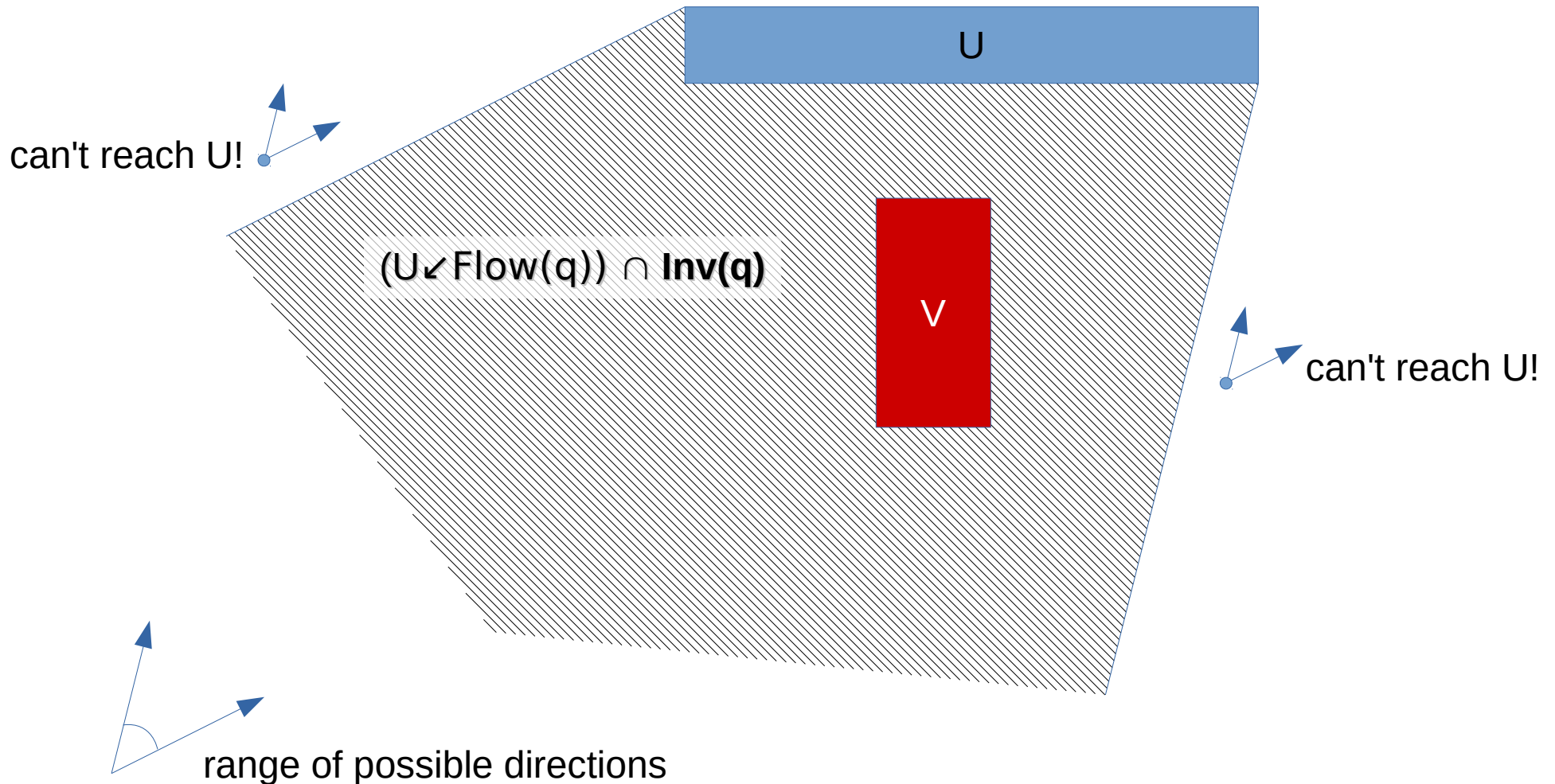
$\text{Inv}(q) = \bar{V}$ (i.e., V is a “hole” in the invariant)



range of possible directions

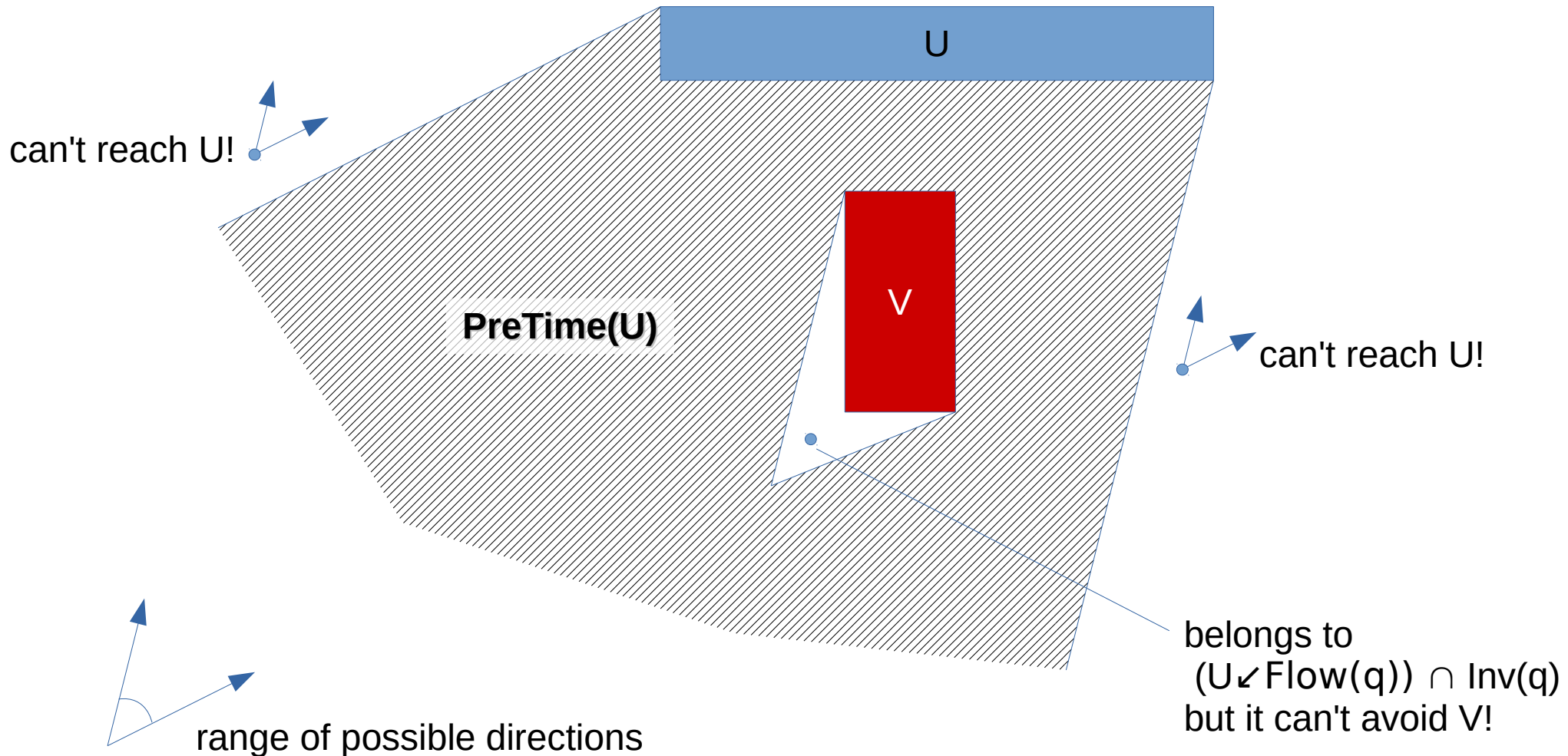
PreTime and non-Convex Invariants

$\text{Inv}(q) = \bar{V}$ (i.e., V is a “hole” in the invariant)



PreTime and non-Convex Invariants

$\text{Inv}(q) = \bar{V}$ (i.e., V is a "hole" in the invariant)



Reach-While-Avoiding Operator

Fix a location q and the corresponding dynamics $\text{Flow}(q)$.

Definition. Given two polyhedra U and V ,

RWA(U, V) is the set of points from which there is a trajectory that:

- reaches U
 - while avoiding V at all times.
-
- a.k.a.: *flow_avoid* in [Wong-Toi,97], *Reach* in [Tomlin et al.,00]
 - in temporal logic (CTL): $\exists \bar{V} \text{ Until } U$

PreTime and RWA

PreTime is a special case of RWA, i.e.:

$$\text{PreTime}(\{q\} \times U) = \{q\} \times \text{RWA}(U, \overline{\text{Inv}(q)})$$

Let's analyze the basic properties of RWA...

Properties of RWA

Assume w.l.o.g. that U and V are disjoint.

[*bounds 1*] $U \subseteq \text{RWA}(U, V) \subseteq \bar{V}$

[*bounds 2*] $\text{RWA}(U, V) \subseteq U \checkmark$

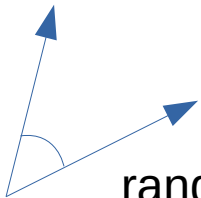
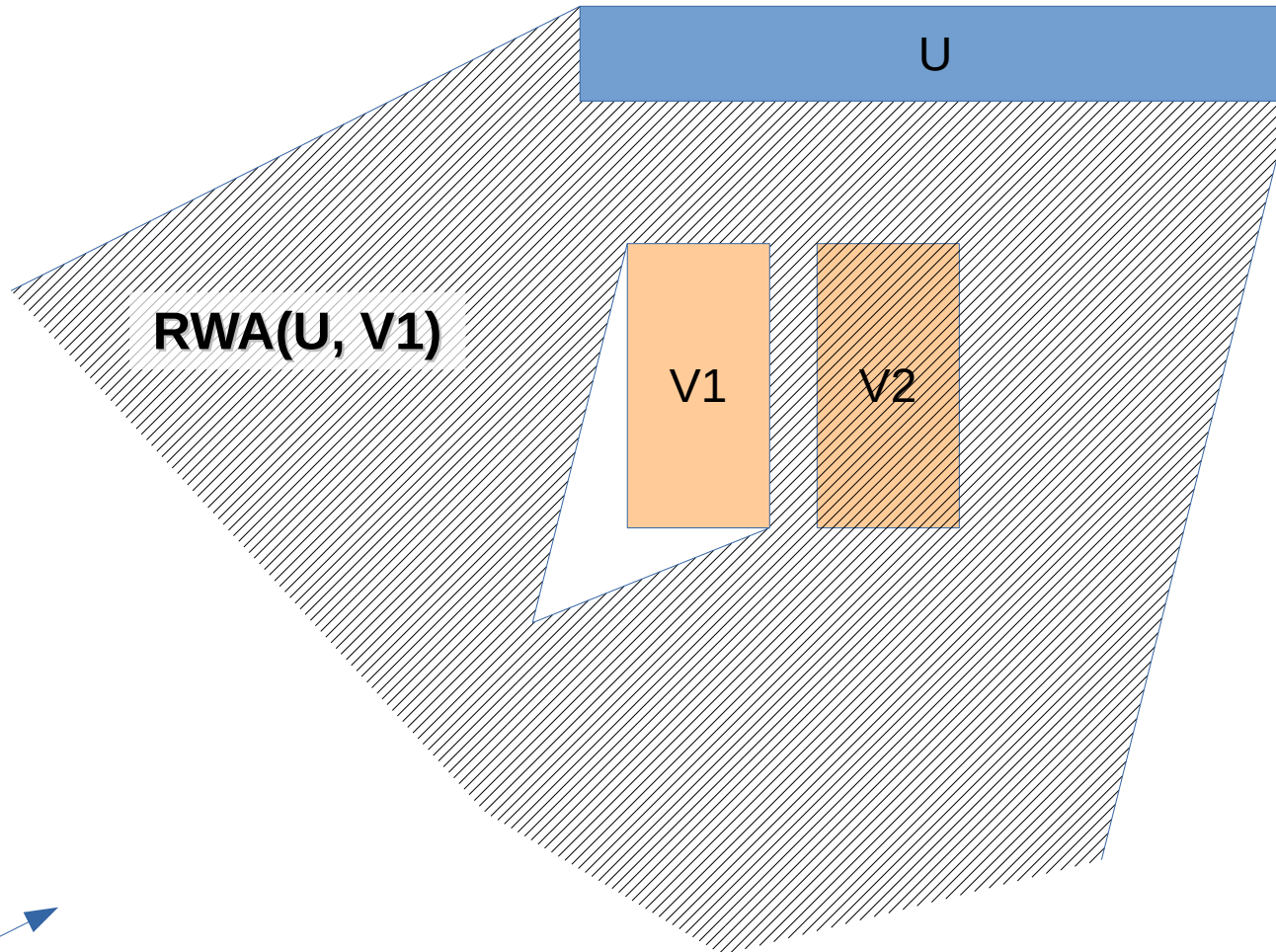
[*distributivity 1st arg*]

$$\text{RWA}(U_1 \cup U_2, V) = \text{RWA}(U_1, V) \cup \text{RWA}(U_2, V)$$

[*non-distrib. 2nd arg*]

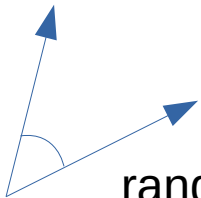
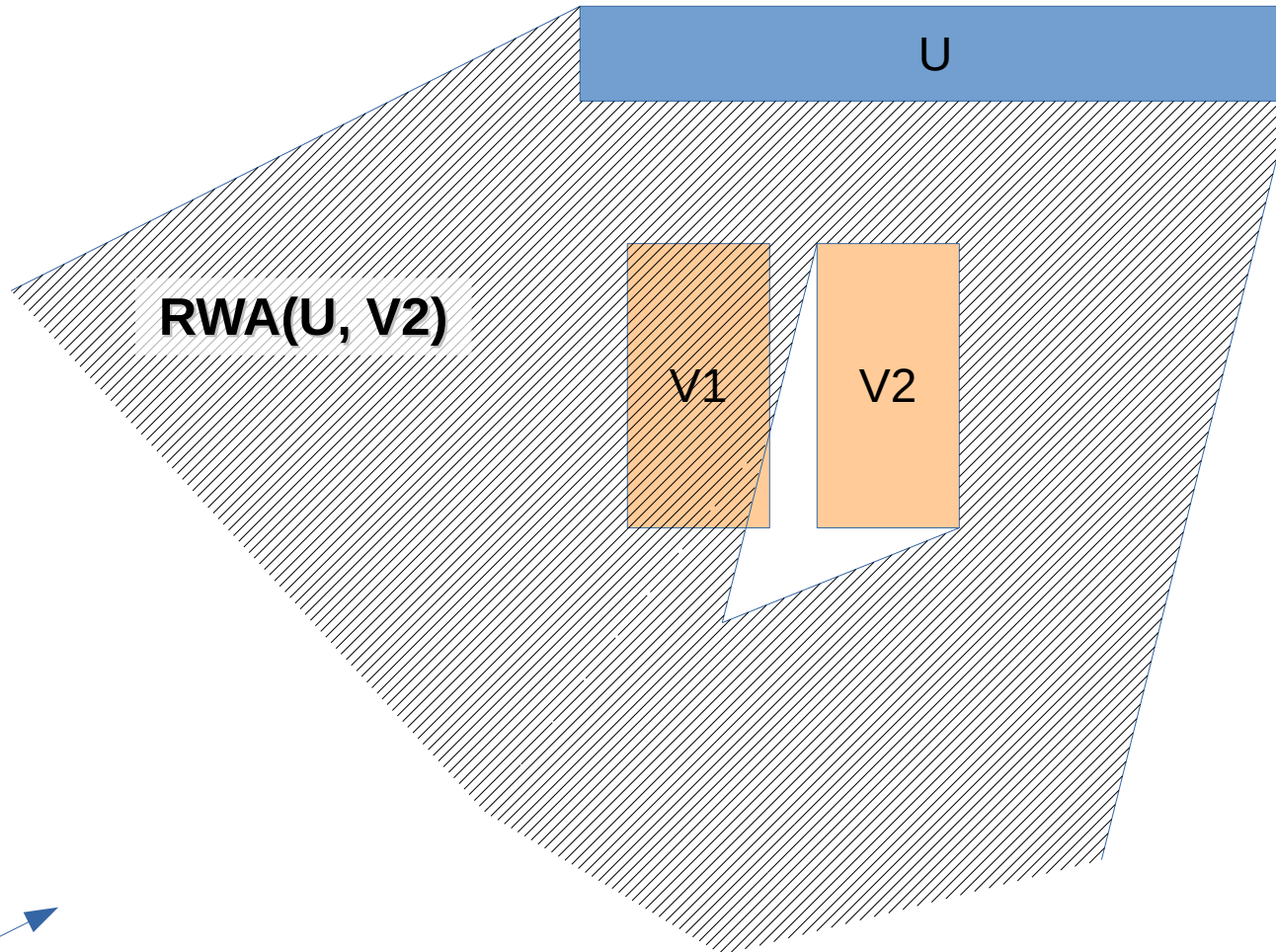
$$\text{RWA}(U, V_1 \cup V_2) \neq \text{RWA}(U, V_1) \cap \text{RWA}(U, V_2)$$

Non-distributivity



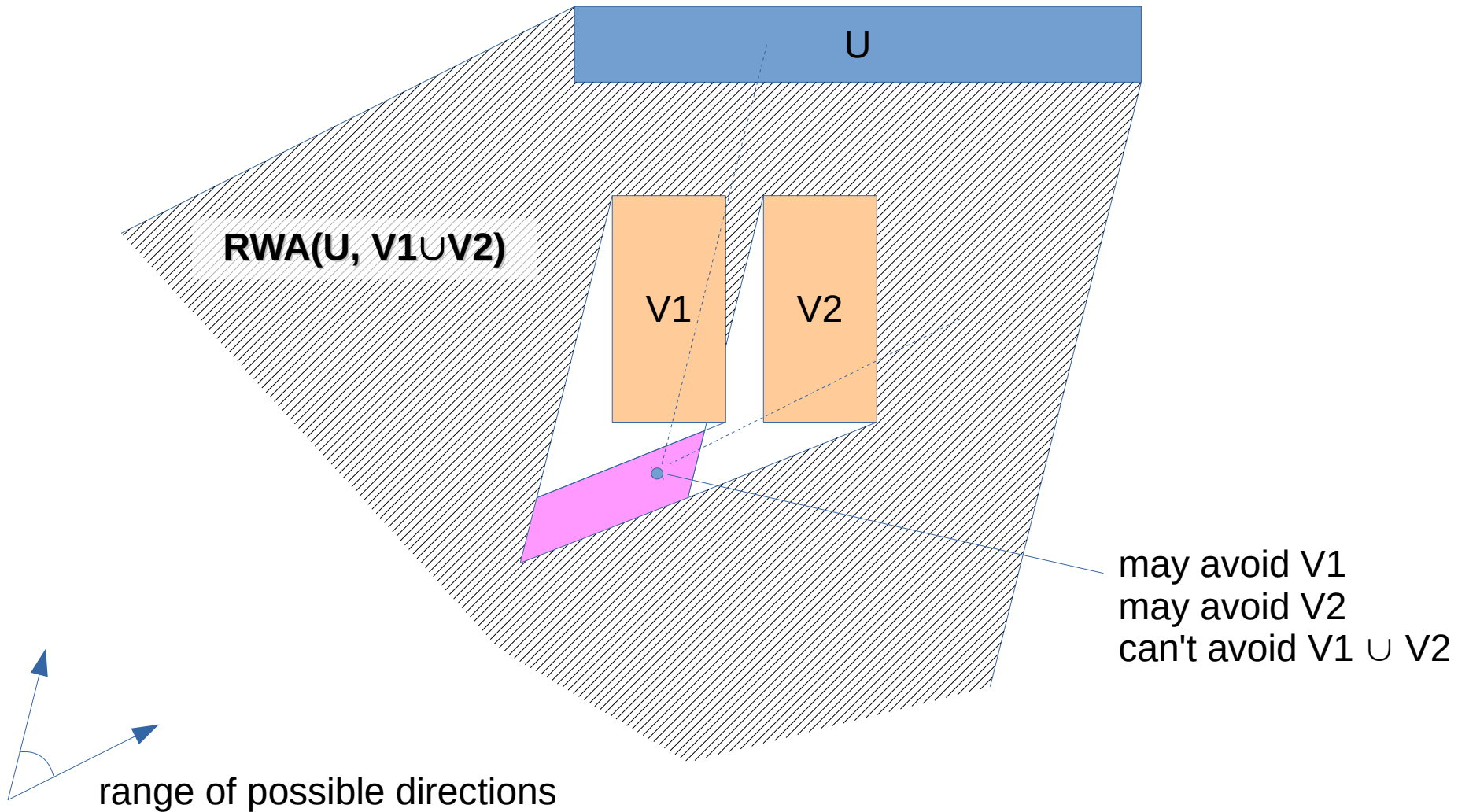
range of possible directions

Non-distributivity



range of possible directions

Non-distributivity



Computing RWA

[*bounds 1*] $U \subseteq \text{RWA}(U, V) \subseteq \bar{V}$

[*bounds 2*] $\text{RWA}(U, V) \subseteq U \checkmark$

[*distrib*] $\text{RWA}(U_1 \cup U_2, V) = \text{RWA}(U_1, V) \cup \text{RWA}(U_2, V)$

We compute RWA incrementally:

$$R_0 \subseteq R_1 \subseteq \dots \subseteq R_n = \text{RWA}(U, V)$$

By [*distrib*], we can assume that U is convex.

By [*bounds 1*], we can start with $R_0 = U$.

By [*bounds 1 & 2*], we only need to add points from $\bar{V} \cap U \checkmark$.

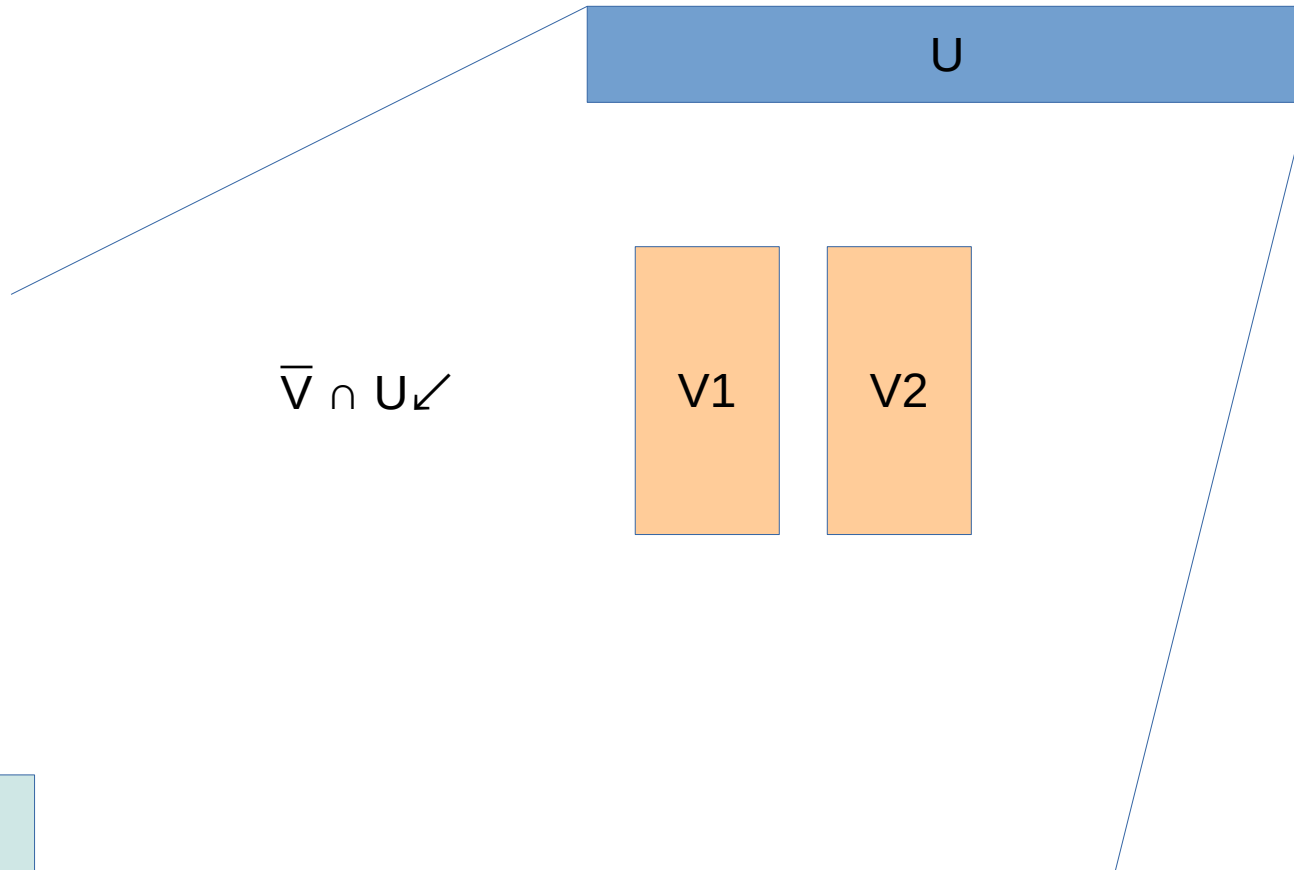
Computing RWA

- 1) Start from $R_0 = U$
- 2) Let R_i be the current set
- 3) Pick a convex polyhedron P in $\bar{V} \cap U \setminus R_i$
- 4) Pick a convex polyhedron P' in R_i which is **adjacent to P** (if any)
- 5) Compute the set Q of points of P that can go **directly** into P'
- 6) $R_{i+1} = R_i \cup Q$
- 7) Repeat from Step 2, until a fixed point is reached

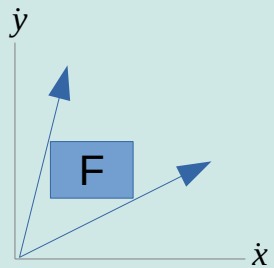
(This procedure terminates)

Computing $RWA(U, V)$

$$V = V1 \cup V2$$

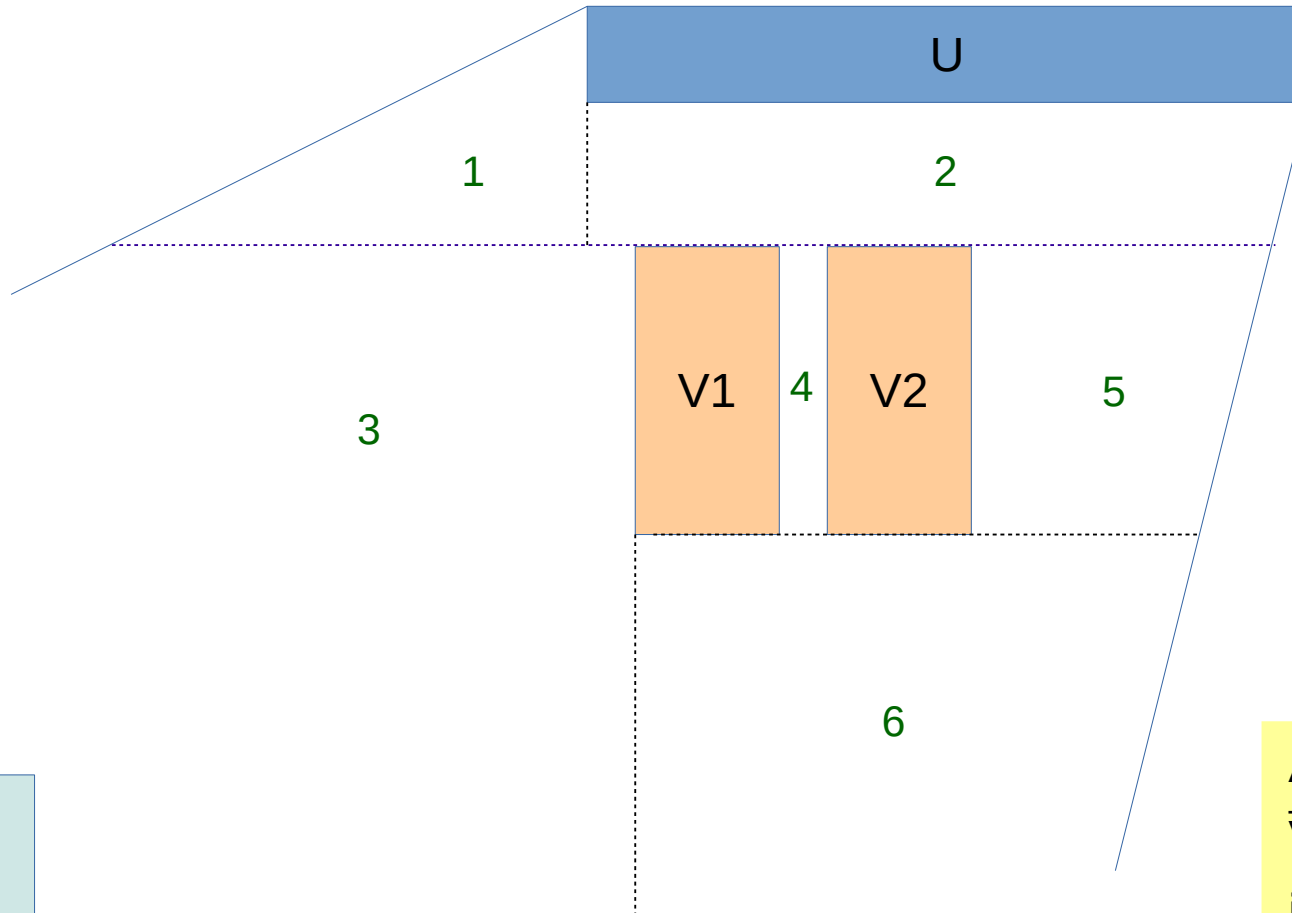


Dynamics:

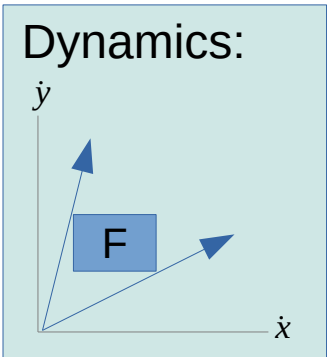


Computing $RWA(U, V)$

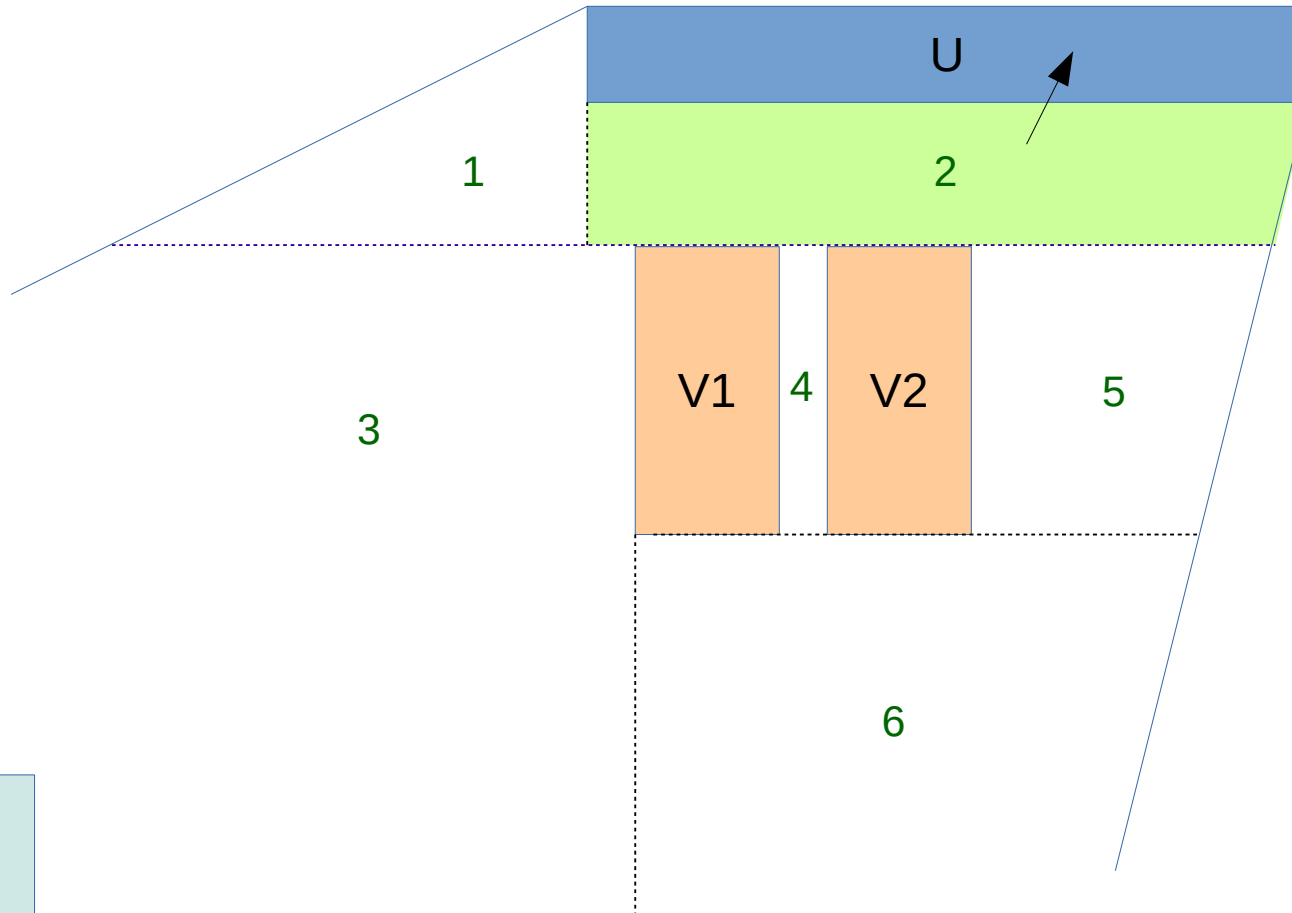
$$V = V1 \cup V2$$



A partition of $\bar{V} \cap U$ into 6 convex polyhedra

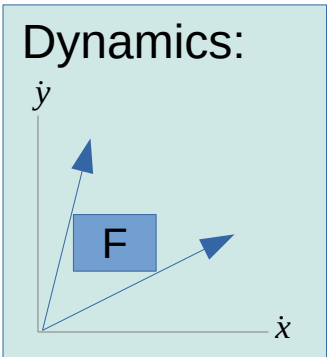


Computing $RWA(U, V)$

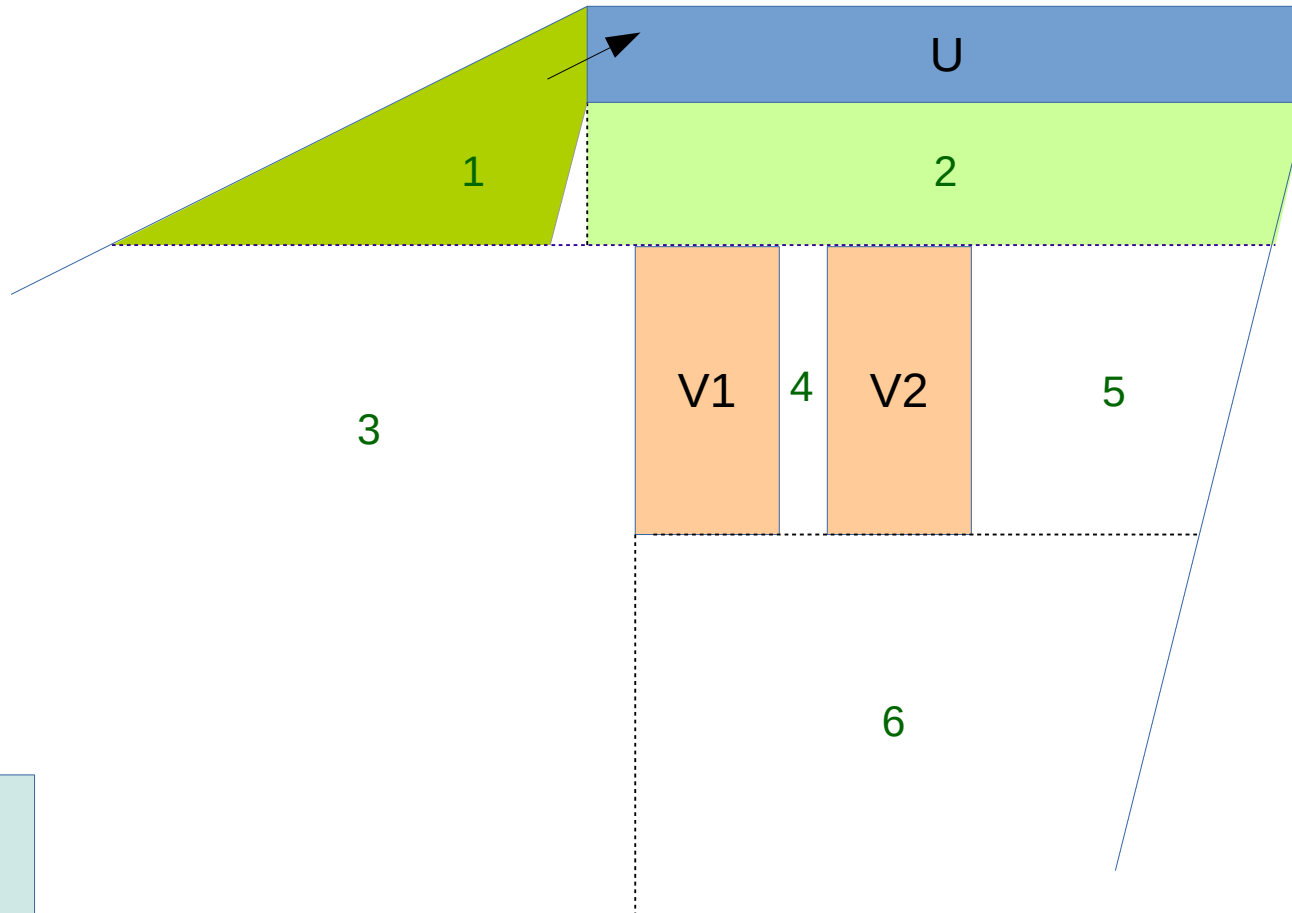


All points of P2 go directly into U

They are added to the result

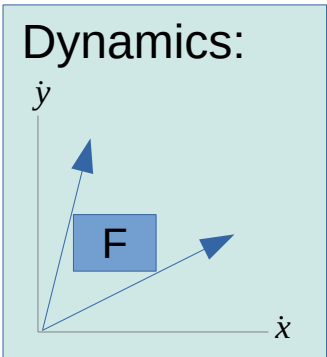


Computing $RWA(U, V)$

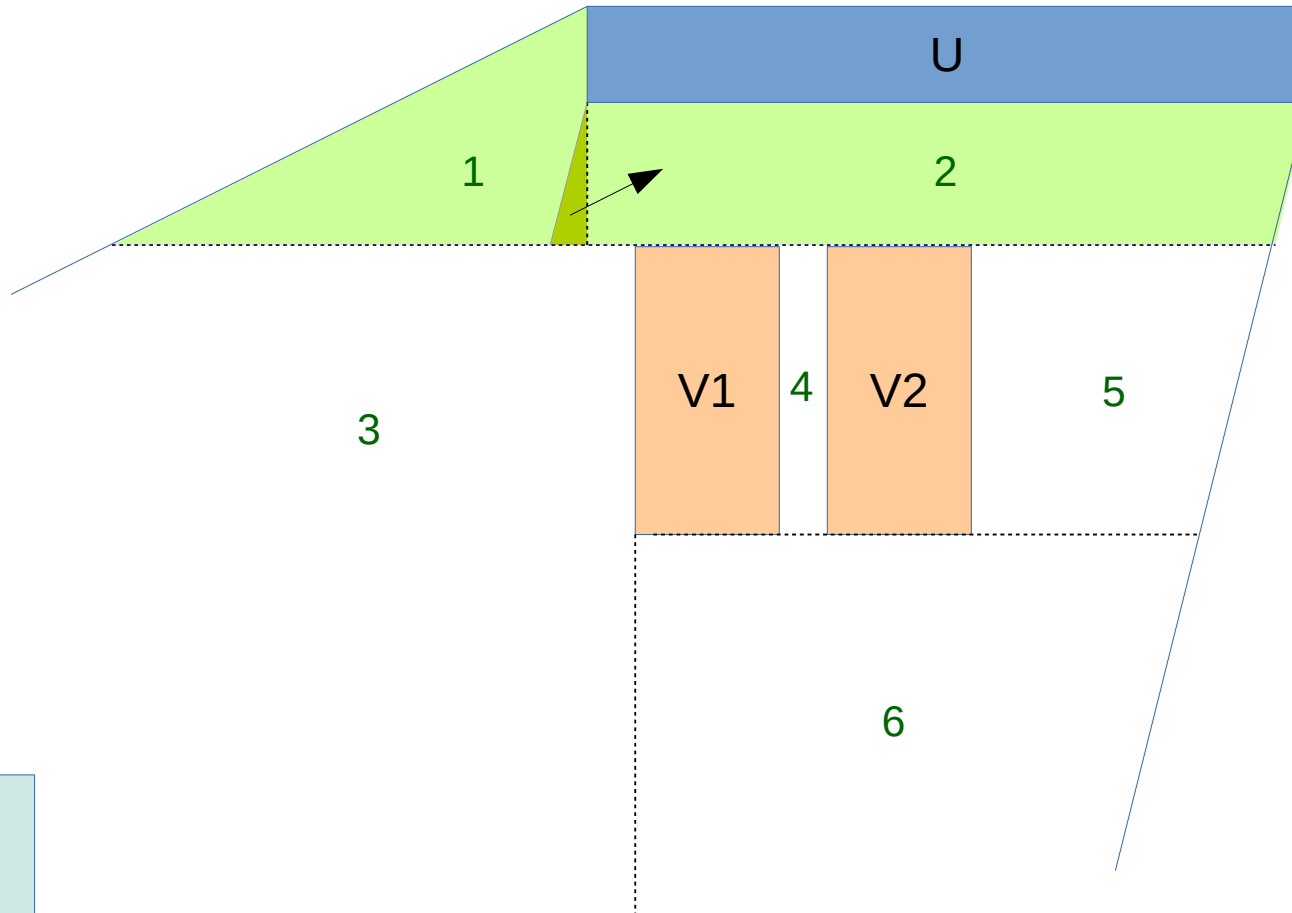


Some points of P1 go directly into U

They are added to the result



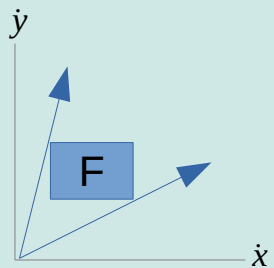
Computing $RWA(U, V)$



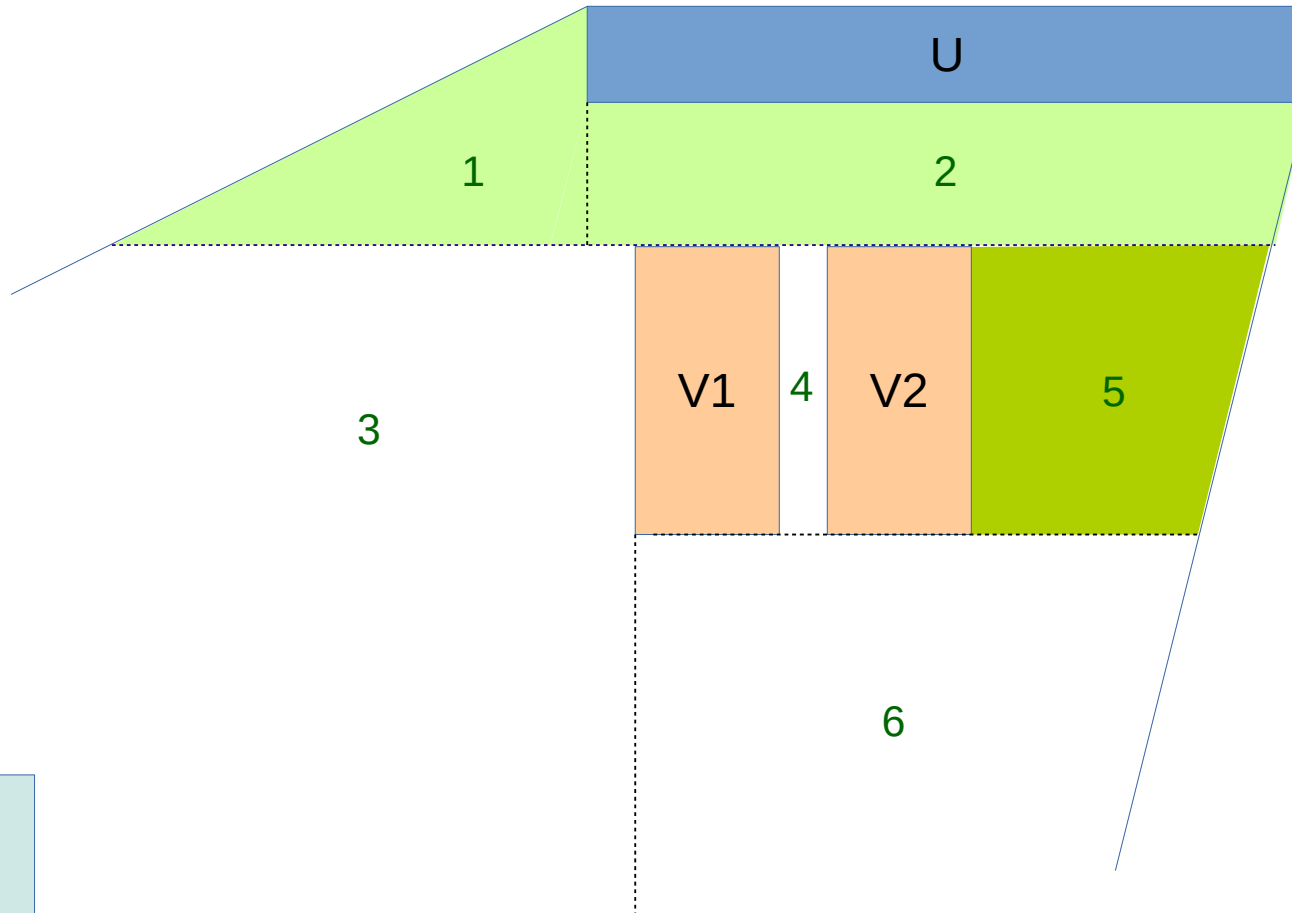
The other points of $P1$ go directly into $P2$

They are added to the result

Dynamics:

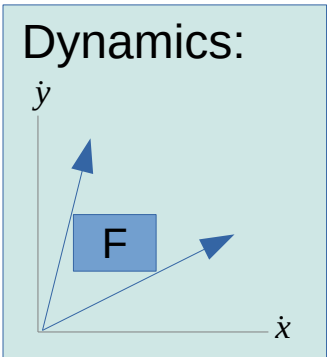


Computing $RWA(U, V)$

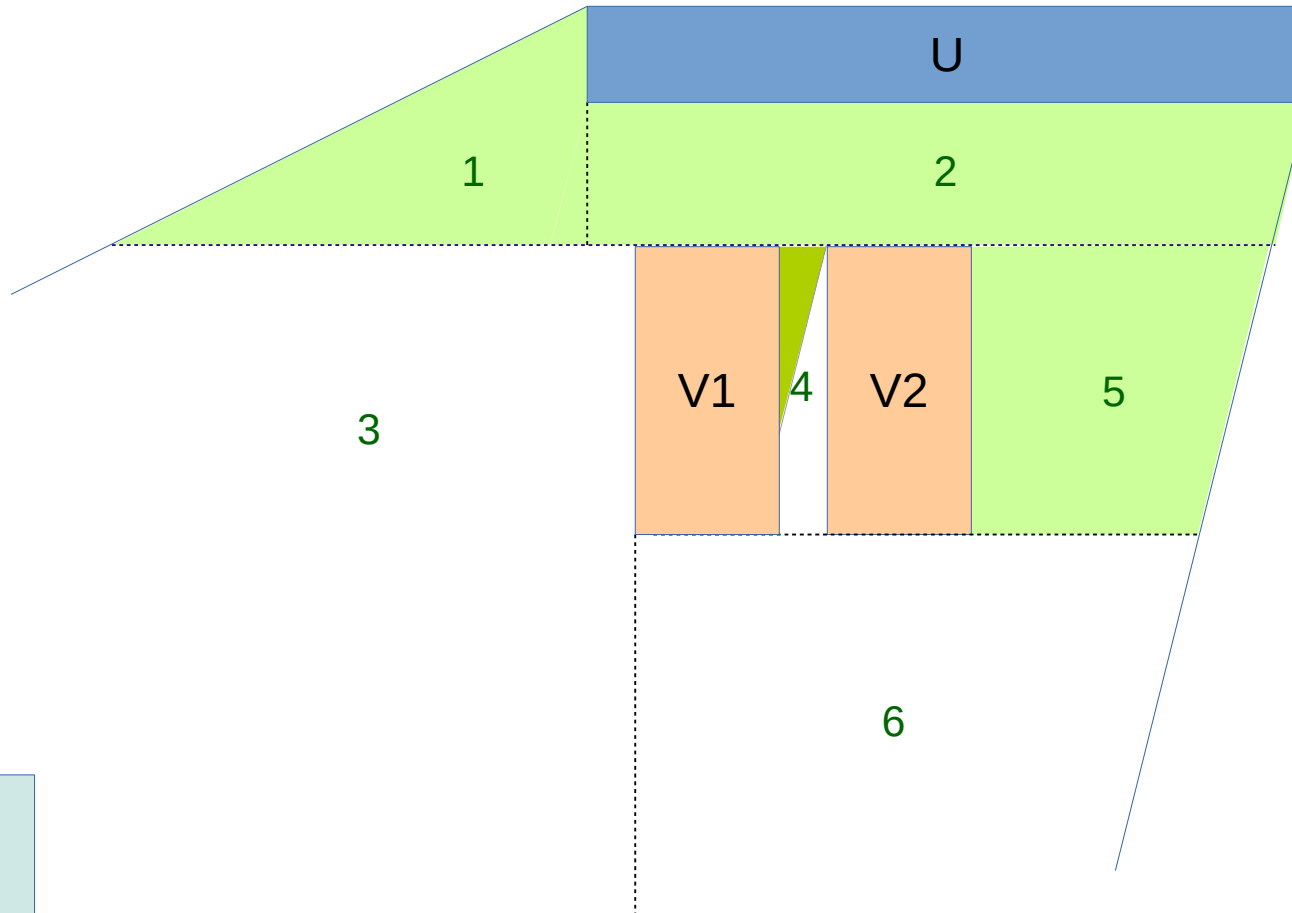


All points of P5 go directly into P2

They are added to the result

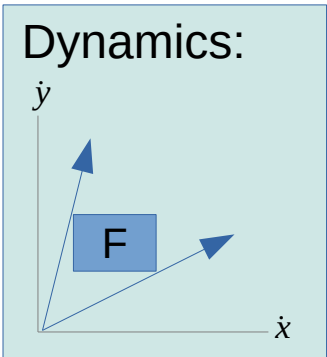


Computing $RWA(U, V)$

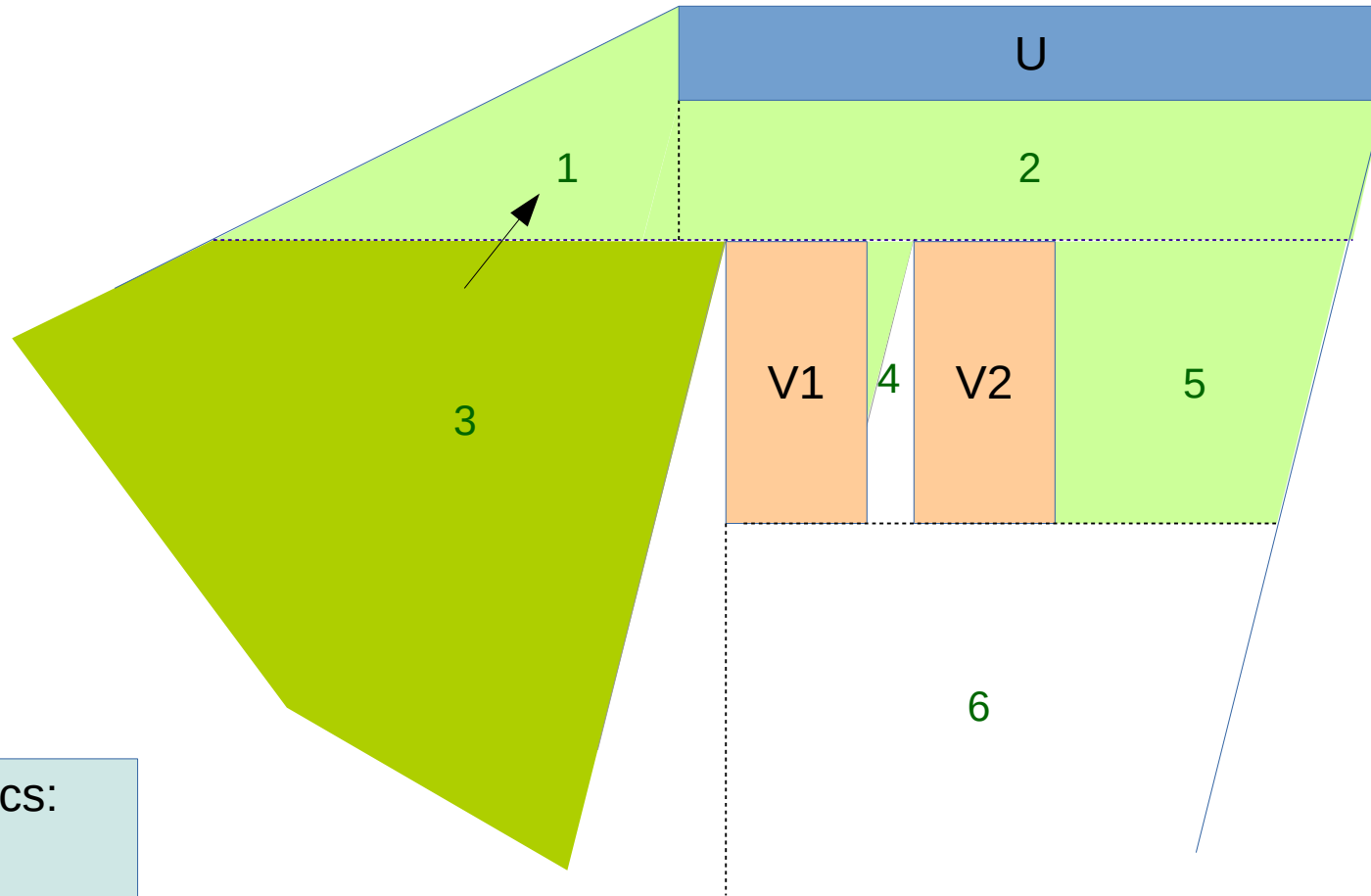


Some points
of P4 go
directly into P2

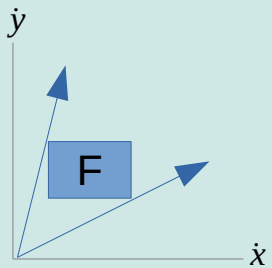
They are
added to the
result



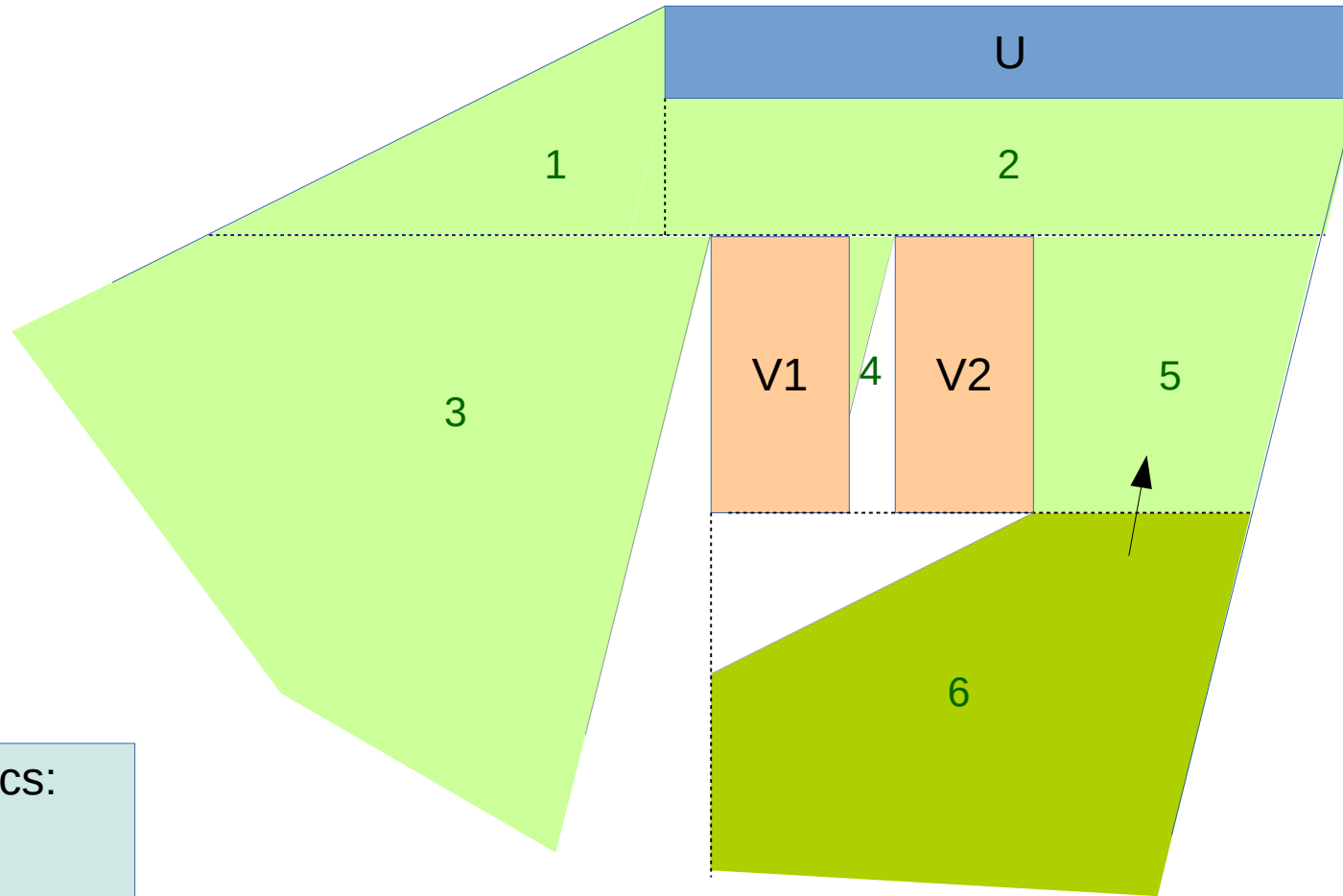
Computing $RWA(U, V)$



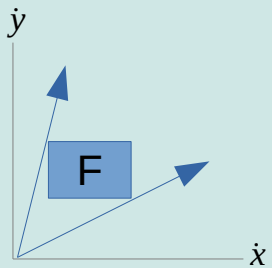
Dynamics:



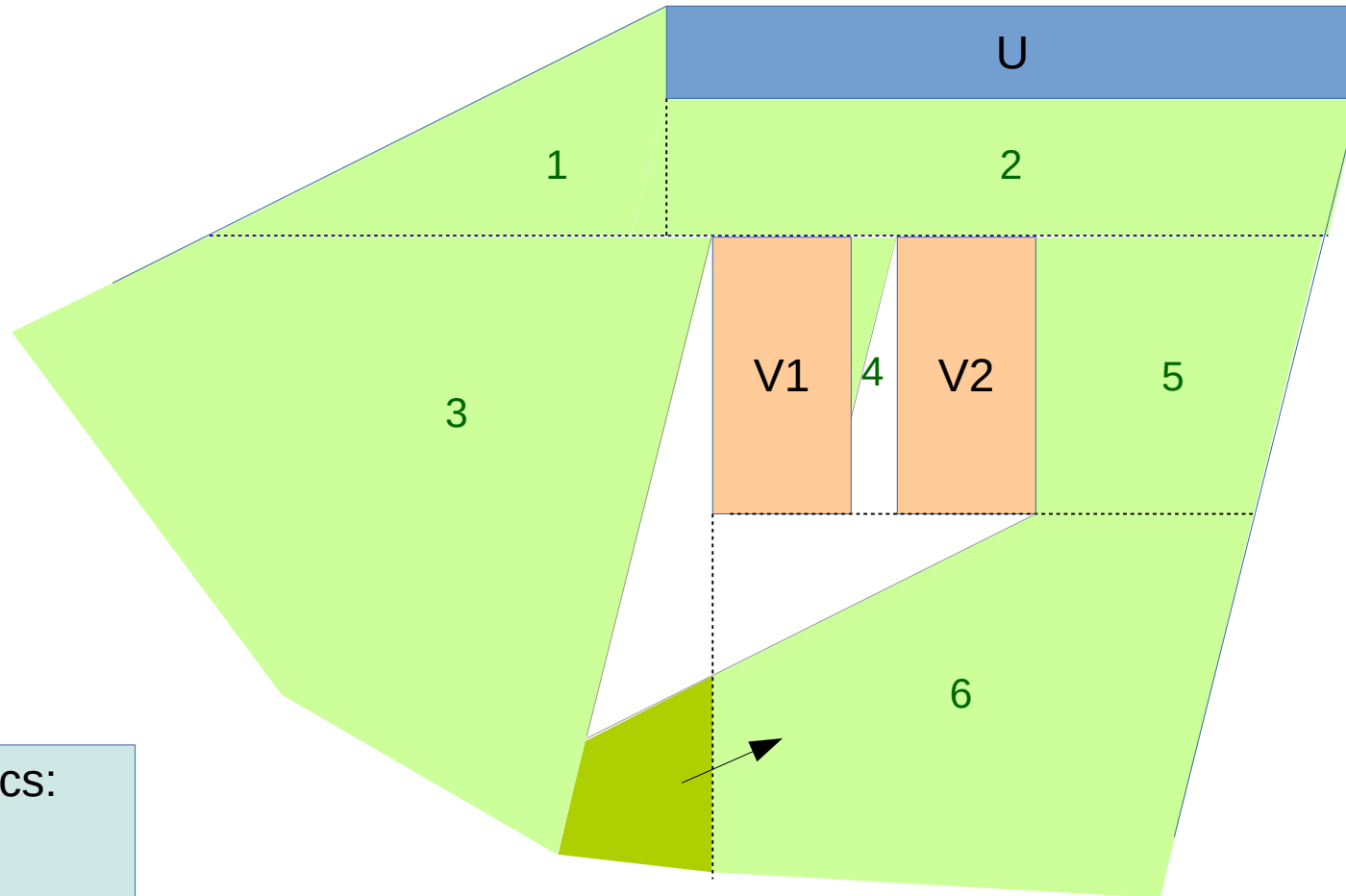
Computing $RWA(U,V)$



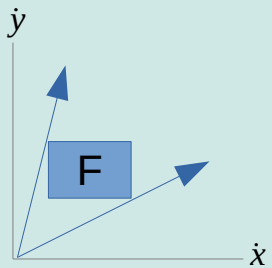
Dynamics:



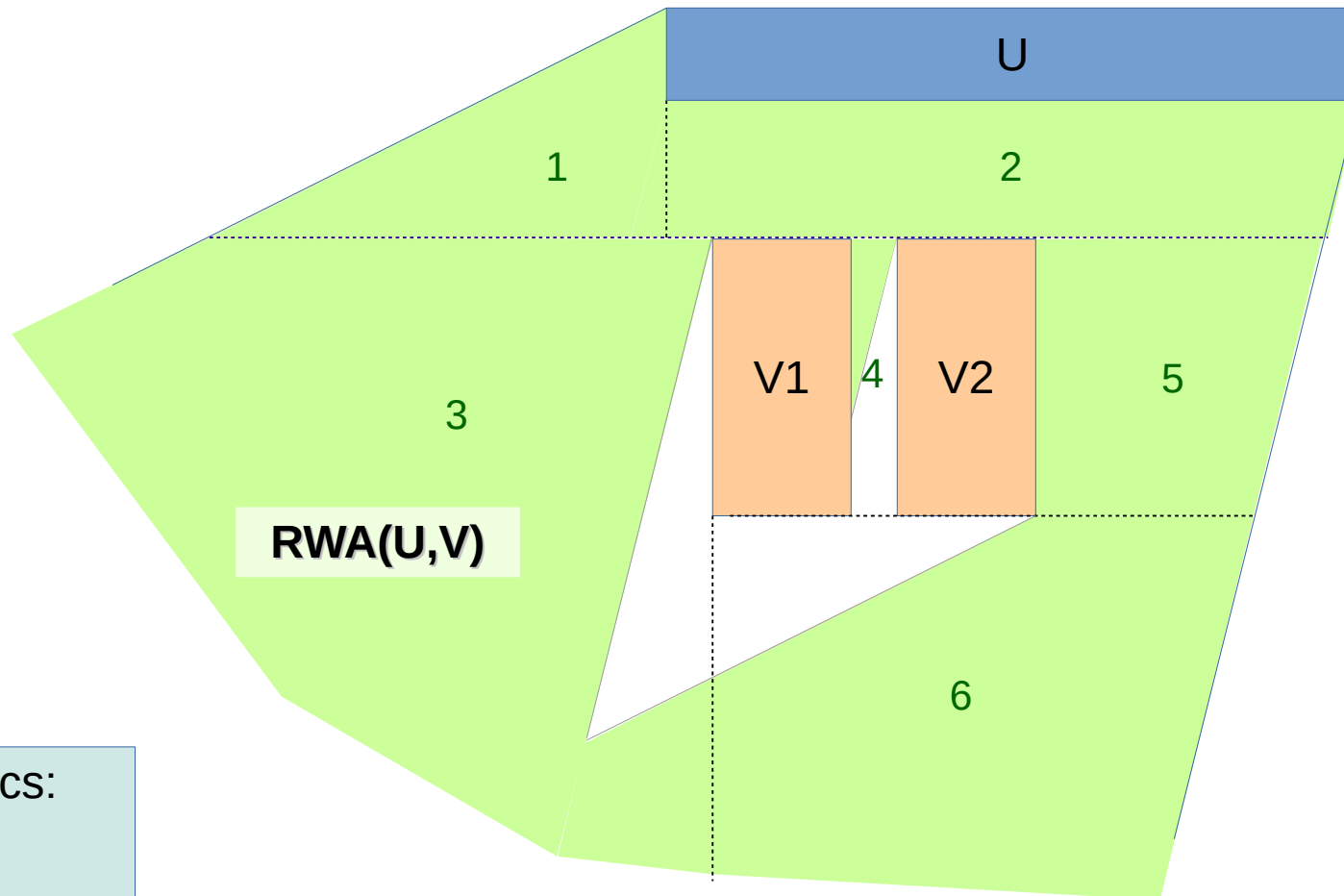
Computing $RWA(U, V)$



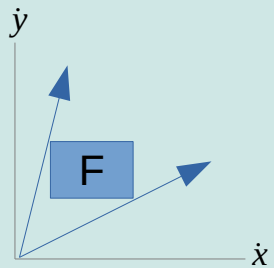
Dynamics:



Computing $RWA(U,V)$



Dynamics:



Algorithm for RWA(U, V)

$$\mu R . U \cup \bigcup_{P \in \llbracket \bar{V} \cap U \rrbracket} \bigcup_{P' \in \llbracket R \rrbracket} \left(P \cap (\text{bdry}(P, P') \cap P') \right),$$

where

$$\text{bdry}(P, P') = (P \cap \text{cl}(P')) \cup (\text{cl}(P) \cap P').$$

and $\llbracket A \rrbracket$ is the representation of A as a finite set of convex polyhedra

- Interesting implementation issues
- More info in [Benerecetti et al., TCS 2013]