

Lecture 3 – Dataflow Analysis

SWS128: Software Analysis

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2026 Fall

- A **CFG**: program points, and edges $p \xrightarrow{c} q$ carrying one command each.
- **Dominators**: a recursive definition, solved by iterating to a **fixpoint** with a worklist.

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- **Dominators**: a recursive definition, solved by iterating to a **fixpoint** with a worklist.
- Today: the same iteration, but the sets hold **data**: definitions, variables, expressions. Four classic analyses.

1. Dataflow Analysis

- Definition

- Example: Dominators

2. Four Analyses

- Overview

- Reaching Definitions

- Live Variables

- Available Expressions

- Very Busy Expressions

3. In Python

- Engine

- Homework

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- **Data** $\mathbb{D}$: the facts tracked at each point, and a **join** to merge them

$$\Gamma : N \rightarrow \mathbb{D} \qquad \sqcup : \mathbb{D} \times \mathbb{D} \rightarrow \mathbb{D}$$

($\sqcup$ is $\cup$ for **may**: some path, or $\cap$ for **must**: every path)

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- **Transfer**: what one edge $\ell = p \xrightarrow{c} q$ does to the data

$$f_{\ell}(X) = \text{gen}(\ell) \cup (X \setminus \text{kill}(\ell))$$

- $\text{kill}(\ell)$: the facts ℓ destroys
- $\text{gen}(\ell)$: the facts ℓ creates

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- **Direction**: how one round moves the data across the edges

$$\text{forward} \quad F(\Gamma)(q) = \sqcup_{\ell} f_{\ell}(\Gamma(p)) \quad \text{where } \ell = p \xrightarrow{c} q$$

$$\text{backward} \quad F(\Gamma)(p) = \sqcup_{\ell} f_{\ell}(\Gamma(q)) \quad \text{where } \ell = p \xrightarrow{c} q$$

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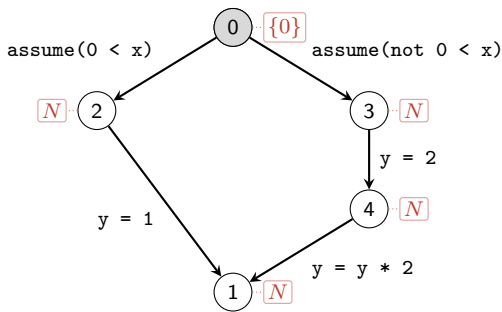
$$\text{backward} \quad F(\Gamma)(p) = \sqcup_{\ell} f_{\ell}(\Gamma(q)) \quad \text{where } \ell = p \xrightarrow{c} q$$

- **Initial** Γ_0 : the start point keeps it; elsewhere iterate $\Gamma_{i+1} = F(\Gamma_i)$ to a fixpoint, with the worklist.

Which points must have run before p ?

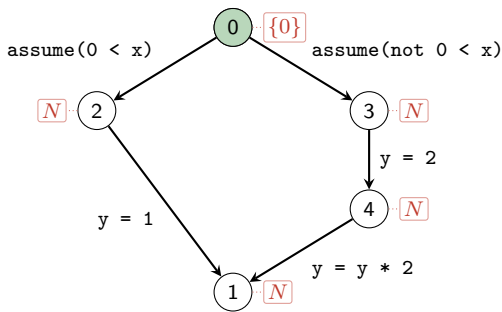
- **Data:** $\mathbb{D} = \mathcal{P}(N)$
- **Join:** $\cap$ (**must:** true on every path)
- **Transfer:** $\text{kill}(\ell) = \emptyset$, $\text{gen}(\ell) = \{q\}$ where $\ell = p \xrightarrow{c} q$
- **Direction:** forward
- **Initial:** $\Gamma_0(\text{entry}) = \{\text{entry}\}$, $\Gamma_0(p) = N$ otherwise

$$F(\Gamma)(q) = \bigcap_{\ell} (\Gamma(p) \cup \{q\}) = \{q\} \cup \bigcap_{p \rightarrow q} \Gamma(p)$$

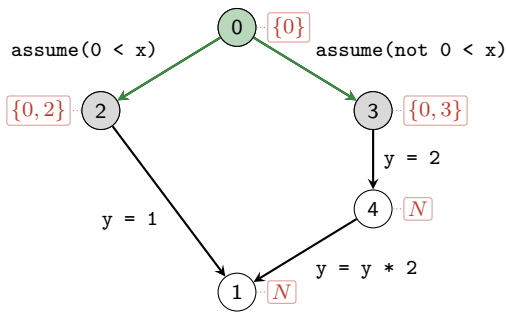


Data $\mathbb{D} = \mathcal{P}(N)$

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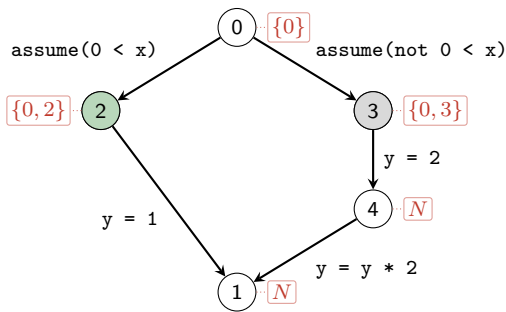
Direction forward: $W = \{\text{entry}\}$; pop p , push along each $\ell = p \xrightarrow{c} q$



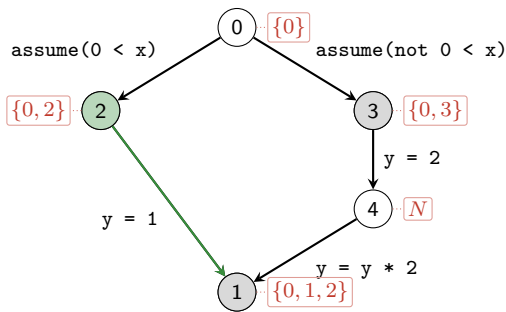
Transfer $\text{kill}(\ell) = \emptyset$, $\text{gen}(\ell) = \{q\}$ where $\ell = p \xrightarrow{c} q$

Join $\sqcup = \cap$

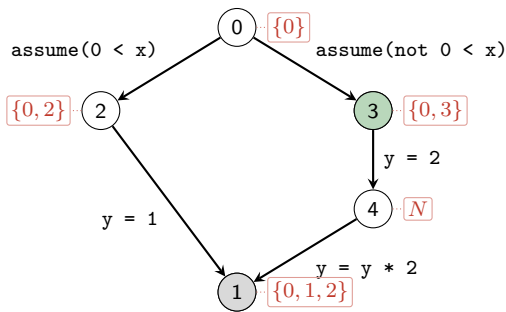
$\Gamma(2)$, $\Gamma(3)$ changed: Push 2, 3 to W



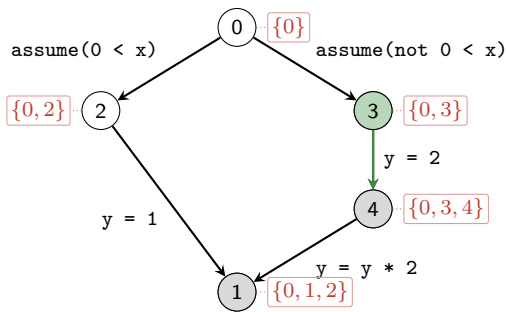
Pop 2 from $W = \{2, 3\}$



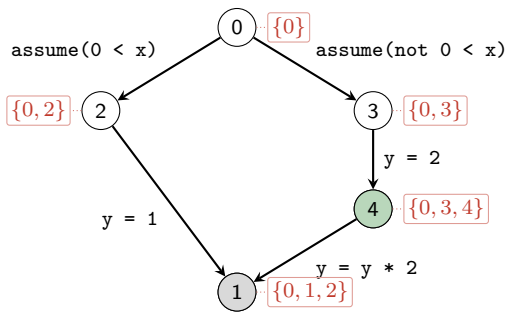
$$\Gamma(1) = N \cap \{0, 2, 1\} = \{0, 1, 2\} \quad \text{Push 1 to } W$$



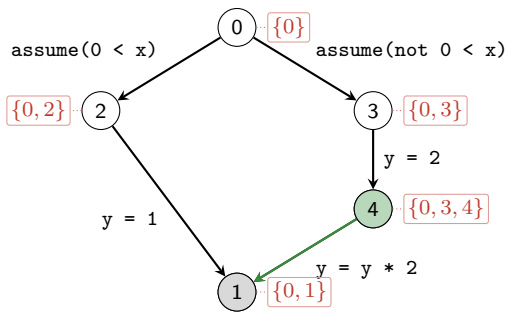
Pop 3 from $W = \{3, 1\}$



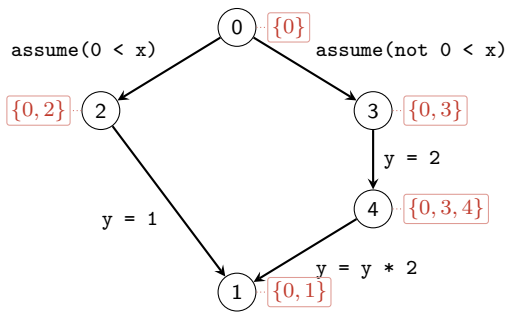
$$\Gamma(4) = N \cap \{0, 3, 4\} = \{0, 3, 4\} \quad \text{Push 4 to } W$$



Pop 4 from $W = \{1, 4\}$



$$\Gamma(1) = \{0, 1, 2\} \cap \{0, 3, 4, 1\} = \{0, 1\} \quad 1 \text{ is already in } W$$



Join $\cap$: a **must** analysis. Facts that hold on every path.

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Example: Dominators

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Two directions, two joins: four classic analyses.

	Join $\cup$ (may)	Join $\cap$ (must)
forward	reaching definitions	available expressions
backward	live variables	very busy expressions

Two directions, two joins: four classic analyses.

	Join $\cup$ (may)	Join $\cap$ (must)
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- **Reaching definitions:** which assignment may have written a variable's value?
- **Live variables:** might a variable's current value still be read?
- **Available expressions:** may an expression's result be reused?
- **Very busy expressions:** will an expression be computed on every path ahead?

Which assignment may have written the value of a variable here?

```
def f(n):  
    i = 0                # i flows from here  
    while i < n:         # i comes from two places  
        i = i + 1        # and from here  
    return i
```

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def f(n):  
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    return i
```

At **every point**, for **every variable**:
from which **assignment** did its value flow in?

- **Data:** $\mathbb{D} = \mathcal{P}(\text{Var} \times (E \uplus \{\mathbf{p}\}))$
(x_2 : x was defined on edge ℓ_2 . x_p : x is a parameter.)

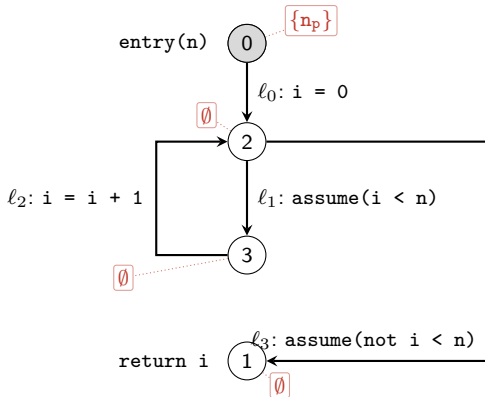
- **Join:** $\cup$ (**may:** true on some path)

- **Transfer:** for $\ell = p \xrightarrow{x:=e} q$,

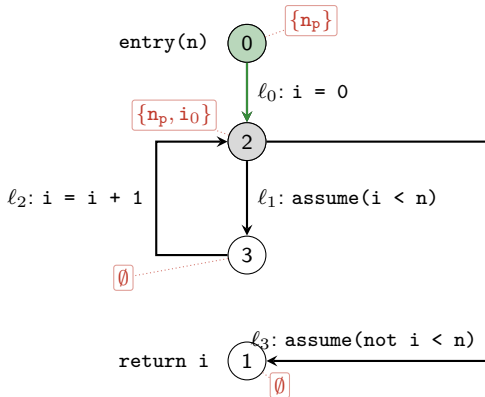
$$\text{kill}(\ell) = \{(x, d) \mid d \in E \uplus \{\mathbf{p}\}\} \quad \text{gen}(\ell) = \{(x, \ell)\}$$

and $\text{kill}(\ell) = \text{gen}(\ell) = \emptyset$ for any other command.

- **Direction:** forward
- **Initial:** $\Gamma_0(\text{entry}) = \{(x, \mathbf{p}) \mid x \text{ a parameter}\}$, $\Gamma_0(p) = \emptyset$ otherwise

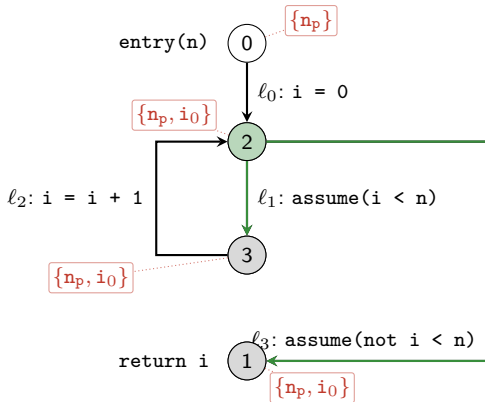


Data $\mathbb{D} = \mathcal{P}(\text{Var} \times (E \uplus \{p\}))$ **Initial** $\Gamma_0(\text{entry}) = \{n_p\}, \Gamma_0(p) = \emptyset$
 otherwise



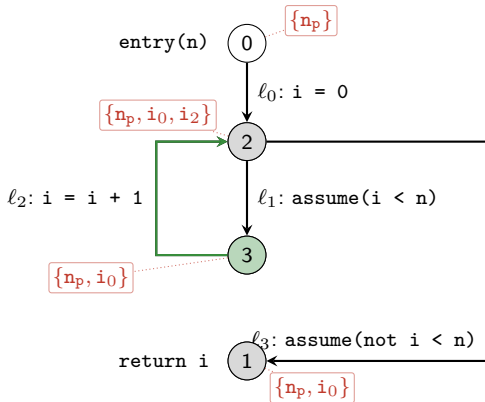
$$\text{kill}(\ell) = \{(x, d) \mid d \in E \uplus \{p\}\} \quad \text{gen}(\ell) = \{(x, \ell)\} \quad \text{for } \ell = p \xrightarrow{x:=e} q \quad \text{Join } \sqcup = \cup$$

Direction forward $\text{kill}(\ell_0) = \{i_*\} \quad \text{gen}(\ell_0) = \{i_0\}$



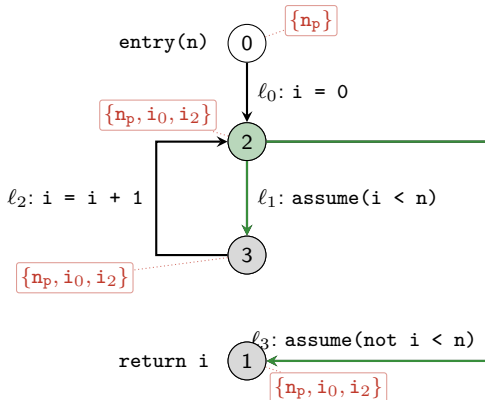
$$\text{kill}(\ell) = \{(x, d) \mid d \in E \uplus \{p\}\} \quad \text{gen}(\ell) = \{(x, \ell)\} \quad \text{for } \ell = p \xrightarrow{x:=e} q \quad \text{Join } \sqcup = \cup$$

$$\text{assume: kill}(\ell_1) = \text{gen}(\ell_1) = \emptyset \quad \text{kill}(\ell_3) = \text{gen}(\ell_3) = \emptyset$$



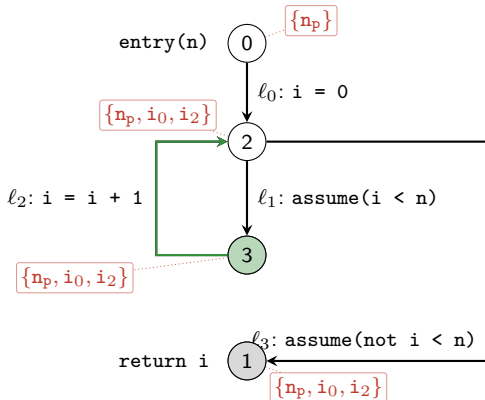
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$$\text{kill}(\ell_2) = \{i_*\} \quad \text{gen}(\ell_2) = \{i_2\}$$

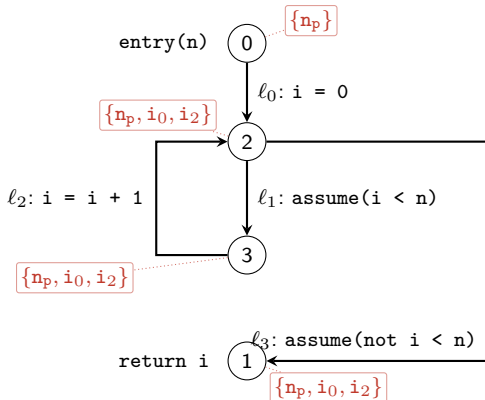


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$$\begin{aligned}
 \text{kill}(\ell) &= \{(x, d) \mid d \in E \uplus \{p\}\} & \text{gen}(\ell) &= \{(x, \ell)\} & \text{for } \ell = p \xrightarrow{x:=e} q & \quad \mathbf{Join} \sqcup = \cup \\
 \text{kill}(\ell_2) &= \{i_*\} & \text{gen}(\ell_2) &= \{i_2\} & \Gamma(2) \text{ unchanged}
 \end{aligned}$$



Join ∪: a **may** analysis. Facts that hold on *some* path.
 At 2, i may come from ℓ₀ (first round) or ℓ₂ (later rounds).

Might the current value of a variable still be read later?

```
def f(a, b):  
    x = a * 2           # dead: overwritten before any read  
    y = b * 2           # live: one branch reads it  
    if a < b:  
        x = y  
    else:  
        x = b  
    return x
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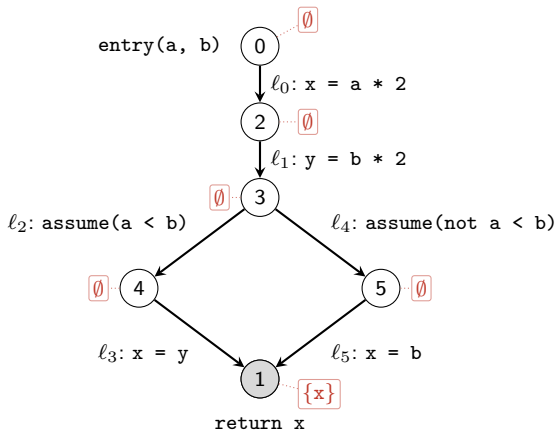
At **every point**, for **every variable**:
may its **current value** still be **read**?

- **Data:** $\mathbb{D} = \mathcal{P}(\text{Var})$
- **Join:** $\cup$ (**may**: true on some path)
- **Transfer:** for $\ell = p \xrightarrow{c} q$,

$$\text{kill}(\ell) = \text{defs}(c) \quad \text{gen}(\ell) = \text{uses}(c)$$

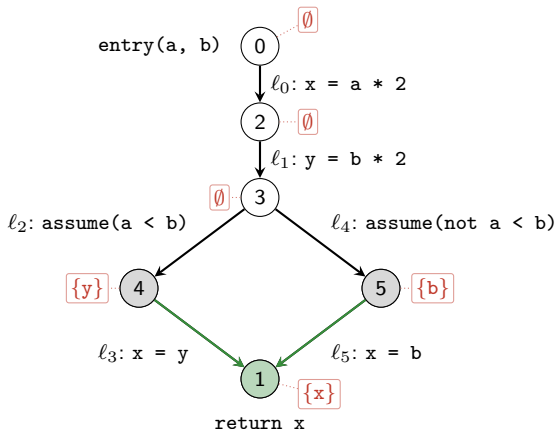
($\text{defs}(c)$: the variables c writes. $\text{uses}(c)$: the variables c reads.)

- **Direction:** backward
- **Initial:** $\Gamma_0(\text{exit}) = \text{vars}(\text{the returned expression})$, $\Gamma_0(p) = \emptyset$ otherwise



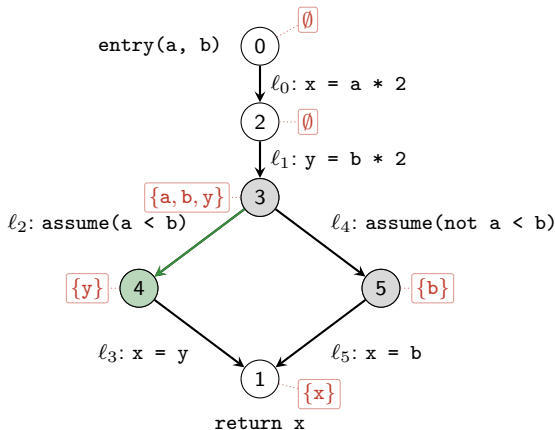
Data $\mathbb{D} = \mathcal{P}(\text{Var})$

Initial $\Gamma_0(\text{exit}) = \{x\}$ from return x, $\Gamma_0(p) = \emptyset$ otherwise



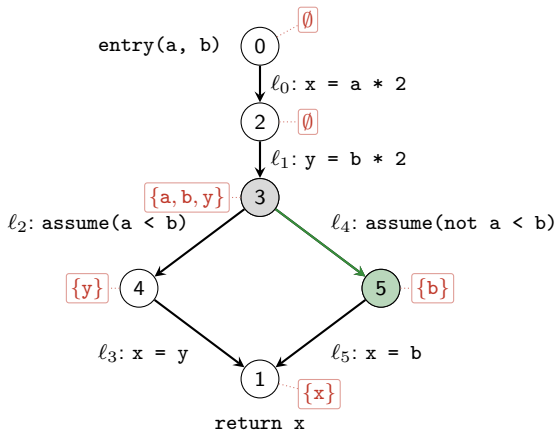
$\text{kill}(\ell) = \text{defs}(c)$ $\text{gen}(\ell) = \text{uses}(c)$ for $\ell = p \xrightarrow{c} q$ **Join** $\sqcup = \cup$

Direction backward $\text{kill}(\ell_3) = \text{kill}(\ell_5) = \{x\}$ $\text{gen}(\ell_3) = \{y\}, \text{gen}(\ell_5) = \{b\}$



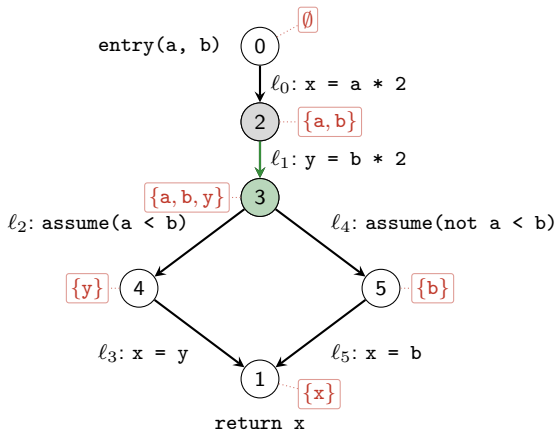
$\text{kill}(\ell) = \text{defs}(c)$ $\text{gen}(\ell) = \text{uses}(c)$ for $\ell = p \xrightarrow{c} q$ **Join** $\sqcup = \cup$

$\text{kill}(\ell_2) = \emptyset$ $\text{gen}(\ell_2) = \{a, b\}$



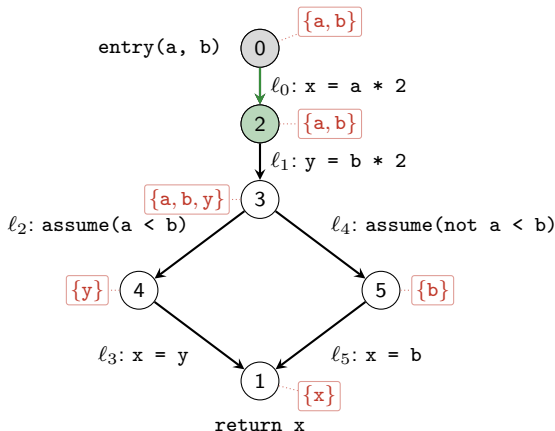
$\text{kill}(\ell) = \text{defs}(c)$ $\text{gen}(\ell) = \text{uses}(c)$ for $\ell = p \xrightarrow{c} q$ **Join** $\sqcup = \cup$

$\text{kill}(\ell_4) = \emptyset$ $\text{gen}(\ell_4) = \{a, b\}$ $\Gamma(3)$ unchanged



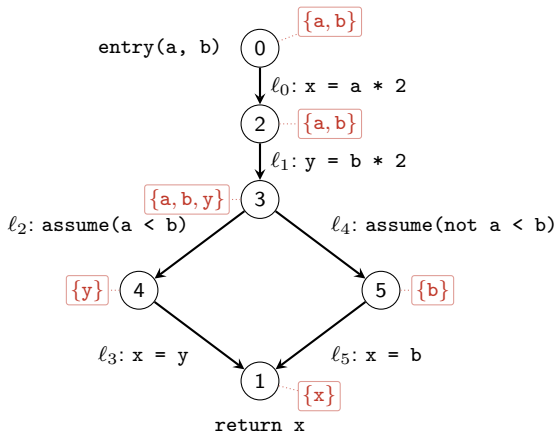
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$\text{kill}(\ell_1) = \{y\}$ $\text{gen}(\ell_1) = \{b\}$



$\text{kill}(\ell) = \text{defs}(c)$ $\text{gen}(\ell) = \text{uses}(c)$ for $\ell = p \xrightarrow{c} q$ **Join** $\sqcup = \cup$

$\text{kill}(\ell_0) = \{x\}$ $\text{gen}(\ell_0) = \{a\}$



Join $\cup$: a **may** analysis. Facts that hold on *some* path.

x is dead at 2: $x = a * 2$ can go. y is live at 3: one branch reads it.

May the result of an expression be reused here?

```
def f(a, b, c):  
    x = (a + b) + (c * 2)  # computes a + b and c * 2  
    if a < b:  
        a = 0              # a changes on this path  
    y = (a + b) + 3        # a + b: must recompute  
    z = 1 + (c * 2)        # c * 2: can reuse  
    return y + z
```

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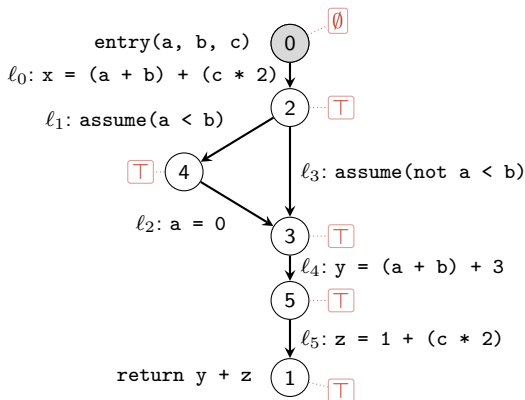
At **every point**: which **expressions** were computed on **every path**,
with no operand changed since?

- **Data:** $\mathbb{D} = \mathcal{P}(\text{Expr})$
- **Join:** $\cap$ (**must:** true on every path)
- **Transfer:** for $\ell = p \xrightarrow{c} q$,

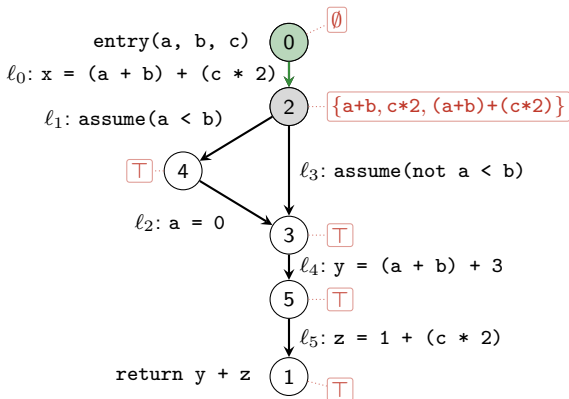
$$\text{kill}(\ell) = \{e \mid \text{vars}(e) \cap \text{defs}(c) \neq \emptyset\} \quad \text{gen}(\ell) = \text{exprs}(c) \setminus \text{kill}(\ell)$$

($\text{exprs}(c)$: the expressions c evaluates.)

- **Direction:** forward
- **Initial:** $\Gamma_0(\text{entry}) = \emptyset$, $\Gamma_0(p) = \text{Expr}$ otherwise

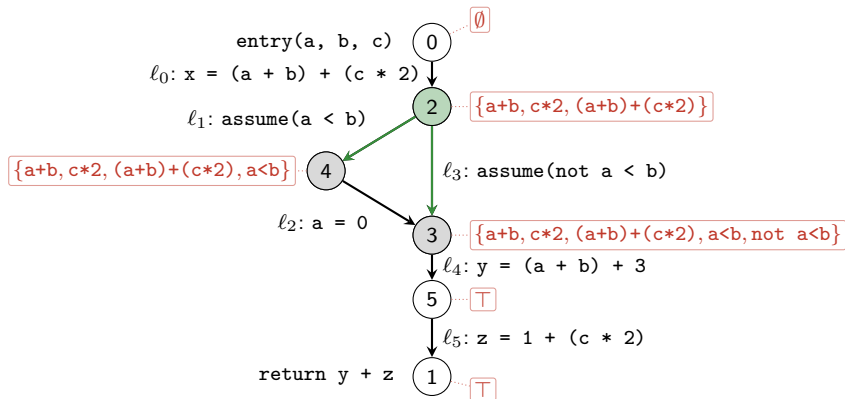


Data $\mathbb{D} = \mathcal{P}(\text{Expr})$ **Initial** $\Gamma_0(\text{entry}) = \emptyset, \Gamma_0(p) = \top$ otherwise
 ($\top = \text{Expr}$: every expression in the program)



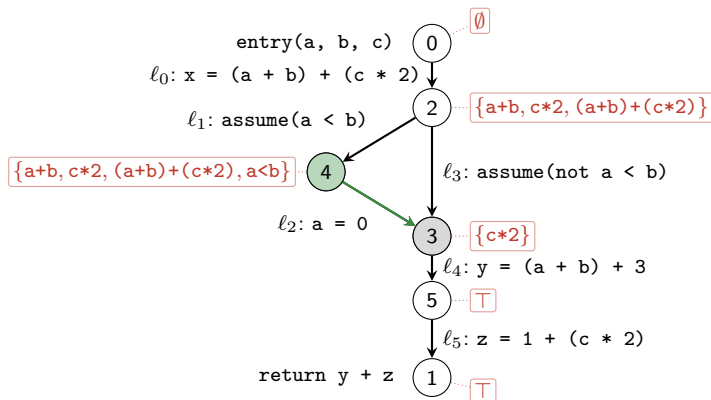
$\text{kill}(\ell) = \{e \mid \text{vars}(e) \cap \text{defs}(c) \neq \emptyset\}$
 $\text{gen}(\ell) = \text{exprs}(c) \setminus \text{kill}(\ell)$
 for $\ell = p \xrightarrow{c} q$
Join $\sqcup = \cap$

Direction forward
 $\text{kill}(\ell_0) = \emptyset$
 $\text{gen}(\ell_0) = \{a+b, c*2, (a+b)+(c*2)\}$



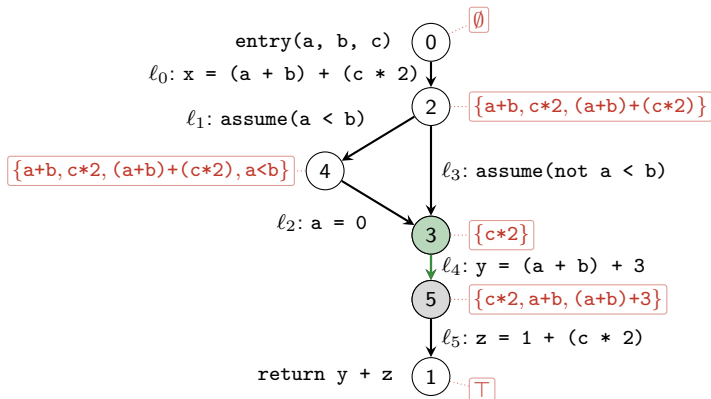
$\text{kill}(\ell) = \{e \mid \text{vars}(e) \cap \text{defs}(c) \neq \emptyset\}$ $\text{gen}(\ell) = \text{exprs}(c) \setminus \text{kill}(\ell)$ for $\ell = p \xrightarrow{c} q$ **Join** $\sqcup = \cap$

$\text{kill}(\ell_1) = \text{kill}(\ell_3) = \emptyset$ $\text{gen}(\ell_1) = \{a < b\}$, $\text{gen}(\ell_3) = \{a < b, \text{not } a < b\}$



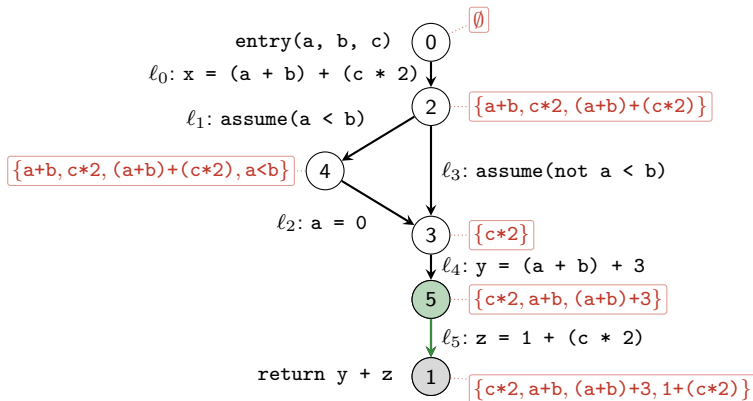
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$\text{kill}(\ell_2) = \{a+b, (a+b)+3, (a+b)+(c*2), a<b, \text{not } a<b\}$ $\text{gen}(\ell_2) = \emptyset$



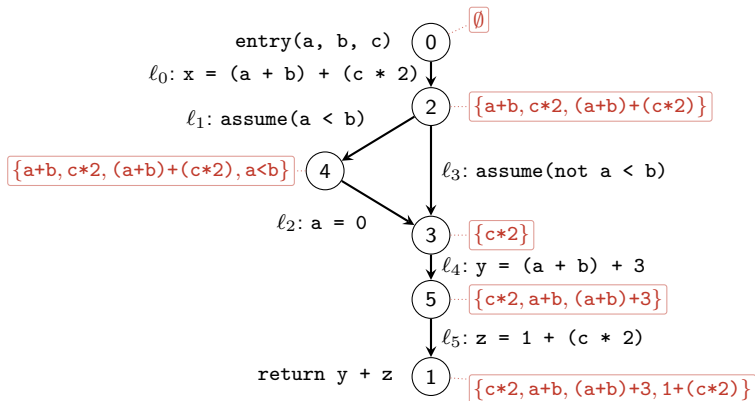
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$\text{kill}(\ell_4) = \{y+z\}$ $\text{gen}(\ell_4) = \{a+b, (a+b)+3\}$



$\text{kill}(\ell) = \{e \mid \text{vars}(e) \cap \text{defs}(c) \neq \emptyset\}$ $\text{gen}(\ell) = \text{exprs}(c) \setminus \text{kill}(\ell)$ for $\ell = p \xrightarrow{c} q$ **Join** $\sqcup = \cap$

$\text{kill}(\ell_5) = \{y+z\}$ $\text{gen}(\ell_5) = \{c*2, 1+(c*2)\}$



Join $\cap$: a **must** analysis. Facts that hold on *every* path.

At 3, $c*2$ is still available and $a+b$ is not: reuse one, recompute the other.

Will an expression be computed on every path from here?

```
def f(a, b, c):  
    if c < 0:  
        x = (a * b) + (b + 1)  
    else:  
        a = 1                                # a changes: kills a * b  
        x = (a * b) + (b + 1)  
    return x
```

Will an expression be computed on every path from here?

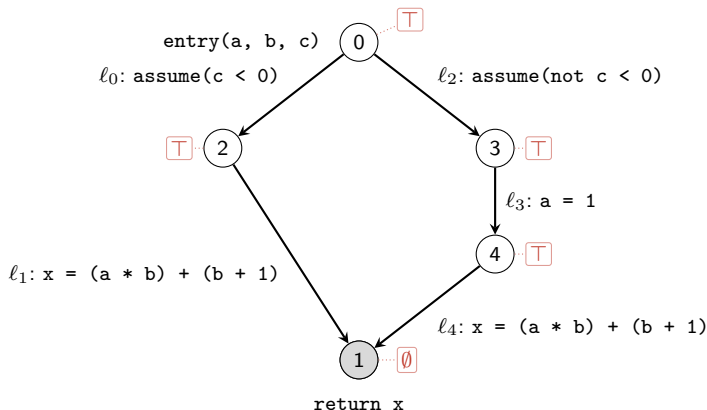
```
def f(a, b, c):  
    if c < 0:  
        x = (a * b) + (b + 1)  
    else:  
        a = 1                                # a changes: kills a * b  
        x = (a * b) + (b + 1)  
    return x
```

At **every point**: which **expressions** will **every path** compute next,
before an operand changes?

- **Data:** $\mathbb{D} = \mathcal{P}(\text{Expr})$
- **Join:** $\cap$ (**must:** true on every path)
- **Transfer:** for $\ell = p \xrightarrow{c} q$,

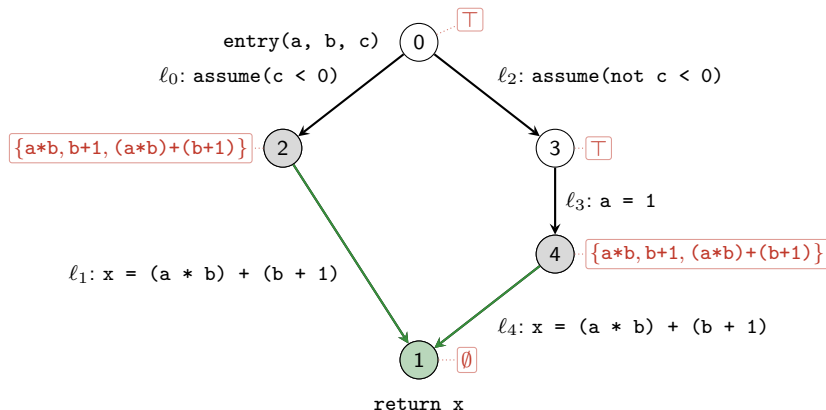
$$\text{kill}(\ell) = \{e \mid \text{vars}(e) \cap \text{defs}(c) \neq \emptyset\} \quad \text{gen}(\ell) = \text{exprs}(c)$$

- **Direction:** backward
- **Initial:** $\Gamma_0(\text{exit}) = \text{exprs}(\text{the returned expression})$, $\Gamma_0(p) = \text{Expr}$ otherwise



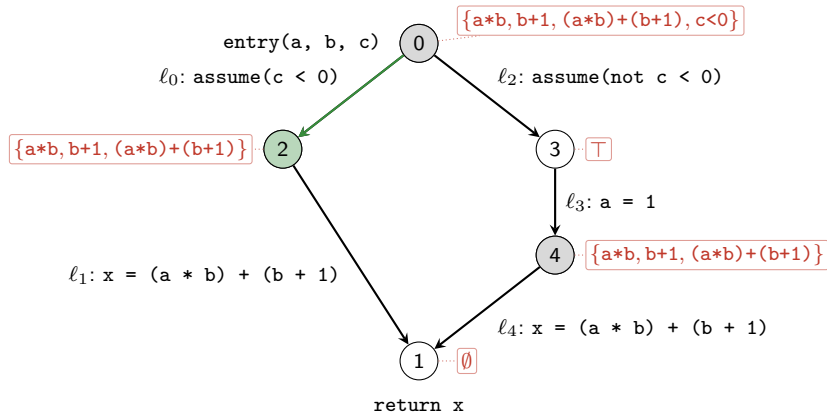
Data $\mathbb{D} = \mathcal{P}(\text{Expr})$
otherwise

Initial $\Gamma_0(\text{exit}) = \emptyset$ from return x, $\Gamma_0(p) = \top$
($\top = \text{Expr}$: every expression in the program)



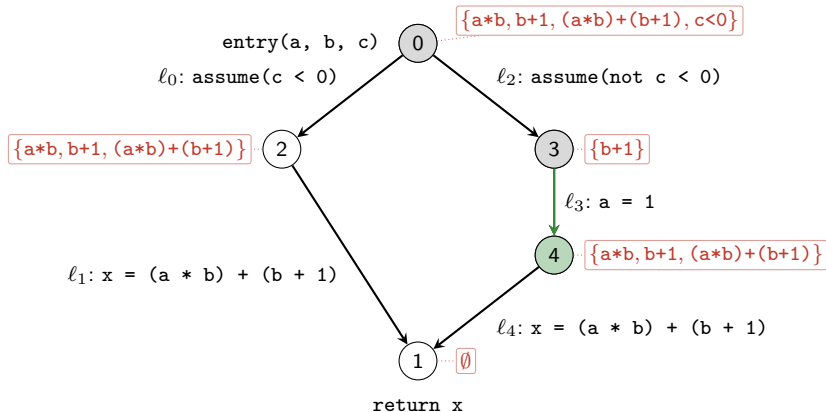
$\text{kill}(\ell) = \{e \mid \text{vars}(e) \cap \text{defs}(c) \neq \emptyset\}$ $\text{gen}(\ell) = \text{exprs}(c)$ for $\ell = p \xrightarrow{c} q$ **Join** $\sqcup = \cap$

Direction backward $\text{kill}(\ell_1) = \text{kill}(\ell_4) = \emptyset$
 $\text{gen}(\ell_1) = \text{gen}(\ell_4) = \{a*b, b+1, (a*b)+(b+1)\}$



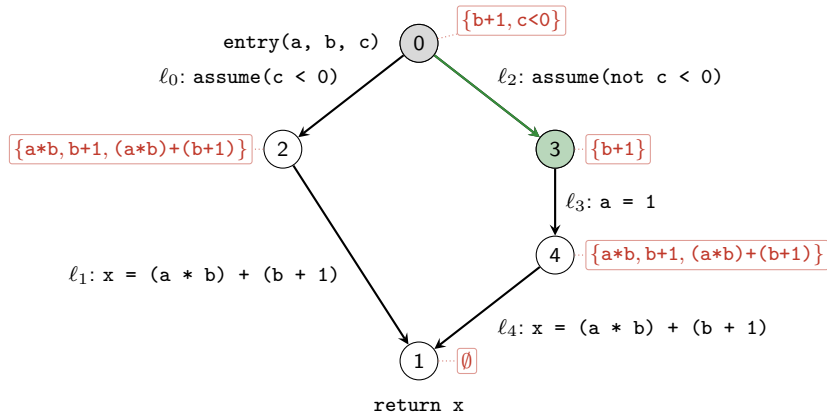
$$\text{kill}(\ell) = \{e \mid \text{vars}(e) \cap \text{defs}(c) \neq \emptyset\} \quad \text{gen}(\ell) = \text{exprs}(c) \quad \text{for } \ell = p \xrightarrow{c} q \quad \textbf{Join } \sqcup = \cap$$

$$\text{kill}(\ell_0) = \emptyset \quad \text{gen}(\ell_0) = \{c < 0\}$$



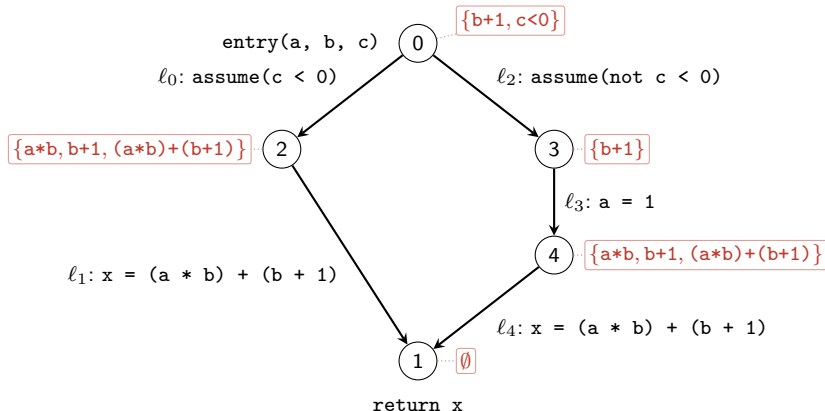
$$\text{kill}(\ell) = \{e \mid \text{vars}(e) \cap \text{defs}(c) \neq \emptyset\} \quad \text{gen}(\ell) = \text{exprs}(c) \quad \text{for } \ell = p \xrightarrow{c} q \quad \textbf{Join } \sqcup = \cap$$

$$\text{kill}(\ell_3) = \{a*b, (a*b)+(b+1)\} \quad \text{gen}(\ell_3) = \emptyset$$



$$\text{kill}(\ell) = \{e \mid \text{vars}(e) \cap \text{defs}(c) \neq \emptyset\} \quad \text{gen}(\ell) = \text{exprs}(c) \quad \text{for } \ell = p \xrightarrow{c} q \quad \text{Join } \sqcup = \cap$$

$$\text{kill}(\ell_2) = \emptyset \quad \text{gen}(\ell_2) = \{c < 0, \text{not } c < 0\}$$



Join $\sqcap$: a **must** analysis. Facts that hold on every path.

$b+1$ is very busy at entry: hoist it. $a*b$ is not: one branch changes a first.

1. Dataflow Analysis

- Definition

- Example: Dominators

2. Four Analyses

- Overview

- Reaching Definitions

- Live Variables

- Available Expressions

- Very Busy Expressions

3. In Python

- Engine

- Homework

```
Data = frozenset

PARAM = -1          # the "edge" that defines the parameters: the call itself

@dataclass(frozen=True)
class Analysis:
    forward: bool
    bottom: Data      # initial guess everywhere
    init: Data        # the data at the start point
    join: Callable[[Data, Data], Data]
    transfer: Callable[[Edge, Data], Data] # what one edge does
```

- bottom and join: the data and $\sqcup$. init: Γ_0 at the start point.
- transfer: f_ℓ , given the Edge. forward: which F .

```
def solve(g: CFG, a: Analysis) -> dict[NodeId, Data]:
    """Least fixpoint of the dataflow equations: one set per program point.

        forward:  data(q) = join of transfer(e, data(p)) for every edge p -> q
        backward: data(p) = join of transfer(e, data(q)) for every edge p -> q
    """
    start = g.entry if a.forward else g.exit
    data = {p: a.bottom for p in g}
    data[start] = a.init
    work = Worklist([start])
    while work:
        p = work.pop()
        # for every edge out of p in the direction of a, to a point q:
        #   data[q] = a.join(data[q], a.transfer(e, data[p]))
        #   and push q if that changed it, or if q is newly reached
    return data
```

- The dominators loop, reading its four parameters from a.

```
def dominators(g: CFG) -> Analysis:
    """Which points must have run before this one?"""
    def transfer(e: Edge, s: Data) -> Data:
        return s | {e.dst}                                # kill nothing, gen q

    return Analysis(True, frozenset(g.nodes), frozenset({g.entry}),
                    frozenset.intersection, transfer)
```

- The dominators table, as data: forward, bottom is N , init is $\{\text{entry}\}$, join is $\cap$.
- One line of content: $f_\ell(X) = X \cup \{q\}$.
- The other three analyses: change these five values.

- Fill in `dataflow.py`: the engine, **reaching definitions**, **live variables**, **available expressions**.
- Everything you need, and the tests that grade you:
github.com/ku-plrg-classroom/py-dataflow
- Due October 12 on the [LMS](#). Submit `dataflow.py` only.

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- Taint Analysis

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