

# Scaling Transaction Verifications in Cryptocurrencies

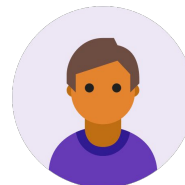
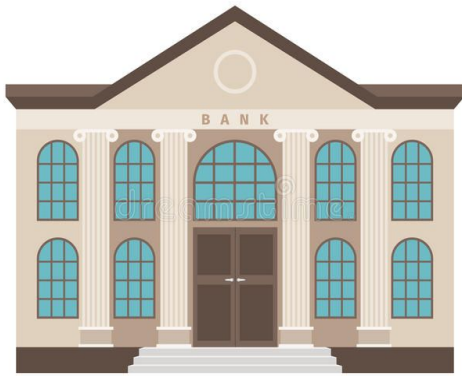
PRIMES Computer Science Conference

October 13th, 2018

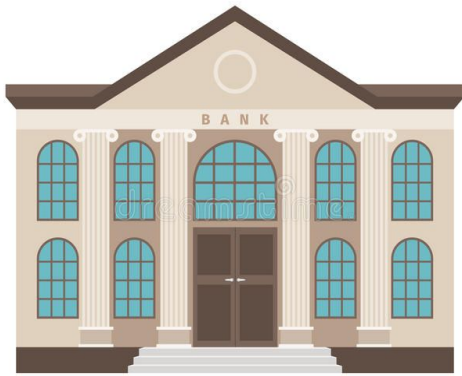
Yiming Zheng

Alin Tomescu

# Motivation



# Motivation



Balance: \$50

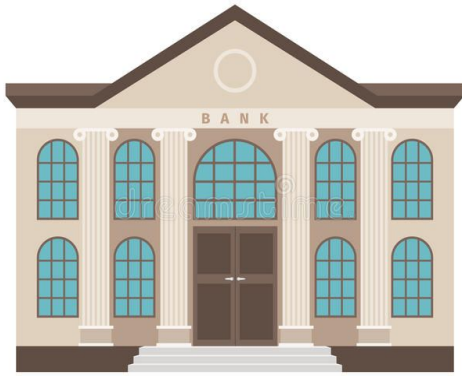


Balance: \$40



Balance: \$50

# Motivation



Digest:  $d_n$



Balance: \$50

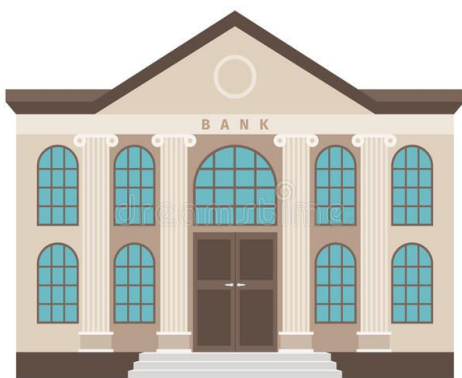


Balance: \$40



Balance: \$50

# Motivation



Digest:  $d_n$



Balance: \$50,  
Proof:  $\Pi_A(n)$

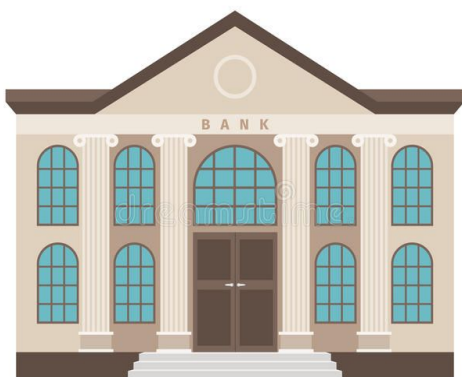


Balance: \$40,  
Proof:  $\Pi_B(n)$



Balance: \$50,  
Proof:  $\Pi_C(n)$

# Motivation



Digest:  $d_n$

Send \$20 to Carl



Balance: \$50,  
Proof:  $\Pi_A(n)$

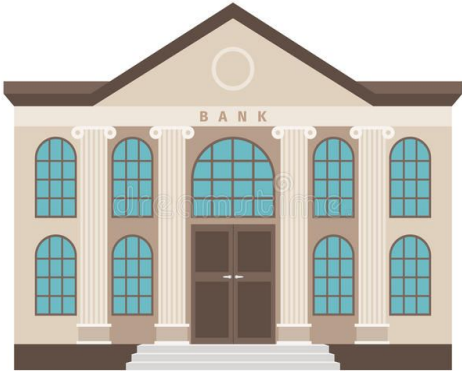


Balance: \$40,  
Proof:  $\Pi_B(n)$



Balance: \$50,  
Proof:  $\Pi_C(n)$

# Motivation



Digest:  $d_n$

Send \$20 to Carl



Balance: \$50,  
Proof:  $\Pi_A(n)$

$\Pi_A(n)$



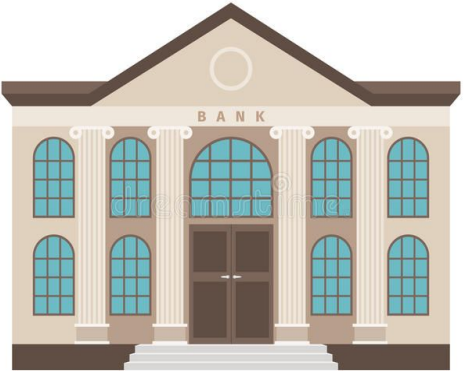
Balance: \$40,  
Proof:  $\Pi_B(n)$

⋮



Balance: \$50,  
Proof:  $\Pi_C(n)$

# Motivation

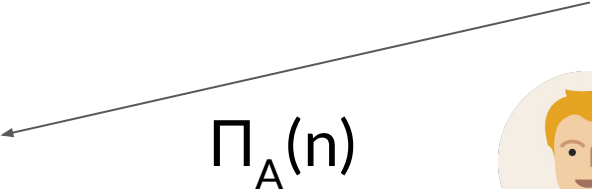


Digest:  $d_n$

$\text{Ver}(d_n, A, \$20, \Pi_A(n))$



Balance: \$50,  
Proof:  $\Pi_A(n)$



$\Pi_A(n)$



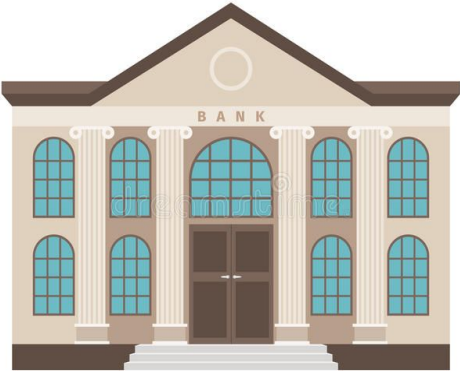
Balance: \$40,  
Proof:  $\Pi_B(n)$



Balance: \$50,  
Proof:  $\Pi_C(n)$



# Motivation

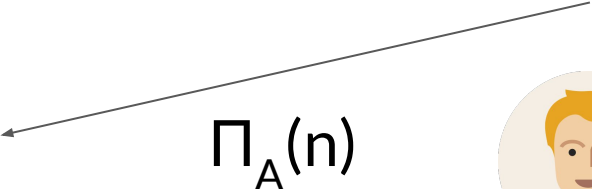


Digest:  $d_n$

$$\text{Ver}(d_n, A, \$20, \Pi_A(n)) = \mathbf{T}$$



Balance: \$50,  
Proof:  $\Pi_A(n)$



$\Pi_A(n)$

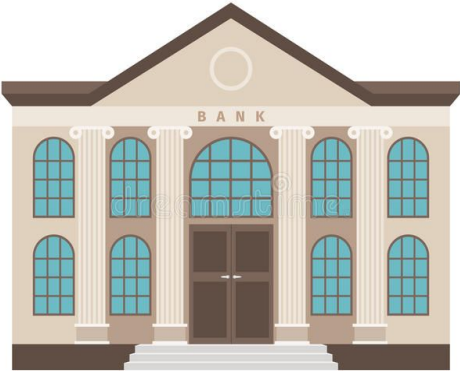


Balance: \$40,  
Proof:  $\Pi_B(n)$



Balance: \$50,  
Proof:  $\Pi_C(n)$

# Motivation



Digest:  $d_n$

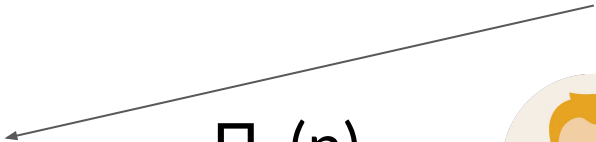
$$\text{Ver}(d_n, A, \$20, \Pi_A(n)) = \mathbf{T}$$

Alice indeed has \$50



Balance: \$50,  
Proof:  $\Pi_A(n)$

$\Pi_A(n)$

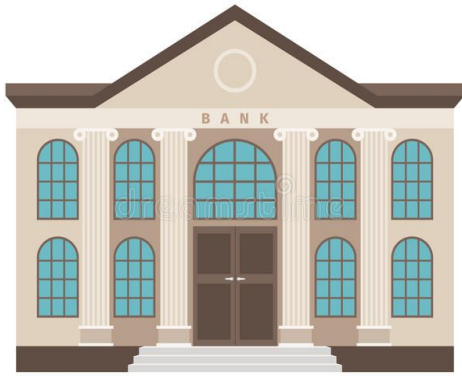


Balance: \$40,  
Proof:  $\Pi_B(n)$



Balance: \$50,  
Proof:  $\Pi_C(n)$

# Motivation



Digest:  $d_n$

$$\text{Ver}(d_n, A, \$20, \Pi_A(n)) = \mathbf{T}$$

Alice indeed has \$50

The server only stores a 32-byte digest  $d_n$



Balance: \$50,  
Proof:  $\Pi_A(n)$



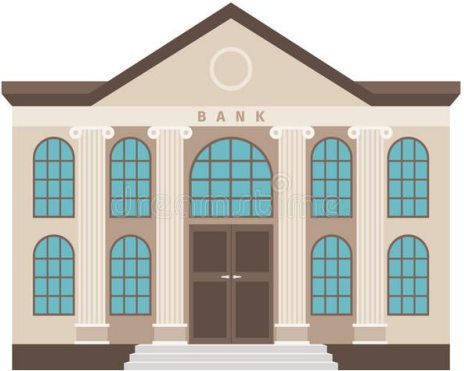
Balance: \$40,  
Proof:  $\Pi_B(n)$



Balance: \$50,  
Proof:  $\Pi_C(n)$

$\Pi_A(n)$

# Motivation



Digest:  $d_n$

-\$20



Balance: \$50,  
Proof:  $\Pi_A(n)$



Balance: \$40,  
Proof:  $\Pi_B(n)$



+\$20

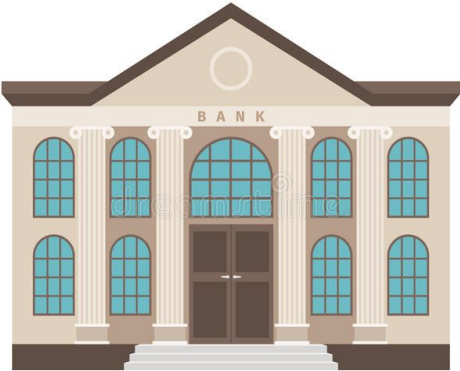


Balance: \$50,  
Proof:  $\Pi_C(n)$

$$\text{Ver}(d_n, A, \$20, \Pi_A(n)) = \mathbf{T}$$

$$d_{n+1} = \text{Update}(d_n, \$20, A, C)$$

# Motivation



Digest:  $d_{n+1}$

-\$20



Balance: **\$30**,  
Proof:  $\Pi_A(n+1)$



Balance: \$40,  
Proof:  $\Pi_B(n+1)$

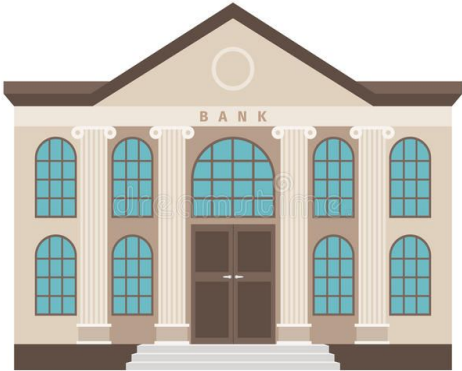


+\$20



Balance: **\$70**,  
Proof:  $\Pi_C(n+1)$

# Motivation



Digest:  $d_{n+1}$



Send **\$40** to Bob



Balance: \$30,  
Proof:  $\Pi_A(n+1)$

$\Pi_A(n+1)$



Balance: \$40,  
Proof:  $\Pi_B(n+1)$



Balance: \$70,  
Proof:  $\Pi_C(n+1)$

# Motivation



Digest:  $d_{n+1}$

$$\text{Ver}(d_{n+1}, A, \$40, \Pi_A(n+1)) = F$$



Send **\$40** to Bob



Balance: \$30,  
Proof:  $\Pi_A(n+1)$

$\Pi_A(n+1)$

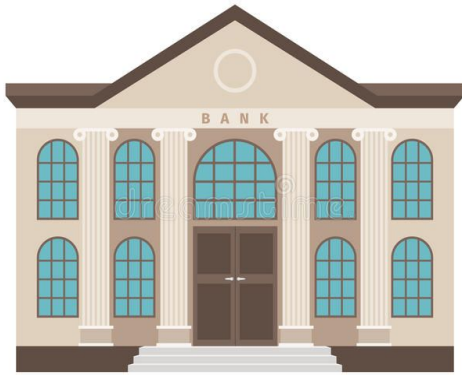


Balance: \$40,  
Proof:  $\Pi_B(n+1)$



Balance: \$70,  
Proof:  $\Pi_C(n+1)$

# Motivation



Digest:  $d_{n+1}$

$$\text{Ver}(d_{n+1}, A, \$40, \Pi_A(n+1)) = F$$

Alice does not have  
sufficient funds



Send \$40 to Bob



Balance: \$30,  
Proof:  $\Pi_A(n+1)$

$\Pi_A(n+1)$



Balance: \$40,  
Proof:  $\Pi_B(n+1)$



Balance: \$70,  
Proof:  $\Pi_C(n+1)$

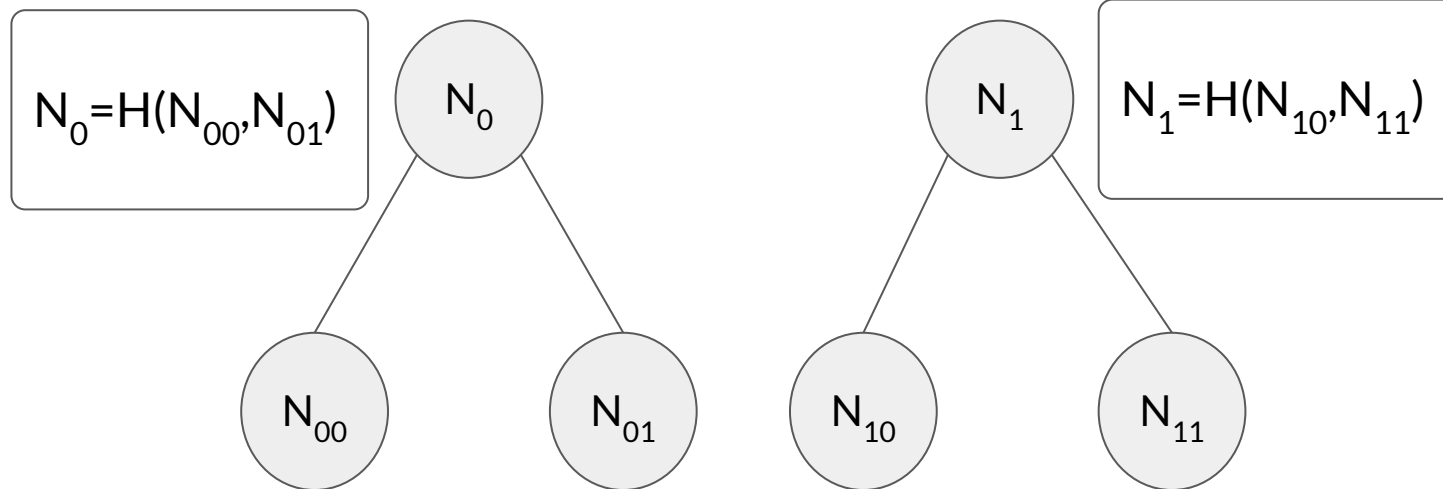


How can we do this?

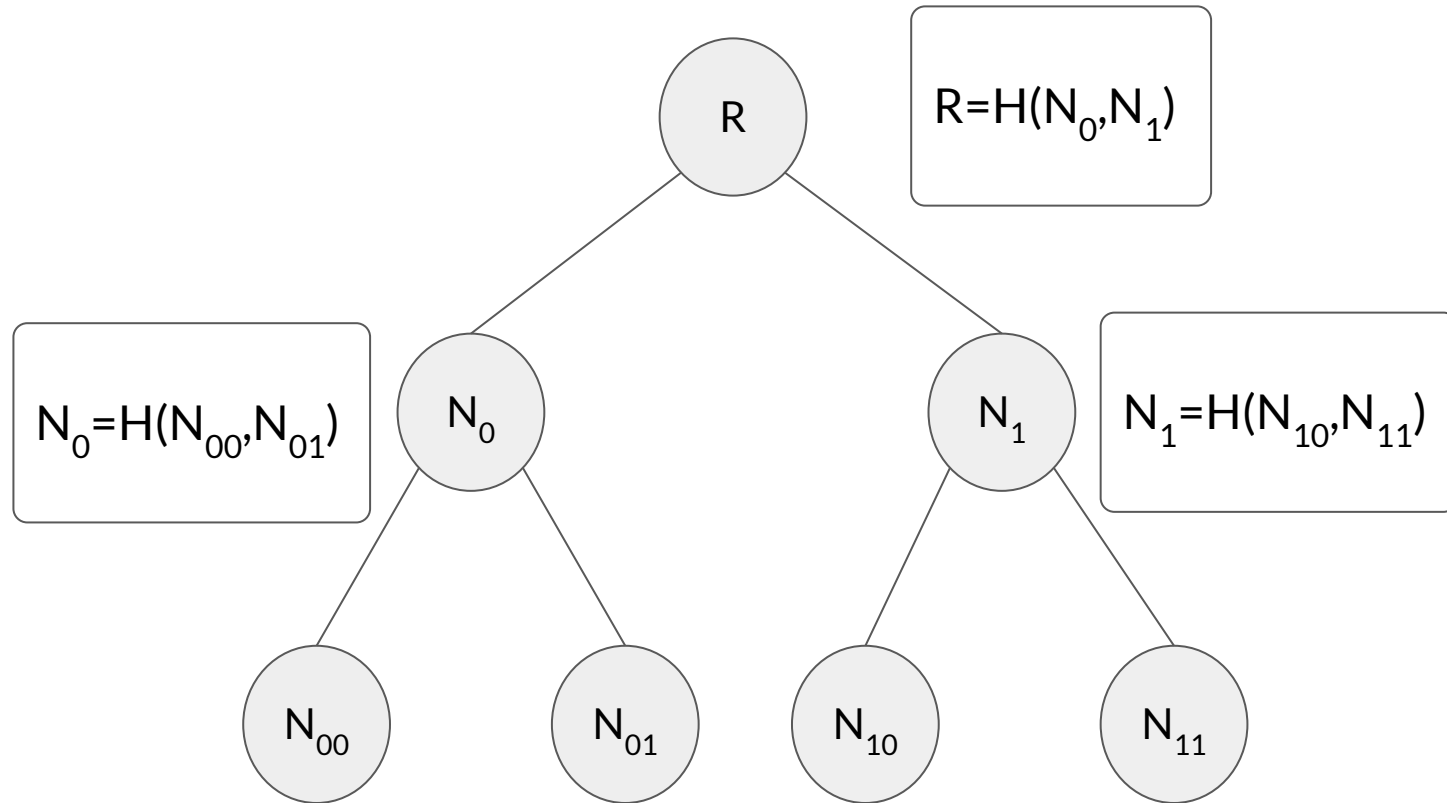
How can we do this? Merkle Hash Trees (MHT)!



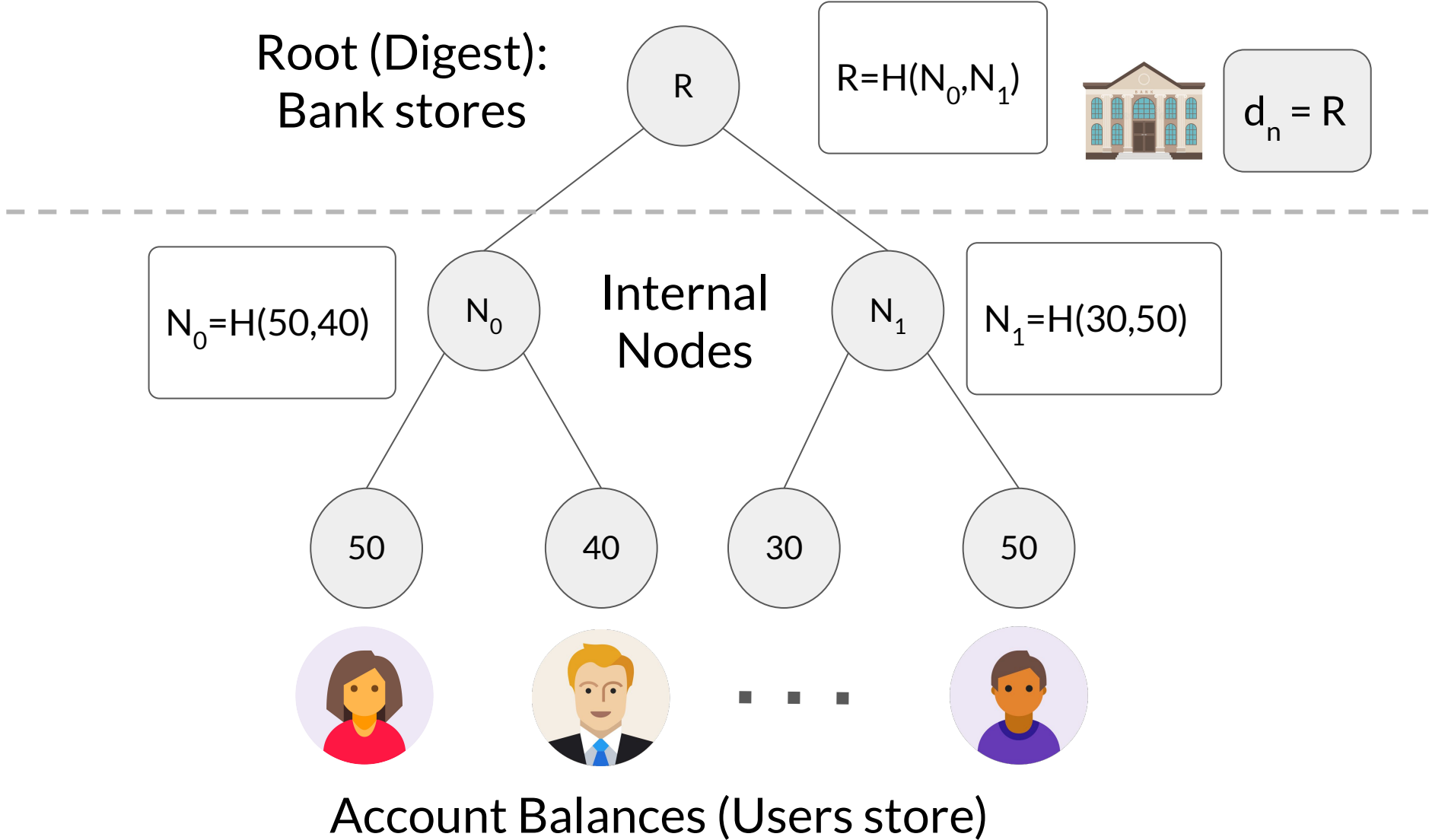
# Building an MHT



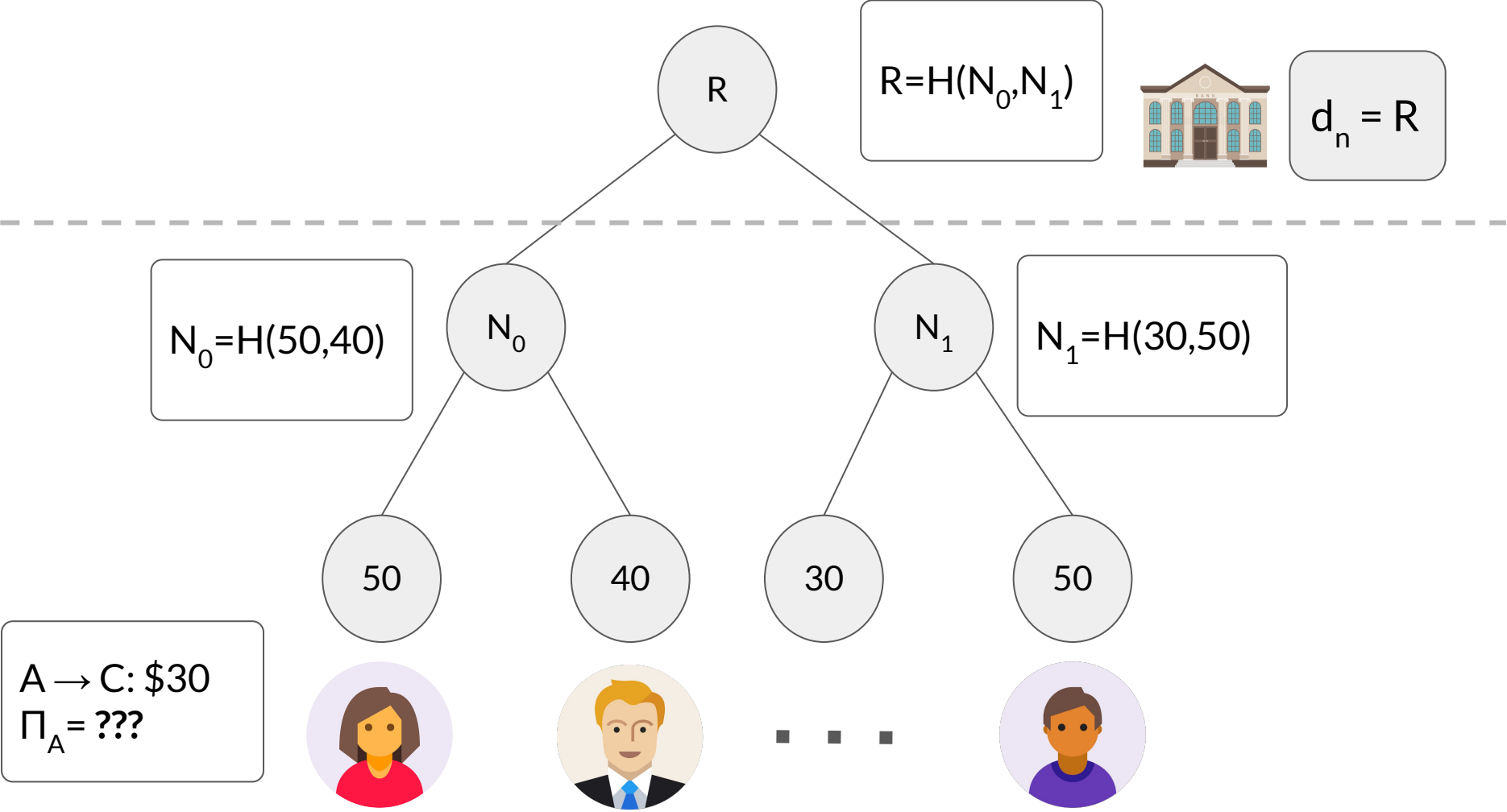
# Building an MHT



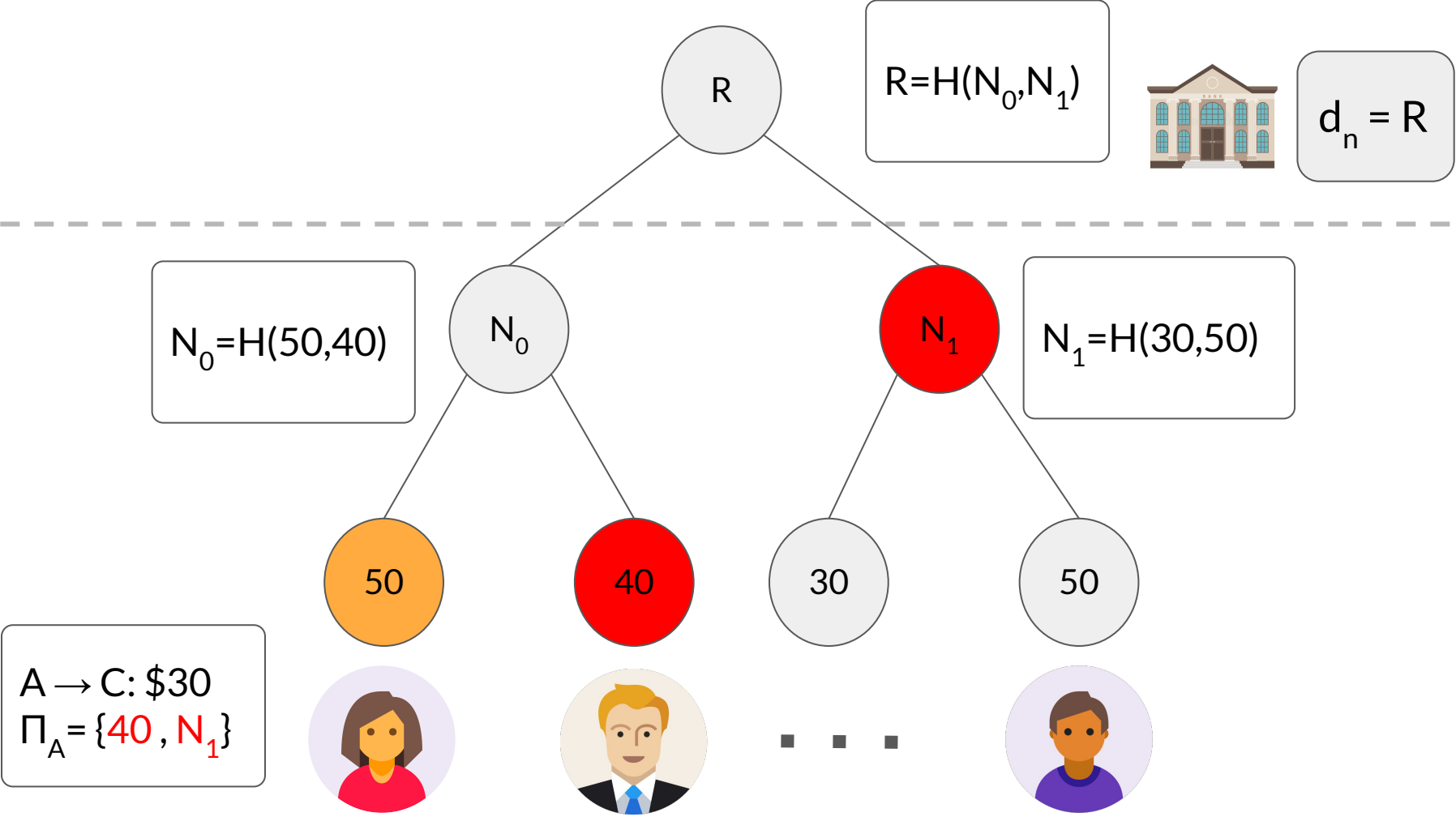
# MHT Example



# MHT Proof of Balance



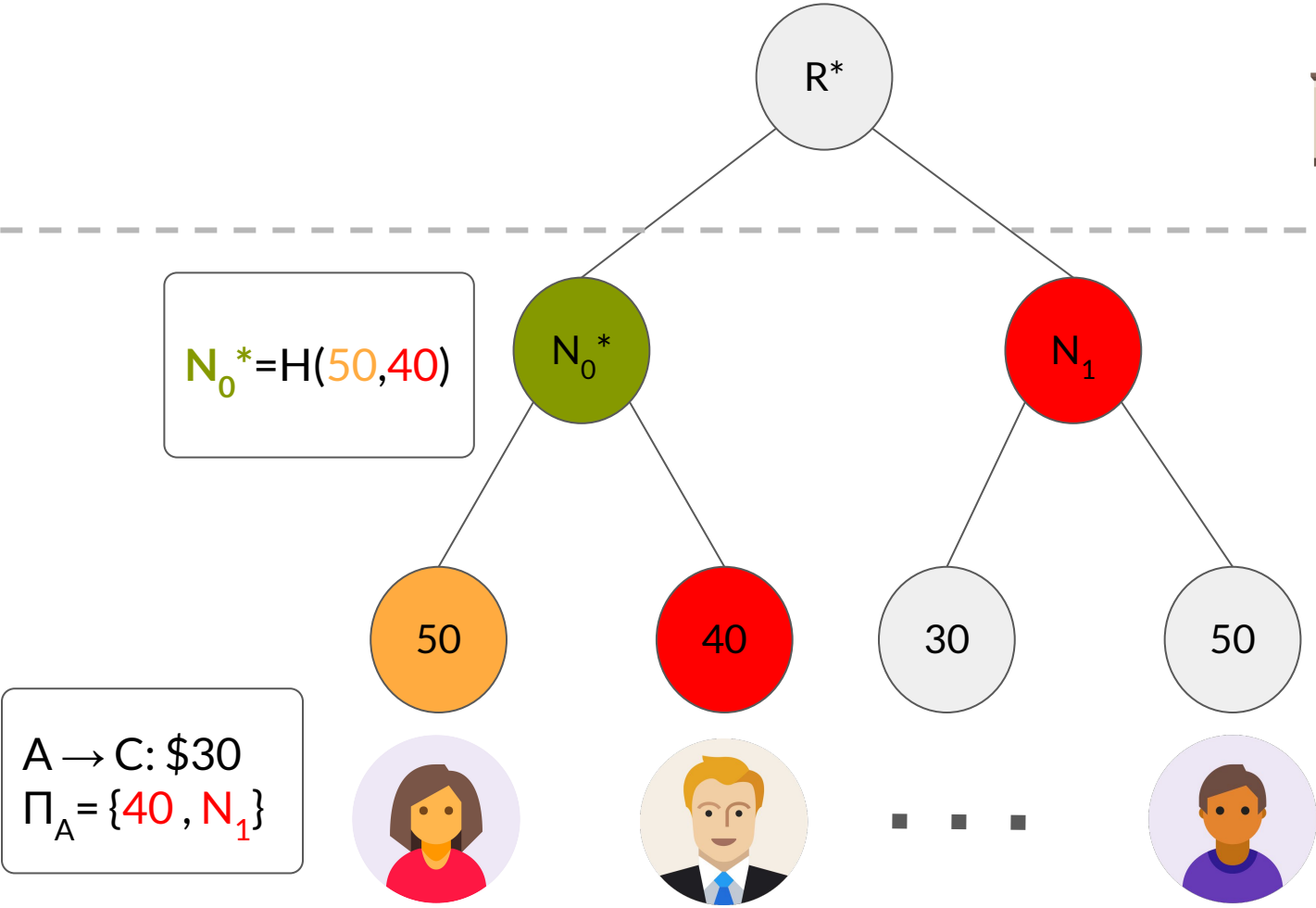
# MHT Proof of Balance



# MHT Proof of Balance Verification



$$d_n = R$$



$$N_0^* = H(50, 40)$$

$$A \rightarrow C: \$30$$
$$\Pi_A = \{40, N_1\}$$



# MHT Proof of Balance Verification

$R^* = R$  ✓

$R^* = H(N_0^*, N_1)$



$d_n = R$

$N_0^* = H(50, 40)$

$N_0^*$

$N_1$

50

40

30

50

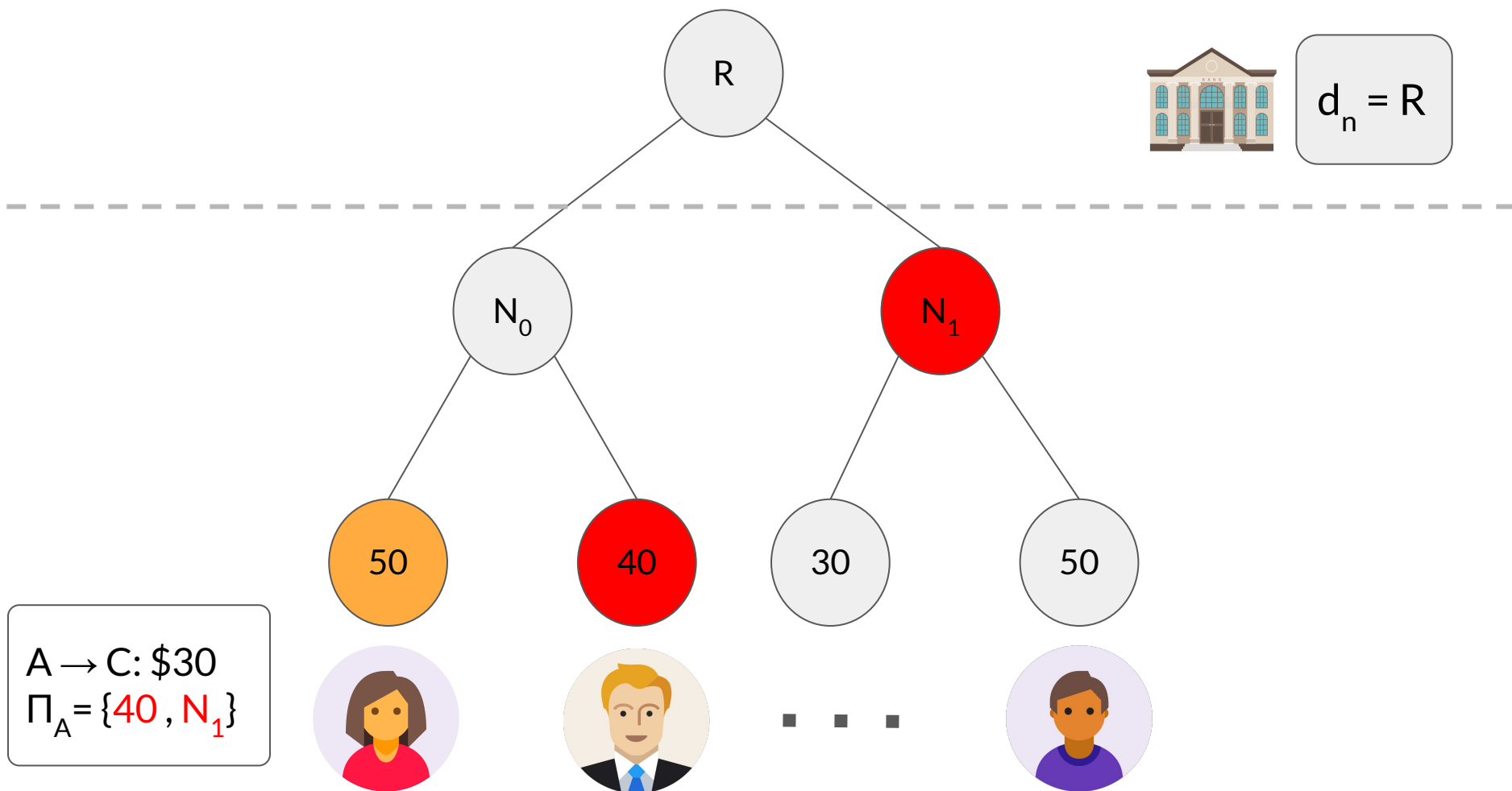


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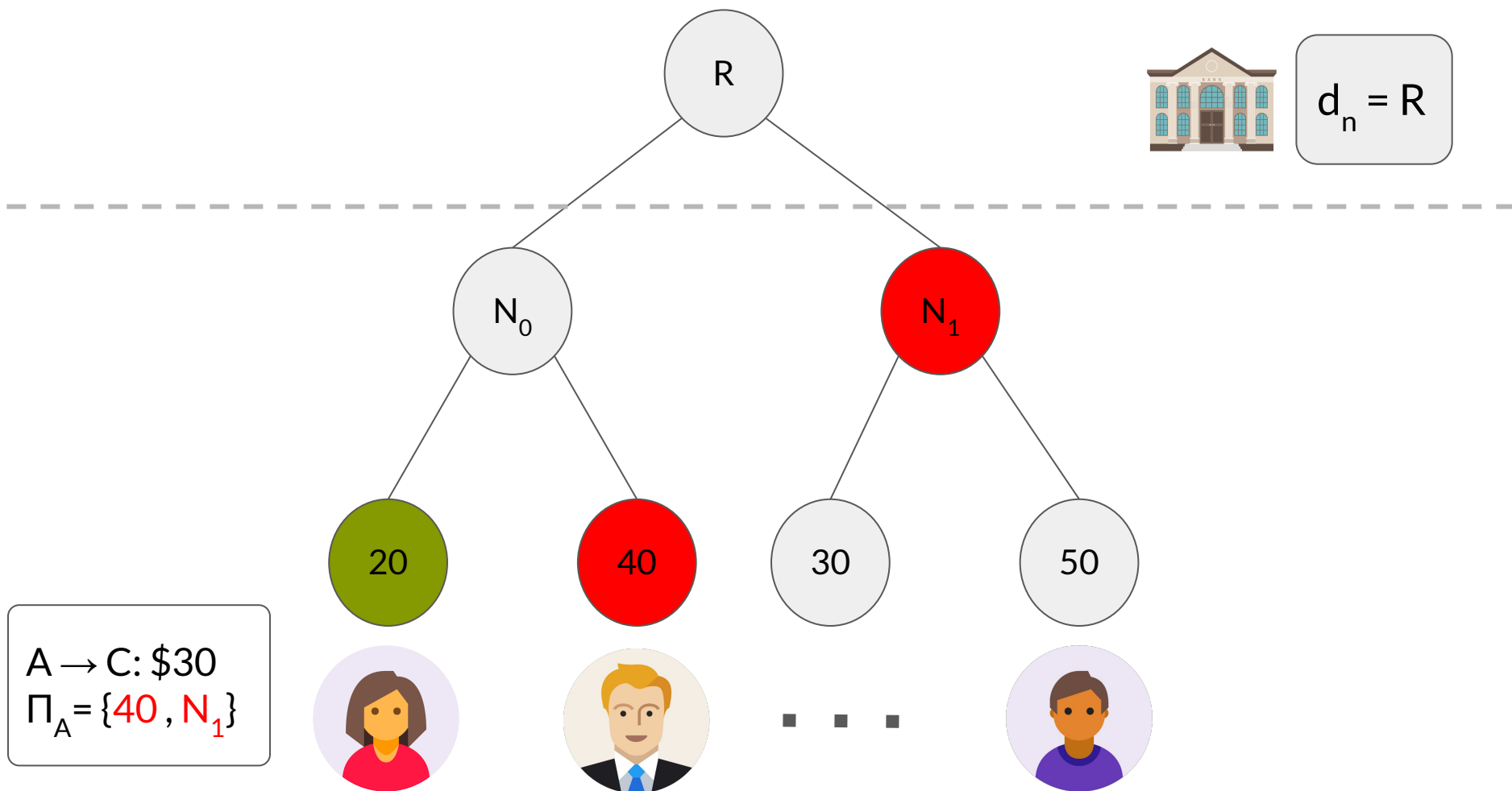


$A \rightarrow C: \$30$   
 $\Pi_A = \{40, N_1\}$

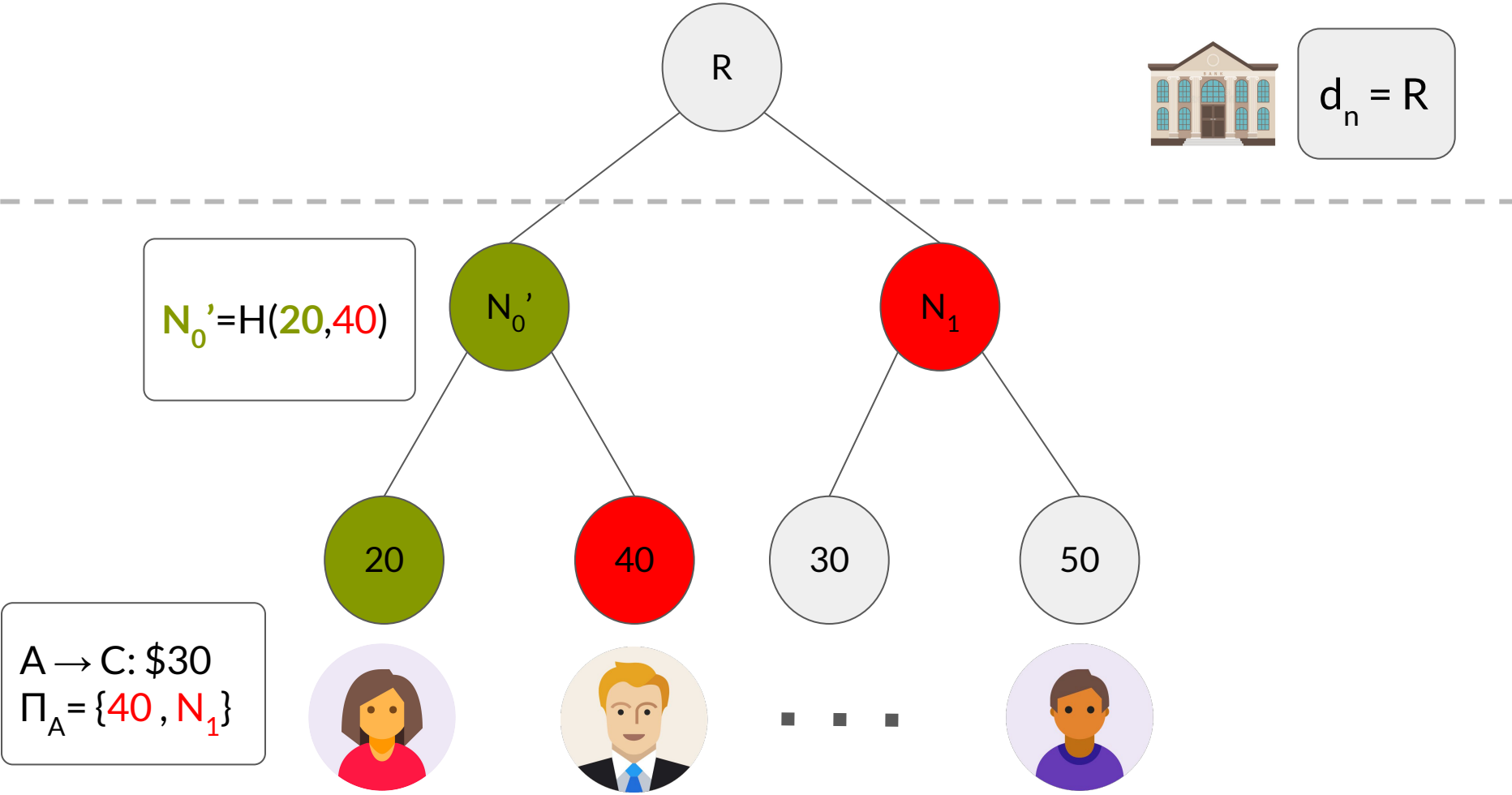
# MHT Updating Balance




# MHT Updating Balance



# MHT Updating Balance

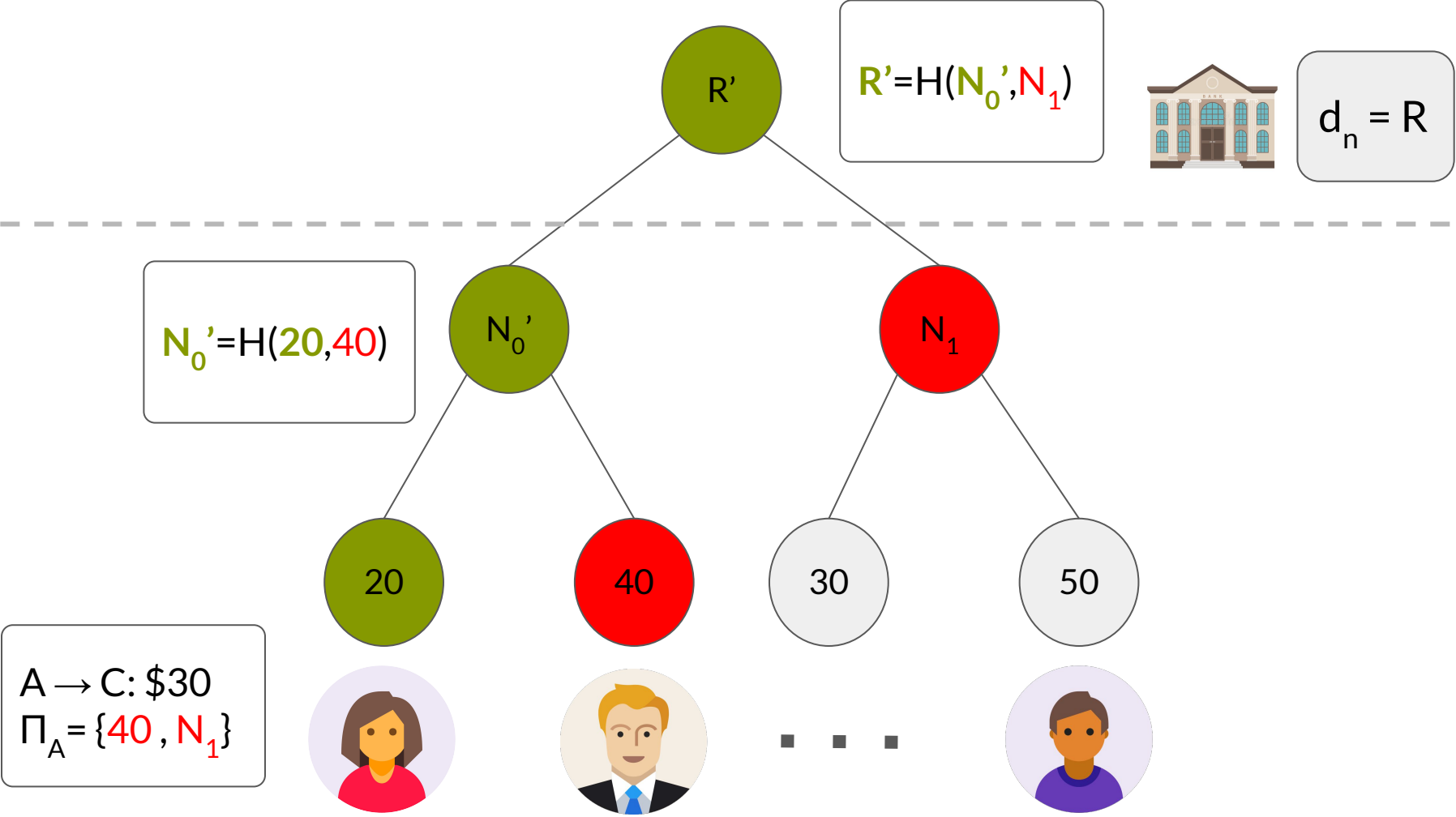


$N_0' = H(20, 40)$

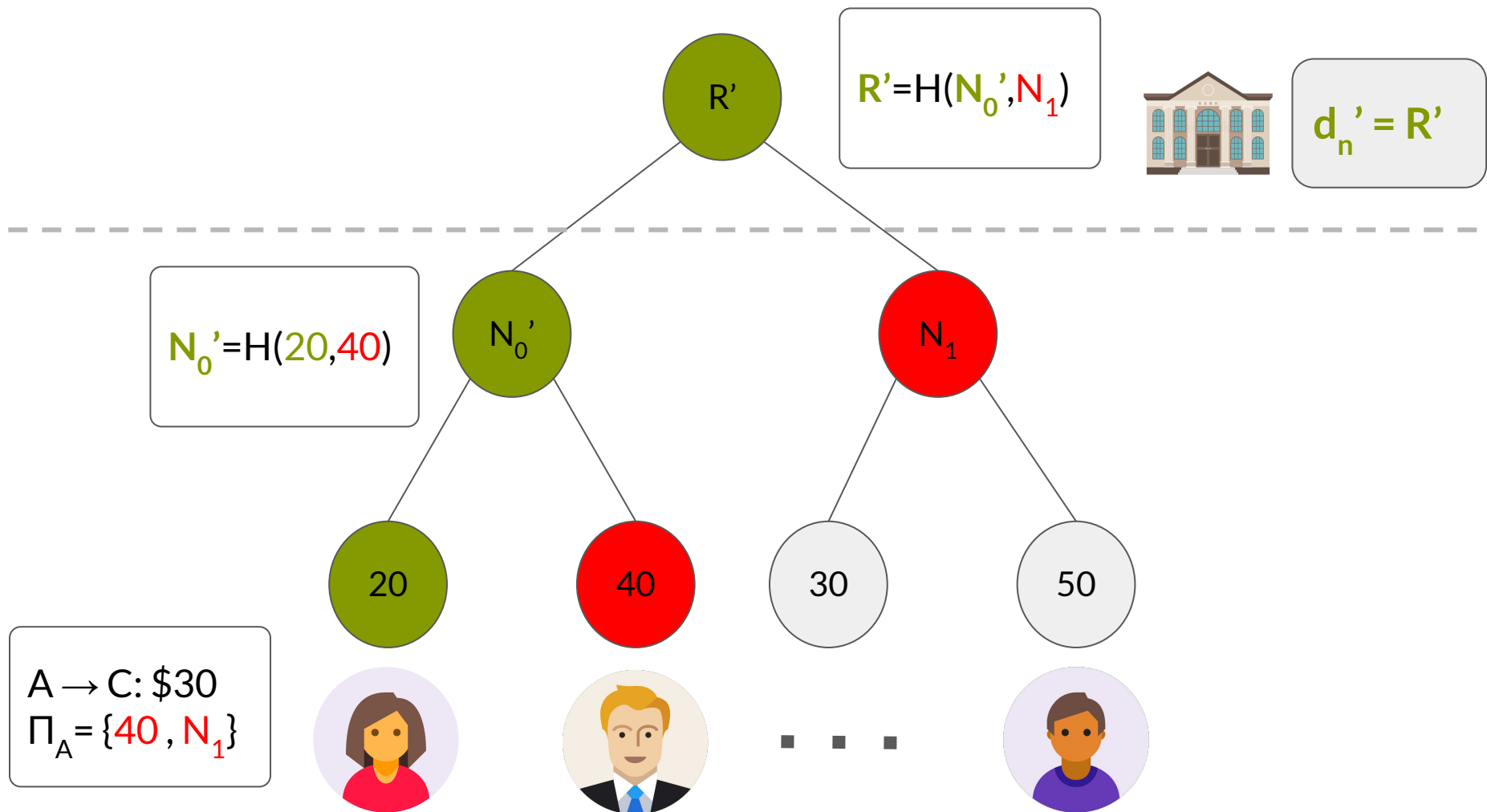
  $d_n = R$

$A \rightarrow C: \$30$   
 $\Pi_A = \{40, N_1\}$

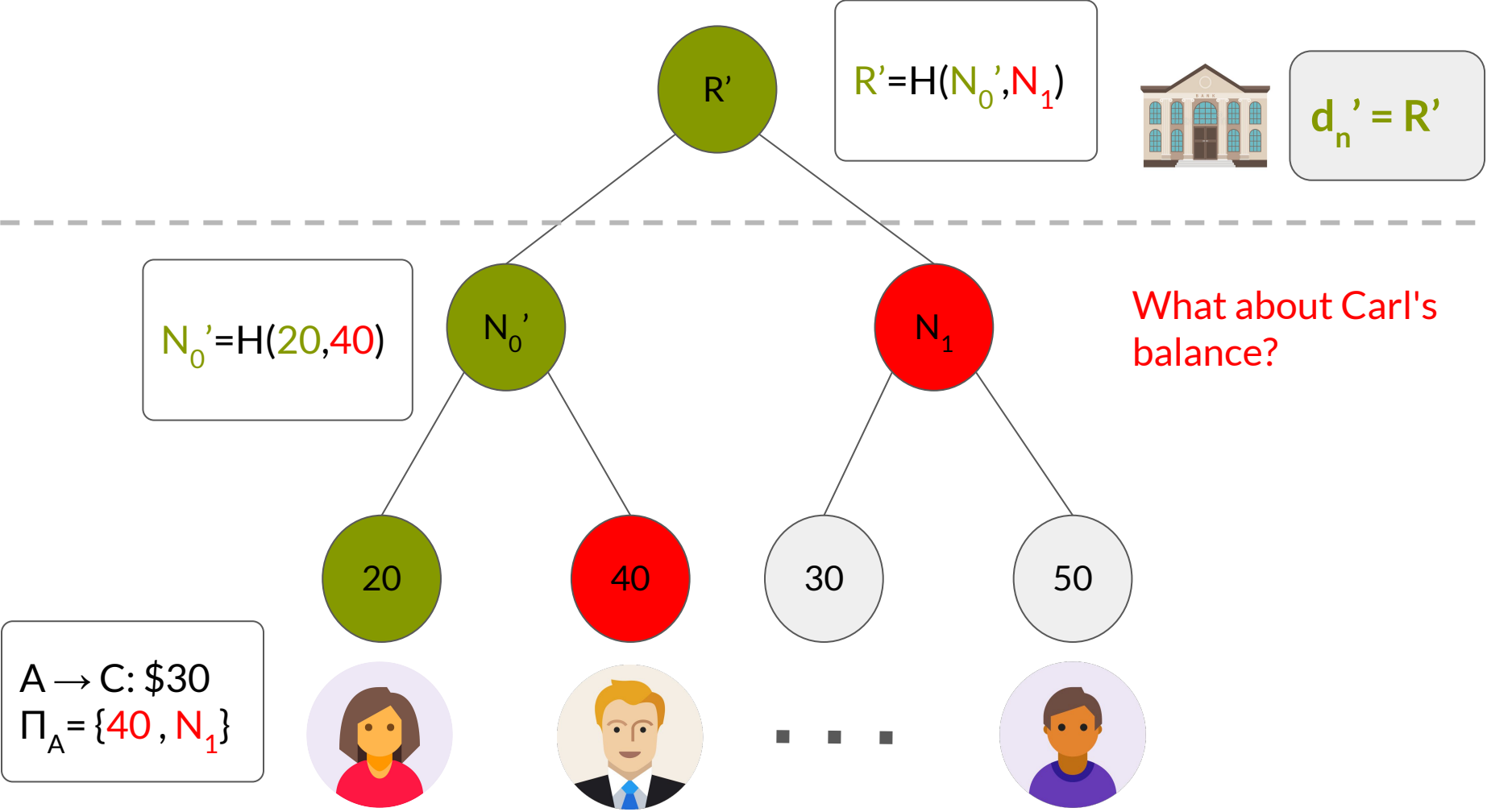
# MHT Updating Balance



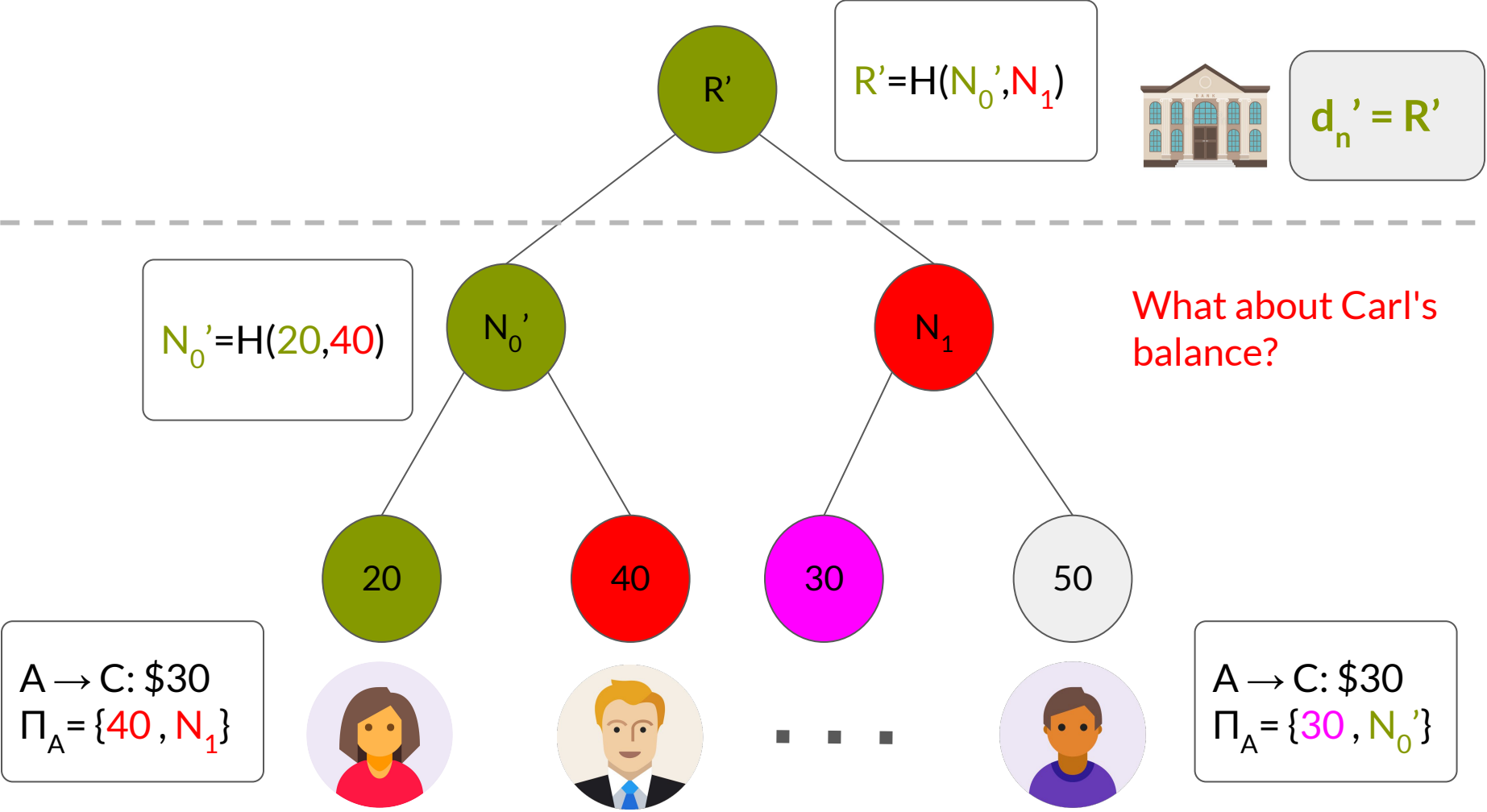
# MHT Updating Balance



# MHT Updating Balance

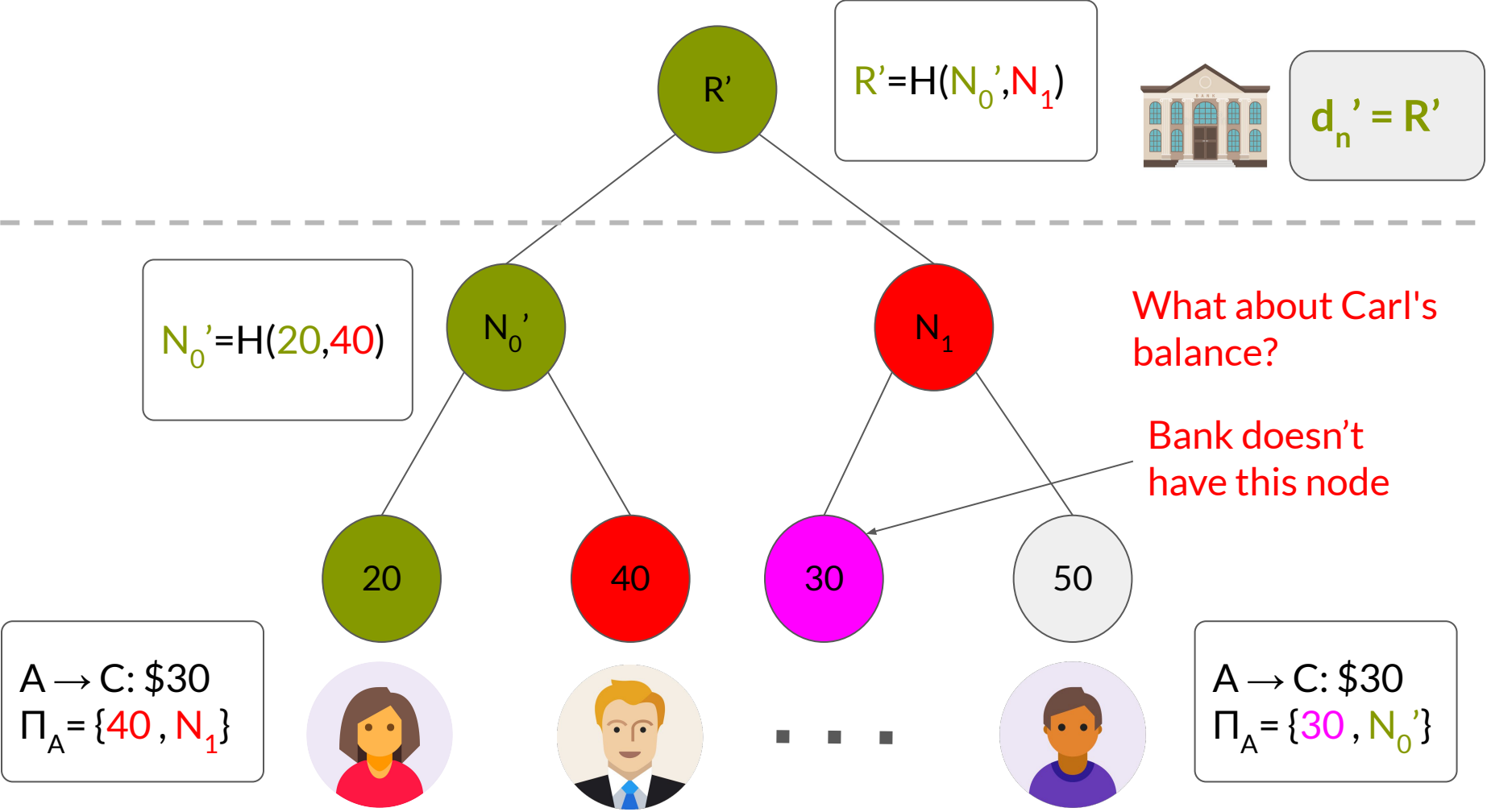


# MHT Updating Sender's Balance

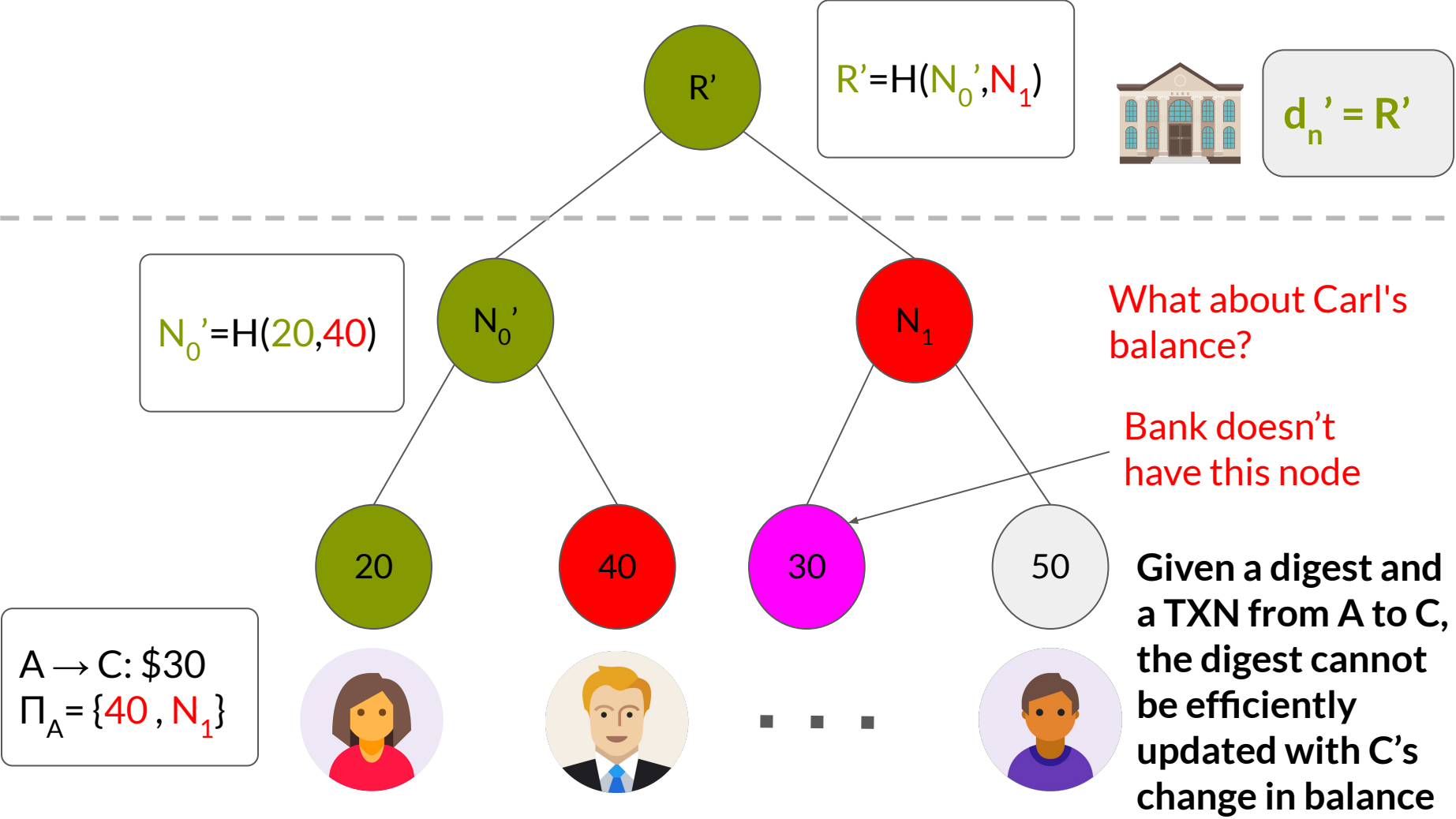




# MHT Updating Sender's Balance

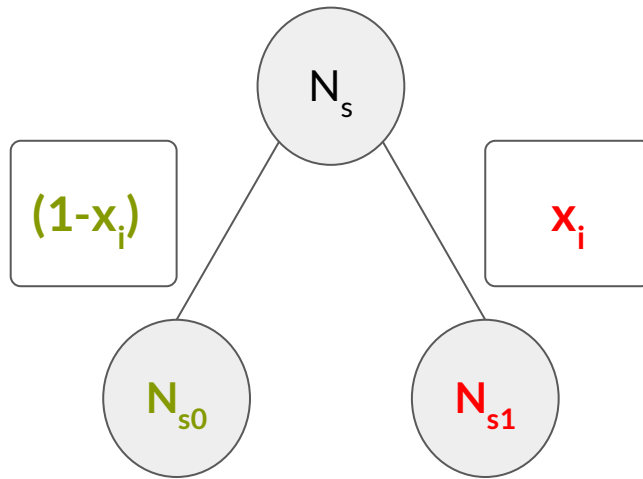


# MHT Updating Sender's Balance



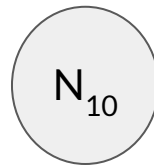
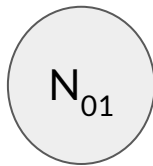
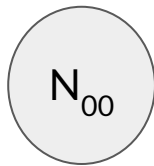
# Building a Multivariate Polynomial Hash Tree (MPHT)

$$N_s(x_i) = (1-x_i)N_{s0} + x_i N_{s1}$$

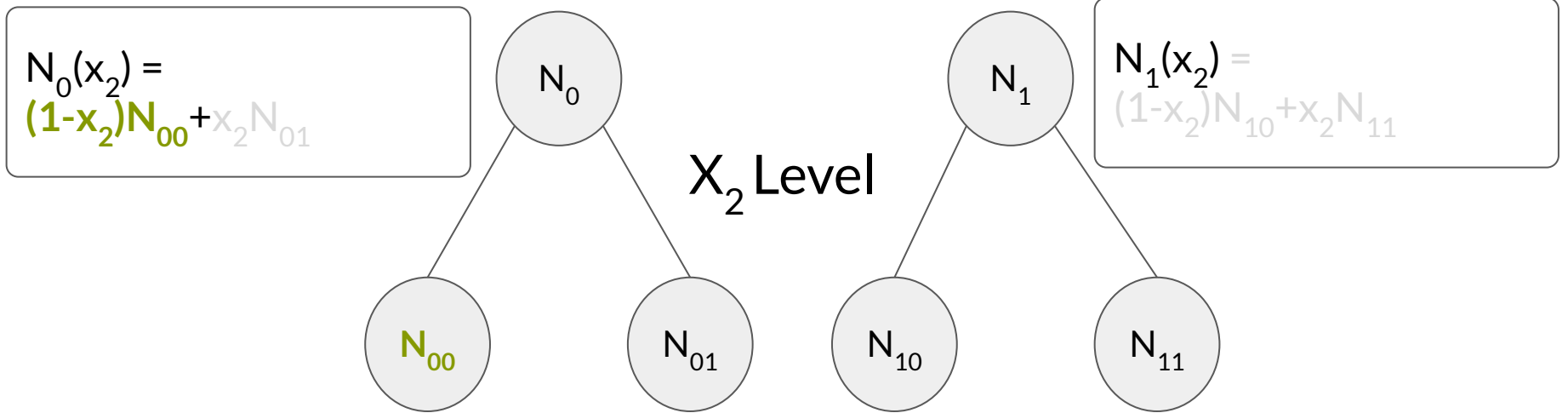


$x_i$  Level

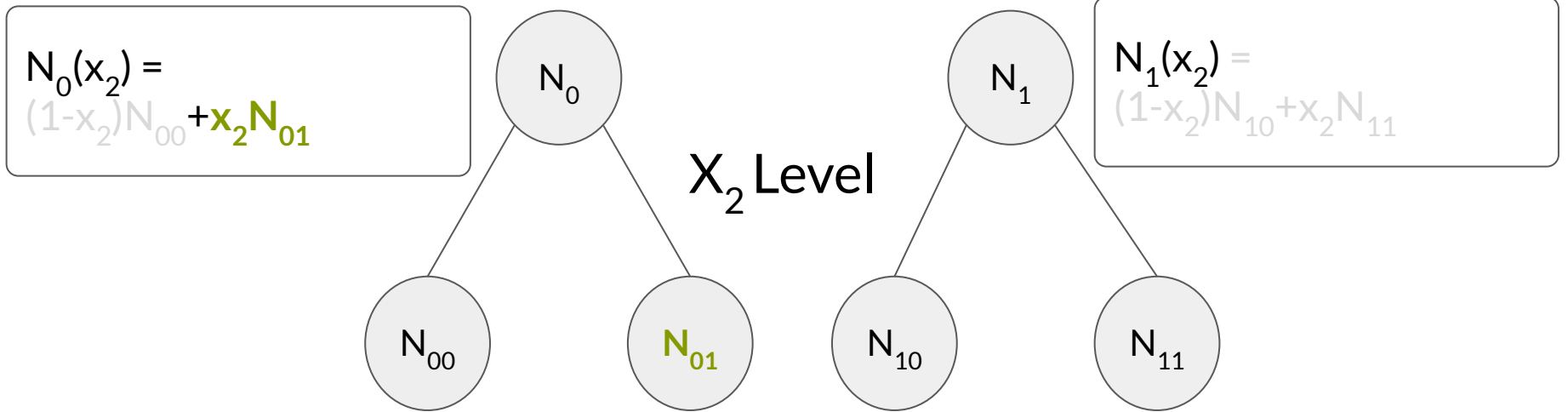
# Building an MPHT



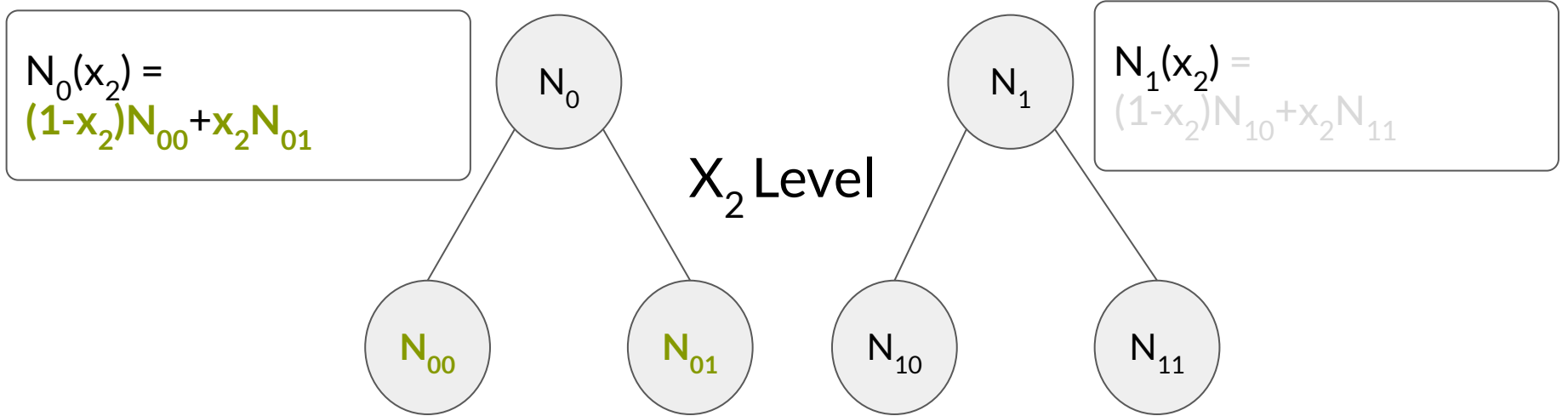
# Building an MPHT



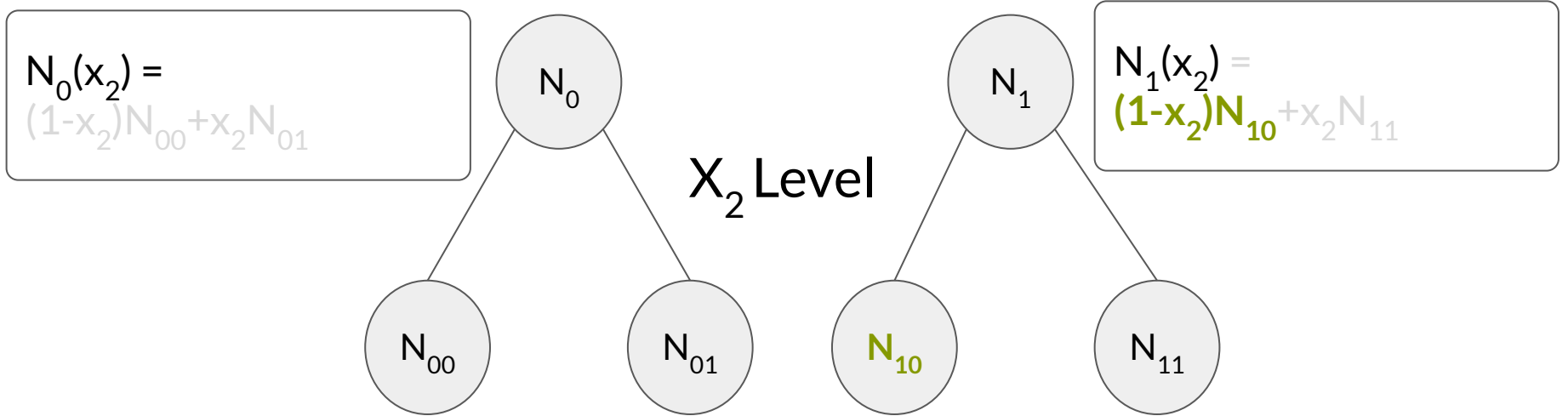
# Building an MPHT



# Building an MPHT

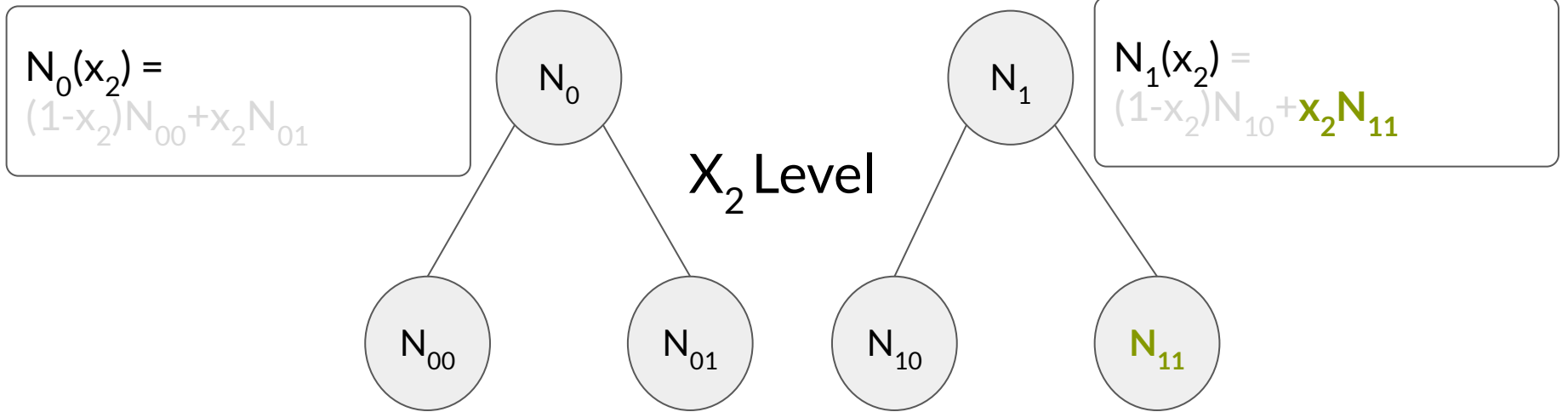


# Building an MPHT

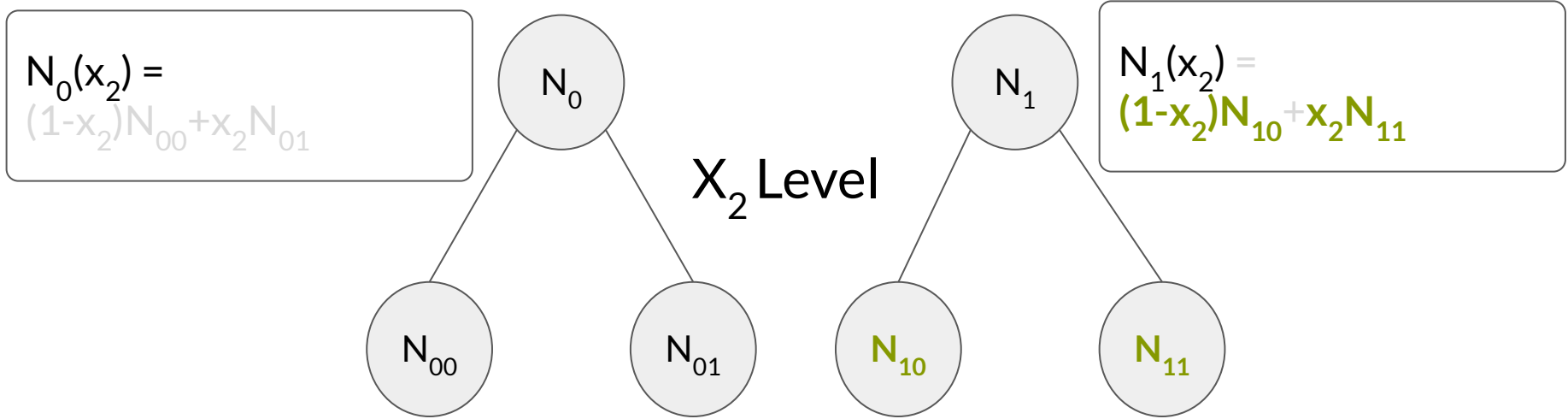




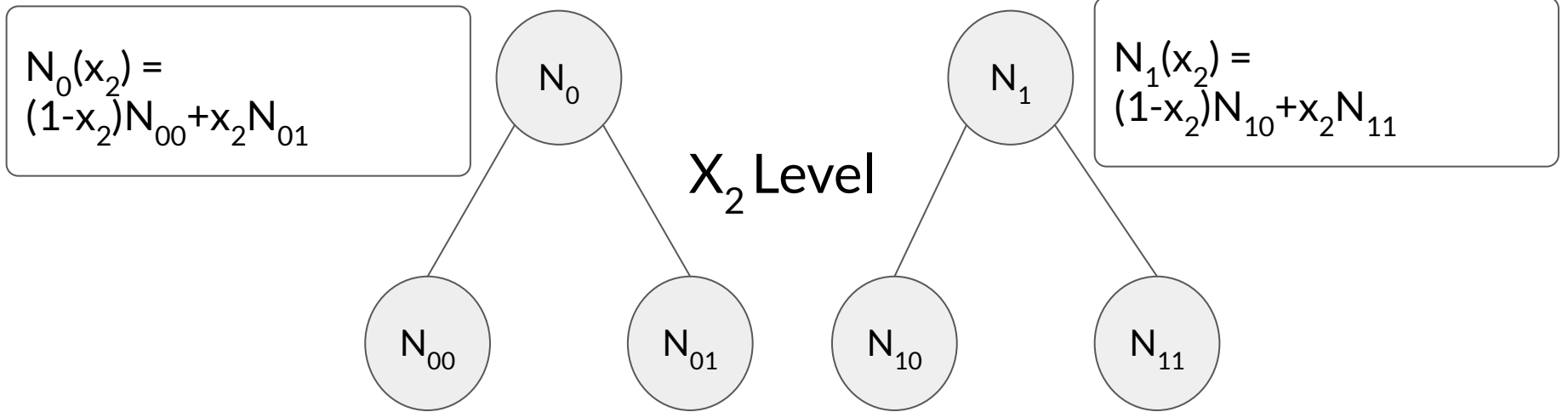
# Building an MPHT



# Building an MPHT

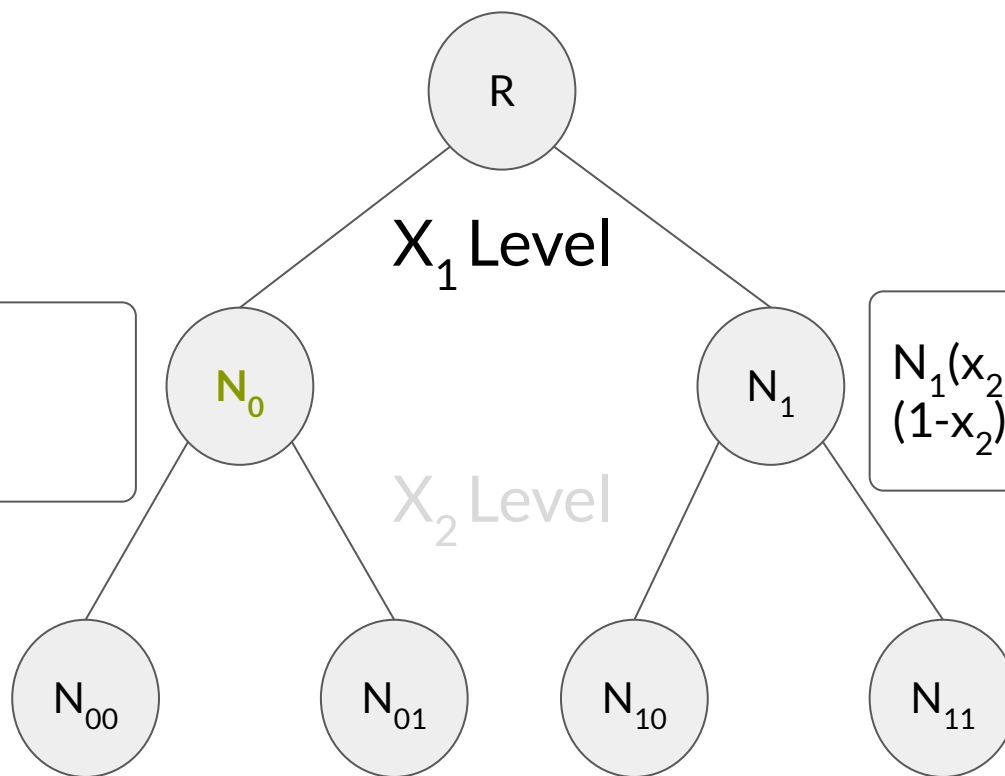


# Building an MPHT



# Building an MPHT

$$R(x_1, x_2) = (1-x_1)N_0(x_2) + x_1N_1(x_2)$$

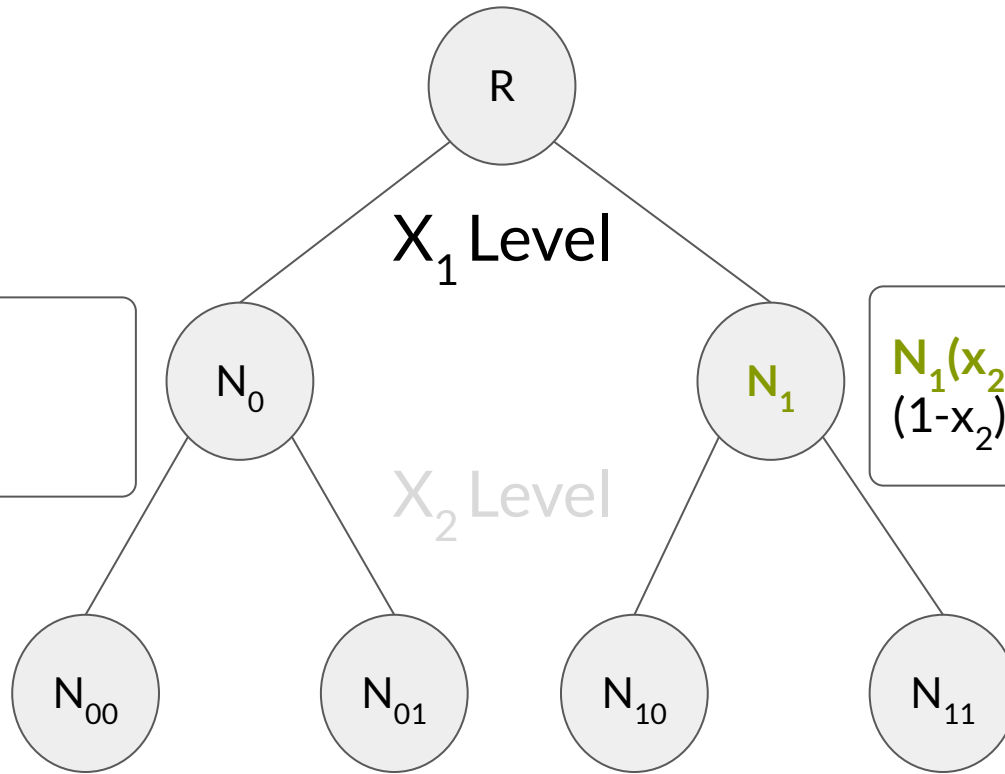


$$N_0(x_2) = (1-x_2)N_{00} + x_2N_{01}$$

$$N_1(x_2) = (1-x_2)N_{10} + x_2N_{11}$$

# Building an MPHT

$$R(x_1, x_2) = (1-x_1)N_0(x_2) + x_1N_1(x_2)$$



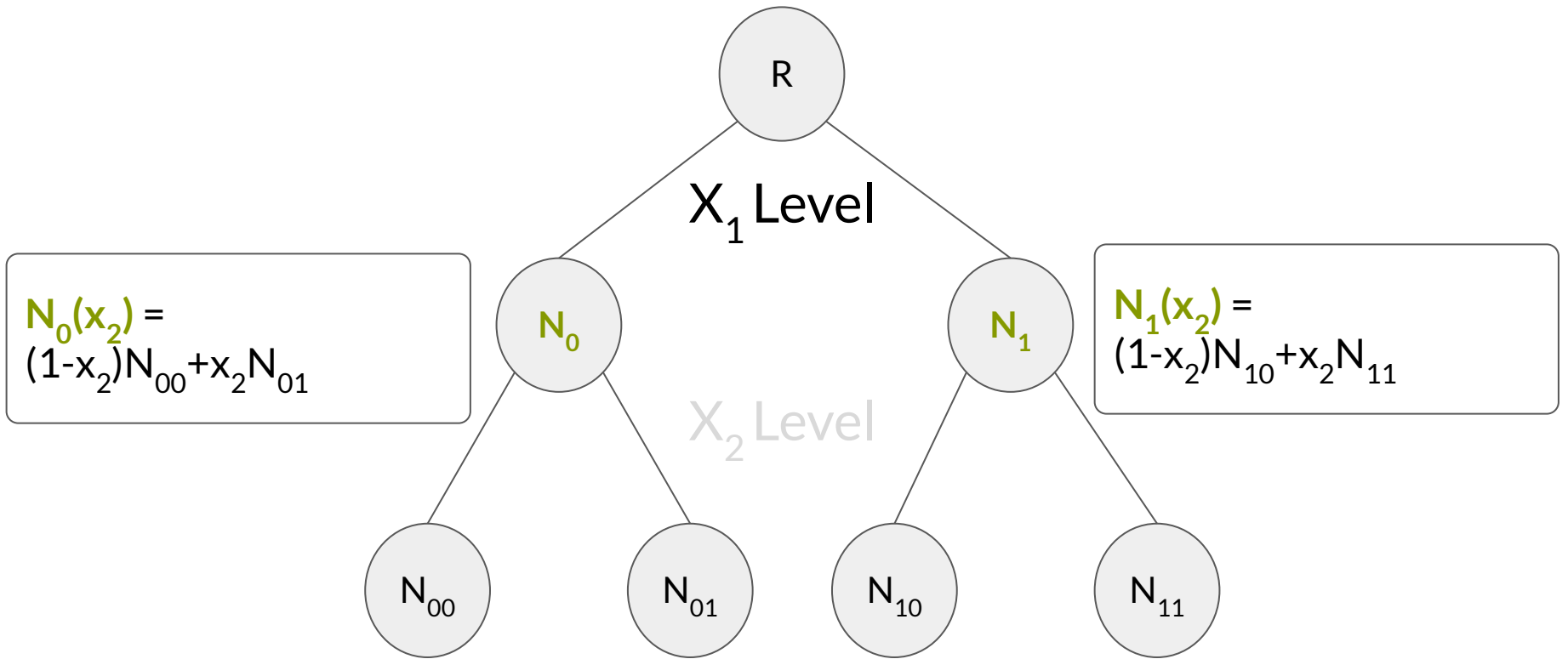
$$N_0(x_2) = (1-x_2)N_{00} + x_2N_{01}$$

$$N_1(x_2) = (1-x_2)N_{10} + x_2N_{11}$$

$X_2$  Level

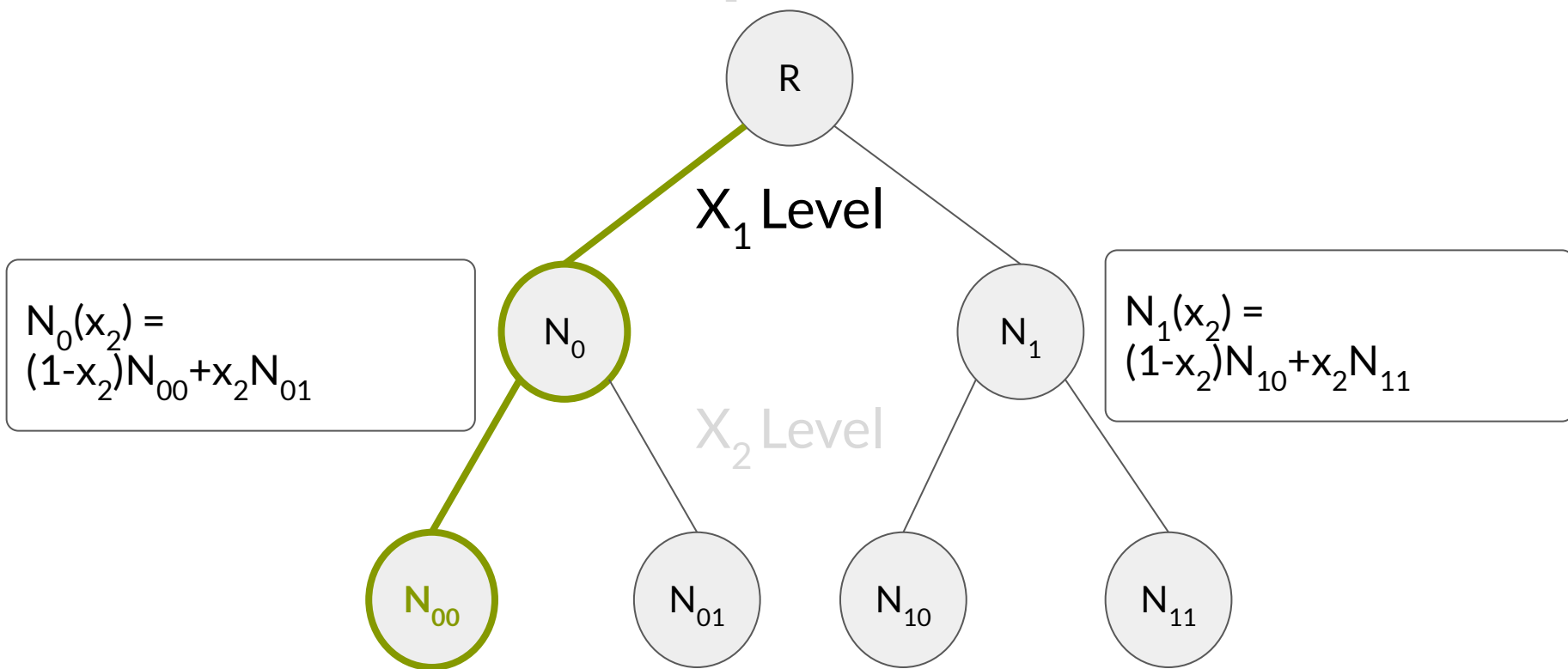
# Building an MPHT

$$R(x_1, x_2) = (1-x_1)N_0(x_2) + x_1N_1(x_2)$$



# Building an MPHT

$$R(x_1, x_2) = x_1 N_0(x_2) + (1-x_1) N_1(x_2) = \\ (1-x_1)(1-x_2)N_{00} + (1-x_1)x_2N_{01} + x_1(1-x_2)N_{10} + x_1x_2N_{11}$$

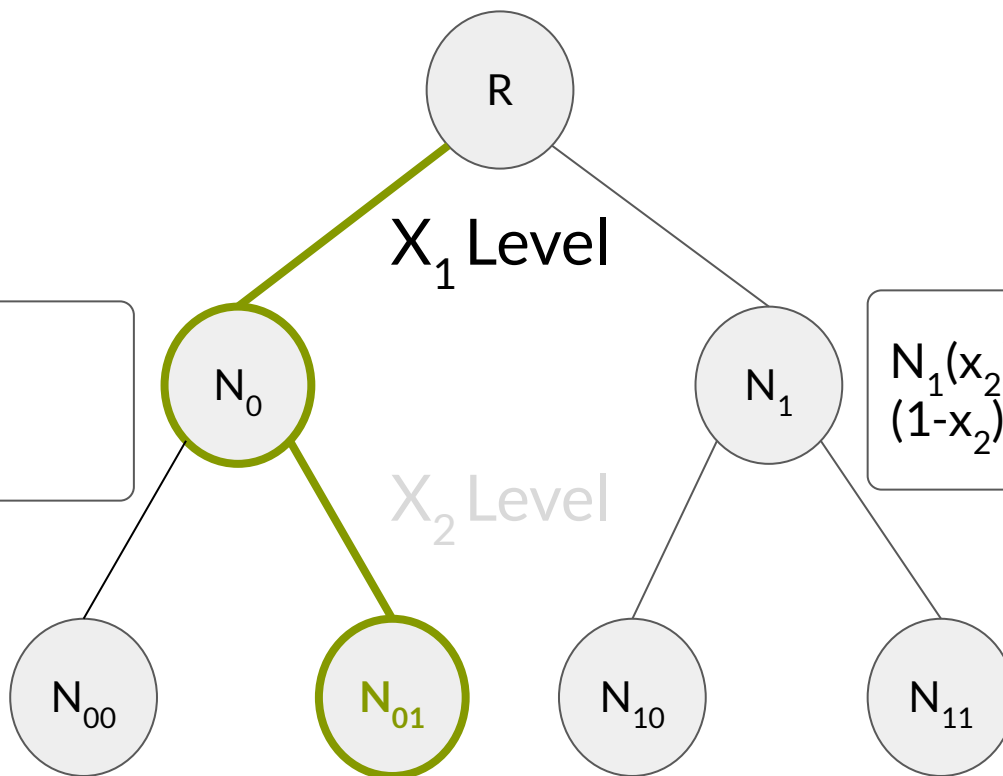


# Building an MPHT

$$R(x_1, x_2) = x_1 N_0(x_2) + (1-x_1) N_1(x_2) = \\ (1-x_1)(1-x_2)N_{00} + (1-x_1)x_2N_{01} + x_1(1-x_2)N_{10} + x_1x_2N_{11}$$

$$N_0(x_2) = \\ (1-x_2)N_{00} + x_2N_{01}$$

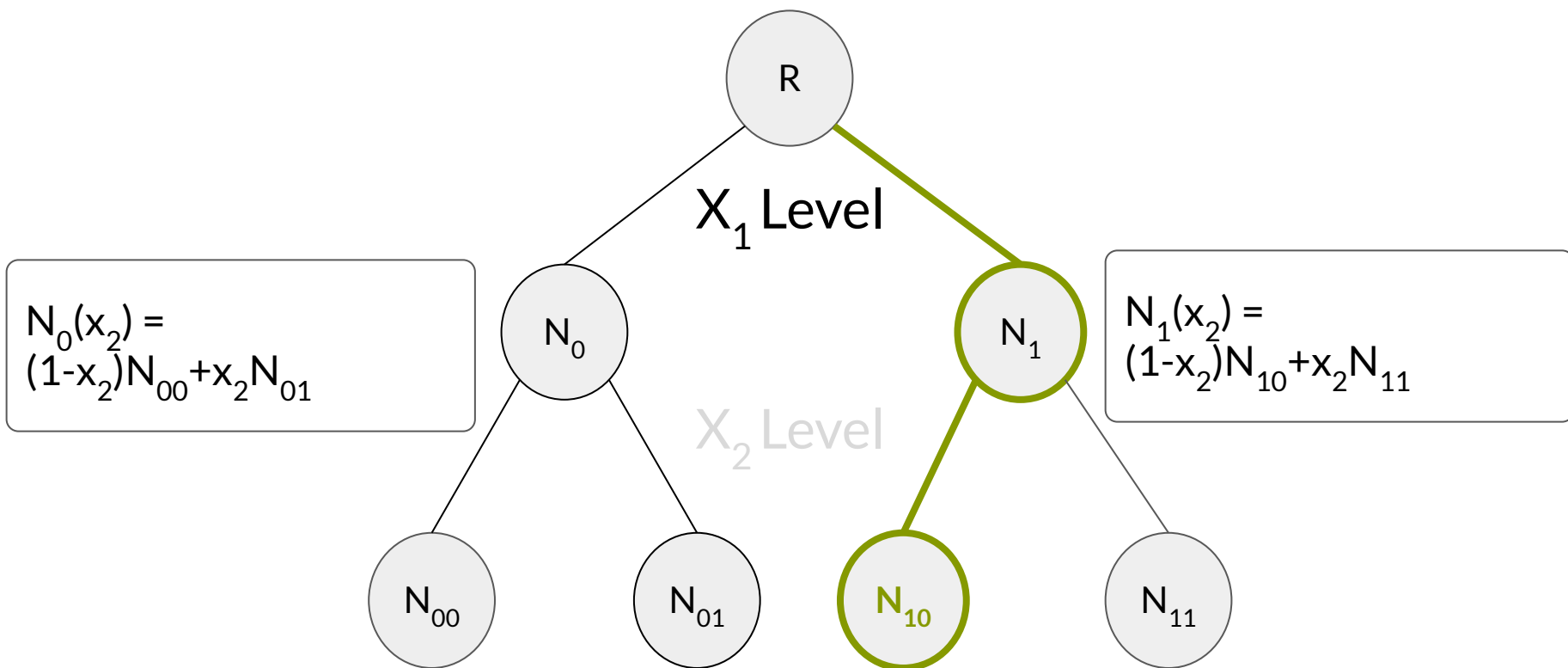
$$N_1(x_2) = \\ (1-x_2)N_{10} + x_2N_{11}$$





# Building an MPHT

$$R(x_1, x_2) = x_1 N_0(x_2) + (1-x_1) N_1(x_2) = \\ (1-x_1)(1-x_2)N_{00} + (1-x_1)x_2N_{01} + x_1(1-x_2)N_{10} + x_1x_2N_{11}$$

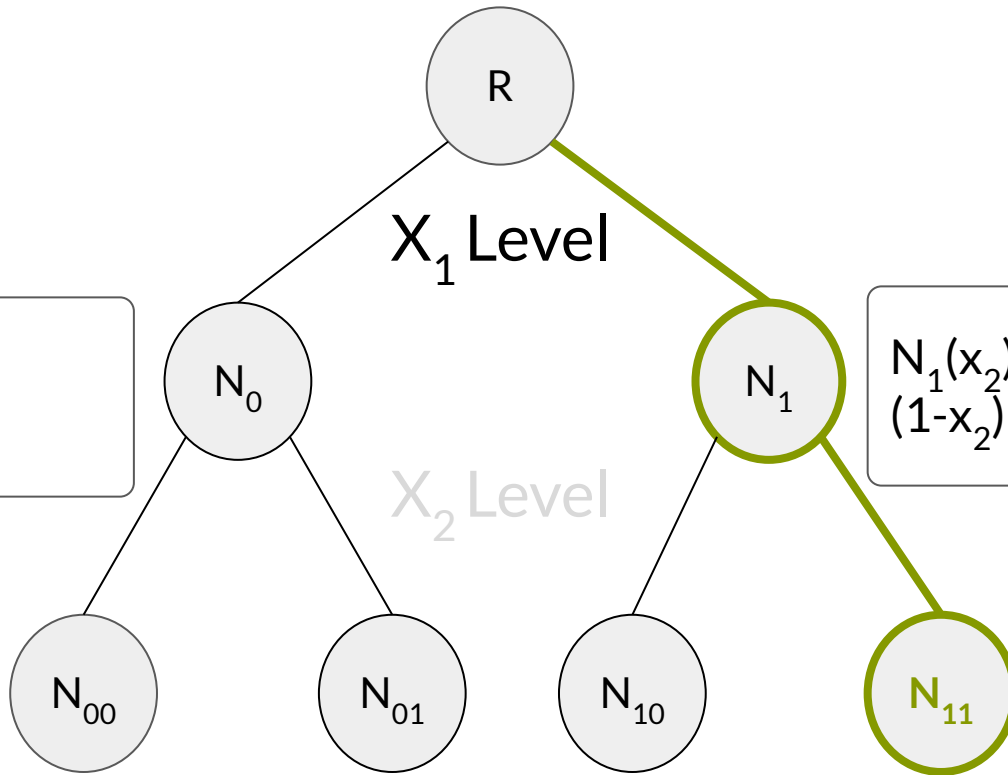


# Building an MPHT

$$R(x_1, x_2) = x_1 N_0(x_2) + (1-x_1) N_1(x_2) = (1-x_1)(1-x_2)N_{00} + (1-x_1)x_2N_{01} + x_1(1-x_2)N_{10} + x_1x_2N_{11}$$

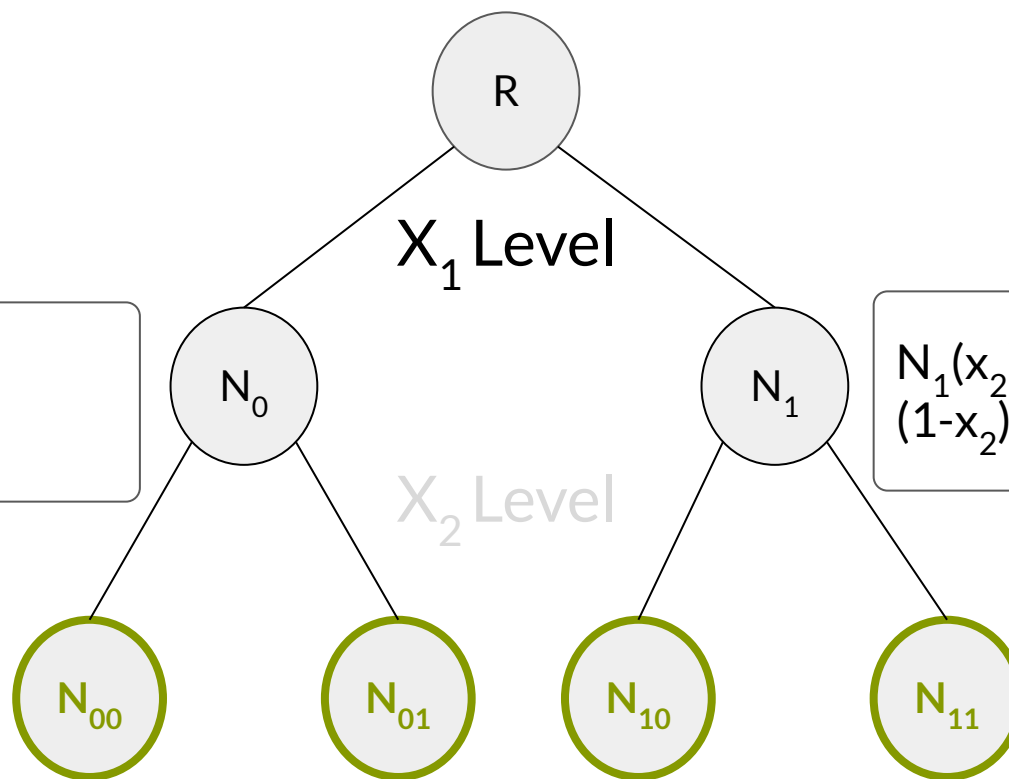
$$N_0(x_2) = (1-x_2)N_{00} + x_2N_{01}$$

$$N_1(x_2) = (1-x_2)N_{10} + x_2N_{11}$$



# Building an MPHT

$$R(x_1, x_2) = x_1 N_0(x_2) + (1-x_1) N_1(x_2) = \\ (1-x_1)(1-x_2)N_{00} + (1-x_1)x_2N_{01} + x_1(1-x_2)N_{10} + x_1x_2N_{11}$$



$$N_0(x_2) = \\ (1-x_2)N_{00} + x_2N_{01}$$

$$N_1(x_2) = \\ (1-x_2)N_{10} + x_2N_{11}$$

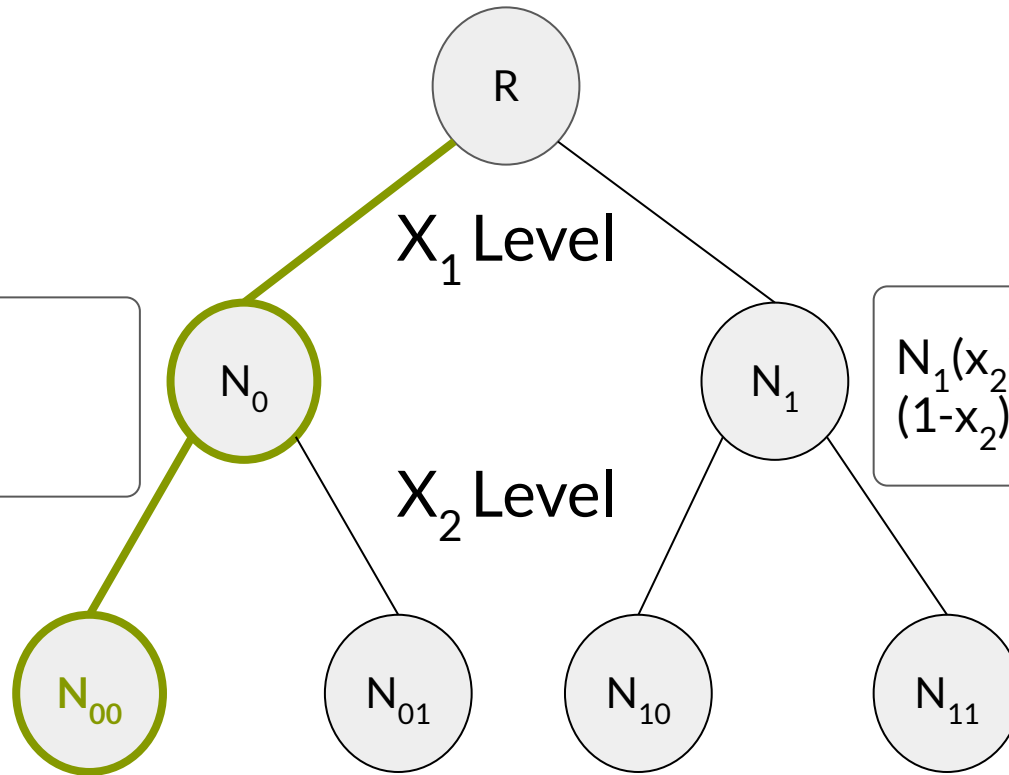
# Building an MPHT

$$R(x_1, x_2) = x_1 N_0(x_2) + (1-x_1) N_1(x_2) = \\ (1-x_1)(1-x_2)N_{00} + (1-x_1)x_2N_{01} + x_1(1-x_2)N_{10} + x_1x_2N_{11}$$

$$N_0(x_2) = \\ (1-x_2)N_{00} + x_2N_{01}$$

$$N_1(x_2) = \\ (1-x_2)N_{10} + x_2N_{11}$$

$$R(0,0) = N_{00}$$

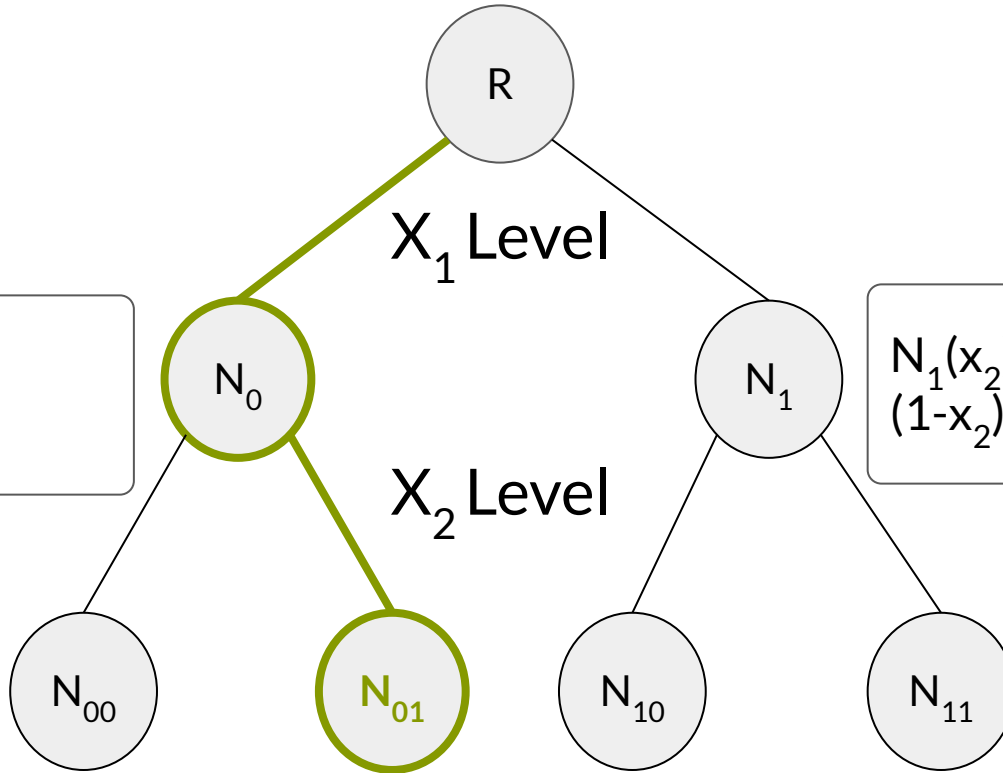


# Building an MPHT

$$R(x_1, x_2) = x_1 N_0(x_2) + (1-x_1) N_1(x_2) = (1-x_1)(1-x_2) N_{00} + (1-x_1)x_2 N_{01} + x_1(1-x_2) N_{10} + x_1 x_2 N_{11}$$

$$N_0(x_2) = (1-x_2) N_{00} + x_2 N_{01}$$

$$N_1(x_2) = (1-x_2) N_{10} + x_2 N_{11}$$



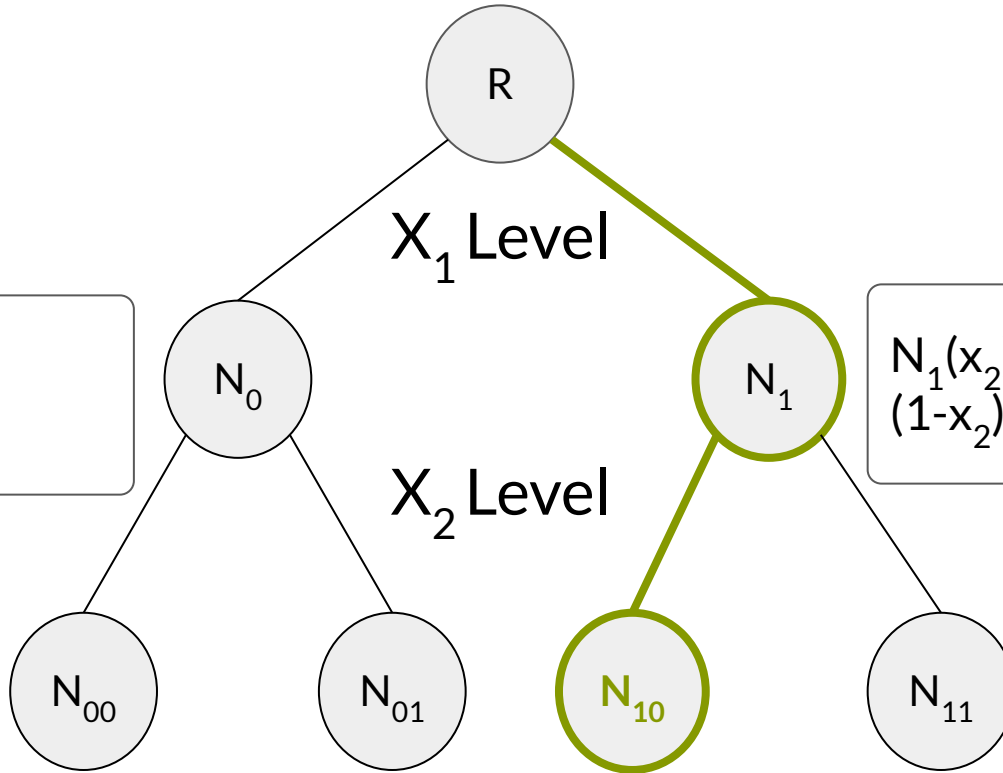
$$R(0,1) = N_{01}$$

# Building an MPHT

$$R(x_1, x_2) = x_1 N_0(x_2) + (1-x_1) N_1(x_2) = (1-x_1)(1-x_2)N_{00} + (1-x_1)x_2N_{01} + x_1(1-x_2)N_{10} + x_1x_2N_{11}$$

$$N_0(x_2) = (1-x_2)N_{00} + x_2N_{01}$$

$$N_1(x_2) = (1-x_2)N_{10} + x_2N_{11}$$



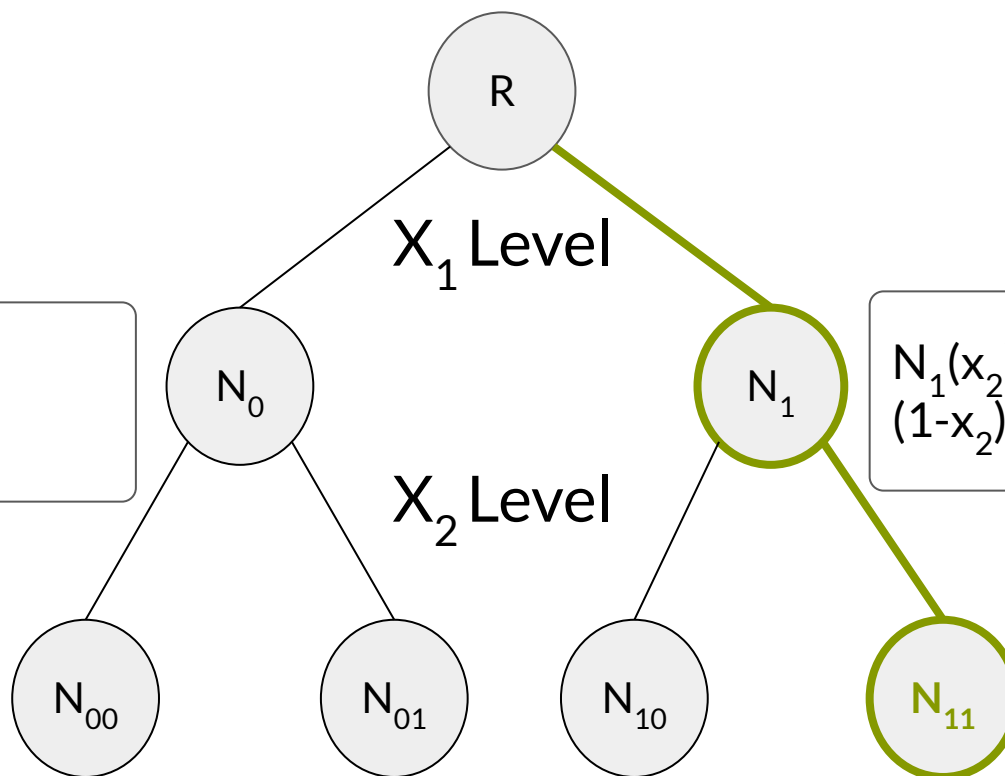
$$R(1,0) = N_{10}$$

# Building an MPHT

$$R(x_1, x_2) = x_1 N_0(x_2) + (1-x_1) N_1(x_2) = \\ (1-x_1)(1-x_2)N_{00} + (1-x_1)x_2N_{01} + x_1(1-x_2)N_{10} + x_1x_2N_{11}$$

$$N_0(x_2) = \\ (1-x_2)N_{00} + x_2N_{01}$$

$$N_1(x_2) = \\ (1-x_2)N_{10} + x_2N_{11}$$



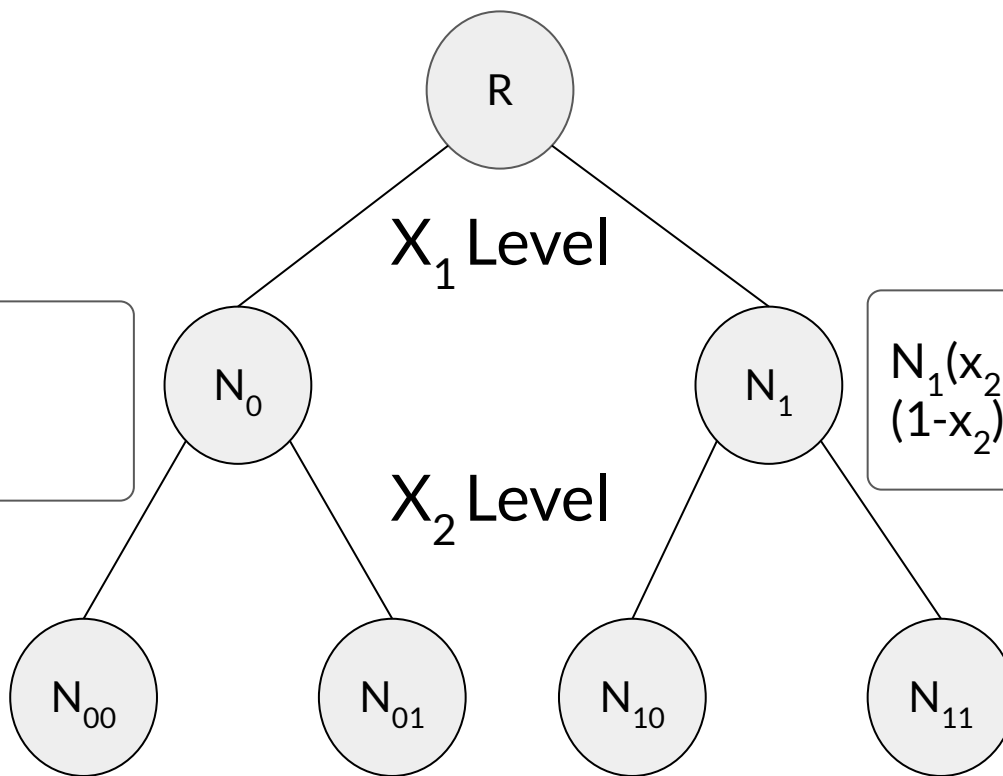
$$R(1,1) = N_{11}$$

# Building an MPHT

$$R(x_1, x_2) = x_1 N_0(x_2) + (1-x_1) N_1(x_2) = \\ (1-x_1)(1-x_2) N_{00} + (1-x_1)x_2 N_{01} + x_1(1-x_2) N_{10} + x_1 x_2 N_{11}$$

$$N_0(x_2) = \\ (1-x_2) N_{00} + x_2 N_{01}$$

$$N_1(x_2) = \\ (1-x_2) N_{10} + x_2 N_{11}$$



$$R(0,0) = N_{00}$$

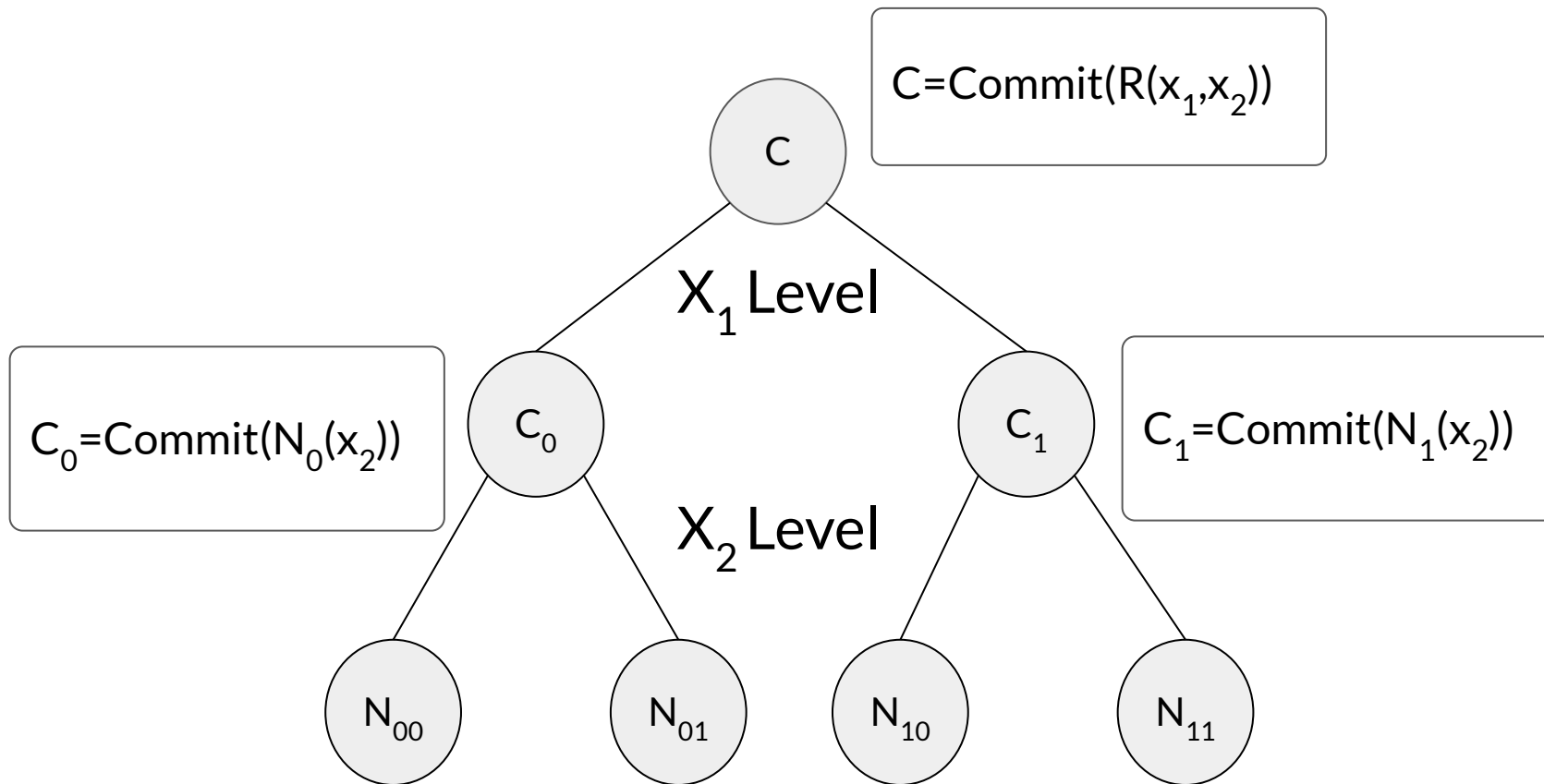
$$R(0,1) = N_{01}$$

$$R(1,0) = N_{10}$$

$$R(1,1) = N_{11}$$



# MPHT Commitments to Polynomials

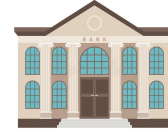


# MPHT Example

$$R(x_1, x_2) = (1-x_1)N_0(x_2) + x_1N_1(x_2)$$

Root (Digest):  
Bank stores

R



$d_n = R$

$X_1$  Level

$N_0$

$N_1$

$$N_0(x_2) = (1-x_2)50 + x_240$$

$$N_1(x_2) = (1-x_2)30 + x_250$$

$X_2$  Level

50

40

30

50



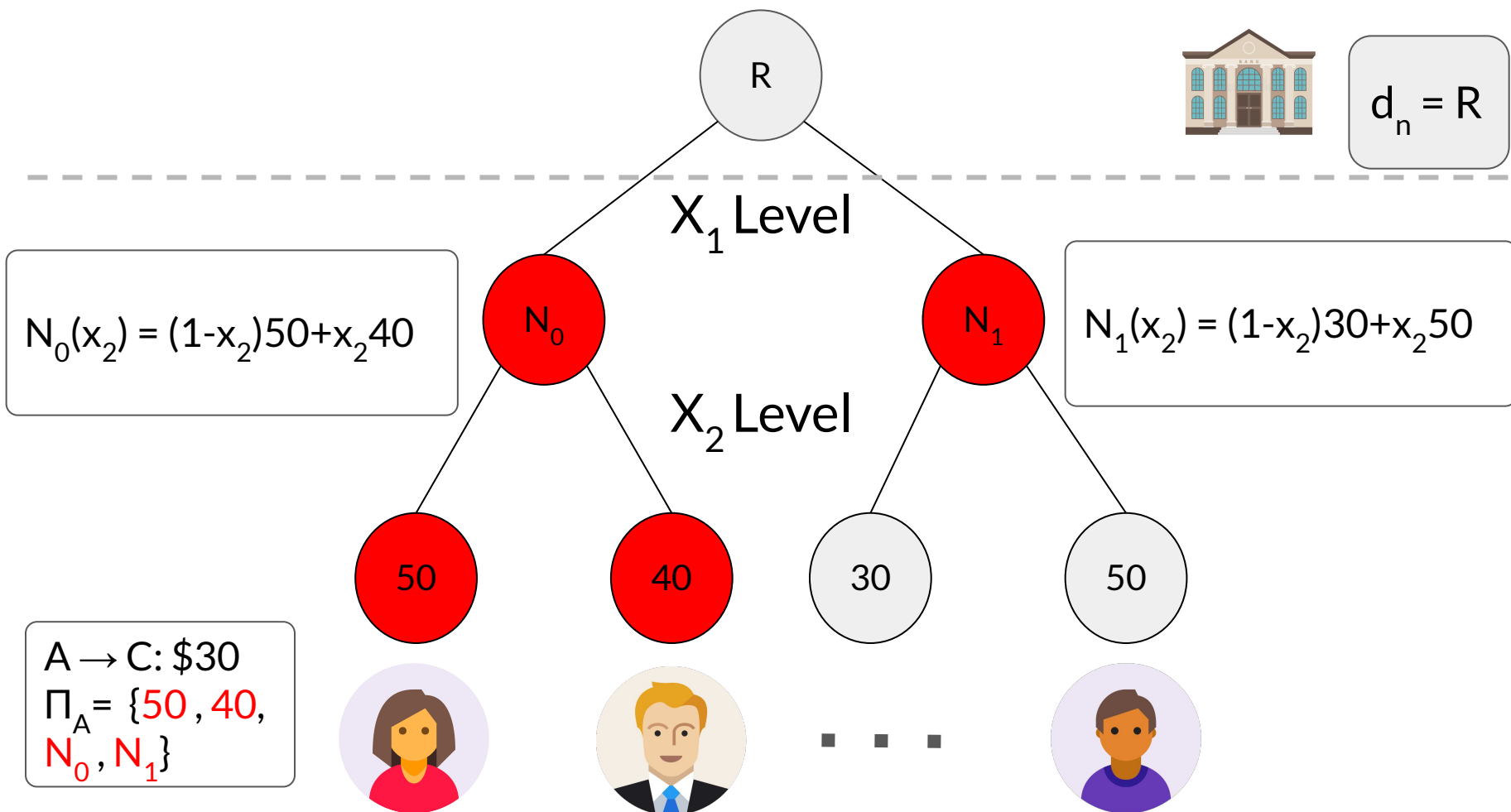
Account Balances (Users store)

# MPHT Proof of Balance

$$R(x_1, x_2) = (1-x_1)N_0(x_2) + x_1N_1(x_2)$$



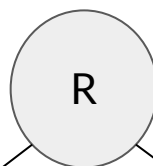
$$d_n = R$$



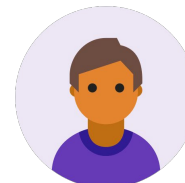
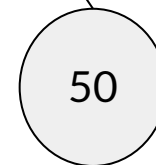
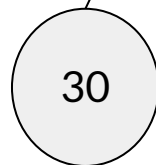
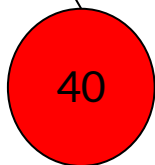
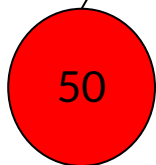
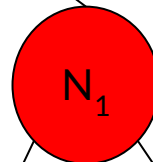
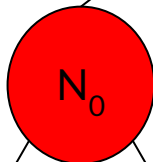
# MPHT Proof of Balance Verification



$$d_n = R$$



$X_1$  Level



Check:

$$N_0(x_2) = (1-x_2)50 + x_2 40$$

$A \rightarrow C: \$30$

$$\Pi_A = \{50, 40, N_0, N_1\}$$

# MPHT Proof of Balance Verification

Check:

$$R(x_1, x_2) = (1-x_1)N_0(x_2) + x_1N_1(x_2)$$



R



$$d_n = R$$

$X_1$  Level

$N_0$

$N_1$

Check:

$$N_0(x_2) = (1-x_2)50 + x_240$$

$X_2$  Level

50

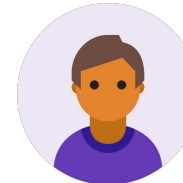
40

30

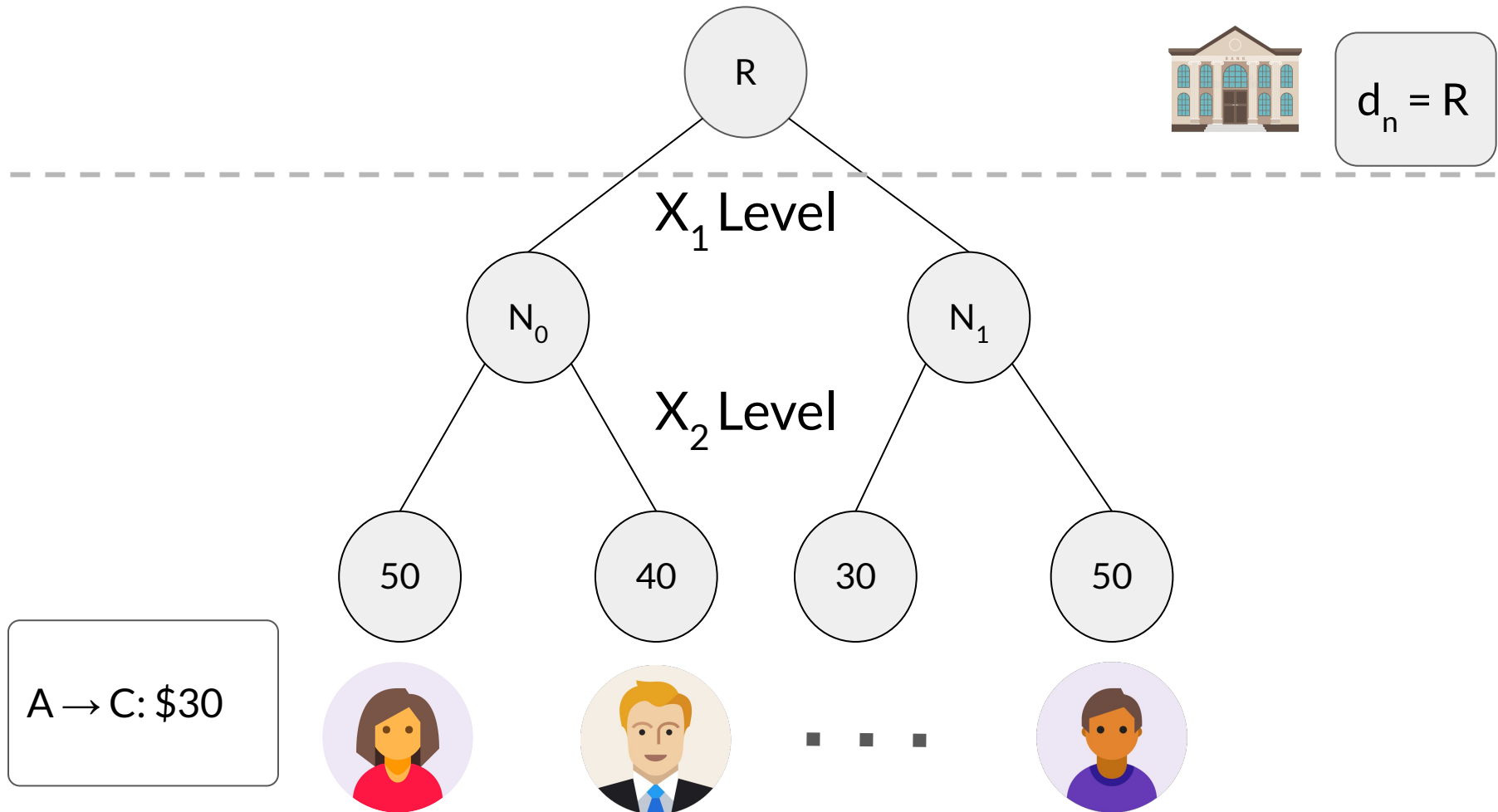
50

A → C: \$30

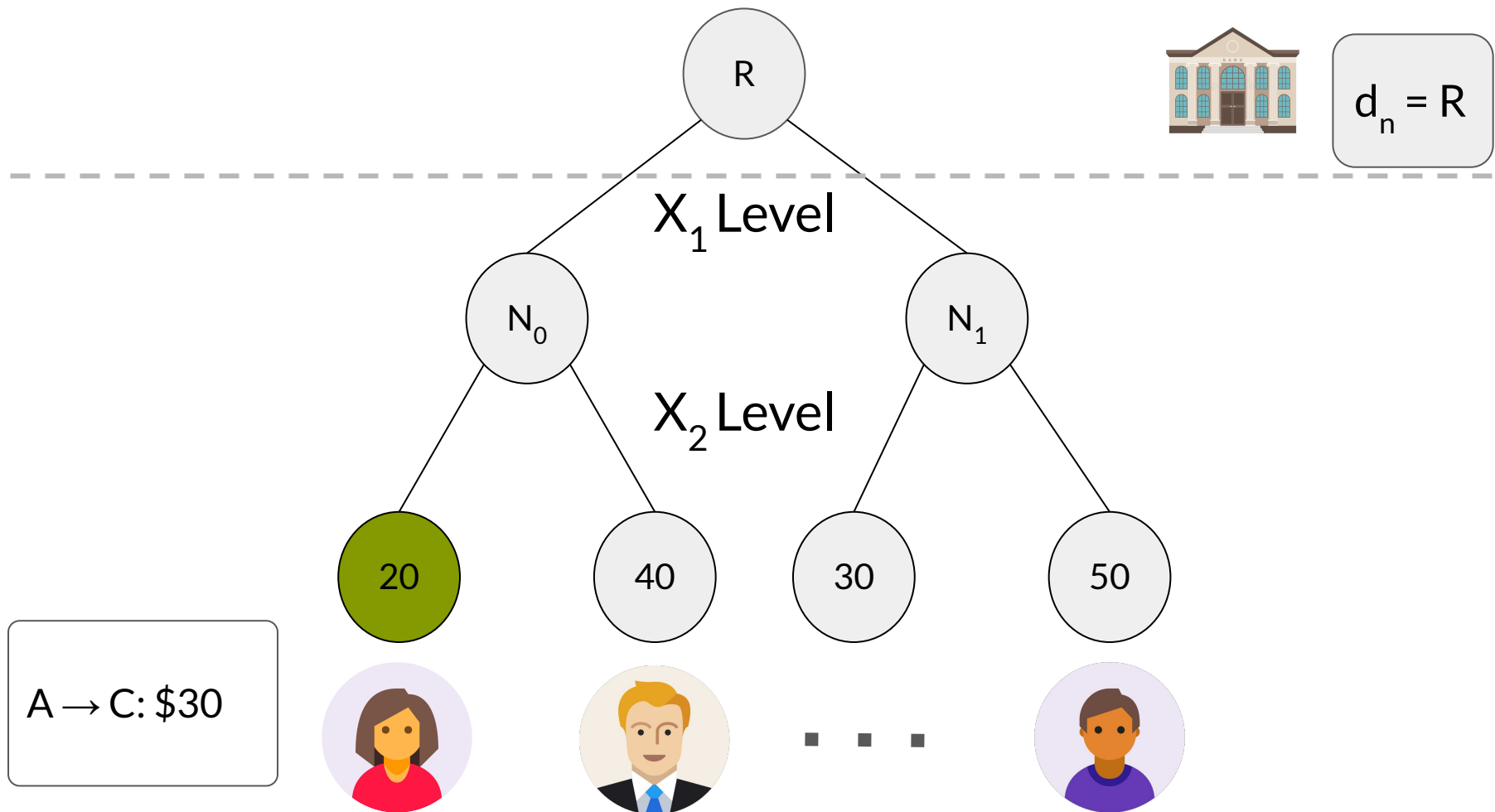
$$\Pi_A = \{50, 40, N_0, N_1\}$$



# MPHT Updating Digest



# MPHT Updating Digest

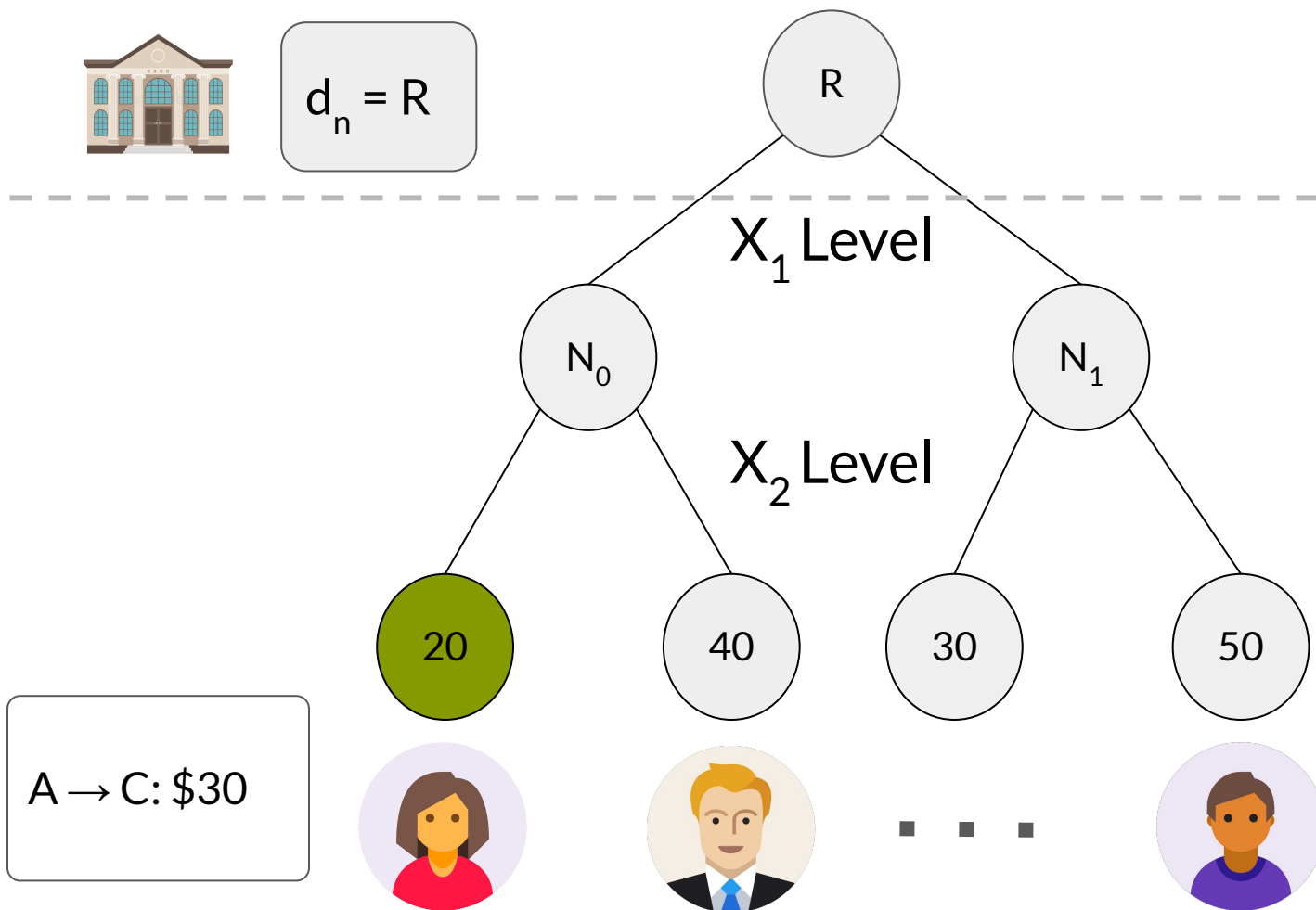


# MPHT Updating Digest

$$\Delta_1(x_1, x_2) = (1-x_1)(1-x_2)(-30)$$



$$d_n = R$$

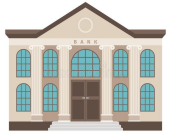


$A \rightarrow C$ : \$30



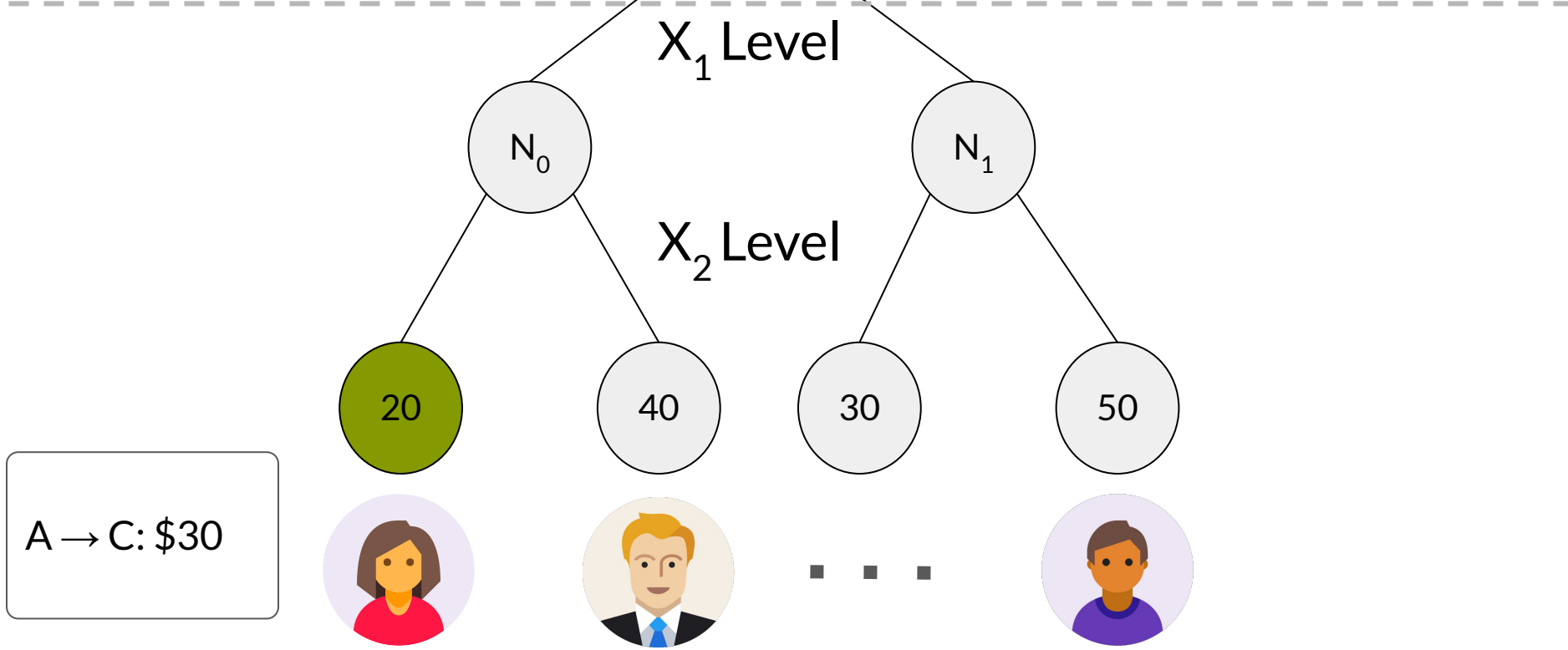
# MPHT Updating Digest

$$\Delta_1(x_1, x_2) = (1-x_1)(1-x_2)(-30)$$



$$d_n = R$$

$$R'(x_1, x_2) = R(x_1, x_2) + \Delta_1(x_1, x_2)$$

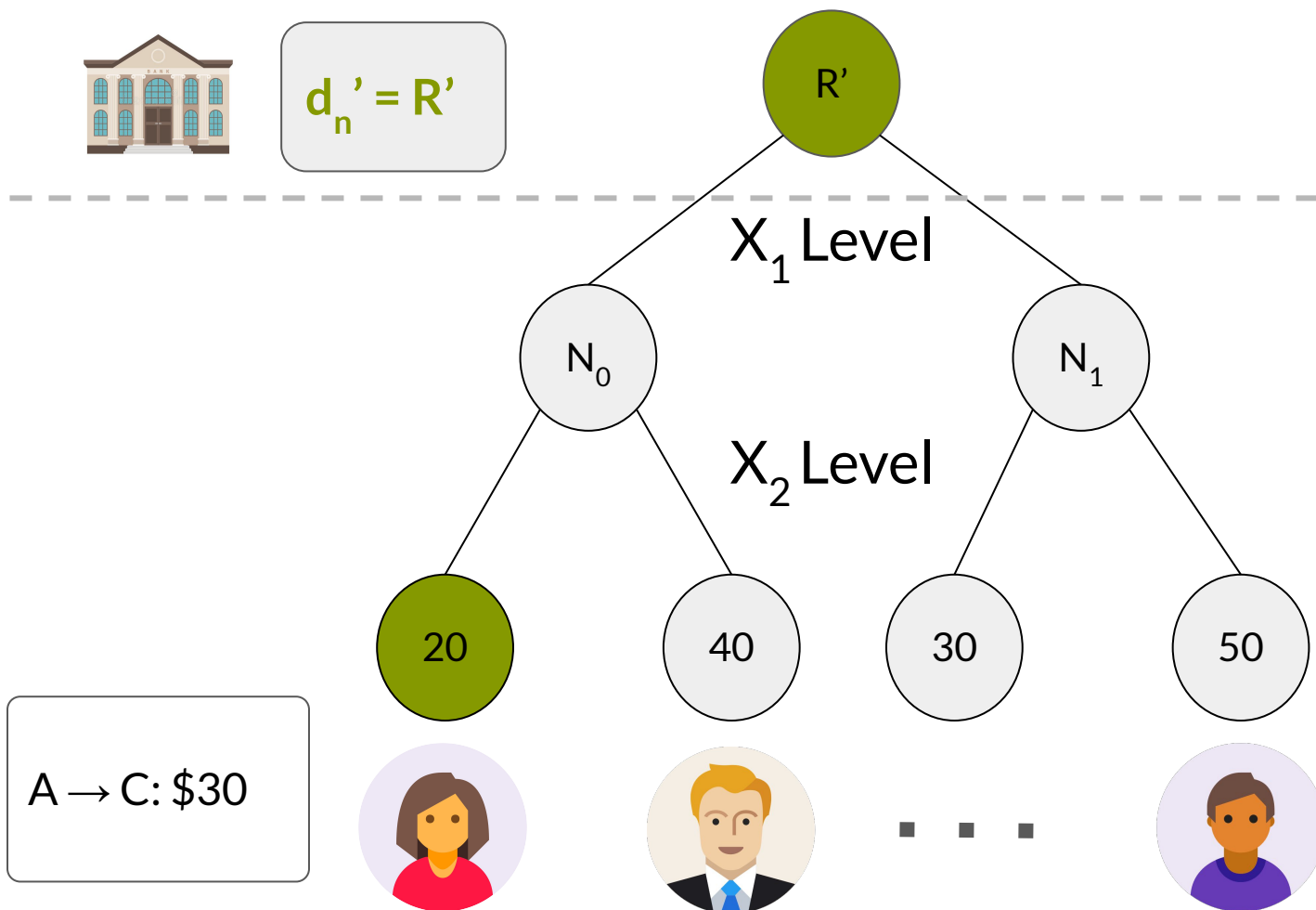


# MPHT Updating Digest

$$\begin{aligned} R'(x_1, x_2) &= (1-x_1)(1-x_2)50 + (1-x_1)x_2 40 + x_1(1-x_2)30 + x_1x_2 50 + \\ &\quad (1-x_1)(1-x_2)(-30) \\ &= (1-x_1)(1-x_2)20 + (1-x_1)x_2 40 + x_1(1-x_2)30 + x_1x_2 50 \end{aligned}$$

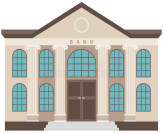


$$d_n' = R'$$

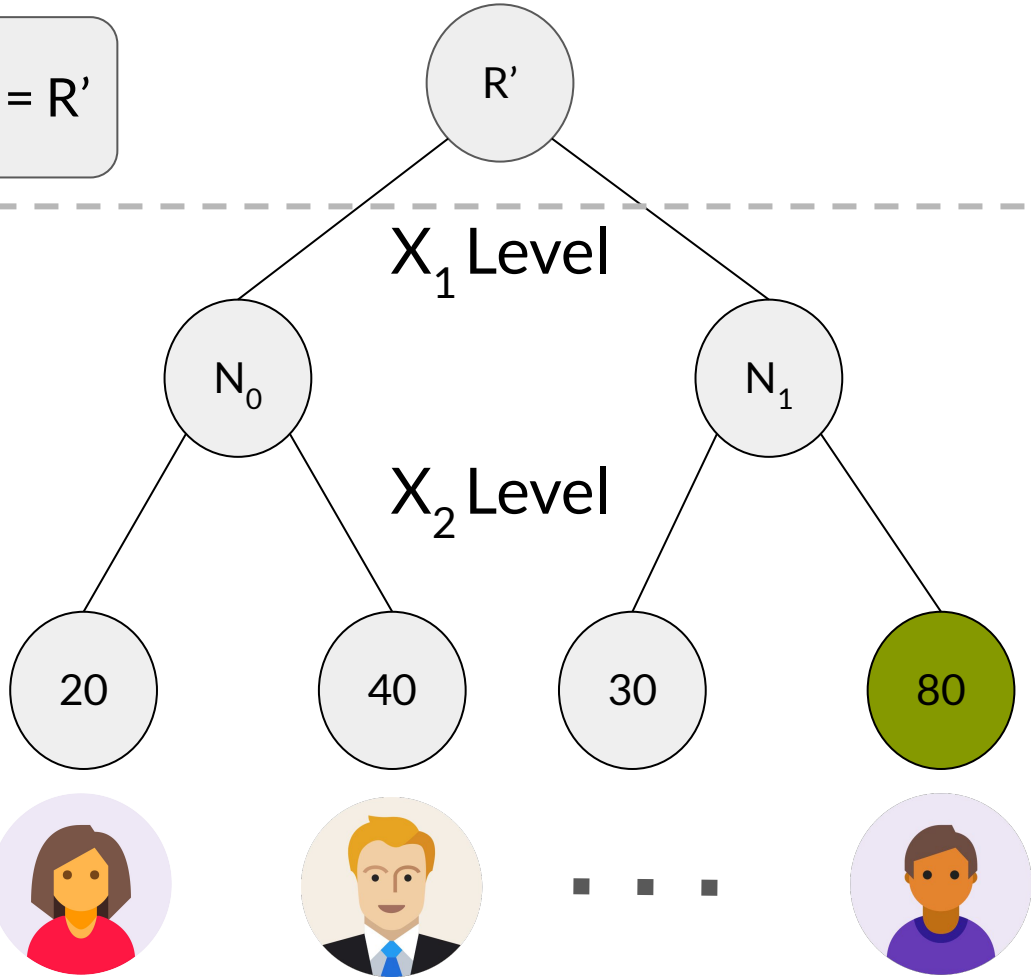


# MPHT Updating Digest

$$\Delta_2(x_1, x_2) = +x_1 x_2 30$$



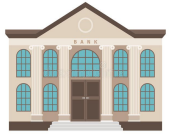
$$d_n' = R'$$



$$A \rightarrow C: \$30$$

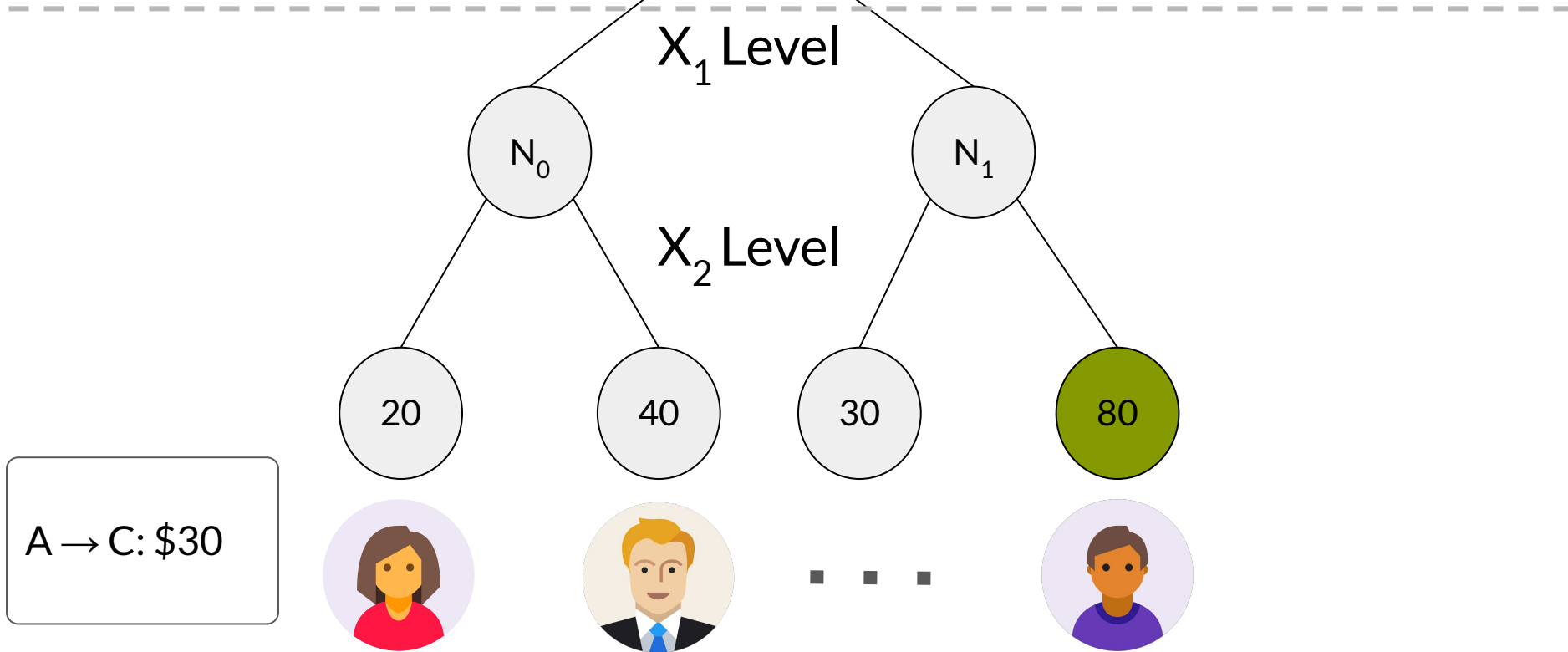
# MPHT Updating Digest

$$\Delta_2(x_1, x_2) = +x_1 x_2 30$$



$$d_n' = R'$$

$$R''(x_1, x_2) = R'(x_1, x_2) + \Delta_2(x_1, x_2)$$



$$A \rightarrow C: \$30$$

# MPHT Updating Digest

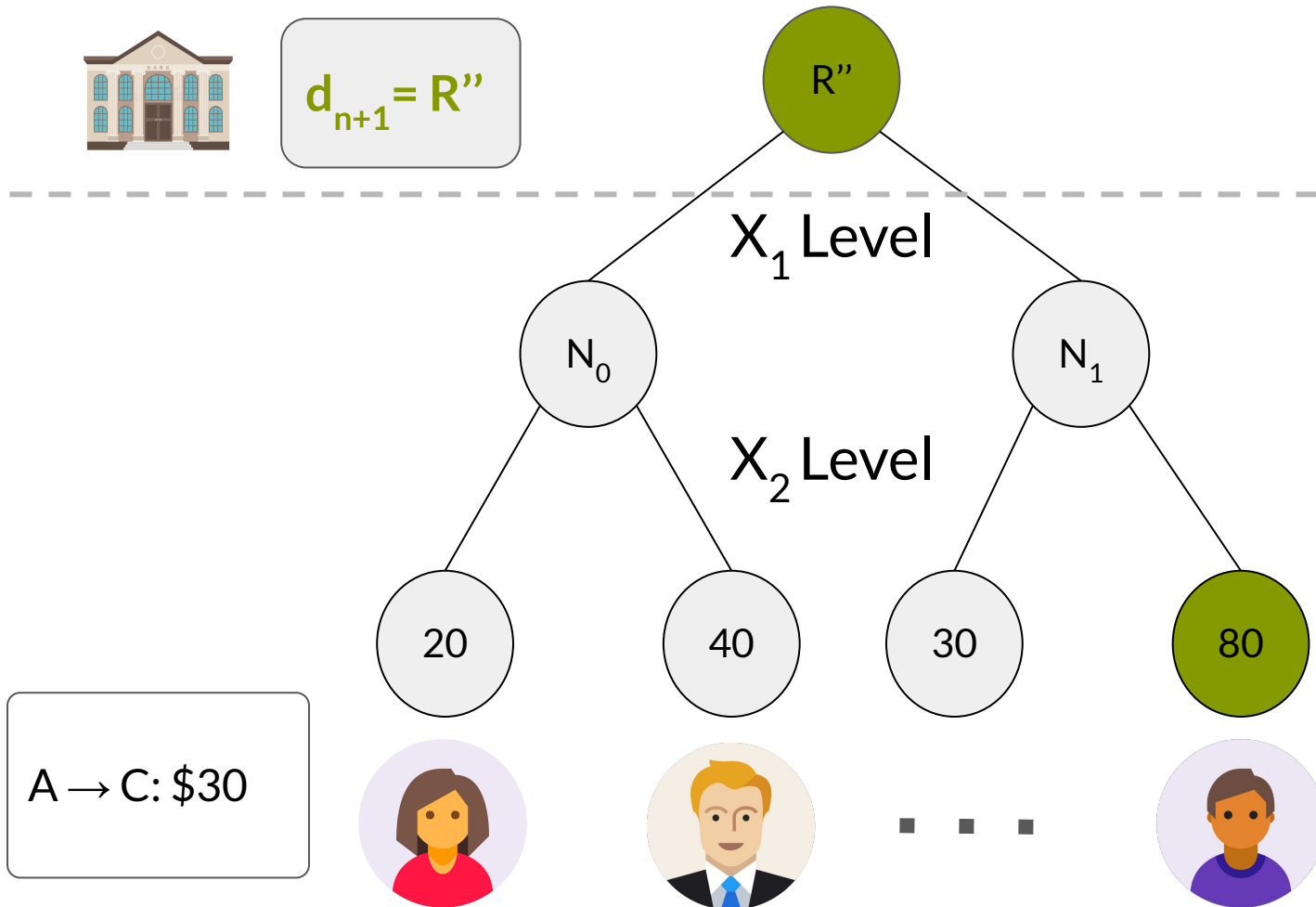
$$R'(x_1, x_2)$$

$$= (1-x_1)(1-x_2)20 + (1-x_1)x_2 40 + x_1(1-x_2)30 + x_1x_2 50$$

$$+ x_1x_2 30$$
$$= (1-x_1)(1-x_2)20 + (1-x_1)x_2 40 + x_1(1-x_2)30 + x_1x_2 80$$



$$d_{n+1} = R''$$



# MPHT Updating Proofs

- Out of time
- High-level idea:
  - There exist "*public parameters*"
  - Clients use them to update their proofs of balance after seeing transactions

# Conclusion

- We present a new type of Merkle tree based on multivariate polynomials with an efficiently updatable digest
- Can be used to scale TXN verifications in cryptocurrencies (e.g. Ethereum)

## Drawbacks/Future Work

- A large number of public parameters are needed in this construction to "hash" multivariate polynomials (however, clients do not need to store them if a fully-untrusted server does)
- Verifying proofs of balance in our tree is more expensive than the MHT construction ( $\sim 1000x$ ), but should still be much faster than going to disk



# Acknowledgements

Thanks to my mentor Alin Tomescu for his support and guidance!

Thanks to PRIMES for this opportunity!

Thanks to my parents for their support!

Thank you!

Questions?